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1 **Stable isotope profiling for large-scale evaluation of feed efficiency in Atlantic**  
2 **salmon (*Salmo salar*)**

3

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12

13 Running title: Individual feed efficiency in aquatic species

14 Abstract

15

16 In growing animals, individual variation in feed efficiency may arise from individual differences  
17 in growth rate and protein metabolism. Over a period of time, these factors will affect the ratio  
18 between “new” vs. “old” protein, which can be quantified using isotope profiling. The aim of the  
19 current study was to investigate the relationship between relative weight gain and atom  
20 percentage excess  $^{15}\text{N}$  in muscle, liver and mid-intestine. A 50-day experiment was conducted  
21 with a total of 375 fish initially fed a standard diet, subsequently replaced by one out of five  
22 experimental diets, enriched with  $^{15}\text{N}$ . In general, fast-growing fish are expected to have a better  
23 feed efficiency, and the results show that this is captured by isotope profiling in liver and muscle  
24 tissues. Furthermore, individual variation in isotope content, i.e. relative fraction of “new”  
25 protein, among fish with comparable growth rates was observed, most expressed around ~50%  
26 isotope saturation, indicating differences in protein degradation and replacement not attributed to  
27 growth. The results suggest that isotope profiles can be used as individual indicator traits for feed  
28 efficiency and that inclusion levels of stable isotopes of 1-2% gave the most reliable results.

29

30 Keywords: Atlantic salmon, growth, maintenance requirements, protein metabolism, protein  
31 turnover, selective breeding

## 32 1. Introduction

33

34 Advanced selective breeding programs for Atlantic salmon (*Salmo salar*, *Salmonidae*) have been  
35 carried out since the early 1970's (Gjedrem, Gjøen, & Gjerde, 1991), with growth as the pivotal  
36 trait. After five generations of selection, Thodesen, Grisdale-Helland, Helland, and Gjerde  
37 (1999) compared selected salmon to wild salmon, reporting a 25% improvement in feed  
38 efficiency, defined as growth per unit of feed. Recording of individual feed efficiency involves  
39 recording of the individual feed intake as well as individual weight gain. While the latter is  
40 relatively easy to obtain, individual feed intake is not easily attainable in large-scale aquaculture  
41 systems. Research have shown that feed intake cannot fully explain individual variation in  
42 growth, due to different individual growth responses when consuming the same amount of feed  
43 (Carter, Houlihan, Buchanan, & Mitchell, 1993b; Houlihan, Carter, & McCarthy, 1995).  
44 Although genetic variation in feed efficiency obviously exists, the underlying mechanisms are  
45 unknown, but can be assumed partly due to individual variation in protein metabolism.

46

47 Traditionally, individual feed efficiency in fish has been improved through selection for  
48 increased growth rate, assuming a favourable genetic correlation to feed efficiency (Thodesen,  
49 Gjerde, Grisdale-Helland, & Storebakken, 2001). A fast-growing animal will likely be more feed  
50 efficient by using a relatively larger fraction of the feed for growth and less for maintenance of  
51 existing body tissue. On a family level, Thodesen et al. (2001) estimated a favourable correlation  
52 of 0.8 between feed efficiency and growth rate. They stated an apparently decreasing response in  
53 feed efficiency with increasing growth rates, suggesting that direct selection for improved feed  
54 efficiency would be beneficial. Hence, it is timely to address other indicator traits related to feed  
55 efficiency as a tool to improve selective breeding for feed efficiency in aquatic species.

56

57 Diets with distinct stable isotope ratios, for example  $^{15}\text{N}/^{14}\text{N}$  and  $^{13}\text{C}/^{12}\text{C}$ , can be used to trace  
58 metabolism of nutrients (Houlihan et al., 1995). Feeding diets with enriched levels of specific  
59 isotopes will result in an isotopic change in the organism (Le Vay & Gamboa-Delgado, 2011).  
60 Changes in the isotopic composition of tissues after a change in diet occur through two processes  
61 (Jardine, McGeachy, Paton, Savoie & Cunjak, 2003; Fellerhoff, 2002). Firstly, the process  
62 involves the metabolic breakdown of tissues that were synthesized during feeding on the

63 previous diet, and their subsequent replacement with tissues synthesized on a new diet. Secondly,  
64 the growth of new tissue that occurs after a diet switch will reflect the isotopic composition of  
65 the current diet, and will contribute to the overall reflection of that diet in the isotopic  
66 composition of the fish (Figure 1). Growth rate is a result of the net *difference* between  
67 absorption of new nutrients from feed and loss of nutrient components in faeces, while efficiency  
68 depends on the *ratio* between them. Hence, growth rate may not explain all variation in  
69 efficiency (i.e., a slow- or moderately growing individual may still be efficient if the degradation  
70 losses are sufficiently low). By combining growth rate and change in isotope profile, the  
71 efficiency can be more accurately assessed than by using relative increase in growth alone. The  
72 change in isotope ratio can be used to determine the rate of protein metabolism in various tissues,  
73 as a result of metabolic activity, nutritional state, partitioning of nutrients, physical activity and  
74 tissue growth (Bloomfield, Elsdon, Walther, Gier, & Gillanders, 2011).

75

76 The current experiment is part of a study aiming at investigating the use of stable isotope in feed  
77 to assess feed efficiency in Atlantic salmon. The current study was a pilot with five inclusion  
78 levels of  $^{15}\text{N}$  in feed and sampling fish at seven time points with the aim to study the relationship  
79 between relative weight gain and atom percentage excess (APE)  $^{15}\text{N}$  in muscle, liver and mid-  
80 intestine. From this, one objective was to draw inference as to how phenotyping could be carried  
81 out and yet another to discuss the potential of the indicator traits in selective breeding for  
82 improved feed efficiency in aquaculture species.

83

## 84 2. Materials and methods

85

### 86 2.1 Fish, housing and health

87

88 The experiment was carried out at the fish laboratory at the Norwegian University of Life  
89 Sciences (NMBU), Aas, Norway, following the laws and regulations for experiments on live  
90 animals in EU (Directive 2010/637EU) and Norway (FOR-2015-06-18-761). The experiment  
91 was approved by the Norwegian Food Safety Authority (FOTS ID 9484). A total of 510 Atlantic  
92 salmon with an average initial body weight of 21 g were randomly distributed into 15 tanks (34  
93 fish per tank). Prior to start of the 50-day experimental period, all fish were pit-tagged with a 2 x

94 12 mm unique glass tag (RFID Solutions, Hafrsfjord, Norway), and initial length and weight  
95 were recorded. The tanks, each with a 270 l capacity, were supplied with recirculated freshwater.  
96 Water flow rate was 7-8 l min<sup>-1</sup>, and the fish were kept under 12 h/12 h light-dark regime, with  
97 temperature in range of 15-16 °C. Dissolved oxygen was measured daily and kept above 8 mg l<sup>-1</sup>  
98 in the outlet water (Handy Delta, OxyGuard<sup>®</sup> AS, Farum, Denmark). There were no mortality or  
99 sign of disease during the experimental period.

