

1 Contributions of MS metabolomics to gilthead sea bream (*Sparus aurata*) nutrition.  
2 Serum fingerprinting of fish fed low fish meal and fish oil diets

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17 ABSTRACT

18 The aim of this study was to evaluate the impact of fish meal (FM) and fish oil (FO)  
19 replacement by plant proteins and oils in the serum metabolome of two-year old  
20 gilthead sea bream (*Sparus aurata*) fed from early life stages with control and  
21 experimental diets. Randomly selected fish were overnight sampled and clotted serum  
22 was used for metabolomics fingerprinting by means of ultra-high performance liquid  
23 chromatography coupled to quadrupole time-of-flight mass spectrometry. More than  
24 12,500 different  $m/z$  ions were detected, and Partial Least Squares-Discriminant  
25 analysis separated fish fed control and plant-based diets, with a 71% of variance  
26 explained and 44% of variance predicted by the two first components. After variable  
27 importance in projection (VIP) and Benjamini-Hochberg test correction filtering, 50  
28 endogenous compounds were elucidated as highly discriminant features of dietary  
29 treatment. Most of them were lipid-related compounds and reflected the different fatty  
30 acid composition of dietary oils, whereas changes in N-acyl taurines, cytidine and  
31 nucleoside related compounds would indicate changes in tissue repair and DNA  
32 degradation processes. Untargeted analysis also identified some exogenous compounds  
33 as markers of marine and vegetable raw materials. In the case of hercynine (antioxidant  
34 fungi and mycobacteria product), this was exemplified by a close lineal association  
35 between circulating and feed levels. Targeted approaches were focused on vitamins and  
36 a clear reduction of B<sub>12</sub>, indirectly assessed via methylmalonic acid levels, was found in  
37 fish fed vegetable diets. Conversely, serum riboflavin (B<sub>2</sub>) and pantothenic acid (B<sub>5</sub>)  
38 levels were consistently increased, which highlighted the close link between nutrition  
39 and gut microbiota.

40

41 **Keywords:** Fish nutrition; liquid chromatography; mass spectrometry; metabolomics;  
42 vitamins; microbiota; plant-based diets.

## 43 1. Introduction

44

45 Current stagnation of fish meal (FM) and fish oil (FO) production from wild  
46 fisheries limits further growth of aquaculture (Tacon and Metian, 2015). The most  
47 obvious alternatives are the plant ingredients, which are a common practice in  
48 salmonids and marine fish to reduce the reliance of European aquaculture on marine  
49 fishery resources. Major progress in this way has been achieved within AQUAMAX,  
50 and ARRAINA EU projects and data on key performance indicators clearly indicate that  
51 alternative feeds with less than 7% marine ingredients support the maximum growth of  
52 gilthead sea bream (*Sparus aurata*) from early life stages to completion of sexual  
53 maturation (Benedito-Palos et al., 2016; Simó-Mirabet et al., 2018). It is also  
54 noteworthy that plant-based diets did not have a negative impact on the shelf life of  
55 gilthead bream, trout or carp as high quality foods (Grigorakis et al., 2018). Also, both  
56 in salmon and gilthead sea bream, no transfer from feeds to edible fillets was found for  
57 regulated mycotoxins, pesticides and persistent organic pollutants with the current  
58 plant-based diet formulations (Berntssen et al., 2005, 2010; Nacher-Mestre et al., 2009;  
59 2015; Bell et al., 2012; Portolés et al., 2017). However, regardless of fish fatty acid  
60 (FA) biosynthetic capabilities, the use of plant-based diets is associated with a reduced  
61 content of n-3 long-chain poly-unsaturated FAs (PUFA) in the meat of farmed fish  
62 (Benedito-Palos et al., 2009; Liland et al., 2013, Ballester-Lozano et al., 2016; Turchini  
63 et al., 2018).

64 Other drawback effects of plant-based diets in marine farmed fish are related to  
65 changes in fish health and stress resilience (Montero and Izquierdo, 2010). Certainly,  
66 the magnitude and persistence of high plasma cortisol levels after crowding exposure is  
67 increased in juveniles of gilthead sea bream fed vegetable oils (Ganga et al., 2011),  
68 although a lower risk of oxidative stress in these challenged fish is also inferred (Pérez-  
69 Sánchez et al., 2013b). However, below the threshold level for the theoretical  
70 requirements in essential FAs, high inclusion levels of vegetable oils allow a faster  
71 disease progression in juveniles of gilthead sea bream challenged with the intestinal  
72 parasite *Enteromyxum leei* (Estensoro et al., 2011; Calduch-Giner et al., 2012). A  
73 possible cause are the nutritionally-mediated changes on the intestinal profile of mucins,  
74 mucosal immunoglobulins (*IgT*) and other immune-relevant genes of either diagnostic  
75 or predictive value (Calduch-Giner et al., 2012; Pérez-Sánchez et al., 2013c; Piazzon et  
76 al., 2016), which revealed a pro-inflammatory condition affecting also the integrity of

77 the intestinal barrier (Estensoro et al., 2016) and the composition of gut microbiota and  
78 intestinal mucus proteome (Piazzon et al., 2017). From these studies, however, it was  
79 also conclusive that most of these disturbing effects are reversed by the supplementation  
80 of plant-based diets with sodium butyrate, resulting in improved diseases outcomes in  
81 fish challenged with *E. ictaluri* and the bacteria *Photobacterium damsela* subsp. *piscicida*  
82 (Piazzon et al., 2017). Experimental evidence also indicates that diets enriched with  
83 medium-chain fatty acid salts (sodium heptanoate, sodium dodecanoate) have a positive  
84 impact on feed intake and energy metabolism of juvenile fish reared under sub-optimal  
85 conditions (Simó-Mirabet et al., 2017; Martos-Sitcha et al., 2018), although possible  
86 mechanisms still await full elucidation.

87         Very often, the application of targeted analyses is the prevailing strategy for  
88 qualitative and quantitative detection of different biomarkers. However, this strategy  
89 restricts the possibilities to detect other unpredictable effects that could result directly or  
90 indirectly from the changes in diet composition. This limitation has encouraged the  
91 development and application of new and powerful analytical approaches to face the  
92 complexity of this problem and to improve the chance to detect unanticipated effects.  
93 Currently a promising new “omic” approach is metabolomics, which aims to use  
94 profiles of low-molecular weight metabolic entities (usually < 1,000 Da) to identify  
95 biomarkers indicative of specific conditions and particular metabolic pathways. The  
96 novelty of this approach in aquaculture research is highlighted in the review article of  
97 Alfaro and Young (2018). In particular, nuclear magnetic resonance (NMR)-based lipid  
98 fingerprinting allows to precisely classify wild and farmed gilthead sea bream based on  
99 their muscle lipid composition (Melis et al., 2014). In another gilthead sea bream study,  
100 Robles et al. (2013) measured over 80 metabolites from fish intestine samples using a  
101 high-performance liquid chromatography-mass spectroscopy (HPLC–MS) platform.  
102 Although both analytical platforms rely on wide-untargeted approaches, MS allows  
103 retrospective analysis and a higher sensitivity and resolution power (Castro-Puyana and  
104 Herrero, 2013). Indeed, we have detected more than 15,000 *m/z* ions in the serum of  
105 gilthead sea bream by means of ultra-high performance liquid chromatography  
106 (UHPLC) and high resolution MS (HRMS) (Gil-Solsona et al., 2017). The same  
107 platform has been used in the present study to analyse fish from the eight-months  
108 feeding trial of Benedito-Palos et al. (2016). That study was prolonged, and herein data  
109 on wide- and targeted-serum metabolome were used to underline the effects of  
110 alternative feeds in two-year old fish fed experimental diets from early life stages.

111 **2. Materials and methods**

112

113 *2.1. Reagents and chemicals*

114

115 HPLC-grade methanol (MeOH), HPLC-supergradient acetonitrile (ACN),  
116 sodium hydroxide (> 99%), ammonium hydroxide (NH<sub>4</sub>OH) and ammonium acetate  
117 (NH<sub>4</sub>Ac) were obtained from Scharlab (Barcelona, Spain). HPLC-grade water was  
118 obtained from a Milli-Q water purification system (Millipore Ltd., Bedford, MA, USA).  
119 Leucine-enkephalin (mass-axis calibration), formic acid (mobile phase modifier), N,N-  
120 dimethyl L-histidine (reagent grade), methyl iodine (reagent grade) and  
121 tetrabutylammonium acetate (reagent grade) were purchased from Sigma-Aldrich  
122 (Saint Louis, MO, USA).

123

124 *2.2. Diets*

125

126 Four experimental diets were formulated and produced by BioMar (Brande,  
127 Denmark). All diets were isonitrogenous, isolipidic and isoenergetic and met all known  
128 nutritional requirements of gilthead sea bream. FM was included at 23% in the D1  
129 (control) diet and at 3% in the other three experimental diets (D2, D3 and D4). Fish  
130 hydrolysate (CPSP) was added at 2% in all diets. Added oil was either FO (D1 diet) or a  
131 blend of vegetable oils (1:1 ratio of rapeseed oil: palm oil), replacing 58% (D2 diet) and  
132 84% (D3 and D4 diets) FO. A commercial butyrate preparation (BP-70<sup>®</sup>, NOREL) was  
133 added to the D4 diet at 0.4%. All diets contained histidine (0.14%), antioxidants  
134 (0.045%) and a mineral-vitamin mix (0.5%). Lysine, methionine, choline, lecithin and  
135 monocalcium phosphate were balanced in D2, D3 and D4 diets to the values of the  
136 control diet (Table 1).

137

138 *2.3. Animal care and sampling*

139

140 Juvenile fish (15 g initial average body weight) of Atlantic origin (Ferme Marine  
141 de Douhet, Ile d'Oléron, France) were fed control and experimental diets in the indoor  
142 experimental facilities of the Institute of Aquaculture Torre de la Sal (IATS-CSIC,  
143 Spain). Fish were allocated in 2,500 L tanks in triplicated groups (150 fish/tank), and  
144 each one was fed one of the experimental diets for 16 months from May 2013 to August

145 2014. The number of fish per tank was progressively reduced by periodical samplings,  
146 maintaining the rearing density below 15 kg/m<sup>3</sup>. Oxygen content of outlet water  
147 remained higher than 75% saturation and day-length and water temperature followed  
148 natural changes at IATS-CSIC latitude (40° 5'N; 0° 10'E). At time of sampling, actively  
149 fed fish (3-4 fish per tank to achieve 10 fish per diet) were sampled following overnight  
150 fasting for blood and tissue collection. Liver and visceral adipose tissue were extracted  
151 and weighed. Blood was taken from caudal vessels with vacutainer tubes with a clot  
152 activator, allowed to clot for 30 min at room temperature, and then centrifuged at 1,300  
153 g for 10 min. The obtained samples were stored at -20°C until analysis.

154 All procedures were approved by the IATS Ethics and Animal Welfare  
155 Committee according to national (Royal Decree RD53/2013) and EU legislation  
156 (2010/63/EU) on the handling of animals for experiments.

157

#### 158 2.4. UHPLC-HRMS

159

160 The analytical procedure was similar to that described elsewhere by Gil-Solsona  
161 et al. (2017). Briefly, serum samples were deproteinized with ACN and one supernatant  
162 aliquot was used for hydrophilic interaction liquid chromatography (HILIC). Another  
163 aliquot was evaporated to dryness and re-dissolved in MeOH 10% for reversed phase  
164 (RP) analysis. Quality control (QC) samples were prepared by pooling 50 µL of each  
165 sample extract. Extracts (10 µL) were injected in HILIC and RP in both positive and  
166 negative ionization modes (0.7 kV and 1.5 kV capillary voltages, respectively) in a  
167 hybrid quadrupole time-of-flight mass spectrometer (Xevo G2 QTOF, Waters,  
168 Manchester, UK) with a cone voltage of 25 V, using nitrogen as both desolvation and  
169 nebulizing gas.

