

# Isogenic lines of rainbow trout (Oncorhynchus mykiss) as a tool to assess how growth and feeding behaviour are correlated to feed efficiency in fish

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1	Isogenic lines of rainbow trout (Oncorhynchus mykiss) as a tool to assess how growth
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#### 15 Abstract

Accurately measuring individual feed intake is required to include feed efficiency (FE) as an 16 objective in commercial breeding programs. Phenotyping individual feed intake through 17 direct measurements remains complex in fish reared in groups. One way to overcome this 18 challenge is to find proxies for estimating FE. This study aimed to investigate the correlations 19 between fish FE and potential predictive criteria in rainbow trout Oncorhynchus mykiss. As 20 predictive criteria, we considered the variations of body weight assessed as thermal growth 21 coefficients (TGC) and the feeding behaviour assessed as the number of feed demands over a 22 period and the proportion of the demands made before noon. Feed intake was assessed over 23 three different periods in ten isogenic lines allowing a recording for each of the ten genotypes 24 while keeping fish in groups. The protocol consisted of two successive feed deprivation and 25 26 refeeding phases after initial basal growth periods. Correlations were then calculated between FE, measured either as feed conversion ratio (FCR) or residual feed intake (RFI), and the 27 28 different indirect criteria. We found positive phenotypic correlations between FCR and RFI over the feed intake measurement periods (r  $\ge$  0.79, P < 0.001). Assessment of the 29 relationship between FE traits (FCR and RFI) calculated over the three measurement periods 30 and TGC revealed no significant association. Regarding feeding behaviour, significant 31 differences in the daily profile of feed demands and their numbers were found among the ten 32 33 isogenic lines. RFI calculated from the first feed intake measurement period and feeding behaviour, assessed as the number of feed demands were positively correlated (r = 0.42-0.49, 34  $P \leq 0.022$ ). Nevertheless, such correlations were not established for the two other 35 measurement periods following feed deprivation. While we demonstrated that the weight 36 variations during feed deprivation are not a good proxy for FE (FCR or RFI) in rainbow trout, 37 we also highlighted the interest in exploring more the relationships between FE and feeding 38 behaviour in fish. 39

- 40 **Keywords:** feeding behaviour, fish, residual feed intake, thermal growth coefficient, weight
- 41 variations

#### 42 **1. Introduction**

Aquaculture is one of the fastest-growing animal protein supplies globally, while 43 approximately 70% of aquaculture production requires external feed inputs (FAO, 2020). 44 Nowadays, exogenous feeds for reared species are at the heart of concerns for the 45 sustainability of finfish aquaculture. While exogenous feeds can represent up to 70% of farm 46 costs (Doupé and Lymbery, 2004; de Verdal et al., 2018a), they are also responsible for 47 environmental impacts directly resulting from feeds manufacturing and then, indirectly, by the 48 release of nutrients by fish (Mente et al., 2006; Read and Fernandes, 2003). Furthermore, the 49 mobilization of resources and arable lands for aquafeed production raises concerns about 50 aquaculture's social impact (Troell et al., 2014). Therefore, selecting fish turning feeds 51 efficiently into meat is key to achieving the sustainable development of aquaculture. 52

In fish, feed efficiency (FE) has been traditionally measured by feed conversion ratio (FCR), 53 defined as the ratio of feed intake (FI) to weight gain. However, FCR values can result from 54 different biological conditions such as a reduced FI, an increase of biomass production or a 55 combination of both (Cantalapiedra-Hijar et al., 2020). Thereby, FCR is mainly used for the 56 zootechnical and economic performances assessment of a batch of animals at the farm level. 57 An alternative to FCR is the residual feed intake (RFI), defined as the difference between the 58 feed consumed by an animal and its expected consumption as predicted from a regression 59 model involving the requirements for maintenance and growth through the integration of 60 metabolic weight and weight gain over the recording period as the independent variables 61 (Koch et al., 1963). Therefore, contrary to FCR (Besson et al., 2020; Kause et al., 2006; 62 Thodesen et al., 1999), RFI is uncorrelated to body weight by construction and individuals 63 with a negative RFI are more efficient than the mean of the population, while individuals with 64 a positive RFI are less efficient. 65