100

## 101 2.2 Dietary treatments and feeding

102

103 The dietary treatments consisted of four <sup>15</sup>N-marked diets with different inclusion levels of <sup>15</sup>N.  
104 Diet SP1 and SP2 contained 1% and 2% <sup>15</sup>N marked *Spirulina* whole cells (Larodan, Sweden),  
105 while diet L0.1 and L0.2 had 0.1% and 0.2% <sup>15</sup>N marked L-Lysine (Sigma, Norway). A control  
106 diet was formulated with no added (0%) <sup>15</sup>N. All diets were formulated to meet requirements for  
107 Atlantic salmon for protein (NRC, 2011), and their composition are given in Table 1. The feed  
108 ingredients were mixed at the feed laboratory at NMBU, Ås, Norway. All dry ingredients, except  
109 gelatine, were mixed in a Forberg mixer (vacuum coater) (Forberg AS, Hegdal, Larvik, Norway).  
110 Gelatine was dissolved in cold water and then heated to 55 °C in a microwave oven. Fish oil,  
111 dissolved gelatine, water and the dietary ingredients were mixed with a Moretti Foreni kneading  
112 machine (Spiry 25, Mondolfo, Italy). This resulted in a firm dough that was cold pelleted using  
113 an Italgipasta extruder (P35 A, Carasco, Italy) equipped with a 2.5 mm die. Feed was cooled to  
114 room temperature and dried at 45-60 °C to about 95% dry matter, in a batch dryer with a DANIA  
115 9 kW fan (Inelco A7S, Fjerntslev, Denmark). The feed was stored at 4 °C until feeding. The diets  
116 were fed to triplicate groups of fish for a period of one hour, twice a day (08:00 and 17:00) by  
117 automatic belt feeders. The feeding level equalled 1.5% of body weight the first day and then  
118 10% in excess, based on the level of uneaten feed. Uneaten feed was collected from the water  
119 outlet, and feed intake was calculated as described by Helland, Grisdale-Helland, and Nerland  
120 (1996).

121

## 122 2.3 Chemical analysis

123

124 The diets were ground, and analyses were performed in duplicates. Diets were analysed for dry  
125 matter by drying to constant weight at 104 °C, ash by combustion at 550 °C, crude protein by  
126 Kjeldahl nitrogen x 6.25 according to Commission regulation (EC) No 152/2009 and starch as  
127 described in McCleary, Solah, and Gibson (1994). Lipid was analysed after extraction with  
128 petroleum ether and acetone (70/30) on an Accelerated Solvent Extractor (ASE 200) (Dionex  
129 Corp, Sunnyvale, CA, USA). Gross energy was determined with PARR 1281 Adiabatic Bomb  
130 calorimeter (Parr Instruments, Moline, IL, USA) according to ISO 9831. Amino acids except  
131 tryptophan were analysed according to Commission regulation (EC) No 152/2009 on a Biochrom  
132 30 Amino Acid Analyser (Biochrom Ltd., Cambridge, UK). For tryptophan, a Dionex Ultimate  
133 3000 HPLC system (Dionex Softron GmbH, Germering, Germany) equipped with a Shimadzu  
134 RF-535 fluorescence detector (Shimadzu Corporation, Kyoto, Japan) was used, and the analysis  
135 was carried out according to Commission regulation (EC) No 152/2009. The chemical  
136 composition of the diets is given in Table 2.

137

#### 138 2.4 Sampling

139

140 Four fish from each tank were sampled at different time points (2, 4, 8, 16, 32 and 50 days). The  
141 remaining fish (n = 150) were kept for another experiment. Fish were anesthetized with  
142 metacaine (MS-222<sup>TM</sup>; 1 g l<sup>-1</sup> water) and killed with a sharp blow to the head prior to dissection.  
143 Slaughter weight and length were recorded for all fish, and tissue samples (muscle, liver and  
144 mid-intestine) were collected in cryotubes, snap-frozen in liquid nitrogen and kept in a freezer at  
145 -80 °C until freeze-drying, grinding and stable isotope analysis. Prior to the experiment, tissue  
146 samples from 15 fish were collected to determine the initial isotopic atom percentage (IA %).  
147 Tissue sampling was standardized; muscle was sampled in front of the dorsal fin (1 x 1 cm cube),  
148 the whole liver was sampled and mid-intestine from the end of pyloric ceca to distal intestine.

149

#### 150 2.5 Stable isotope analysis

151

152 Tissue samples were freeze-dried and homogenized with two stainless steel beads 5 mm (Qiagen,  
153 Retsch GmbH, Haan, Germany) in a TissueLyser (Qiagen, Retsch GmbH, Haan, Germany) for  
154 two minutes at 20 Hertz. Diets and ingredients were ground in an Ultra Centrifugal Mill ZM 100

155 (Retsch GmbH, Haan, Germany) to a homogeneous powder. Molecules containing  $^{14}\text{N}$  and  $^{15}\text{N}$   
 156 differ in mass, and the ratio of these isotopes can be detected with an element analysis isotope  
 157 ratio mass spectrometry (EA-IRMS). First, the sample was subjected to element analysis by  
 158 being dropped into a heated reactor which contains an oxidant such as copper or chromium  
 159 oxide. Samples were combusted at 1000 °C to produce  $\text{N}_2$ ,  $\text{NO}_x$ ,  $\text{H}_2\text{O}$ ,  $\text{O}_2$  and  $\text{CO}_2$ . The  
 160 abundance of the isotopes in the sample was then determined by mass spectrometry (Iso-  
 161 analytical, 2018). Samples of approximately 1 mg were weighed into small tin capsules (8 x 5  
 162 mm, Elemental Microanalysis, Devon, UK). Samples were analysed for N-isotope composition  
 163 using a Nu Horizon isotope-ratio mass spectrometer (IRMS) (Nu Instruments, Wrexham, UK)  
 164 coupled to an Eurovector element analyser (EA) 3028 (Eurovector S.p.A, Redavalle, Italy) at the  
 165 Institute for Energy Technology (Kjeller, Norway). Analysed content of  $^{15}\text{N}$  in the diets is given  
 166 in Table 2.