170 The HILIC separation was performed using a mix of ACN:H<sub>2</sub>O (95:5, v/v) as  
171 weak mobile phase (A) and H<sub>2</sub>O as strong mobile phase (B) both in 0.01% formic acid  
172 (HCOOH) and 10 mM NH<sub>4</sub>Ac. The percentage of B was changed as follows: 0 min,  
173 2%; 1.5 min, 2%; 2.5 min, 15%; 6 min, 50%; 7.5 min, 75%; and finally at 7.51 min,  
174 2%, with a total run time of 10 min, for both ESI+ and ESI-. For RP separation, the  
175 weak mobile phase (A) was H<sub>2</sub>O with 0.01% HCOOH and the strong mobile phase (B)  
176 was MeOH with 0.01% HCOOH. The B percentage was changed from 10% at 0 min, to  
177 90% at 14 min, 90% at 16 min and 10% at 16.01 min, with a total run time of 18 min  
178 for both ESI+ and ESI-. In order to obtain a better resolution among isomers of free FAs

179 and phospholipids, aliquots of RP samples were fortified at 50 mM with  
180 tetrabutylammonium acetate (TBA) and injected with the following gradient: A: H<sub>2</sub>O  
181 0.01% HCOOH, B: MeOH 0.01% HCOOH; The percentage of B was maintained at  
182 70% during the first 5 min and changed from 70% at 5 min, to 80% at 8 min, 85% at 12  
183 min, 95% at 15 min, 100% at 22 min and 70% again at 22.01 min with a total run time  
184 of 24 min for both ESI+ and ESI-.

185

## 186 2.5. Untargeted Data Processing

187

188 LC-MS data were processed using XCMS R package  
189 (<https://xcmsonline.scripps.edu/>) with *Centwave* algorithm for peak picking (peak width  
190 from 5 to 20 s, S/N ratio higher than 10 and mass tolerance of 15 ppm), followed by  
191 retention time alignment, peak area normalization (mean centering), log 2 applying (to  
192 avoid heteroscedasticity) and Pareto scaling. For elucidation purposes, fragmentation  
193 spectra of features of interest were compared with reference spectra databases  
194 (METLIN, <http://metlin.scripps.edu/>; Human Metabolome DataBase,  
195 <http://www.hmdb.ca>; MassBank, <http://www.massbank.eu>). For unassigned  
196 metabolites, *in silico* fragmentation software (MetFrag, [http://msbi.ipb-](http://msbi.ipb-halle.de/MetFrag)  
197 [halle.de/MetFrag](http://msbi.ipb-halle.de/MetFrag)), with subsequent searches through Chemspider  
198 (<http://www.chemspider.com>) and PubChem (<https://pubchem.ncbi.nlm.nih.gov>)  
199 chemical databases, was employed.

200

## 201 2.6. Targeted analysis

202

203 The retrospective analysis of data acquired in MS<sup>E</sup> mode served for the refined  
204 search of additional relevant compounds. This procedure consisted in the search of the  
205 *m/z* ratio (parent ions) of the metabolites of interest in the LE function, as well as  
206 product ions obtained from MS/MS spectrum online databases (METLIN and Human  
207 Metabolome DataBase) in the HE function. In the case of vitamins and related-  
208 compounds, fat-soluble vitamins were not directly analysable in serum, and their related  
209 metabolites were analysed as retinol phosphate for vitamin A, 25-hydroxyvitamin D<sub>3</sub>  
210 for vitamin D<sub>3</sub>,  $\alpha$ -Carboxyethylhydroxychroman for vitamin E and menaquinone for  
211 vitamin K<sub>2</sub> (Tai et al., 2010; Lebold et al., 2012; Karl et al., 2014). Water-soluble

212 vitamins were directly analysed (B<sub>1</sub>, B<sub>2</sub>, B<sub>5</sub>, B<sub>6</sub>, B<sub>7</sub> and C) with the exception of B<sub>12</sub>,  
213 which was indirectly assayed as methylmalonic acid (MMA) (Lewerin et al., 2003).

214 Targeted analysis was also applied for hercynine, a betaine compound  
215 synthesized by fungi and mycobacteria. This exogenous compound was analysed in  
216 feeds and serum samples, using a hercynine standard synthesized as described elsewhere  
217 (Khonde and Jardine, 2015). In the case of feed samples, the analytical protocol  
218 included a polar extraction procedure previously employed in our laboratory for animal  
219 by-products (Nácher-Mestre et al., 2016). Briefly, 2.5 g of feeds were extracted with 10  
220 mL H<sub>2</sub>O:ACN (20:80) 0.1% HCOOH, centrifuged and supernatant (5 mL) was passed  
221 through an OASIS WCX SPE cartridge previously cleaned with 6 mL MeOH and 6 mL  
222 of Milli-Q H<sub>2</sub>O. Sample was loaded, cleaned with 6 mL of MeOH:H<sub>2</sub>O (1:1) and finally  
223 eluted in 3 mL of 2% formic acid in methanol. The feeds samples were then lead to  
224 dryness and diluted in 200 µL of Milli-Q H<sub>2</sub>O to continue with MS analysis.

225

## 226 2.7. Statistical analysis

227

228 Data on growth performance and targeted analysis were analysed by one-way  
229 ANOVA followed by the Student Newman–Keuls test ( $P < 0.05$ ). After data  
230 preprocessing of untargeted metabolomics, multivariate analysis was performed to find  
231 discriminative features among groups by means of the EZ-Info software (Umetrics,  
232 Sweden). First, Principal Component Analysis (PCA) was used to ensure the absence of  
233 outliers and the correct classification of QCs after normalization. Then, all the four  
234 experimental groups were joined in a single file and Partial Least Squares-Discriminant  
235 Analysis (PLS-DA) was conducted to maximize the separation of dietary groups. The  
236 contribution of  $m/z$  features to the PLS-DA model was assessed by means of variable  
237 importance in projection (VIP) measurements. A VIP score  $> 1$  was considered an  
238 adequate threshold to determine discriminant variables in the PLS-DA model (Wold et  
239 al., 2001; Li et al., 2012; Kieffer et al., 2016). Additionally, orthogonal PLS-DA  
240 (Wiklund et al., 2008) with a high threshold ( $P [\text{corr}] > 0.7$ ) was carried out to highlight  
241 the most discriminant compounds. To end, differences in normalized peak areas of  $m/z$   
242 features were analysed by One-way ANOVA followed by Benjamini-Hochberg  
243 multiple testing correction analysis (Benjamini and Hochberg, 1995).

244



### 245 **3. Results and Discussion**

246

#### 247 *3.1. Fish condition*

248 In the previous study of Benedito-Palos et al. (2016), data on key performance  
249 indicators and gene expression of growth-related markers in liver and skeletal muscle  
250 highly supported the suitability of FM/FO replacement by plant ingredients. In  
251 agreement with this, when fish coming from this initial trial were randomly sampled for  
252 serum metabolomics fingerprinting, all fish showed a similar average body weight  
253 ranging between 577 and 612 g (Table 2). Likewise, hepatosomatic index (HSI) and  
254 mesenteric fat index (MSI) remained mostly within the normal range of variation for the  
255 class of fish size and season (Cruz-García et al., 2009; Benedito-Palos et al., 2010). This  
256 revealed a lack of impact of dietary treatment upon body fat storage or tissue lipid  
257 trafficking, which are now recognized as clear signs of essential FA deficiencies in  
258 gilthead sea bream (Pérez-Sánchez et al., 2013a; Ballester-Lozano et al., 2015). Despite  
259 this, integrative omics approaches combining transcriptomics, proteomics and  
260 microbiome analyses highlighted a pro-inflammatory phenotype, with changes in the  
261 integrity of the epithelial intestinal barrier and diseases outcomes when fish fed plant-  
262 based diets are challenged with bacteria and enteric parasites (Estensoro et al., 2016;  
263 Piazzon et al., 2016; 2017). Recently, it has also been proven that plasma levels of sex  
264 steroids and the male-female sex reversal through the life cycle of gilthead sea bream  
265 are differentially regulated in fish fed marine and vegetable diets (Simo-Mirabet et al.,  
266 2018). Nevertheless, sex steroids (testosterone, 11-ketotestosterone, 17 $\beta$ -estradiol)  
267 cannot be considered a major discriminating factor in this study, since their plasmatic  
268 concentrations increase gradually through gametogenesis in concomitance with gonadal  
269 growth, decreasing abruptly thereafter. Accordingly, circulating sex steroids were  
270 almost undetectable in our experimental setup using fish sampled out of the  
271 reproductive period, which normally extends for gilthead sea bream from October to  
272 March in our latitude (Chaoui et al., 2006; Hadj-Taieb et al., 2013). In any case, our  
273 methodology allowed a wide-screening approach, and a total of 12,982 *m/z* features  
274 (ions) were obtained in all four acquisition modes (RP and HILIC in both ionization  
275 modes ESI+ and ESI-). These numbers are comparable to those previously reported for  
276 fed and fasted juveniles of gilthead sea bream, using the same UHPLC-HRMS platform  
277 (Gil-Solsona et al., 2017). Of course, not all features corresponded to a single  
278 compound, but the number of detectable ions (13,000-15,000) was high enough to have

279 a wide-representation of the serum fish metabolome. Indeed, the number of different  
280 compounds in animal biofluids is estimated to be more than 8,000 (Kałużna-Czaplińska  
281 et al., 2014), with around 4,500 in human blood according to the Human Metabolome  
282 DataBase (Wishart et al., 2013).

283

### 284 3.2. *Untargeted fingerprinting: multivariate analysis*

285

286 One-way ANOVA was suitable to detect a wide-range of changes in circulating  
287 metabolites with more than 5,000 differentially expressed ions when comparing control  
288 and extreme D3/D4 groups ( $P < 0.05$ ), but these numbers were drastically reduced after  
289 filtering with Benjamini-Hochberg for false positive corrections (Fig. 1A). Thus, the  
290 number of ions with a different abundance ranged between 451 and 2,929 when  
291 comparisons were made between D1 and D2 fish; and D1 and D4 fish, respectively.  
292 However, only four individual features were different between groups D3 and D4,  
293 which was indicative that the source of variation when FM/FO diets were supplemented  
294 with butyrate was very low in comparison to that of the replacement of FM and FO with  
295 plant ingredients alone. This was also evidenced by multivariate PLS-DA analysis as  
296 many individuals of D3 and D4 groups overlapped in the score plot (Fig. 1B). This is  
297 the reason why data from fish fed D3 and D4 were pooled in the same group (D3/4) for  
298 subsequent PLS-DA analyses, where the 71% of variance and 44% of variance was  
299 explained or predicted, respectively, by the two first components. The maximum  
300 individual variability was achieved within D2 group, but importantly all fish of D1 and  
301 D3/D4 groups were correctly classified in the discriminant model. Thus, the maximum  
302 separation along both components was found for D1 and D3/4 fish that were distributed  
303 along the first (X-axis) and second (Y-axis) component, whereas the separation of D2  
304 and D3/4 fish was only evidenced along the first component reflecting the changes in  
305 FO inclusion levels (6.5% D2 diet; 2.50% D3/4 diets). In contrast, the distribution along  
306 the second component would primarily reflect the reduced feed intake of FM and fish  
307 hydrolysates with inclusion levels of 25.0% in D1 diet and 5.0% in D2, D3 and D4  
308 diets. However, it is noteworthy that the number of features with a  $P[\text{corr}] > 0.95$  by  
309 Orthogonal PLS-DA was reduced to 39, whereas up to 850 ions were identified as  
310 clearly discriminant ions in 10-days fasted fish (Gil-Solsona et al., 2017). Therefore, the  
311 magnitude of changes induced in the present study by dietary treatment were markedly  
312 reduced in comparison to the fasting mediated effects, which suggests that most of them

313 primarily mirror differences in diet composition rather than functional metabolic  
314 dysfunctions associated to changes in diet composition. For this reason, a less restrictive  
315  $P[\text{corr}] > 0.7$  was used for the subsequent elucidation procedures.