Improvement of FE in fish can be achieved through various levers, including husbandry (El-66 67 Sayed, 2002; Yilmaz and Arabaci, 2010), nutrition (e.g., Bowyer et al., 2020; Xu et al., 2001), and genetic selection (e.g., de Verdal et al., 2018a, 2018b; Knap and Kause, 2018). Feed 68 efficiency is now among the main traits of interest for fish breeding programs (Chavanne et 69 al., 2016). However, except for family-based selection requiring heavy infrastructures and 70 human labour, as previously done for Atlantic salmon in Norway (Gjedrem, 2010), selection 71 for FE remains challenging, as the precise recording of individual FI is needed. Such 72 phenotyping is challenging in fish. Indeed, fish are usually reared in large groups making it 73 difficult to follow the FI of each individual. The usual way to measure FI in fish is to remove 74 75 and count uneaten pellets allowing to calculate FI as the difference between the weight of feed given and the weight of feed uneaten by fish (wasted) (Jobling et al., 2001). Other approaches 76 have been developed to measure individual FI in fish including the use of dyed feed, X-77 78 radiography and individual rearing (Besson et al., 2019; Jobling et al., 2001; Silverstein, 2006; Talbot and Higgins, 1983). An alternative method consisting of rearing small groups of 79 fish in aquaria (~5-15 fish together) with video recording has been proven to be efficient for 80 FI determination in fish (de Verdal et al., 2017, 2018b, 2019; Just et al., 2021) while 81 developments are currently performed to automate video analysis by artificial intelligence 82 83 (Zhou et al., 2018). Recently, Dvergedal et al. (2022) suggested that lipid deposition in rainbow trout Oncorhynchus mykiss, which is related to FE, could be phenotyped through the 84 C stable isotope contents in feeds and fish. Nevertheless, all of these methods have 85 86 limitations, including measurement inaccuracies with a lack of repeatability and/or measurement conditions too far from production conditions (reviewed by de Verdal et al. 87 (2018a)) while the most recent ones are still requiring methodological developments. 88

Because collecting individual FI data in fish through direct measurements remains complex,
many indirect criteria such as traits derived: 1) from bio-energetic models: lipid deposition,
nitrogen retention, oxygen consumption and 2) from growth models: growth and changes in

the body after starvation and refeeding periods, have been studied in recent years for 92 93 estimating FE. Focusing on body weight loss during starvation and gain during the subsequent refeeding period, Grima et al. (2010a, 2010b) suggested that selection for European seabass 94 Dicentrarchus labrax losing less weight during the starvation period should improve FE and 95 increase muscle fatness. However, in rainbow trout, Grima et al. (2008) did not find any 96 significant correlation between RFI and weight variations during starvation or refeeding 97 periods. However, they highlighted that an index combining growth performances over all the 98 experimental periods explained up to 59% of RFI variations. 99

100 Feed efficiency can also be linked to feeding behaviour. Indeed, several authors have shown that in terrestrial-farmed animals, feed-efficient individuals are less active while feeding (e.g., 101 Kelly et al., 2010; Montanholi et al., 2010). In fish, Martins et al. (2006) have shown that 102 103 African catfish Clarias gariepinus with lower RFI spend less time eating. In Nile tilapia Oreochromis niloticus, Martins et al. (2011a) found that RFI was negatively correlated with 104 105 feeding latency (i.e. the time each fish takes to consume the first pellet), while positive correlations were found with the total feeding time and the number of feeding acts. 106 Nevertheless, such relationships have been poorly investigated in the literature and, based on 107 108 the limited information available, seem to be contrasted depending on the size of the fish used 109 (Martins et al., 2011b).