167

168 Isotopic signatures were reported as  $\delta^{15}\text{N}$  values, and converted to atom percentage excess (APE)  
 169 as follows (Fry, 2006):

$$170 \quad \text{APE } ^{15}\text{N} = \left( \left( \frac{(\delta^{15}\text{N}_{\text{Sample}} + 1000)}{\left( \delta^{15}\text{N}_{\text{Sample}} + 1000 + \left( \frac{1000}{\delta^{15}\text{N}_{\text{Standard}}} \right) \right)} \right) 100 \right) - IA \%$$

171 where  $\delta^{15}\text{N}_{\text{Sample}}$  and  $\delta^{15}\text{N}_{\text{Standard}}$  are the proportion of  $^{15}\text{N}$  in the ratios  $^{15}\text{N}/^{14}\text{N}$  in the sample  
 172 and in the reference standard (atmospheric  $\text{N}_2$ ;  $\delta^{15}\text{N}_{\text{Standard}} = 0.003663$  IAEA (International  
 173 Atomic Energy Agency) 305) and  $IA \%$  is the initial atom percentage in  $N_{\text{standard}}$ . The APE  $^{15}\text{N}$   
 174 after feeding with enriched feed will be proportional to the fraction of newly deposited amino  
 175 acids in the tissue, resulting from both tissue growth and replacement of previously deposited  
 176 protein, denoted as protein metabolism. Atom percentage excess  $^{15}\text{N}$  is the total atom percentage  
 177  $^{15}\text{N}$  in the sample adjusted for the  $IA \%$ . When enrichment of  $^{15}\text{N}$  was low ( $\sim 0.5\% \text{ } ^{15}\text{N}$ )  
 178 calibration of  $^{15}\text{N}$  was performed against the international standards IAEA 305B and IAEA N-1,  
 179 while when enrichment of  $^{15}\text{N}$  was high ( $2\% \text{ } ^{15}\text{N}$ ), calibration standards IAEA 311 and IAEA N-  
 180 1 were used. Three samples of the internal reference material (IFE Trout) was analysed in the  
 181 beginning, middle and end of a sequence (75-78 samples per sequence) and for every sixth tissue  
 182 sample. The average  $\delta^{15}\text{N}$  in IFE Trout, was 11.60‰ with a standard deviation of 0.20. The



183 corresponding  $\delta^{15}\text{N}$  values for samples analysed according to IAEA 305B and IAEA 311 were  
184  $375.3 \pm 0.96\text{‰}$  and  $4693 \pm 4.49\text{‰}$ , respectively. The content of  $^{15}\text{N}$  before feeding with enriched  
185 feed was expected very low. For 15 fish the IA % was on average 0.370 with a standard  
186 deviation of 0.0001, respectively.

187

## 188 2.6 Calculations and statistics

189

190 Feed conversion ratio (FCR) was calculated on a tank level as follows:

$$191 \quad FCR = FI (FW-IW)^{-1}$$

192 where FI is feed intake (g dry matter) and FW and IW are final and initial weights (g) of fish,  
193 respectively. An average FCR over three tanks given the same diet was calculated. Further,  
194 relative weight gain for an individual, i.e., growth relative to final body weight, was calculated as  
195 follows:

$$196 \quad \text{relative weight gain} = ((FW-IW) FW^{-1}) 100)$$

197

198 An effect of diet on averages of recorded variables was tested by use of the following univariate  
199 model:

$$200 \quad \bar{y}_{ij} = \mu + \text{diet}_i + \varepsilon_{ij}$$

201 where  $\bar{y}_{ij}$  is average feed intake, initial and final weights, weight gain, relative weight gain and  
202 FCR in tank  $j$  ( $j = 1 \dots 15$ ),  $\mu$  is the overall mean, diet is the fixed effect of  $i^{\text{th}}$  diet ( $i = 1 \dots 5$ ) and  
203  $\varepsilon_{ij}$  is a random residual.

204

205 Simple linear regression as well as Pearson correlations between relative weight gain and APE  
206  $^{15}\text{N}$  in muscle, liver and mid-intestine were calculated per diet and sampling time points. All  
207 statistical analyses above were carried out by use of SAS<sup>®</sup> software, V.9.4 (SAS Inst. Inc., Cary,  
208 NC).

209

### 210 3. Results

211

212 All diets contained the same level of *Spirulina* and L-Lysine, but with different inclusion levels  
213 of their <sup>15</sup>N marked counterparts (Table 1). Chemical analysis of the diets (Table 2) showed that  
214 there were some minor differences in total amino acid content between diets, being somewhat  
215 lower for SP2 and L0.2. The enrichment percentage of <sup>15</sup>N was slightly under the formulated  
216 values in all diets, but all diets were isotopically distinct.

217

218 All diets were consumed as expected. Overall average and standard deviation for start and final  
219 weights per fish were  $21 \pm 2.5$  g and  $36.2 \pm 14.1$  g, respectively, with a relative weight gain over  
220 the 50 days of  $35.6 \pm 19.0\%$ . Corresponding average feed intake over the 15 tanks throughout the  
221 50-day period was  $489.4 \pm 42.4$  g, and average FCR was  $0.68 \pm 0.013$ . The model showed no  
222 significant ( $P < 0.05$ ) effect of diet on any of the traits tested, as expected due to the same  
223 chemical composition. Descriptive statistics of the different traits by diet are therefore given in  
224 Table 3.

225

226 Table 4 shows the correlations between APE <sup>15</sup>N and relative weight gain in muscle, liver or  
227 mid-intestine over time in diets with added <sup>15</sup>N. Correlations were generally positive (one  
228 exception), ranging 0.12-0.98, -0.09-0.94 and 0.03-0.90 in muscle, liver and mid-intestine,  
229 respectively (Table 4). The relationship between relative weight gain and APE <sup>15</sup>N in the muscle  
230 for all diets over time is shown in Figures 2A-E. For diets enriched with <sup>15</sup>N, there was a strong  
231 positive relationship between relative weight gain and APE <sup>15</sup>N in the muscle (Figures 2B-E),  
232 which is expected due to the fact that protein growth is necessarily based on deposition of newly  
233 consumed and thus enriched protein. As expected, a stable <sup>15</sup>N concentration over time was  
234 observed for fish given the control diet (Figure 2A). The same tendency was also evident for  
235 liver and mid-intestine (data not shown). The main differences between muscle, liver and mid-  
236 intestine were that liver and mid-intestine were nearly in equilibrium with the diets around day  
237 50, due to faster metabolic rate in these tissues.