316

### 317 *3.3. Elucidation of untargeted differential compounds*

318

319 A total of 55 representative compounds with statistically significant changes in  
320 abundance after correction for false positives and a VIP score  $> 1.3$  were elucidated  
321 (Table 3). Most of them were compounds of lipid nature, such as phosphocholines (PC,  
322 24), lysophosphocholines (LysoPC, 10), free FAs (8) and sphingolipids (2). Other  
323 compounds with a different abundance were elucidated as N-acyl-aurines (2), cytidine  
324 and cytosine nucleosides (4), cysteinolic acid, tauropine, trimethylamine N-oxide  
325 (TMAO), arsenobetaine and hercynine. Accordingly, most of these compounds are  
326 related to lipid metabolism and highly reflected the decreased unsaturation index of FAs  
327 of vegetable oils. Indeed, FO has an elevated content of n-3 LC-PUFAs, whereas  
328 vegetable oils are almost devoid of eicosapentaenoic acid (20:5n-3) and  
329 docosahexaenoic acid (22:6n-3), which cannot be synthesized at a high rate in marine  
330 fish from the C18 PUFA precursor,  $\alpha$ -linolenic acid (18:3n-3) (Tocher, 2015). In  
331 consequence, previous studies in gilthead sea bream clearly indicate that the inclusion  
332 of vegetable oils in fish feeds reduced the content of LC-PUFAs and increased that of  
333 C18 PUFAs in liver, adipose tissue and muscle fillets, with a selective incorporation of  
334 unsaturated FAs in polar lipids (Izquierdo et al., 2005; Benedito-Palos et al., 2010;  
335 2013) to preserve and maintain the function of cell membrane surfaces. Especially for  
336 fat fish species, most of these changes in the flesh FA composition are highly  
337 predictable by means of a dummy regression model (Ballester-Lozano et al., 2014;  
338 2016). Less is known about the effects of diet composition on the FA composition of  
339 circulating lipids, although clinical studies evidence that they also reflect the changes in  
340 diet composition (Laidlaw and Holub, 2003; Lemaitre et al., 2003) as it was herein the  
341 case of circulating PCs, lysoPCs and free FAs. Moreover, the number and degree of  
342 these changes in comparison to control group D1 increase with the level of replacement  
343 in a dose-dependent manner.

344 Sphingolipids, as well as phospholipids, are essential components of all  
345 eukaryotic cell membranes with important roles in a variety of biological processes  
346 including cell division and cell-to-cell interactions (Hannun and Obeid, 2018). In their

347 simplest forms, sphingosine, phytosphingosine, and dihydrosphingosine serve as the  
348 backbones upon which further complexity is achieved. For example, phosphorylation of  
349 the C1 hydroxyl group yields the final breakdown products and/or the important  
350 signalling molecules sphingosine-1-phosphate, phytosphingosine-1-phosphate and  
351 dihydrosphingosine-1-phosphate, respectively (Gault and Obeid, 2010). In the present  
352 study, two sphingosine-related compounds were altered by dietary treatment and the  
353 abundance of (9-methyl-d19:3) sphingosine was markedly reduced (D2, 23% control  
354 fish; D3, 16% control) by the replacement of marine resources by plant ingredients.  
355 Conversely, (d14:2) sphingosine was markedly increased in D2 fish (878% with respect  
356 to D1 group) with intermediate values with the extreme diet formulation in D3/4 fish,  
357 which suggests that other factors that the simple inclusion level of plant ingredients  
358 have effects on sphingolipid metabolism, but we are still far to understand the  
359 physiological significance of this finding.

360 In recent years, a number of studies have demonstrated the essentiality of dietary  
361 taurine for many commercially relevant species, especially marine teleosts.  
362 Consequently, the removal of taurine-rich dietary ingredients such as FM can induce  
363 deficiencies with a wide range of symptoms, including reduced growth and survival,  
364 increased susceptibility to diseases and impaired larval developments as reviewed by  
365 Salze and Davis (2015). However, the paradigm that taurine is an essential nutrient is  
366 not nearly as clear in freshwater species and it is difficult to draw definitive conclusions,  
367 although the list of fish species for which taurine is required is increasing. In any case,  
368 taurine is well recognized as an essential nutrient in most carnivorous fish, and early  
369 studies in gilthead sea bream indicated that low levels of taurine in the pool of muscle  
370 free amino acids is associated with growth impairments in fish fed plant protein-based  
371 diets (Gómez-Requeni et al., 2004). The amides of long-chain FAs with taurine (N-acyl-  
372 taurines) are produced via oxidation of bile acid precursors in peroxisomes, and can  
373 function as cell signalling molecules with a wide range of biological activities (Hunt et  
374 al., 2012). N-acyl-taurines have been recently identified in liver and other rodent tissues,  
375 and genetic deletion or pharmacological blockage of the serine amidase FA amide  
376 hydrolase (FAAH) causes profound acceleration on wound healing in mouse skin, and  
377 repair associated responses in primary cultures of human keratinocytes and fibroblasts  
378 (Sasso et al., 2016). In the same study, immunofluorescence images of intact mouse  
379 skin show that FAAH co-localizes with cytokeratin 10 and filaggrin, two proteins that  
380 are expressed by epidermal supra-basal keratinocytes. In a previous study, we have

381 identified the cytokeratin 8 as a good marker of multiple aquaculture stressors (tank  
382 shaking, sounds, moving objects into water, water reverse flow and light flashes) in the  
383 skin mucus of gilthead sea bream (Pérez-Sánchez et al., 2017). The association of  
384 cytokeratines with N-acyl taurines has not been established in fish, but we found herein  
385 that the concentration of either N-heptadecenoyl-taurine or N-palmitoleoyl-taurine was  
386 progressively and consistently reduced with the combined replacement of FM and FO  
387 by plant ingredients. This finding opens new research issues in fish nutrition, which  
388 would be targeted to alleviate some of the drawback effects of plant-based diets upon  
389 the epithelial mucosae of gilthead sea bream, probably mediated by cell renewal or anti-  
390 inflammatory processes, as it has been reported for other bioactive compounds, such as  
391 butyrate which helps to restore and preserve the integrity and function in gilthead sea  
392 bream fed from early life stages with plant-based diets (Estensoro et al., 2016; Piazzon  
393 et al., 2017). Moreover, experimental evidence indicates that both butyrate and taurine  
394 are able to mitigate through different modes of action the intestinal anomalies of  
395 European sea bass fed with highly enriched soybean meal diets (Rimoldi et al., 2016).

396 Cytidine and nucleoside related compounds (cytosine, deoxycytidine,  
397 methylcytosine) were also clear discriminant factors in our experimental model, and  
398 their concentrations were consistently increased in fish fed plant-based diets.  
399 Intriguingly this was more evident in the group of fish fed D2 diet (200-734% control  
400 fish) than in the extreme D3/4 group (120-190% control fish). Since these compounds  
401 originate from dietary sources, from cellular excretion subsequent to RNA turnover,  
402 from cytosolic pools of nucleotides, or from degradation of nuclear DNA phagocytized  
403 by macrophages (Holstege et al., 1984), it is difficult to understand the physiological  
404 significance of these findings, although a major source of variation might be related to  
405 some kind of cellular DNA instability. Indeed, the highest difference amount control  
406 and experimental groups was reported for deoxycytidine and methylcytosine.  
407 Degradation of DNA produces deoxycytidine and chemotherapy sharply raises plasma  
408 deoxycytidine levels above pretreatment levels (Cohen et al., 1997). At the same time,  
409 methylation of cytosines is an important element of epigenetic regulation, and the  
410 increased circulating levels of methylcytosine can indicate not only a higher DNA  
411 degradation or instability, but also a hyper-methylation at the whole DNA or at specific  
412 gene sites. However, this notion needs to be confirmed by more specific assays, because  
413 vegetarian life styles are associated with hypo-methylation states (Geisel et al., 2005).

414 Unlike endogenous compounds, the origin and significance of exogenous  
415 compounds with a different abundance was easier to trace, being highly informative of  
416 the nature and origin of feed ingredients. Accordingly, the replacement of FM by plant  
417 ingredients was associated to a decrease of circulating cysteinolic acid, tauropine,  
418 TMAO or arsenobetaine. Cysteinolic acid is a non-protein amino acid similar to taurine,  
419 detected in gilthead sea bream and red sea bream (*Pagrus major*) as cholesterol-  
420 conjugate precursors in the synthesis of bile salts (Goto et al., 1996; Une et al., 1991).  
421 This amino acid is not synthesized by fish, but it can be easily incorporated in the food  
422 chain as some marine seaweed such as *Ulva* or *Enteromorpha* contain large amounts  
423 (Ito, 1963). Likewise, tauropine is an anaerobic end product found in several marine  
424 invertebrate phyla, but widely prevalent in marine molluscs (Venter et al., 2016). The  
425 same for TMAO, a compound found in animals, plants and fungi, but the concentration  
426 of TMAO in marine animals significantly exceeds that of other organisms (Yancey,  
427 2005). Likewise, arsenobetaine is the arsenic analogue of the quaternary ammonium  
428 compound glycine betaine, and marine animals contain very high levels of this  
429 compound, non-toxic for human or animals (Molin et al., 2015; Stiboller et al., 2015).  
430 Its relative contribution of trophic transfer and biotransformation of arsenic derivatives  
431 in the arsenobetaine content in fish is still under debate (Caumette et al., 2012;  
432 Popowich et al., 2016), although from our results it was evident the direct relation  
433 between dietary FM and circulating arsenobetaine levels.

434 Another exogenous compound with a high discriminant value in our  
435 experimental model was hercynine. This is an intermediate compound in the synthesis  
436 of ergothioneine, a natural antioxidant that is only synthesized by non-yeast fungi,  
437 cyanobacteria and actinobacteria (Fahey, 2001; Pfeiffer et al., 2011). Therefore, its  
438 detectable presence in the serum of fish is indicative of feeding plant ingredients,  
439 although its circulating concentration did not parallel the replacement level, being the  
440 circulating concentration (arbitrary units) in D2 fish ( $737 \pm 74\%$ ) too much higher than  
441 that of D3/4 ( $182 \pm 15\%$ ) fish. However, when these values were plotted against the  
442 relative concentration of hercynine in the diet, a close linear association was found for  
443 this compound (Fig. 2). Therefore, with the advent of new formulations, hercynine is  
444 coming as good biomarker of raw material traceability, but also of proper feed storage  
445 and processing of plant-based diets with no fungi/mycobacteria growth.