On an experimental scale, one tool to overcome the drawbacks of the usual FI assessment 110 methods in fish is using isogenic lines (Franěk et al., 2020; Komen and Thorgaard, 2007a; 111 Quillet et al., 2007b). In such lines, all individuals are genetically identical. Crossing 112 individuals from two homozygous isogenic lines allows to obtain genetically identical but 113 heterozygous individuals in the next generation (de Verdal et al., 2018a). Although isogenic 114 115 lines are produced for experimental purposes only, they are an excellent tool for studying the variability of FE, which is highly sensitive to environmental variations. Because the genetic 116 variability within an isogenic line is null, fish belonging to the same line reared in the same 117

tank allow a precise assessment of FI of an individual genotype while maintaining social
interactions between individuals for each of the genotypes. In addition, combining
information from different isogenic lines gives access to the genetic variability of FE.

121 The aims of this study were: (1) to confirm the existence of genetic variability in FE, (2) to 122 estimate correlations between RFI, FCR and body weight variations during successive FD and 123 compensatory growth (CG) periods and (3) to investigate the link between feeding behaviour 124 and FE in rainbow trout.

#### 125 **2. Materials and Methods**

126 2.1. Ethical statement

All the experiments were carried out at the INRAE experimental facilities (PEIMA, INRAE,
2021, Fish Farming systems Experimental Facility, DOI: 10.15454/1.5572329612068406E12,
Sizun, France) authorised for animal experimentation under the French regulation D29-27702. The experiments were carried out from January 2008 to July 2009 following the
Guidelines of the National Legislation on Animal Care of the French Ministry of Research
(Decree N°2001-464, May 29, 2001). At this date, project authorisation was not required.
Experiments were conducted under the official license of M. Dupont-Nivet (A29102).

134 2.2. Heterozygous isogenic lines

135 Experimental fish were produced and reared in the INRAE experimental fish farm (PEIMA, Sizun, France) as described by Lallias et al. (2017) and Millot et al. (2014). Parents were 136 issued from the INRAE homozygous isogenic lines. These lines were previously established 137 after two generations of gynogenesis and further maintained within each line by single-pair 138 mating using sex-reversed XX males (Quillet et al., 2007b). Mating 24 homozygous females 139 from a single maternal isogenic line (spawning on the same day with similar egg weights) 140 with ten sex-reversed XX males from ten other homozygous isogenic lines produced ten 141 heterozygous isogenic lines. Eggs were mixed and then divided into ten batches, each batch 142

being fertilised by one of the ten homozygous males. To avoid confusion with the INRAE
homozygous isogenic lines, heterozygous lines will be named the line's original name where
the sire came from, plus "h" as heterozygous.

Since there is only one maternal line, progeny differs only through paternal genetic effects 146 across batches. Fertilised eggs were incubated at 11.4°C. At the eyed stage, 1500 eggs of each 147 of the ten produced heterozygous lines were distributed in 0.25  $m^3$  indoor tanks (n = 3 per 148 line, 500 fish per replicate) supplied with natural spring water at the same temperature. Fish 149 were transferred in 1.8 m<sup>3</sup> outdoor tanks (n=3 per line) supplied with dam water (11.3-16.0°C) 150 151 after 137 days post-fertilization (dpf) up to the end of the experiment (548 dpf). In order to keep a density below 50 kg m<sup>-3</sup>, regular random eliminations were performed, and 100 fish 152 per replicate remained at 548 dpf. Commercial pellets (BioMar's Biostart range and Le 153 154 Gouessant's B-Mega range) were distributed by automatic feeders during the indoor phase and self-feeders (Imetronic®, France) during the outdoor rearing phase (see Section 2.4.2 for 155 156 details). Feed ration was maintained ad libitum throughout the experiment. Mortality was checked every day. 157