238

239 Among inclusion levels, the SP2 diet (2% inclusion level of <sup>15</sup>N) was the only diet estimated  
240 with significant correlations ( $P < 0.05$ ) between APE <sup>15</sup>N and relative weight gain both in muscle

241 and liver at all time points ( $r = 0.82-0.97$  and  $r = 0.59-0.94$ , respectively). These, correlations  
242 were, slightly lower and less stable in liver than in muscle tissue. For mid-intestine, many of the  
243 correlations between APE  $^{15}\text{N}$  and relative weight gain were not significant.

244  
245 Figure 3 shows that the level of isotope in muscle tissue for fish fed the SP2 diet over time  
246 asymptotes towards an equilibrium atom percentage. Moreover, Figure 3 indicates that the  
247 individual variation in isotope level was low in the beginning of the 50 day experimental period  
248 and increased in accordance with the individual relative weight gain before it approaches  
249 equilibrium. Similar shape of curves was, in fact, obtained for the other diets (data not shown).  
250 This implies that for all the diets, the individual variation in APE  $^{15}\text{N}$  is likely highest when the  
251 tissue is, on average, 50% saturated with the isotope in the feed, leaving room for individual  
252 variation around the value. For the SP2 diet this occurred for an APE  $^{15}\text{N}$  in body tissue being  
253 1% (Figure 3).

#### 254 255 4. Discussion

256  
257 The basic idea of the current project was to develop a method for use of isotope enriched feed to  
258 assess individual feed efficiency in fish, without recording their individual feed intake. By  
259 switching from normal to isotope-enriched feed, the isotope profile of the fish will change  
260 accordingly. The change in the nitrogen isotope profile can be explained by protein metabolism,  
261 i.e., growth dilution in addition to replacement of existing body tissue (losses). Here, Atlantic  
262 salmon in the freshwater phase were fed diets with different inclusion levels, and the  
263 corresponding changes in relative weight gain and APE  $^{15}\text{N}$  of tissues were monitored over time.  
264 Generally, the largest positive relationship between the two variables was found in muscle with  
265 APE  $^{15}\text{N}$  approaching an asymptote over time for all diets. This implies that diets with variable  
266 inclusion of isotopes, either by enrichment or natural variation in isotope content, may be used  
267 for assessing feed efficiency. It is recommended to test until ~50% saturation with the isotope  
268 level in the feed.

269  
270 The finding that the body content of the feed-enriched isotope increases with body growth is  
271 hardly surprising. Figures 2B-E show that fish of similar relative weight gain, but different

272 growth rates (i.e., reaching the same relative weight gain at different time points), had clearly  
273 different isotope contents, with the fastest-growing fish having the lowest content of enriched  
274 isotope. This cannot be attributed to growth dilution (as relative weight gain is similar), implying  
275 that fast growth results in reduced replacement of existing body tissue, and better FCR, likely  
276 due to less maintenance costs from a shorter growth period. The experiment indicates that  
277 individual differences in FCR are likely to be captured by individual differences in isotope  
278 profiles. Furthermore, within each time point, Figure 2, there is individual variation in protein  
279 metabolism between fish of similar relative weight gain. This can partly be explained by  
280 measurement errors, but potentially by variation in protein degradation between fish at the same  
281 relative weight gain. Variation in levels of APE <sup>15</sup>N (i.e., variable replacement of body nitrogen)  
282 may be explained by variation in maintenance requirements (per unit body protein and day), and  
283 relates to individual differences in protein efficiency. Likewise, Figure 2 shows individual  
284 variation in relative weight gain for fish at the same APE <sup>15</sup>N, again pointing to potential  
285 differences in maintenance requirements. It remains to explore whether some of this variance has  
286 a genetic component.

287  
288 Stable isotope analysis is a well-established method to obtain measurements of protein  
289 metabolism in fish. Protein efficiency, where amount of ingested protein is accreted as growth in  
290 muscle has been shown to vary between groups of individuals, where efficient fish obtain a  
291 higher growth rate for a reduced protein degradation (Carter et al., 1993b; McCarthy, Houlihan,  
292 & Carter, 1994; Morgan, McCarthy, & Metcalfe, 2000). These studies have all been based on the  
293 flooding dose method (Garlick, McNurlan, & Preedy, 1980), injecting radioactive [<sup>3</sup>H]  
294 phenylalanine in the caudal vein, with subsequent tissue measurements over a shorter period of  
295 time (1-6 hours). The isotope profiling in this study, however, is based on adding stable isotopes  
296 to feed and considers cumulative individual measures over longer period of time, herein up to  
297 three weeks dependent on the growth rate of the fish. Another advantage of labelling the feed, is  
298 the ability to trace the nutrient deposition and loss without disturbing the fish. Labelling the feed  
299 allows to measure the change in isotope profile for a large number of individuals, making the  
300 indicator trait more relevant in a selective breeding context. As for the flooding dose method, the  
301 footprint of isotopes is measured in tissues, herein muscle, liver and mid-intestine. In fish,  
302 muscle alone accounts for as much as 40-60% of the total body weight and is the main protein

303 accretion site (Verri, Terova, Dabrowski, & Saroglia, 2011), directly reflecting the whole-body  
304 growth (Peragon, Barroso, Garcia-Salguero, de la Higuera, & Lupianez, 1999). Moreover, it has  
305 been proposed that protein metabolism in white muscle of fish could be used as a biochemical  
306 index for protein accretion and growth (Fauconneau, Gray, & Houlihant, 1995), which is  
307 confirmed in this study. In addition, significant correlations between APE  $^{15}\text{N}$  and relative  
308 weight gain in liver and mid-intestine existed for all diets (Table 4). Liver as a highly metabolic  
309 tissue with high protein metabolism, as well as epithelial renewal in the mid-intestine can explain  
310 the correlation between APE  $^{15}\text{N}$  and relative weight gain in these tissues. Correlations between  
311 mid-intestine APE  $^{15}\text{N}$  and relative weight gain throughout the experiment were unstable, and  
312 many were non-significant (Table 4), likely because the tissue was difficult to rinse properly. In  
313 summary, our results show that isotope profile changes in muscle, liver and mid-intestine can be  
314 effectively traced by feed labelling. The clear association between individual relative weight gain  
315 and individual APE  $^{15}\text{N}$  in different tissues over time demonstrates that isotope profiling from  
316 labelling the feed accurately assess deposition of new protein especially in muscle, but also in the  
317 liver.