446  
447

448 3.4. Targeted vitamin analysis

449

450 Vitamins are essential micronutrients that are normally found as precursors of  
451 various enzyme reactions in all living cells. However, most of them cannot be  
452 synthesized by animals and they need to be obtained exogenously by means of diet  
453 fortification, although the use of vitamin-producing microorganisms represents a more  
454 natural and consumer-friendly alternative (Le Blanc et. al., 2013). In humans, it has  
455 been shown that members of the gut microbiota are able to synthesize vitamin K as well  
456 as most of the water-soluble B vitamins, such as biotin, cobalamin, folates, nicotinic  
457 acid, pantothenic acid, pyridoxine, riboflavin and thiamine (Hill, 1997). Unlike dietary  
458 vitamins, the predominant uptake of the microbially-produced vitamins occurs in the  
459 colon (Said and Mohammed, 2016). A similar specialization seems to exist along the  
460 digestive tract of fish, as evidenced the microarray gene expression profiling of several  
461 genes related to vitamin B<sub>12</sub> through the intestine of European sea bass (Calduch-Giner  
462 et al., 2016). Experimental evidence also indicates that replacement of FM by plant  
463 ingredients drives many changes in the micronutrient diet composition, with an  
464 important decrease in the content of some vitamins (NRC, 2011). In our experimental  
465 model, most of the theoretically mineral and vitamin requirements are met in excess by  
466 the diet (Table 1), but to assess the proper levels of circulating vitamins and vitamin-  
467 related compounds, a retrospective (targeted) analysis was conducted by means of the  
468 MS<sup>E</sup> acquisition mode. This approach served to check deficiencies in specific  
469 compounds that could have been masked by the astringent Benjamini-Hochberg  
470 multiple testing correction in the untargeted approach. Hence, as shown in Table 4, the  
471 relative concentration of riboflavin (vitamin B<sub>2</sub>) and pantothenic acid (vitamin B<sub>5</sub>) were  
472 progressively and significantly increased with the replacement of marine sources by  
473 plant ingredients in D3/4 fish. Conversely, methylmalonic acid (MMA), used as a  
474 biomarker of vitamin B<sub>12</sub> deficiency in humans and rodents (Watanabe et al., 1991;  
475 Carmel, 2011), increased progressively and significantly with the replacement FM/FO  
476 by plant ingredients in fish fed D2 and D3/4 diets. The replacement of FM by plant  
477 proteins also decreased the concentration of vitamin B<sub>12</sub> in muscle and liver tissues of  
478 Atlantic cod (Hansen et al., 2007), being now well recognized the risk of vitamin B<sub>12</sub>  
479 deficiency in vegetarian humans (Stabler and Allen, 2004; Allen, 2009). Our targeted  
480 approach did not detect additional changes in vitamin condition, although vitamin B<sub>7</sub> is  
481 markedly reduced by short-term fasting in gilthead sea bream (Gil-Solsona et al., 2017).

482 All this reinforces the importance to define the core microbiota for a given feeding  
483 regime and nutritional status, but studies in livestock animal and fish in particular are  
484 still in an infancy state to fully understand the complexity of host and gut microbiota  
485 interactions.

486

487



#### 488 **4. Conclusions**

489 UHPLC-HRMS approach allowed us to identify a high number of *m/z* ions in the  
490 serum of farmed gilthead sea bream. This was the result of combined targeted and  
491 untargeted approaches, which identified a wide-range of endogenous and exogenous  
492 compounds with a high discriminant capacity as summarized in Fig. 3. Multivariate  
493 analyses highlighted a clear separation of fish fed the control and plant-based diets, and  
494 the distribution through X-axis and Y-axis evidenced the different effects related to FM  
495 or FO replacement by plant proteins and oils. Most of the changes reflected the different  
496 FA composition of dietary oils in fish growing at high rates without apparent signs of  
497 FA deficiencies. However, N-acyl taurines emerged as target compounds to alleviate  
498 some of the negative health effects of plant-based diets. Other metabolite changes  
499 (cytidine and nucleoside compounds) highlighted different nutritionally-mediated  
500 effects on DNA stability and perhaps methylation levels. Targeted vitamin analysis  
501 corroborated the risk of low levels of vitamin B<sub>12</sub> in fish fed plant-based diets, whereas  
502 other dietary or microbially-produced vitamins were not affected or increased (B<sub>2</sub>, B<sub>5</sub>).  
503 Lastly, the detection of different exogenous compounds served to trace the use of  
504 different raw materials in fish feeds, but also to eventually assess their proper  
505 processing and storage.

506

#### 507 **Disclosures**

508

509 No conflicts of interest, financial or otherwise, are declared by the authors.

510

#### 511 **Author contributions**

512

513 J.V.S, F.H. and J.P.S conceived and designed the experiments. R.G.S, J.C.G.,  
514 J.N.M., L.L.B. and J.P.S. performed the experiments. All authors have contributed to  
515 analysis of data and the final writing of the paper. All authors have read and approved  
516 the final manuscript.

517

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519

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527 **References**

- 528 Alfaro, A.C., Young, T., 2018. Showcasing metabolomics research in aquaculture: a  
529 review. *Reviews in Aquaculture* 10, 135-152.
- 530 Allen, L.H., 2009. How common is vitamin B12 deficiency? *Am. J. Clin. Nutr.* 89,  
531 S693-S696.
- 532 Ballester-Lozano, G.F., Benedito-Palos, L., Estensoro, I., Sitjà-Bobadilla, A., Kaushik,  
533 S., Pérez-Sánchez J. 2015. Comprehensive biometric, biochemical and  
534 histopathological assessment of nutrient deficiencies in gilthead sea bream fed  
535 semi-purified diets. *British Journal of Nutrition* 114, 713-726.
- 536 Ballester-Lozano, G.F., Benedito-Palos, L., Mingarro, M., Navarro, J.C., Pérez-  
537 Sánchez, J., 2016. Up-scaling validation of a dummy regression approach for  
538 predictive modelling the fillet fatty acid composition of cultured European sea  
539 bass (*Dicentrarchus labrax*). *Aquaculture Research* 47, 1067-1074.
- 540 Ballester-Lozano, G.F., Benedito-Palos, L., Riaza, A., Navarro, J.C., Rosel, J., Pérez-  
541 Sánchez, J., 2014. Dummy regression analysis for modelling the nutritionally  
542 tailored fillet fatty acid composition of turbot and sole using gilthead sea bream as  
543 a reference subgroup category. *Aquaculture Nutrition* 20, 421-430.
- 544 Bell, J.G., Dick, J.R., Strachan, F., Guy, D.R., Berntssen, M.H.G., Sprague, M., 2012.  
545 Complete replacement of fish oil with a blend of vegetable oils affects dioxin,  
546 dioxin-like polychlorinated biphenyls (PCBs) and polybrominated diphenyl ethers  
547 (PBDEs) in 3 Atlantic salmon (*Salmo salar*) families differing in flesh adiposity.  
548 *Aquaculture* 324-325, 118-126.
- 549 Benedito-Palos, L., Ballester-Lozano, G.F., Simó, P., Karalazos, V., Ortiz, A., Calduch-  
550 Giner, J.A., Pérez-Sánchez, J., 2016. Lasting effects of butyrate and low FM/FO  
551 diets on growth performance, blood haematology/biochemistry and molecular  
552 growth-related markers in gilthead sea bream (*Sparus aurata*). *Aquaculture* 454,  
553 8-18.
- 554 Benedito-Palos, L., Calduch-Giner, J.A., Ballester-Lozano, G.F., Pérez-Sánchez, J.,  
555 2013. Effect of ration size on fillet fatty acid composition, phospholipid allostasis  
556 and mRNA expression patterns of lipid regulatory genes in gilthead sea bream  
557 (*Sparus aurata*). *British Journal of Nutrition* 109, 1175-1187.
- 558 Benedito-Palos, L., Navarro, J.C., Bermejo-Nogales, A., Saera-Vila, A., Kaushik, S.,  
559 Pérez-Sánchez, J., 2009. The time course of fish oil wash-out follows a simple  
560 dilution model in gilthead sea bream (*Sparus aurata* L.) fed graded levels of  
561 vegetable oils. *Aquaculture* 288, 98-105.
- 562 Benedito-Palos, L., Navarro, J.C., Kaushik, S., Pérez-Sánchez, J., 2010. Tissue-specific  
563 robustness of fatty acid signatures in cultured gilthead sea bream (*Sparus aurata*  
564 L.) fed practical diets with a combined high replacement of fish meal and fish oil.  
565 *Journal of Animal Science* 88, 1759-1770.
- 566 Benjamini, Y., Hochberg, Y., 1995. Controlling the false discovery rate: a practical and  
567 powerful approach to multiple testing. *Journal of the Royal Statistical Society,*  
568 *Series B* 57, 289-300.
- 569 Berntssen, M.H.G., Julshamn, K., Lundebye, A.K., 2010. Chemical contaminants in  
570 aquafeeds and Atlantic salmon (*Salmo salar*) following the use of traditional-  
571 versus alternative feed ingredients. *Chemosphere* 78, 637-646.

- 572 Berntssen, M.H.G., Lundebye, A.K., Torstensen, B.E., 2005. Reducing the levels of  
573 dioxins and dioxin-like PCBs in farmed Atlantic salmon by substitution of fish oil  
574 with vegetable oil in the feed. *Aquaculture Nutrition* 11, 219-231.
- 575 Calduch-Giner, J.A., Sitjà-Bobadilla, A., Davey, G.C., Cairns, M.T., Kaushik, S., Pérez-  
576 Sánchez, J., 2012. Dietary vegetable oils do not alter the intestine transcriptome of  
577 gilthead sea bream (*Sparus aurata*), but modulate the transcriptomic response to  
578 infection with *Enteromyxum leei*. *BMC Genomics* 13, 13.
- 579 Calduch-Giner, J.A., Sitjà-Bobadilla, A., Pérez-Sánchez, J., 2016. Gene expression  
580 profiling reveals functional specialization along the intestinal tract of a  
581 carnivorous teleostean fish (*Dicentrarchus labrax*). *Frontiers in Physiology* 7,  
582 359.
- 583 Carmel, R., 2011. Biomarkers of cobalamin (vitamin B-12) status in the epidemiologic  
584 setting: a critical overview of context, applications, and performance  
585 characteristics of cobalamin, methylmalonic acid, and holotranscobalamin II. *Am.*  
586 *J. Clin. Nutr.* 94, 348S-358S..
- 587 Castro-Puyana, M., Herrero, M., 2013. Metabolomics approaches based on mass  
588 spectrometry for food safety, quality and traceability, *Trends in Analytical*  
589 *Chemistry* 52, 74-87.
- 590 Caumette, G., Koch, I., Reimer, K.J., 2012. Arsenobetaine formation in plankton: a  
591 review of studies at the base of the aquatic food chain. *J. Environ. Monitor.* 14,  
592 2841-2853.
- 593 Chaoui, L., Kara, M.H., Faure, E., Quignard, J.P., 2006. Growth and reproduction of the  
594 gilthead seabream *Sparus aurata* in Mellah lagoon (north-eastern Algeria).  
595 *Scientia Marina* 70, 545-552.
- 596 Cohen, J.D., Strock, D.J., Teik, J.E., Katz, T.B., Marcel, P.D., 1997. Deoxycytidine in  
597 human plasma: Potential for protecting leukemic cells during chemotherapy.  
598 *Cancer Lett.* 116, 167-175.
- 599 Cruz-García, L., Saera-Vila, A., Navarro, I., Calduch-Giner, J., Pérez-Sánchez, J., 2009.  
600 Targets for the TNF alpha-induced lipolysis in gilthead sea bream (*Sparus aurata*  
601 L.) adipocytes isolated from lean and fat juveniles fish. *J. Exp. Biol.* 212, 2254-  
602 2260.
- 603 Estensoro, I., Ballester-Lozano, G.F., Benedito-Palos, L., Grammes, F., Martos-Sitcha,  
604 J.A., Mydland, L.-T., Calduch-Giner, J.A., Fuentes, J., Karalazos, V., Ortiz, A.,  
605 Øverland, M., Sitjà-Bobadilla, A., Pérez-Sánchez, J., 2016. Dietary butyrate helps  
606 to restore the intestinal status of a marine teleost (*Sparus aurata*) fed extreme diets  
607 low in fish meal and fish oil. *PLoS ONE* 11, e0166564.
- 608 Estensoro, I., Benedito-Palos, L., Palenzuela, O., Kaushik, S., Sitjà-Bobadilla, A.,  
609 Pérez-Sánchez, J., 2011. The nutritional background of the host alters the disease  
610 outcome in a fish-myxosporean system. *Veterinary Parasitology* 175, 141-150.
- 611 Fahey, R.C., 2001. Novel thiols of prokaryotes. *Annu. Rev. Microbiol.* 51, 333-356.
- 612 Ganga, R., Bell, J.G., Montero, D., Atalah, E., Vraskou, Y., Tort, L., Fernández, A.,  
613 Izquierdo, M.S., 2011. Adrenocorticotrophic hormone-stimulated cortisol release  
614 by the head kidney inter-renal tissue from sea bream (*Sparus aurata*) fed with  
615 linseed oil and soybean oil. *British Journal of Nutrition* 105, 238-247.