158 2.3. Successive experimental phases

The experiment reported here started at the beginning of the outdoor rearing phase (i.e. 137 159 dpf). The experimental protocol is summarised in Figure 1. After two basal growth periods 160 161 separated by chronic stress (see Lallias et al. (2017) for details), the protocol consisted of two repeated phases of FD and refeeding periods. Following an FD period, fish tend to 162 compensate for the loss of growth experienced during the FD period by increasing their 163 growth more than usual, a phase known as the CG period (Ali et al., 2003). In literature, there 164 is a large variability in the protocols used to measure weight loss during FD, with 165 measurements performed on groups or on isolated fish, with different durations of feeding 166 periods, with repetitive FD periods or not, and with different sizes and ages of fish at the 167

beginning of the experiment (reviewed in Ali et al., 2003). Here, we followed a FD protocol adapted from Grima et al. (2008) and targeting an average weight loss equivalent to approximately 10% in order to be able to highlight contrasting performances between lines while avoiding deleterious effects. It is for this reason in particular that the duration of the second fasting phase was extended following an intermediate weighing (see below).

The experiment was divided into six different phases: two basal growth periods (bg<sub>1</sub>; from 173 day 1 to day 129, *i.e.* 128 d and bg<sub>2</sub>; from day 186 to day 277, *i.e.* 91 d), FD period 1 (fd<sub>1</sub>; 174 from day 278 to day 300, *i.e.* 22 d), CG period 1 (cg<sub>1</sub>; from day 301 to day 335, *i.e.* 34 d), FD 175 period 2 (fd<sub>2</sub>; from day 336 to day 387, *i.e.* 48 d), and CG period 2 (cg<sub>2</sub>; from day 388 to day 176 415, *i.e.* 29 d). Feed intake (FI) was measured three times during the experiment, as shown in 177 Figure 1. The first period of FI assessment was carried out from day 129 to day 161 (*i.e.* 32 d) 178 179 to provide FE of the tested isogenic lines under normal growth conditions. The period from day 162 to day 185 was not considered here because fish were exposed to stress challenges 180 181 which strongly influenced their growth (Figure 2B). Then, the other FI measurement periods (fi) were performed during  $cg_1$  and  $cg_2$ . 182

183 2.4. Traits measured

184 2.4.1. Body weight variations

Body weight was measured at the beginning and then 11 times throughout the experiment (n  $\approx$  100 fish per replicate). Fish were starved for 24h before any sampling. Weight gain or loss in each period of interest (*i.e.* bg<sub>1</sub>, bg<sub>2</sub>, fd<sub>1</sub>, cg<sub>1</sub>, fd<sub>2</sub>, cg<sub>2</sub>) was expressed as thermal growth coefficient (TGC), offering a standardised measure of growth that is unaffected by body weight, time interval, and water temperature (Iwama and Tautz, 1981; Grima et al., 2010b) that varied from 5 to 17°C over the experiment (Figure 2A). TGC was calculated according to the following equation:

$$TGC = \frac{(BW_f^{\frac{1}{3}} - BW_i^{\frac{1}{3}})}{\sum T} \times 1000$$

where  $BW_f$  and  $BW_i$  are the final and initial average body weights of the considered period, and  $\Sigma T$  is the sum of daily temperatures. Growth rates are referred to as  $TGC_{bg1}$ ,  $TGC_{bg2}$ , TGC<sub>fd1</sub>,  $TGC_{cg1}$ ,  $TGC_{fd2}$  and  $TGC_{cg2}$  for the different separated periods.

195 2.4.2. Feed efficiency and feed demands

Self-feeders were used throughout the experiment to characterise the feeding behaviour of 196 197 each isogenic line. This feeding technique is based on the learning ability of fish, and feed is delivered depending on their demand (Azzaydi et al., 2007). In a self-feeding system, fish are 198 assumed to precisely control the feed distribution by activating a "trigger" sensor (Mambrini 199 200 et al., 2004; da Silva et al., 2016). In order to limit involuntary demands and subsequent waste, sensors were placed just above the water. In addition, the self-feeders, one per tank, 201 were configured to make access to the pellets more difficult according to the quantity of feed 202 distributed over the day by increasing the inhibition time of the probe and by requiring two 203 triggerings for pellet distribution. The protocol was adjusted over time according to the 204 205 number of demands and the fish appetite. All the self-feeders were connected to a computer system (Imetronic®, France), allowing a continuous recording of all the fish's feed 206 distribution (sorted as rewarded demands when they led to feeding or unrewarded demands if 207 208 not) during the FI measurement periods.