318

319 The EA-IRMS technique is an accepted method for analysis of  $^{15}\text{N}/^{14}\text{N}$  ratios, the analysis can be  
320 used for samples with low  $^{15}\text{N}$ -concentrations (Grassineau, 2006) and has very good precision (<  
321 0.1% relative standard deviation) (Matthews & Hayes, 1978). Thus, enrichments of  $^{15}\text{N}$  with an  
322 APE of 0.004 can be detected (Matthews & Hayes, 1978). In this experiment the SP2 diet with  
323 an enrichment as high as 1.974 APE  $^{15}\text{N}$  gave the most stable correlations throughout the 50-day  
324 sampling period (Table 4). This stability was considered important because the purpose of this  
325 experiment was to investigate the potential of using the change in isotope profile in a relation to  
326 relative weight gain with a consequence for individual feed efficiency. In addition, an increasing  
327 isotopic variance was observed (Figure 3) throughout the experiment, which can be explained by  
328 individual differences in growth and tissue replacement. However, the relationship between  
329 average level and time was non-linear, and the level asymptotes when the body tissues approach  
330 equilibrium with  $^{15}\text{N}$  in the diet. At equilibrium, the isotope profile is fully dictated by the diet,  
331 and no variation among fish is expected (as observed prior to the feed trial). In contrast, the  
332 variation between fish will be highest when, on average, ~50% saturation is reached (i.e.,  
333 saturation varies among fish). Due to high growth rates, fish reached ~50% saturation at day 25

334 for the SP2 diet. Relative growth rates vary considerably among species and life-stages within  
335 species, and the experiment should be adapted to each specific case.

336

337 Growth can be explained by increased protein synthesis, reduction in protein degradation and  
338 high accretion rate of proteins to skeletal muscle (Carter, Houlihan, Brechin, & McCarthy,  
339 1993a; McCarthy et al., 1994; Morgan et al., 2000). The strong relationship between muscle  
340 protein metabolism and relative weight gain can be explained by the fact that 80% of the  
341 synthesized proteins in white muscle are retained as net protein accretion (Houlihan & Laurent,  
342 1987). McCarthy et al. (1994) compared groups (n = 6) of protein “efficient” and “inefficient”  
343 rainbow trout (*Oncorhynchus mykiss*) where faster growing and more efficient fish showed  
344 reduced degradation rates, and differences in growth correlated to protein metabolism  
345 differences. Differences in protein degradation rates were important determinants of their  
346 reported variation of growth efficiencies. Our individual differences corresponded well with the  
347 results of McCarthy et al. (1994): fast-growing fish showed lower protein degradation in muscle,  
348 when compared at the same relative weight gain, as explained above. Correspondingly, Hawkins,  
349 Day, Rusin, and Worrall (1989) have reported genotype-dependent differences in protein  
350 metabolism in mussels (*Mytilus edulis*). Results in the current study indicate that efficient fish  
351 are characterized by a high ratio between relative weight gain and change in isotope profile,  
352 meaning high gain for low cost, by individual variation in feed efficiency.

353

354 According to literature (e.g., Thodesen et al., 2001), a favourable correlation is expected between  
355 feed efficiency and growth rate. Given that isotope profiling can be used to assess feed efficiency  
356 on an individual level, this should be observed as a lower content of APE <sup>15</sup>N in faster-growing  
357 (more efficient) fish, which should be evident from the isotopic profiles. The findings in this  
358 study support this. The results indicate that individual isotope profiles can be used as an indicator  
359 trait of individual feed efficiency in fish.

360

## 361 5. Conclusions

362

363 Results show that the stable isotope <sup>15</sup>N added to feed and accumulated over time in muscle and  
364 liver has the potential to be a promising biomarker for revealing insight into individual feed

365 efficiency of fish. Results show that fast growth results in reduced replacement of existing body  
366 tissue and improved FCR, interpreted as reduced degradation rates, i.e., reduced maintenance  
367 requirement. Efficient fish are characterized by a high ratio between relative weight gain and  
368 change in isotope profile, meaning high gain for low cost or improved feed efficiency. Adding  
369 stable isotopes to feed can be done for a considerable number of fish and has therefore a  
370 potential in a breeding context. It is recommended to feed with stable isotopes to reach 50%  
371 saturation.

372

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378

### 379 Competing interests

380

381 The authors declare that they have no competing interest.

382

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452 **Table 1**  
453 Formulated composition of experimental diets.

<i>Formulation, g kg<sup>-1</sup></i>	Dietary treatments				
	Control	SP1	SP2	L0.1	L0.2
Fish meal <sup>†</sup>	460	460	460	460	460
Gelatinized potato starch <sup>‡</sup>	130	130	130	130	130
Wheat gluten <sup>§</sup>	129.6	129.6	129.6	129.6	129.6
Spirulina <sup>¶</sup>	20.0	10.0	0.0	20.0	20.0
Spirulina <sup>15</sup> N <sup>††</sup>	0.0	10.0	20.0	0.0	0.0
L-Lysine <sup>‡‡</sup>	2.0	2.0	2.0	1.0	0.0
L-Lysine <sup>15</sup> N <sup>§§</sup>	0.0	0.0	0.0	1.0	2.0
Fish oil <sup>¶¶</sup>	170.0	170.0	170.0	170.0	170.0
Gelatine <sup>†††</sup>	80.0	80.0	80.0	80.0	80.0
Premix fish <sup>‡‡‡</sup>	6.3	6.3	6.3	6.3	6.3
Monocalcium phosphate <sup>§§§</sup>	2.0	2.0	2.0	2.0	2.0
Y <sub>2</sub> O <sub>3</sub> <sup>¶¶¶</sup>	0.1	0.1	0.1	0.1	0.1

454 <sup>†</sup>Norse LT 16-001, Norsildmel, Egersund Sildoljefabrikk AS, Egersund, Norway.

455 <sup>‡</sup>Lygel F 60, Lyckeby Culinar, Fjälkinge, Sweden.

456 <sup>§</sup>Vital Wheat Gluten, Amilina, Panevezys, Lithuania.