- 616 Gault, C.R., Obeid, L.M., 2011. Still benched on its way to the bedside: sphingosine  
617 kinase 1 as an emerging target in cancer chemotherapy. *Critical Reviews in*  
618 *Biochemistry and Molecular Biology* 46, 342-351.
- 619 Geisel, J., Schorr, H., Bodis, M., Isber, S., Hübner, U., Knapp, J.P., Obeid, R.,  
620 Herrmann, W., 2005. The vegetarian lifestyle and DNA methylation. *Clin. Chem.*  
621 *Lab. Med.* 43, 1164-1169.
- 622 Gil-Solsona, R., Nacher-Mestre, J., Lacalle-Bergeron, L., Sancho, J.V., Calduch-Giner,  
623 J.A., Hernández, F., Pérez-Sánchez, J., 2017. Untargeted metabolomics approach  
624 for unraveling robust biomarkers of nutritional status in fasted gilthead sea bream  
625 (*Sparus aurata*). *PeerJ* 5, e2920.
- 626 Gómez-Requeni, P., Mingarro, M., Calduch-Giner, J., Medale, F., Martín, S.A.M.,  
627 Houlihan, D.F., Kaushik, S., Pérez-Sánchez, J., 2004. Protein growth  
628 performance, amino acid utilisation and somatotropic axis responsiveness to fish  
629 meal replacement by plant protein sources in gilthead sea bream (*Sparus aurata*).  
630 *Aquaculture* 232, 493-510.
- 631 Goto, T., Ui, T., Une, M., Kuramoto, T., Kihira, K., Hoshita, T., 1996. Bile salt  
632 composition and distribution of the D-cysteinolic acid conjugated bile salts in fish.  
633 *Fish. Sci.* 62, 606-609.
- 634 Grigorakis, K., Dimitra, K., Corraze, G., Pérez-Sánchez, J., Adorjan, A., Zsuzsanna,  
635 J.S., 2018. Impact of diets containing plant raw materials as fish meal and fish oil  
636 replacement on rainbow trout (*Oncorhynchus mykiss*), gilthead sea bream (*Sparus*  
637 *aurata*), and common carp (*Cyprinus carpio*) freshness. *Journal of Food Quality*  
638 2018, 1717465.
- 639 Hadj-Taieb, A., Ghorbel, M., Hadj-Hamida, N.B., Jarboui O. Sex ratio, reproduction,  
640 and growth of the gilthead sea bream, *Sparus aurata* (Pisces: Sparidae), in the  
641 Gulf of Gabes, Tunisia. *Ciencias Marinas* 39, 101-112.
- 642 Hannun, Y.A., Obeid, L.M., 2018. Sphingolipids and their metabolism in physiology  
643 and disease. *Nature Reviews Molecular Cell Biology* 19, 175-191.
- 644 Hansen, A.C., Rosenlund, G., Karlsen, Ø., Koppe, W., Hemre, G.I., 2007. Total  
645 replacement of fish meal with plant proteins in diets for Atlantic cod (*Gadus*  
646 *morhua* L.). I. Effects on growth and protein retention. *Aquaculture* 272, 599-611.
- 647 Hill, M.J., 1997. Intestinal flora and endogenous vitamin synthesis. *Eur. J. Cancer Prev.*  
648 6 (Suppl 1), S43-S45.
- 649 Holstege, A., Manglitz, D., Gerok, W., 1984. Depletion of blood plasma cytidine due to  
650 increased hepatocellular salvage in d-galactosamine-treated rats. *Eur. J. Biochem.*  
651 141, 339-344.
- 652 Hunt, M.C., Siponen, M.I., Alexson, S.E.H., 2012. The emerging role of acyl-CoA  
653 thioesterases and acyltransferases in regulating peroxisomal lipid metabolism.  
654 *Biochimica et Biophysica Acta* 1822, 1397-1410.
- 655 Ito, K., 1963. Distribution of d-cysteinolic acid in marine algae. *Bull. Jap. Soc. Scient.*  
656 *Fish* 29, 771-775.
- 657 Izquierdo, M.S., Montero, D., Robaina, L., Caballero, R., Rosenlund, G., Ginés, R.,  
658 2005. Alterations in fillet fatty acid profile and flesh quality in gilthead seabream  
659 (*Sparus aurata*) fed vegetable oils for a long term period. *Recovery of fatty acid*

- 660 profiles by fish oil feeding. *Aquaculture* 250, 431-444.
- 661 Kałużna-Czaplińska, J., Józwiak, J., Żurawicz, E., 2014. Analytical methods used in  
662 autism spectrum disorders. *Trends in Analytical Chemistry* 62, 20-27.
- 663 Karl, J.P., Fu, X., Dolnikowski, G.G., Saltzman, E., Booth, S.L., 2014. Quantification of  
664 phylloquinone and menaquinones in feces, serum, and food by high-performance  
665 liquid chromatography-mass spectrometry. *Journal of Chromatography B* 963,  
666 128-133.
- 667 Khonde, P.L., Jardine, A., 2015. Improved synthesis of the super antioxidant,  
668 ergothioneine, and its biosynthetic pathway intermediates. *Organic &  
669 Biomolecular Chemistry* 13, 1415-1419.
- 670 Kieffer, D.A., Piccolo, B.D., Vaziri, N.D., Liu, S., Lau, W.L., Khazaeli, M.,  
671 Nazertehrani, S., Moore, M.E., Marco, M.L., Martin, R.J., Adams, S.H., 2016.  
672 Resistant starch alters gut microbiome and metabolomic profiles concurrent with  
673 amelioration of chronic kidney disease in rats. *Am. J. Physiol. Renal. Physiol.*  
674 310, F857-F871.
- 675 Laidlaw, M., Holub, B.J., 2003. Effects of supplementation with fish oil-derived n-3  
676 fatty acids and gamma-linolenic acid on circulating plasma lipids and fatty acid  
677 profiles in women. *Am. J. Clin. Nutr.* 77, 37-42.
- 678 LeBlanc, J.G., Milani, C., de Giori, G.S., Sesma, F., van Sinderen, D., Ventura, M.,  
679 2013. Bacteria as vitamin suppliers to their host: A gut microbiota perspective.  
680 *Curr. Opin. Biotechnol.* 24, 160-168.
- 681 Lebold, K.M., Ang, A., Traber, M.G., Arab, L., 2012. Urinary  $\alpha$ -carboxyethyl  
682 hydroxychroman can be used as a predictor of  $\alpha$ -tocopherol adequacy, as  
683 demonstrated in the Energetics Study. *The American Journal of Clinical Nutrition*  
684 96, 801-809.
- 685 Lemaitre, R.N., King, I.B., Mozaffarian, D., Kuller, L.H., Tracy, R.P., Siscovick, D.S.,  
686 2003. n-3 Polyunsaturated fatty acids, fatal ischemic heart disease, and nonfatal  
687 myocardial infarction in older adults: the Cardiovascular Health Study. *Am. J.  
688 Clin. Nutr.* 77, 319-325.
- 689 Lewerin, C., Nilsson-Ehle, H., Matousek, M., Lindstedt, G., Steen, B., 2003. Reduction  
690 of plasma homocysteine and serum methylmalonate concentrations in apparently  
691 healthy elderly subjects after treatment with folic acid, vitamin B<sub>12</sub> and vitamin  
692 B<sub>6</sub>: a randomised trial. *European Journal of Clinical Nutrition* 57, 1426-1436.
- 693 Li, H., Ma, M.L., Luo, S., Zhang, R.M., Han, P., Hu, W., 2012. Metabolic responses to  
694 ethanol in *Saccharomyces cerevisiae* using a gas chromatography tandem mass  
695 spectrometry-based metabolomics approach. *Int. J. Biochem. Cell. Biol.* 44, 1087-  
696 1096.
- 697 Liland, N.S., Rosenlund, G., Berntssen, M.H.G., Brattelid, T., Madsen, L., Torstensen,  
698 B.E., 2013. Net production of atlantic salmon (FIFO, fish in fish out < 1) with  
699 dietary plant proteins and vegetable oils. *Aquaculture Nutrition* 19, 289-300.
- 700 Martos-Sitcha, J.A., Simó-Mirabet, P., Piazzon, M.C., de las Heras, V., Calduch-Giner,  
701 J.A., Puyalto, M., Tinsley, J., Makol, A., Sitjà-Bobadilla, A., Pérez Sánchez, J.,  
702 2018. Dietary sodium heptanoate helps to improve feed efficiency, growth  
703 hormone status and swimming performance in gilthead sea bream (*Sparus  
704 aurata*). *Aquaculture Nutrition* (in press).

- 705 Melis, R., Sanna, R., Braca, A., Bonaglini, E., Cappuccinelli, R., Slawski, H., Roggio,  
706 T., Uzzau, S., Anedda, R., 2017. Molecular details on gilthead sea bream (*Sparus*  
707 *aurata*) sensitivity to low water temperatures from <sup>1</sup>H NMR metabolomics.  
708 *Comparative Biochemistry & Physiology Part A Molecular & Integrative*  
709 *Physiology* 204, 129-136.
- 710 Molin, M., Ulven, S.M., Meltzer, H.M., Alexander, J., 2015. Arsenic in the human food  
711 chain, biotransformation and toxicology - review focusing on seafood arsenic. *J.*  
712 *Trace Elem. Med. Biol.* 31, 249-259.
- 713 Montero, D., Izquierdo, M.S., 2010. Welfare and health of fish fed vegetable oils as  
714 alternative lipid sources to fish oil, in: Turchini, G., Ng, W., Tocher, D. (Eds),  
715 *Fish oil replacement and alternative lipid sources in aquaculture feeds.* CRC  
716 Press, Cambridge, pp. 439-485.
- 717 Náchter-Mestre, J., Ibáñez, M., Serrano, R., Boix, C., Bijlsma, L., Lunestad, B.T.,  
718 Hannisdal, R., Alm, M., Hernández, F., Berntssen, M.H.G., 2016. Investigation of  
719 pharmaceuticals in processed animal by-products by liquid chromatography  
720 coupled to high-resolution mass spectrometry. *Chemosphere* 154, 231-239.
- 721 Náchter-Mestre, J., Serrano, R., Beltrán, E., Pérez-Sánchez, J., Silva, J., Karalazos, V.,  
722 Hernández, F., Berntssen, M.H.G., 2015. Occurrence and transfer of mycotoxins  
723 in gilthead sea bream and Atlantic salmon by use of novel alternative feed  
724 ingredients. *Chemosphere* 128, 314-320.
- 725 Náchter-Mestre, J., Serrano, R., Benedito-Palos, L., Navarro, J.C., López, F.J., Pérez-  
726 Sánchez, J., 2009. Effects of fish oil replacement and re-feeding on the  
727 bioaccumulation of organochlorine compounds in gilthead sea bream (*Sparus*  
728 *aurata* L.) of market size. *Chemosphere* 76, 811-817.
- 729 NRC, National Research Council, 2011. *Nutrient Requirement of Fish and Shellfish,*  
730 National Academy Press, Washington.
- 731 Pérez-Sánchez, J., Benedito-Palos, L., Ballester-Lozano, G.F., 2013a. Dietary lipid  
732 sources as a means of changing fatty acid composition in fish: implications for  
733 food fortification, in: Preedy, V.R., Srirajaskanthan, R., Patel, V.B. (Eds),  
734 *Handbook of food fortification and health, from concepts to public health*  
735 *applications, volume 2.* Humana Press, New York, pp. 41 – 54.
- 736 Pérez-Sánchez, J., Borrel, M., Bermejo-Nogales, A., Benedito-Palos, L., Saera-Vila, A.,  
737 Calduch-Giner, J.A., Kaushik, S., 2013b. Dietary oils mediate cortisol kinetics  
738 and the hepatic expression profile of stress responsive genes in juveniles of  
739 gilthead sea bream (*Sparus aurata*) exposed to crowding stress. *Comparative*  
740 *Biochemistry and Physiology D* 8, 123-130.
- 741 Pérez-Sánchez, J., Estensoro, I., Redondo, M.J., Calduch-Giner, J.A., Kaushik, S., Sitjà-  
742 Bobadilla, A., 2013c. Mucins as diagnostic and prognostic biomarkers in a fish-  
743 parasite model: transcriptional and functional analysis. *PLOS One* 8, e65457.
- 744 Pérez-Sánchez, J., Terova, G., Simó-Mirabet, P., Rimoldi, S., Folkedal, O., Calduch-  
745 Giner, J.A., Olsen, R.E., Sitjà-Bobadilla, A., 2017. Skin mucus of gilthead sea  
746 bream (*Sparus aurata* L.). Protein mapping and regulation in chronically stressed  
747 fish. *Frontiers in Physiology* 8, 34.
- 748 Pfeiffer, C., Bauer, T., Surek, B., Schomig, E., Grundemann, D., 2011. Cyanobacteria  
749 produce high levels of ergothioneine. *Food Chem.* 129, 1766-1769.