209 Two indicators of FE were used. The first one was the feed conversion ratio calculated as210 follows:

$$FCR = \frac{FI}{BWG}$$

where FI is the feed intake and BWG is the body weight gain. Despite the simplicity of calculation and interpretation, one of the problems with FCR lies in the fact that the ratio obtained can result from different biological conditions: (1) a decrease in ingestion, (2) an
increase in growth or (3) a combination of the two (Cantalapiedra-Hijar et al., 2020). Other
criteria have been proposed in animal genetic selection to overcome the problems associated
with ratios. The most frequently used criterion by geneticists is the residual feed intake (RFI;
Koch et al., 1963), which was used as the second indicator for FE. RFI is calculated according
to the following equation:

$$RFI = FI - \beta_0 - \beta_1 x BW^{0.8} - \beta_2 x BWG$$

with  $\beta_0$  the regression intercept and  $\beta_1$  the partial regression coefficient of the animal's FI on metabolic body weight. Average weights over the measurement period  $(\frac{BW_{initial} + BW_{final}}{2})$  are scaled to metabolic weights (BW<sup>0.8</sup>; Clarke and Johnston, 1999; Jobling, 2002), while  $\beta_2$  is the partial regression coefficient of the animal's FI on BWG. This model allocates the FI according to expected maintenance and growth requirements, the remaining part being defined as the RFI (Koch et al., 1963; de Verdal et al., 2018a).

226 2.5. Statistical analyses

The significance level for statistical analyses was set to  $\alpha = 0.05$ . All statistics were performed using R freeware version 4.3.1 (R Development Core Team, 2020). The final body weight was compared between lines using a linear mixed model with "line" as a fixed effect and "replicate" as a random effect. The model was fitted using the *nlme* package, and contrasts were analysed using the *emmeans* package. Assumptions of normality and homoscedasticity were checked by visual inspections of residuals against fitted values.

Differences in weight variations, TGC, FI and RFI estimated for each experimental period between lines were tested using the aligned rank transformation for nonparametric factorial analysis (*art*(), *ARTool* package) using the tanks as the experimental units. Contrasts were computed using the function *art.con*() from the same R package. Regarding the feeding behaviour data, for each of the three FI measurement periods, the number of daily feed demands was compared between lines as described above for final weight. The daily feeding profile (% demand activity  $h^{-1}$  per day) for each FI measurement period was compared between lines with a generalised linear mixed model with "line" and "hour" as fixed effects while "replicate" was included as a random effect. The model was fitted using the *glmmTMB* package allowing to fit generalised linear mixed models with various extensions.

The correlations between the variables (averaged by tank for rewarded and unrewarded feed
demands) were examined with the *rcorr*() function of the *Hmisc* package.

### 246 3. Results and Discussion

### 247 3.1. Effects of feed deprivation on survival and growth

Feeding management regimes based on short cycles of FD/CG periods have been suggested to 248 improve water quality as well as reducing feed and labour costs in fish farming (Eroldoğan et 249 al., 2006; Hayward et al., 1997). Here, as expected, fish overcame starvation, and the two FD 250 periods did not affect survival in mortality rate (mortality rate < 1% over fd<sub>1</sub> and fd<sub>2</sub>). 251 Weatherley and Gill (1981) already highlighted the ability of rainbow trout to deal with 252 prolonged starvation (i.e. up to 13 weeks) without deleterious effects on subsequent 253 zootechnical performances. The final individual weights by line after the 415-d experiment 254 (*i.e.* 552 dpf) ranged from 704  $\pm$  119 g to 958  $\pm$  123 g for N38h and A02h, respectively 255 256 (Figure 2B), while TGC significantly differed between the lines over the experiment (P < P0.001). The ten lines differed slightly for response to FD, with an average weight loss ranging 257 from 5 to 10% during the first FD period (fd<sub>1</sub>) vs from 8 to 13% during the second FD period 258 (fd<sub>2</sub>), with significant differences recorded among the lines for both periods (P < 0.002). 259 These results confirm the existence of genetic variability in response to feed deprivation 260 (Grima et al., 2008) and highlight differences in the requirements for maintenance between 261