457 <sup>¶</sup>CIL-ULM-8453 Spirulina Whole cells (unlabelled), Cambridge Isotope Laboratories, Larodan, Solna, Sweden.

459 <sup>††</sup>CIL-NLM-8401 Spirulina Whole cells (U-<sup>15</sup>N, 98%+), Cambridge Isotope Laboratories, Larodan, Solna, Sweden.

461 <sup>‡‡</sup>L5751 L-Lysine dihydrochloride (98% unlabelled), Sigma-Aldrich, St. Louis, USA.

462 <sup>§§</sup>CIL-NLM-143 L-Lysine\*2HCl (alfa-<sup>15</sup>N, 95-99%), Cambridge Isotope Laboratories, Larodan, Solna, Sweden.

464 <sup>¶¶</sup>NorSalmOil, Norsildmel, Bergen, Norway.

465 <sup>†††</sup>Rousselot® 250 PS, Rousselot SAS, Courbevoie, France.

466 <sup>‡‡‡</sup>Farmix, Trouw Nutrition, LA Putten, The Netherlands. Per kg feed; Retinol 2500.0 IU, Cholecalciferol 32400.0 IU,  $\alpha$ -tocopherol SD 0.2 IU, Menadione 40.000 mg, Thiamine 15.0 mg, Riboflavin 25.0 mg, d-Ca-Pantothenate 40.002 mg, Niacin 150.003 mg, Biotin 3000.0 mg, Cyanocobalamin 20.0 mg, Folic acid 5.0 mg, Pyridoxine 15.0 mg, Ascorbate polyphosphate 0.098 g, Cu: CuSulfate 5H<sub>2</sub>O 11.998 mg, Zn: ZnSulfate 89.992 mg, Mn: Mn(II)Sulfate 34.993 mg, I: K-Iodine 1.999 mg, Se: Na-Selenite 0.200 mg, Cd Max. 0.0003 mg, Pd Max. 0.028 mg, Ca 0.915 g, K 1.380 g, Na 0.001 g, Cl 1.252 g.

473 <sup>§§§</sup>Bolifor®MCP-F.KPP Oy, Animal Nutrition, Helsingborg, Sweden.

474 <sup>¶¶¶</sup>Yttrium oxide (Y<sub>2</sub>O<sub>3</sub>), Metal Rare Earth Limited, Shenzhen, Guangdong, China.

475 **Table 2**  
 476 Analysed chemical composition of experimental diets.

Chemical composition	Dietary treatments <sup>†</sup>				
	Control	SP1	SP2	L0.1	L0.2
<i>Analysed content, kg<sup>-1</sup></i>					
Dry matter, g	910.6	910.6	911.2	922.0	924.3
Ash, g	76.4	75.8	76.5	76.2	76.6
Crude protein, g	503.6	507.2	503.3	506.6	509.8
Starch, g	121.0	119.0	121.0	124.0	125.0
Lipid, g	170.4	170.6	174.7	183.4	182.1
Gross energy, MJ	22.3	22.2	22.2	22.5	22.6
<i>Analysed content, %</i>					
<sup>15</sup> N, measured (%) <sup>‡</sup>	0.003	0.964	1.974	0.081	0.151
<i>Essential amino acids, g kg<sup>-1</sup></i>					
Arginine	32.3	32.2	30.4	32.4	31.4
Histidine	9.7	9.5	8.8	9.6	9.0
Isoleucine	20.3	19.9	18.3	19.9	18.5
Leucine	35.0	34.6	32.2	34.7	33.2
Lysine	31.3	30.5	28.4	30.8	29.3
Methionine	11.2	10.9	10.2	11.1	10.4
Phenylalanine	20.8	20.6	19.3	20.6	19.4
Threonine	19.1	18.9	17.8	19.2	18.2
Valine	23.2	22.8	21.3	22.9	21.5
Tryptophan	4.7	4.6	4.2	4.6	4.6
<i>Non-essential amino acids, g kg<sup>-1</sup></i>					
Alanine	28.7	28.7	27.3	28.9	28.0
Aspartic acid	40.3	39.7	37.4	40.2	37.3
Glycine	36.3	36.8	35.6	36.6	35.8
Glutamic acid	95.3	95.2	88.6	93.6	89.3
Cysteine	5.5	5.4	5.1	5.3	5.4
Tyrosine	11.7	11.7	10.7	11.8	10.9
Proline	38.1	38.4	36.5	37.4	35.5
Serine	22.3	22.3	21.3	22.5	21.9
Sum amino acids	485.7	482.9	453.2	482.2	459.7

477 <sup>†</sup>All analyses was a mean of duplicates except atom percentage excess <sup>15</sup>N being an average of  
 478 triplicates.

479 <sup>‡</sup>Atom percentage excess <sup>15</sup>N.

480 **Table 3**  
 481 Means and standard deviations of diets for initial and final weights as well as for weight gain,  
 482 relative weight gain, feed intake and feed conversion ratio, over the 50 day test period.