- 750 Piazzon, M.C., Calduch-Giner, J.A., Fouz, B., Estensoro, I., Simó-Mirabet, P., Puyalto,  
751 M., Karalazos, V., Palenzuela, O., Sitjà-Bobadilla, A., Pérez-Sánchez, J., 2017.  
752 Under control: how a dietary additive can restore the gut microbiome and  
753 proteomic profile, and improve disease resilience in a marine teleostean fish fed  
754 vegetable diets. *Microbiome* 5, 164.
- 755 Piazzon, C., Galindo-Villegas, J., Pereiro, P., Estensoro, I., Calduch-Giner, J.A.,  
756 Gómez-Casado, E., Novoa, B., Mulero, V., Sitjà-Bobadilla, A., Pérez-Sánchez, J.,  
757 2016. Differential modulation of IgT and IgM upon parasitic, bacterial, viral and  
758 dietary challenges in a perciform fish. *Frontiers in Immunology* 7, 637.
- 759 Popowich, A., Zhang, Q., Le, X.C., 2016. Arsenobetaine: the ongoing mystery. *Nat.*  
760 *Sci. Rev.* 3, 451-458.
- 761 Portolés, T, Ibáñez, M, Garlito, B, Nácher-Mestre, J., Karalazos, V., Silva, J., Serrano,  
762 R., Pérez-Sánchez, J., Hernández, F., Berntssen, M.H.G., 2017. Comprehensive  
763 strategy for pesticide residue analysis through the production cycle of gilthead sea  
764 bream and Atlantic salmon. *Chemosphere* 179, 242-253.
- 765 Raux, E., Schubert, H.L., Warren, M.J., 2000. Biosynthesis of cobalamin (vitamin B<sub>12</sub>):  
766 A bacterial conundrum. *Cell. Mol. Life Sci.* 57, 1880-1893.
- 767 Rimoldi, S., Finzi, G., Ceccotti, C., Girardello, R., Grimaldi, A., Ascione, C., Terova,  
768 G., 2016. Butyrate and taurine exert a mitigating effect on the inflamed distal  
769 intestine of European sea bass fed with a high percentage of soybean meal, *Fish.*  
770 *Aquat. Sci.* 19, 40.
- 771 Robles, R., Lozano, A.B., Sevilla, A., Marquez, L., Nuez-Ortín, W., Moyano, F.J.,  
772 2013. Effect of partially protected butyrate used as feed additive on growth and  
773 intestinal metabolism in sea bream (*Sparus aurata*). *Fish Physiology and*  
774 *Biochemistry* 39, 1567-1580.
- 775 Said, H.M., Mohammed, Z.M., 2006. Intestinal absorption of water-soluble vitamins: an  
776 update. *Curr. Opin. Gastroenterol.* 22, 140-146.
- 777 Salze, G.P., Davis, D.A., 2015. Taurine: a critical nutrient for future fish feeds.  
778 *Aquaculture* 437, 215-229.
- 779 Sasso, O., Pontis, S., Armirotti, A., Cardinali, G., Kovacs, D., Migliore, M., Summa,  
780 M., Moreno-Sanz, G., Picardo, M., Piomelli, D., 2016. Endogenous N-acyl  
781 taurines regulate skin wound healing, *Proc. Natl. Acad. Sci. U. S. A.* 113, E4397-  
782 E4406.
- 783 Simó-Mirabet, P., Felip Edo, A., Estensoro, I., Martos-Sitcha, J.A., De las Heras, V.,  
784 Calduch-Giner, J., Puyalto, M., Karalazos, V., Sitjà-Bobadilla, A., Pérez-Sánchez,  
785 J. 2018. Impact of low fish meal and fish oil diets on the performance, sex steroid  
786 profile and male-female sex reversal of gilthead sea bream (*Sparus aurata*) over a  
787 three-year production cycle. *Aquaculture* 490, 64-74.
- 788 Simó-Mirabet, P., Piazzon, M.C., Calduch-Giner, J.A., Ortíz, A., Puyalto, M., Sitjà-  
789 Bobadilla, A., Pérez-Sánchez, J., 2017. Sodium salt medium-chain fatty acids and  
790 *Bacillus*-based probiotics strategies to improve growth and intestinal health of  
791 gilthead sea bream (*Sparus aurata*). *PeerJ* 5, e4001.
- 792 Stabler, S.P., Allen R.H., 2004. Vitamin B12 deficiency as a world-wide problem.  
793 *Annu. Rev. Nutr.* 24, 299-326.



- 794 Stiboller, M., Raber, G., Francesconi, K.A., 2015. Simultaneous determination of  
795 glycine betaine and arsenobetaine in biological samples by HPLC/ICPMS/ESMS  
796 and the application to some marine and freshwater fish samples. *Microchem. J.*  
797 122, 172-175.
- 798 Tacon, A.G.J., Metian, M., 2008. Global overview on the use of fish meal and fish oil in  
799 industrially compounded aquafeeds: Trends and future prospects. *Aquaculture*  
800 285, 146-158.
- 801 Tai, S.S.-C., Bedner, M., Phinney, K.W., 2010. Development of a candidate reference  
802 measurement procedure for the determination of 25-hydroxyvitamin D<sub>3</sub> and 25-  
803 hydroxyvitamin D<sub>2</sub> in human serum using isotope-dilution liquid  
804 chromatography–tandem mass spectrometry. *Analytical Chemistry* 82, 1942-  
805 1948.
- 806 Tocher, D.R., 2015. Omega-3 long-chain polyunsaturated fatty acids and aquaculture in  
807 perspective. *Aquaculture* 449, 94-107. Turchini, G.M., Hermon, K.M., Francis,  
808 D.S., 2018. Fatty acids and beyond: Fillet nutritional characterisation of rainbow  
809 trout (*Oncorhynchus mykiss*) fed different dietary oil sources. *Aquaculture* 491,  
810 391-397.
- 811 Une, M., Goto, T., Kihira, K., Kuramoto, T., Hagiwara, K., Nakajima, T., Hoshita, T.,  
812 1991. Isolation and identification of bile salts conjugated with cysteinolic acid  
813 from bile of the red seabream, *Pagrosomus major*. *J. Lipid Res.* 32, 1619-1623.
- 814 Venter, L., Jansen van Rensburg, P., Loots, D.T., Vosloo, A., Lindeque, J.Z., 2016.  
815 Untargeted metabolite profiling of abalone using gas chromatography mass  
816 spectrometry. *Food Anal. Methods* 9, 1254-1261.
- 817 Watanabe, F., Nakano, Y., Tachikake, N., Saido, H., Tamura, Y., Yamanaka, H., 1991.  
818 Vitamin B-12 deficiency increases the specific activities of rat liver NADH- and  
819 NADPH-linked aquacobalamin reductase isozymes involved in coenzyme  
820 synthesis. *J. Nutr.* 121, 1948-1954.
- 821 Wiklund, S., Johansson, E., Sjöström, L., Mellerowicz, E.J., Edlund, U., Shockcor, J.P.,  
822 Gottfries, J., Moritz, T., Trygg J., 2008. Visualization of GC/TOF-MS-based  
823 metabolomics data for identification of biochemically interesting compounds  
824 using OPLS class models. *Analytical Chemistry* 80, 115-122.
- 825 Wishart, D.S., Jewison, T., Guo, A.C., Wilson, M., Knox, C., Liu, Y., Djoumbou, Y.,  
826 Mandal, R., Aziat, F., Dong, E., Bouatra, S., Sinelnikov, I., Arndt, D., Xia, J., Liu,  
827 P., Yallou, F., Bjorndahl, T., Perez-Pineiro, R., Eisner, R., Allen, F., Neveu, V.,  
828 Greiner, R., Scalbert, A., 2013 HMDB 3.0--The Human Metabolome Database in  
829 2013. *Nucleic Acids Res.* 41, D801-D807.
- 830 Wold, S., Sjöström, M., Eriksson, L., 2001. PLS-regression: a basic tool of  
831 chemometrics. *Chemometrics Intelligent Lab. Syst.* 58, 109–130. Yancey, P.H.,  
832 2005. Organic osmolytes as compatible, metabolic and counteracting  
833 cytoprotectants in high osmolarity and other stresses. *J. Exp. Biol.* 208, 2819-  
834 2830.

835 **Figure captions**

836

837 **Fig. 1.** PLS-DA score plot of acquired data of D1 group individuals (black), D2 (red)  
838 and D3/4 (green for D3, blue for D4). Insert is a screen plot of the principal component  
839 analysis, showing eigenvalues (blue bars) and cumulative variability explained (orange  
840 points) against the number of the principal component.

841

842 **Fig. 2.** Correlation plot of hercynine integrated area in feeds (X-axis) and individual  
843 serum samples (Y-axis).

844

845 **Fig. 3.** Integrative profile of differential compounds between D2 and D3/4 compared to  
846 control D1 group. Bars show for each dietary group and biological process the number  
847 of significantly different ( $P < 0.5$ , ANOVA followed by Benjamini-Hochberg multiple  
848 testing correction) abundant compounds. Colors in each bar indicate the level of change  
849 (as % of D1) as indicated in the inbox.

850 **Table 1.** Ingredients and chemical composition of experimental diets.

Ingredient (%)	Diet			
	D1	D2	D3	D4
Fish meal	23.0	3.0	3.0	3.0
Fish hydrolysate (CPSP)	2.0	2.0	2.0	2.0
Soya protein	16.0	25.0	25.0	25.0
Corn gluten	15.0	25.0	25.0	25.0
Wheat gluten	4.0	7.3	7.3	7.3
Rapeseed cake	12.0	9.7	9.9	9.9
Wheat	11.08	6.80	6.64	6.24
Fish oil	15.60	6.56	2.50	2.50
Rapeseed oil	0.0	4.4	6.5	6.5
Palm oil	0.0	4.4	6.5	6.5
Monocalcium phosphate	0.303	2.097	2.097	2.097
Histidine	0.136	0.136	0.136	0.136
Mineral Vitamin mix <sup>a</sup>	0.5	0.5	0.5	0.5
Cholesterol	0.113	0.113	0.113	0.113
Amino-acid and micronutrient mix <sup>b</sup>	0.20	2.92	2.74	2.74
Antioxidants	0.045	0.045	0.045	0.045
Yttrium	0.03	0.03	0.03	0.03
Butyrate (BP-70)	0.0	0.0	0.0	0.4
<i>Proximate composition</i>				
Dry matter (DM, %)	91.65	91.79	91.80	92.34
Crude protein (%DM)	45.48	46.73	46.12	46.03
Crude fat (% DM)	19.80	19.56	20.13	19.40
EPA + DHA (% DM)	2.90	1.38	0.67	0.63

851 <sup>a</sup> Supplied the following (g/kg mix, except as noted): calcium 689, sodium 108, iron 3,  
852 manganese 1, zinc 1, cobalt 2 mg, iodine 2 mg, selenium 20 mg, molybdenum 32 mg, retinyl  
853 acetate 1, DL-cholecalciferol 2.6, DL- $\alpha$  tocopheryl acetate 28, menadione sodium bisulphite 2,  
854 ascorbic acid 16, thiamin 0.6, riboflavin 1.7, pyridoxine 1.2, vitamin B<sub>12</sub> 50 mg, nicotinic acid 5,  
855 pantothenic acid 3.6, folic acid 0.6, and biotin 50 mg.

856 <sup>b</sup> Contains methionine, lysine, choline, and lecithin.

857 **Table 2.** Biometry of sampled gilthead sea bream fed experimental diets. Values are the  
 858 mean  $\pm$  SEM (n= 10).

	D1	D2	D3	D4	P-value (ANOVA)
Body weight (g)	611.95 $\pm$ 24.2	587.40 $\pm$ 25.8	580.8 $\pm$ 10.7	577.6 $\pm$ 21.0	0.679
Liver weight (g)	7.33 $\pm$ 0.33	7.42 $\pm$ 0.64	8.06 $\pm$ 0.38	7.38 $\pm$ 0.38	0.855
Mesenteric fat (g)	13.80 $\pm$ 2.18	11.89 $\pm$ 2.16	10.61 $\pm$ 1.41	10.38 $\pm$ 1.50	0.546
HSI (%) <sup>1</sup>	1.20 $\pm$ 0.05	1.27 $\pm$ 0.06	1.39 $\pm$ 0.06	1.28 $\pm$ 0.06	0.124
MSI (%) <sup>2</sup>	2.20 $\pm$ 0.31	2.19 $\pm$ 0.28	1.80 $\pm$ 0.20	1.79 $\pm$ 0.25	0.673

859 <sup>1</sup>Hepatosomatic index = (100 x liver weight) / fish weight.

860 <sup>2</sup>Mesenteric fat index = (100 x mesenteric fat) / fish weight.

861 **Table 3.** Highlighted compounds obtained from untargeted metabolomics. Values are the mean  $\pm$  SEM (n= 8-10).

Compound name	Biological process <sup>†</sup>	Chromatography/ionization mode	Formula	De/protonated molecule <i>m/z</i> (mDa)	RT (min)	D2, % CTRL	D3/4, %CTRL	Corrected P-value <sup>‡</sup>	VIP <sup>††</sup>	
1	PC(22:6/16:0)	1	RP(spec) / +	C <sub>46</sub> H <sub>80</sub> NPO <sub>8</sub>	806.5701 (+0.1)	18.86	68 $\pm$ 5 <sup>b</sup>	39 $\pm$ 7 <sup>c</sup>	1.63E <sup>-06</sup>	2.12
2	PC(22:6/18:0)	1	RP(spec) / +	C <sub>48</sub> H <sub>84</sub> NPO <sub>8</sub>	834.6010 (-0.3)	19.86	71 $\pm$ 13 <sup>b</sup>	49 $\pm$ 6 <sup>c</sup>	3.57E <sup>-06</sup>	1.48
3	PC(22:6/18:3)	1	RP(spec) / +	C <sub>48</sub> H <sub>78</sub> NPO <sub>8</sub>	828.5544 (+0.1)	17.65	94 $\pm$ 15 <sup>a</sup>	49 $\pm$ 4 <sup>b</sup>	1.54E <sup>-03</sup>	1.47
4	PC(22:6/20:4)	1	RP(spec) / +	C <sub>50</sub> H <sub>80</sub> NPO <sub>8</sub>	854.5700 (+0.1)	19.05	38 $\pm$ 3 <sup>b</sup>	16 $\pm$ 2 <sup>c</sup>	7.16E <sup>-10</sup>	1.90
5	PC(22:6/20:5)	1	RP(spec) / +	C <sub>50</sub> H <sub>78</sub> NPO <sub>8</sub>	852.5541 (-0.2)	17.54	58 $\pm$ 4 <sup>b</sup>	15 $\pm$ 2 <sup>c</sup>	1.91E <sup>-09</sup>	1.33
6	PC(20:5/14:0)	1	RP(spec) / +	C <sub>42</sub> H <sub>72</sub> NPO <sub>8</sub>	750.5079 (+0.5)	23.44	32 $\pm$ 4 <sup>b</sup>	13 $\pm$ 1 <sup>c</sup>	1.62E <sup>-15</sup>	2.03
7	PC(20:5/16:0)	1	RP(spec) / +	C <sub>44</sub> H <sub>78</sub> NPO <sub>8</sub>	780.5532 (-1.1)	18.45	82 $\pm$ 8 <sup>b</sup>	30 $\pm$ 5 <sup>c</sup>	4.31E <sup>-11</sup>	1.93
8	PC(20:5/16:1)	1	RP(spec) / +	C <sub>44</sub> H <sub>76</sub> NPO <sub>8</sub>	778.5385 (-0.2)	17.88	33 $\pm$ 3 <sup>b</sup>	15 $\pm$ 1 <sup>c</sup>	1.82E <sup>-15</sup>	1.86
9	PC(20:5/18:0)	1	RP(spec) / +	C <sub>46</sub> H <sub>82</sub> NPO <sub>8</sub>	808.5855 (-0.1)	19.5	64 $\pm$ 12 <sup>b</sup>	39 $\pm$ 1 <sup>c</sup>	8.38E <sup>-07</sup>	1.96
10	PC(20:5/18:1)	1	RP(spec) / +	C <sub>46</sub> H <sub>80</sub> NPO <sub>8</sub>	806.5700 (0.0)	18.56	107 $\pm$ 14 <sup>a</sup>	80 $\pm$ 6 <sup>b</sup>	6.59E <sup>-02</sup>	1.47
11	PC(20:5/18:2)	1	RP(spec) / +	C <sub>46</sub> H <sub>78</sub> NPO <sub>8</sub>	804.5541(-0.2)	17.88	51 $\pm$ 8 <sup>b</sup>	20 $\pm$ 2 <sup>c</sup>	4.98E <sup>-07</sup>	1.72
12	PC(20:5/18:3)	1	RP(spec) / +	C <sub>46</sub> H <sub>76</sub> NPO <sub>8</sub>	802.5277 (-1.0)	18.43	125 $\pm$ 18 <sup>b</sup>	63 $\pm$ 12 <sup>c</sup>	3.84E <sup>-02</sup>	1.38
13	PC(20:5/20:4)	1	RP(spec) / +	C <sub>48</sub> H <sub>76</sub> NPO <sub>8</sub>	826.5381 (-0.6)	17.25	92 $\pm$ 8 <sup>a</sup>	46 $\pm$ 6 <sup>b</sup>	4.98E <sup>-04</sup>	1.33
14	PC(20:5/20:5)	1	RP(spec) / +	C <sub>48</sub> H <sub>74</sub> NPO <sub>8</sub>	824.5220 (-1.0)	17.28	43 $\pm$ 4 <sup>b</sup>	9 $\pm$ 1 <sup>c</sup>	3.26E <sup>-08</sup>	1.66
15	PC(18:2/16:0)	1	RP(spec) / +	C <sub>42</sub> H <sub>80</sub> NPO <sub>8</sub>	758.5701 (+0.1)	19.23	410 $\pm$ 33 <sup>b</sup>	571 $\pm$ 74 <sup>c</sup>	3.07E <sup>-14</sup>	2.13
16	PC(18:2/18:0)	1	RP(spec) / +	C <sub>44</sub> H <sub>84</sub> NPO <sub>8</sub>	786.6008 (-0.5)	20.34	625 $\pm$ 94 <sup>b</sup>	1689 $\pm$ 270 <sup>c</sup>	1.31E <sup>-05</sup>	2.12
17	PC(18:2/18:2)	1	RP(spec) / +	C <sub>44</sub> H <sub>80</sub> NPO <sub>8</sub>	782.5711 (+1.1)	18.6	568 $\pm$ 68 <sup>b</sup>	1693 $\pm$ 271 <sup>c</sup>	3.16E <sup>-08</sup>	1.67
18	PC(18:1/16:0)	1	RP(spec) / +	C <sub>42</sub> H <sub>82</sub> NPO <sub>8</sub>	760.5859 (+0.3)	20.03	151 $\pm$ 20 <sup>b</sup>	193 $\pm$ 14 <sup>c</sup>	2.44E <sup>-03</sup>	1.31
19	PC(18:1/18:0)	1	RP(spec) / +	C <sub>44</sub> H <sub>86</sub> NPO <sub>8</sub>	788.6191 (+2.2)	21.22	204 $\pm$ 33 <sup>b</sup>	316 $\pm$ 35 <sup>c</sup>	6.10E <sup>-03</sup>	1.89

20	PC(18:1/18:1)	1	RP(spec) / +	C <sub>44</sub> H <sub>84</sub> NPO <sub>8</sub>	786.6012 (-0.1)	20.31	483 ± 68 <sup>b</sup>	761 ± 68 <sup>c</sup>	1.10E <sup>-06</sup>	2.12
21	PC(18:1/18:2)	1	RP(spec) / +	C <sub>44</sub> H <sub>82</sub> NPO <sub>8</sub>	784.5858 (+0.2)	19.37	766 ± 130 <sup>b</sup>	1581 ± 285 <sup>c</sup>	6.29E <sup>-09</sup>	2.12
22	PC(18:1/18:3)	1	RP(spec) / +	C <sub>44</sub> H <sub>80</sub> NPO <sub>8</sub>	782.5712 (+1.2)	18.6	488 ± 93 <sup>b</sup>	1419 ± 199 <sup>c</sup>	6.43E <sup>-08</sup>	1.67
23	PC(16:0/18:0)	1	RP(spec) / +	C <sub>42</sub> H <sub>84</sub> NPO <sub>8</sub>	762.6013 (0.0)	20.03	517 ± 36 <sup>b</sup>	1080 ± 119 <sup>c</sup>	1.74E <sup>-18</sup>	2.16
24	PC(16:0/18:3)	1	RP(spec) / +	C <sub>42</sub> H <sub>78</sub> NPO <sub>8</sub>	756.5545 (+0.2)	18.5	532 ± 85 <sup>b</sup>	1317 ± 105 <sup>c</sup>	3.84E <sup>-08</sup>	1.96
25	LysoPC(22:6)	1	RP(spec) / +	C <sub>30</sub> H <sub>50</sub> NPO <sub>7</sub>	568.3405 (+0.2)	9.81	77 ± 15 <sup>b</sup>	60 ± 8 <sup>b</sup>	1.21E <sup>-05</sup>	1.55
26	LysoPC(22:5)	1	RP(spec) / +	C <sub>30</sub> H <sub>52</sub> NPO <sub>7</sub>	570.3566 (+0.6)	9.11	143 ± 20 <sup>b</sup>	157 ± 25 <sup>b</sup>	7.17E <sup>-03</sup>	1.37
27	LysoPC(20:5)	1	RP(spec) / +	C <sub>28</sub> H <sub>48</sub> NPO <sub>7</sub>	542.3242 (+0.5)	8.58	88 ± 9 <sup>b</sup>	87 ± 7 <sup>b</sup>	4.21E <sup>-02</sup>	1.59
28	LysoPC(20:4)	1	RP(spec) / +	C <sub>28</sub> H <sub>50</sub> NPO <sub>7</sub>	544.3386 (-1.7)	8.12	50 ± 10 <sup>b</sup>	32 ± 4 <sup>b</sup>	2.93E <sup>-08</sup>	133
29	LysoPC(20:2)	1	RP(spec) / +	C <sub>28</sub> H <sub>54</sub> NPO <sub>7</sub>	548.3714 (-0.2)	7.88	294 ± 50 <sup>b</sup>	468 ± 47 <sup>c</sup>	1.62E <sup>-15</sup>	1.61
30	LysoPC(18:3)	1	RP(spec) / +	C <sub>26</sub> H <sub>48</sub> NPO <sub>7</sub>	518.3248 (+0.1)	10.82	212 ± 17 <sup>b</sup>	328 ± 66 <sup>c</sup>	1.69E <sup>-14</sup>	1.54
31	LysoPC(18:2)	1	RP(spec) / +	C <sub>26</sub> H <sub>50</sub> NPO <sub>7</sub>	520.3403 (0.0)	9.00	237 ± 28 <sup>b</sup>	398 ± 40 <sup>c</sup>	5.03E <sup>-11</sup>	1.71
32	LysoPC(18:1)	1	RP(spec) / +	C <sub>26</sub> H <sub>52</sub> NPO <sub>7</sub>	522.3557 (-0.3)	8.41	138 ± 18 <sup>b</sup>	195 ± 29 <sup>c</sup>	8.14E <sup>-07</sup>	1.73
33	LysoPC(18:0)	1	RP(spec) / +	C <sub>26</sub> H <sub>54</sub> NPO <sub>7</sub>	524.3704 (-1.2)	7.55	113 ± 10 <sup>b</sup>	170 ± 19 <sup>c</sup>	3.78E <sup>-04</sup>	1.43
34	LysoPC(16:0)	1	RP(spec) / +	C <sub>24</sub> H <sub>50</sub> NPO <sub>7</sub>	496.3402 (-0.1)	10.82	145 ± 26 <sup>b</sup>	323 ± 42 <sup>c</sup>	3.33E <sup>-05</sup>	1.38
35	FFA(22:6)	2	RP / -	C <sub>22</sub> H <sub>32</sub> O <sub>2</sub>	327.2316 (-0.8)	15.18	85 ± 10 <sup>a</sup>	67 ± 13 <sup>b</sup>	3.25E <sup>-03</sup>	1.31
36	FFA(20:5)	2	RP / -	C <sub>20</sub> H <sub>30</sub> O <sub>2</sub>	301.2167 (-0.1)	15.17	96 ± 17 <sup>a</sup>	77 ± 12 <sup>b</sup>	4.00E <sup>-03</sup>	1.55
37	FFA(20:4)	2	RP / -	C <sub>20</sub> H <sub>32</sub> O <sub>2</sub>	303.2316 (-0.8)	15.86	92 ± 12 <sup>a</sup>	78 ± 5 <sup>b</sup>	9.00E <sup>-03</sup>	1.77
38	FFA(18:4)	2	RP / -	C <sub>18</sub> H <sub>28</sub> O <sub>2</sub>	275.2004 (-0.7)	14.98	51 ± 7 <sup>b</sup>	27 ± 5 <sup>c</sup>	7.51E <sup>-16</sup>	1.95
39	FFA(18:2)	2	RP / -	C <sub>18</sub> H <sub>32</sub> O <sub>2</sub>	279.2316 (-0.8)	15.91	202 ± 38 <sup>b</sup>	295 ± 21 <sup>c</sup>	6.03E <sup>-09</sup>	1.95
40	FFA(18:1)	2	RP / -	C <sub>18</sub> H <sub>34</sub> O <sub>2</sub>	281.2472 (-0.9)	15.66	160 ± 18 <sup>b</sup>	308 ± 34 <sup>c</sup>	1.32E <sup>-04</sup>	1.45
41	FFA(16:1)	2	RP / -	C <sub>16</sub> H <sub>30</sub> O <sub>2</sub>	253.2161 (-0.7)	16.43	103 ± 19 <sup>a</sup>	177 ± 25 <sup>c</sup>	3.00E <sup>-03</sup>	1.35