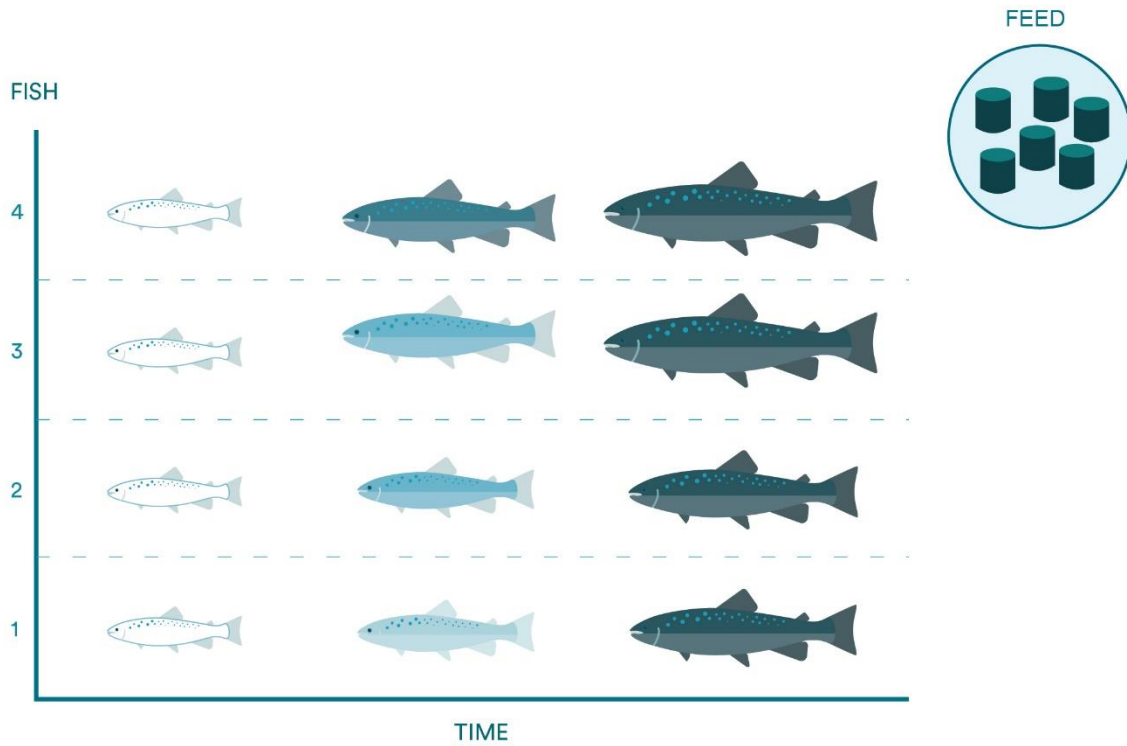
	Dietary treatments				
	Control	SP1	SP2	L0.1	L0.2
Initial weight, g	711.1 ± 10.3	717.2 ± 6.0	713.0 ± 18.6	699.5 ± 3.4	709.6 ± 14.4
Final weight, g	1478.9 ± 57.6	1446.6 ± 49.5	1364.1 ± 28.2	1456.1 ± 66.0	1412.8 ± 20.5
Weight gain, g	767.8 ± 64.6	729.4 ± 54.6	651.1 ± 41.9	756.6 ± 64.1	703.1 ± 30.0
Relative weight gain, %	36.3 ± 2.4	35.7 ± 1.3	33.9 ± 1.84	35.7 ± 1.48	36.5 ± 1.9
Feed intake, g	520.7 ± 41.6	498.8 ± 41.1	437.9 ± 9.4	516.7 ± 39.2	473.0 ± 20.2
Feed conversion ratio	0.68 ± 0.003	0.68 ± 0.008	0.67 ± 0.03	0.68 ± 0.007	0.67 ± 0.005

483

484 **Table 4**  
 485 Pearson correlation coefficients (r) between atom percentage excess (APE) <sup>15</sup>N in muscle (M), liver (L) and mid-intestine (MI) and  
 486 relative weight gain over time (n = 12, at 2, 4, 8, 16, 32 and 50 days) in four <sup>15</sup>N enriched diets. Significant correlations (P < 0.05) are  
 487 indicated with asterisks (\*).

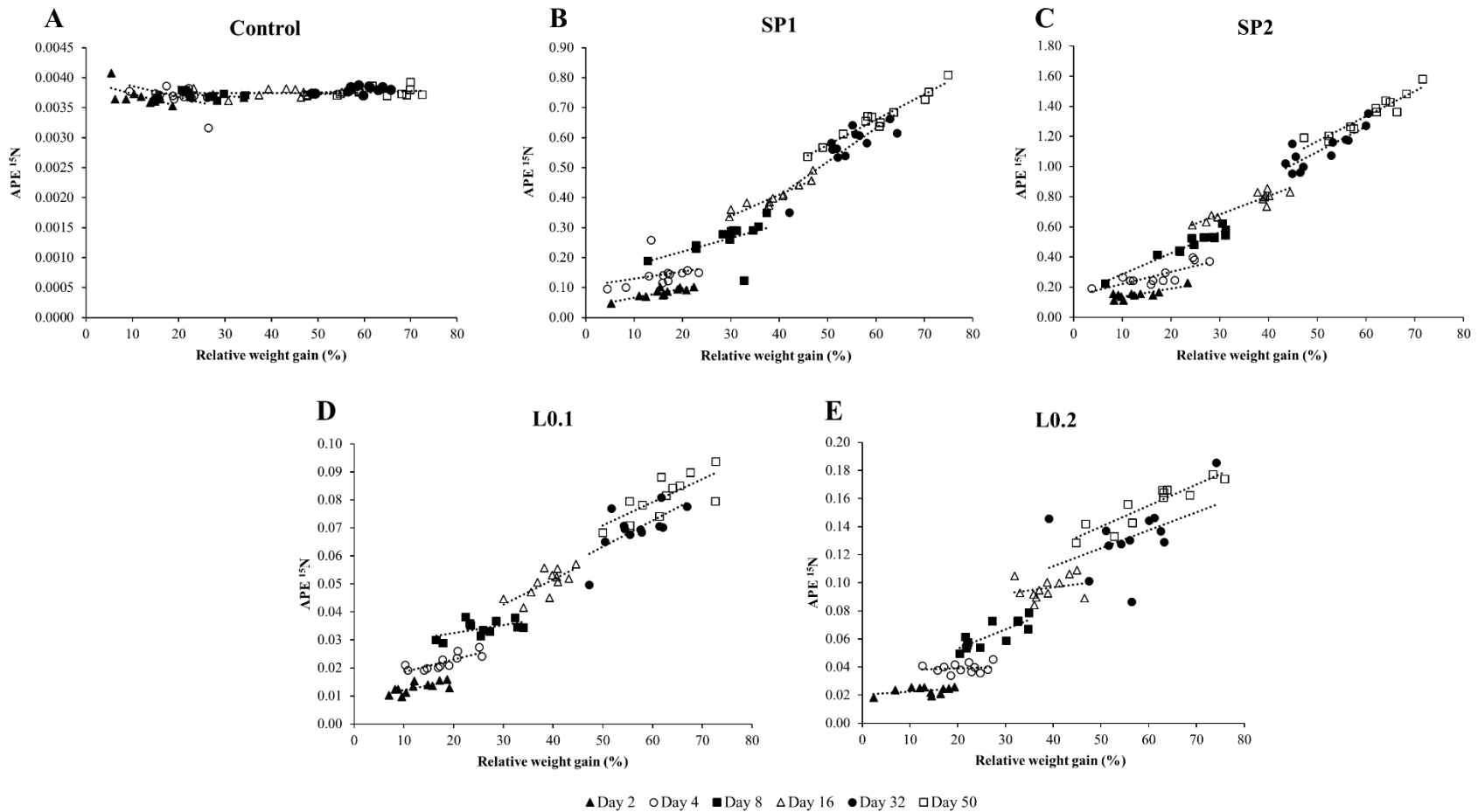
Diet	Days																	
	2			4			8			16			32			50		
	M	L	MI	M	L	MI	M	L	MI	M	L	MI	M	L	MI	M	L	MI
SP1	0.87*	0.66*	0.56	0.31	0.76*	0.65*	0.51	0.60*	0.49	0.92*	0.72*	0.75*	0.83*	0.62*	0.78*	0.98*	0.90*	0.86*
SP2	0.89*	0.88*	0.22	0.82*	0.72*	0.63*	0.97*	0.94*	0.90*	0.92*	0.91*	0.70*	0.85*	0.59*	0.25	0.95*	0.83*	0.54
L0.1	0.77*	0.39	0.41	0.81*	0.48	0.68*	0.53	0.51	0.24	0.72*	0.16	0.47	0.67*	0.78*	0.90*	0.75*	-0.09	0.43
L0.2	0.55	0.73*	0.59*	0.12	0.23	0.03	0.82*	0.49	0.78*	0.25	0.40	0.70*	0.46	0.68*	0.83*	0.92*	0.34	0.36

488



490  
 491 **Figure 1.** A schematic drawing illustrating the overall reflection of the regulation of growth over  
 492 time, synthesized on a new diet, with different colored fish resembling the metabolic breakdown  
 493 of tissues that were synthesized during feeding on the previous diet, and their subsequent  
 494 replacement and growth of tissues synthesized on a new diet.

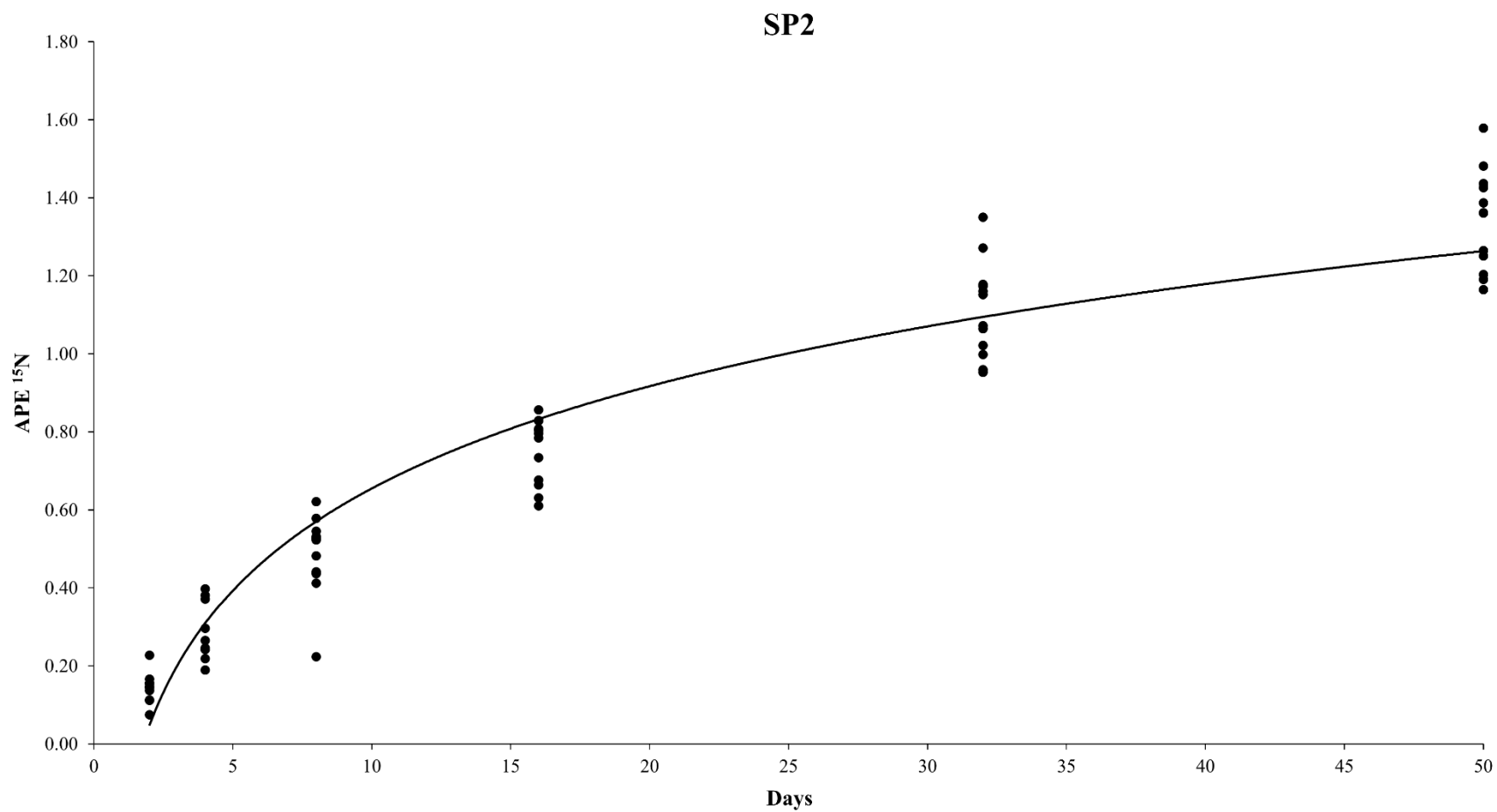
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513 **Figure 2.** Regression lines for the relationship between atom percentage excess (APE)  $^{15}\text{N}$  in muscle and individual relative weight  
 514 gain over time ( $n = 12$  at 2, 4, 8, 16, 32 and 50 days), for the (A) control (0% inclusion of  $^{15}\text{N}$ ), (B) SP1 (1% inclusion of  $^{15}\text{N}$  from  
 515 Spirulina), (C) SP2 (2% inclusion of  $^{15}\text{N}$  from Spirulina), (D) L0.1 (0.1% inclusion of  $^{15}\text{N}$  from L-Lysine) and (E) L0.2 (0.2%  
 516 inclusion of  $^{15}\text{N}$  from L-Lysine) diets.

517



519  
 520 **Figure 3.** Atom percentage excess (APE) <sup>15</sup>N and individual isotopic variation in muscle over time (n = 12 at 0, 2, 4, 8, 16, 32 and 50  
 521 days) in fish fed the SP2 (2% inclusion of <sup>15</sup>N) diet. The estimated regression line was:  $y = 0.38\ln(X) - 0.22$ , with  $R^2 = 0.93$ .