42	FFA(16:0)	2	RP / -	C <sub>16</sub> H <sub>32</sub> O <sub>2</sub>	255.2316 (-0.8)	16.43	111 ± 18 <sup>a</sup>	136 ± 23 <sup>b</sup>	1.05E <sup>-02</sup>	1.40
43	(9-methyl-d19:3) sphingosine	3	RP / +	C <sub>19</sub> H <sub>37</sub> NO <sub>2</sub>	312.2899 (-0.4)	12.32	23 ± 3 <sup>b</sup>	16 ± 2 <sup>c</sup>	1.71E <sup>-11</sup>	2.11
44	(D14:2)sphingosine	3	RP / +	C <sub>14</sub> H <sub>27</sub> NO <sub>2</sub>	242.2118 (-0.2)	9.17	878 ± 123 <sup>b</sup>	148 ± 27 <sup>c</sup>	1.98E <sup>-04</sup>	2.06
45	N-Heptadecenoyl taurine	4	RP / -	C <sub>19</sub> H <sub>37</sub> NSO <sub>4</sub>	374.2355 (-1.0)	15.08	52 ± 10 <sup>b</sup>	22 ± 2 <sup>c</sup>	6.04E <sup>-14</sup>	1.90
46	N-Palmitoleoyl taurine	4	RP / -	C <sub>18</sub> H <sub>35</sub> NSO <sub>4</sub>	360.2209 (0.0)	14.58	47 ± 4 <sup>b</sup>	22 ± 3 <sup>c</sup>	2.87E <sup>-12</sup>	1.95
47	Cytidine	5	HI / +	C <sub>9</sub> H <sub>13</sub> N <sub>3</sub> O <sub>5</sub>	244.0941 (+0.8)	4.37	235 ± 28 <sup>b</sup>	130 ± 21 <sup>c</sup>	1.34E <sup>-02</sup>	1.39
48	Cytosine	5	HI / +	C <sub>4</sub> H <sub>5</sub> N <sub>3</sub> O	112.0502 (-0.9)	4.35	200 ± 26 <sup>b</sup>	120 ± 8 <sup>c</sup>	1.07E <sup>-02</sup>	1.78
49	Deoxycytidine	5	HI / +	C <sub>9</sub> H <sub>13</sub> N <sub>3</sub> O <sub>4</sub>	228.0951 (-3.3)	3.48	653 ± 59 <sup>b</sup>	190 ± 27 <sup>c</sup>	5.62E <sup>-03</sup>	2.27
50	Methylcytosine	5	HI / +	C <sub>5</sub> H <sub>7</sub> N <sub>3</sub> O	126.0645 (-2.2)	4.29	734 ± 103 <sup>b</sup>	120 ± 24 <sup>c</sup>	3.87E <sup>-05</sup>	2.13
51	Cysteinolic acid	6,10	HI / -	C <sub>3</sub> H <sub>9</sub> NSO <sub>4</sub>	154.0169 (-0.5)	4.05	18 ± 3 <sup>b</sup>	10 ± 2 <sup>b</sup>	6.51E <sup>-15</sup>	2.33
52	Tauropine	7,10	HI / -	C <sub>5</sub> H <sub>11</sub> NSO <sub>5</sub>	196.0286 (+0.6)	2.28	28 ± 4 <sup>b</sup>	35 ± 7 <sup>b</sup>	1.74E <sup>-10</sup>	2.32
53	TMAO	7,10	HI / +	C <sub>3</sub> H <sub>9</sub> NO	76.0760 (-0.2)	5.87	53 ± 10 <sup>b</sup>	49 ± 9 <sup>b</sup>	2.69E <sup>-03</sup>	1.52
54	Arsenobetaine	8,10	HI / +	C <sub>5</sub> H <sub>11</sub> AsO <sub>2</sub>	179.0040 (-1.3)	5.78	50 ± 6 <sup>b</sup>	52 ± 7 <sup>b</sup>	5.00E <sup>-05</sup>	1.97
55	Hercynine	9,10	HI / +	C <sub>9</sub> H <sub>15</sub> N <sub>3</sub> O <sub>2</sub>	198.1235 (-0.8)	5.75	737 ± 74 <sup>b</sup>	182 ± 15 <sup>c</sup>	3.00E <sup>-06</sup>	2.55

862 1, Phospholipid metabolism; 2, Fatty acid metabolism; 3, Sphingolipid metabolism; 4, N-acyl amino acid metabolism; 5, Pyrimidine metabolism; 6, Bile acid  
863 metabolism/algae amino acid; 7, Anaerobic microbial metabolism; 8, Arsenic metabolism; 9, Fungi metabolism; 10, Exogenous compounds.  
864 ‡ANOVA followed by Benjamini-Hochberg multiple testing correction. ††Variable importance in projection measurements in PLS-DA.

865 **Table 4.** Vitamin and vitamin-related compounds obtained from refined targeted approach. Values are the mean  $\pm$  SEM (n= 8-10).

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Vitamin/vitamin-related compounds	Chromatography/ ionization mode	Formula	De/protonated molecule <i>m/z</i> (error mDa)	RT (min)	(%) CTRL D2 <sup>†</sup>	(%) CTRL D3/4 <sup>†</sup>	P-value (ANOVA)	
A	Retinol phosphate	RP/+	C <sub>20</sub> H <sub>31</sub> O <sub>4</sub> P	367.2015 (-2.3)	15.75	140 $\pm$ 60 <sup>a</sup>	121 $\pm$ 63 <sup>a</sup>	4.45E-01
B <sub>1</sub>	Thiamin	HI/+	C <sub>12</sub> H <sub>16</sub> N <sub>4</sub> OS	265.1118 (-0.5)	5.68	120 $\pm$ 18 <sup>a</sup>	78 $\pm$ 23 <sup>a</sup>	2.29E-01
B <sub>2</sub>	<b>Riboflavin</b>	RP/-	C <sub>17</sub> H <sub>20</sub> N <sub>4</sub> O <sub>6</sub>	375.1299 (-0.6)	4.44	144 $\pm$ 67 <sup>a</sup>	364 $\pm$ 132 <sup>b</sup>	1.56E-03
B <sub>5</sub>	<b>Pantothenic acid</b>	RP/+	C <sub>9</sub> H <sub>17</sub> NO <sub>5</sub>	220.1183 (-0.2)	2.04	120 $\pm$ 17 <sup>a</sup>	146 $\pm$ 25 <sup>b</sup>	1.98E-02
B <sub>6</sub>	Pyridoxine	RP/+	C <sub>8</sub> H <sub>11</sub> NO <sub>3</sub>	170.0829 (+1.2)	1.72	96 $\pm$ 24 <sup>a</sup>	104 $\pm$ 21 <sup>a</sup>	5.96E-01
B <sub>7</sub>	Biotin	RP/+	C <sub>10</sub> H <sub>16</sub> N <sub>2</sub> O <sub>3</sub> S	245.0955 (-0.5)	5.36	107 $\pm$ 19 <sup>a</sup>	120 $\pm$ 21 <sup>a</sup>	3.68E-01
B <sub>12</sub>	<b>Mehtylmalonic acid (MMA)</b>	RP/-	C <sub>4</sub> H <sub>6</sub> O <sub>4</sub>	117.0190 (+0.2)	1.22	195 $\pm$ 45 <sup>b</sup>	276 $\pm$ 35 <sup>c</sup>	3.27E-03
C	Dehydroascorbic acid	HI/-	C <sub>6</sub> H <sub>6</sub> O <sub>6</sub>	173.0085 (-0.1)	1.12	95 $\pm$ 17 <sup>a</sup>	122 $\pm$ 17 <sup>a</sup>	1.03E-01
D <sub>3</sub>	25-hydroxyvitamin D <sub>3</sub>	RP/+	C <sub>27</sub> H <sub>44</sub> O <sub>2</sub>	401.3412 (-0.8)	13.65	102 $\pm$ 39 <sup>a</sup>	93 $\pm$ 26 <sup>a</sup>	3.59E-01
E	$\alpha$ -Carboxyethylhydroxychroman	RP/-	C <sub>16</sub> H <sub>22</sub> O <sub>4</sub>	277.1441 (+0.1)	14.10	106 $\pm$ 17 <sup>a</sup>	109 $\pm$ 15 <sup>a</sup>	5.64E-01
K <sub>2</sub>	Menaquinone	RP/+	C <sub>41</sub> H <sub>56</sub> O <sub>2</sub>	581.4360 (+0.1)	16.80	72 $\pm$ 45 <sup>a</sup>	140 $\pm$ 54 <sup>a</sup>	1.07E-01

867 <sup>†</sup> Percentage of integrated area for the selected compound as a percentage in fish fed control diet (D1). Compounds with statistical significant differences (P< 0.05) against  
868 control fish are in bold.

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