lines. Thermal growth coefficients estimated from the two FD periods were always highly 262 263 correlated with weight loss (r  $\ge$  0.96, P < 0.001; Table 1) and were significantly different between lines (TGC<sub>fd1</sub>: P < 0.001, and TGC<sub>fd2</sub>: P = 0.001; Table 2). The correlation between 264 TGC recorded during the two FD periods was low (TGC<sub>fd1</sub> and TGC<sub>fd2</sub>; r = 0.19, P = 0.326; 265 Table 1 and Figure 3). For the first CG period, the TGC average values ranged from 3.18 to 266 3.94 and were similar between lines (TGC<sub>cg1</sub>, P = 0.121; Table 2), while TGC values 267 estimated for the second CG period were ranging from 3.30 to 3.75 with a significant line 268 effect (TGC<sub>cg2</sub>, P = 0.007; Table 2). In contrast, TGC recorded during the two CG periods 269 was moderately but significantly correlated (TGC<sub>cg1</sub> and TGC<sub>cg2</sub>; r = 0.39, P = 0.035; Table 270 271 1). Overall, the lines that lost the least weight during the FD periods are those that gained the 272 most during the CG periods, with a significant negative correlation observed between TGC<sub>fd1</sub> and TGC<sub>cg1</sub> (r = -0.53, P = 0.003; Table 1). These findings are in accordance with Dupont-273 Prinet et al. (2010) showing that there was a negative correlation between body weight losses 274 during FD and body weight gain during CG in European sea bass. 275

The differing level of response between the periods may also be the consequence of rapid fish adaptation to a repeated cycle of feed deprivation and refeeding (Blake et al., 2006), with modulation of their physiological responses as suggested by Grima et al. (2008).

### 279 3.2. Feed intake and feed efficiency measurements

The duration of the feed efficiency measurement period can affect the quality of the trait measurement and the correlations with other measured performances. There are many examples in terrestrial animals (e.g., Archer and Bergh, 2000; Wang et al., 2006). In fish, mainly because of the difficulties inherent in measuring individual FI, most of the studies focusing on correlations between traits limited the duration of individual FI measurement periods between 7 to 21 days (e.g., Besson et al., 2019; de Verdal et al., 2018b; Grima et al., 2008: 2010). Interestingly, Rodde et al. (2020) demonstrated that selecting Nile tilapia based on a 2-weeks FCR measurement instead of a 6-month FCR was efficient to rank of the fish
suggesting that short FI measurement periods can be an efficient tool for FE selection in fish.

289 In our study, for each isogenic line, keeping fish in a group allowed us to record FI (see Table 2) from at least 29 consecutive days. This period exceeds the number of meals needed to 290 obtain a reliable mean value of FI in Nile tilapia (i.e. at least 11 out of 19 meals over a 10-day 291 period; de Verdal et al., 2018b) while maintaining social interactions between individuals for 292 each genotype. In this study, measurements of FI were performed either during the basal 293 294 growth period (fi<sub>1</sub>) or in CG periods (fi<sub>2</sub> and fi<sub>3</sub>). We observed that the increase in FI between fi1 and fi2 was, overall, low and line dependent, while FIfi3 was considerably higher in the ten 295 lines (Table 2). Most studies agree that compensatory growth in fishes is enabled by an 296 297 increase in FI, even if the pattern of FI differs between species (Wu et al., 2002). The 298 effective improvement of FE during compensatory growth is debatable. It was demonstrated in rainbow trout (Nikki et al., 2004) and pikeperch Sander lucioperca (Mattila et al., 2009) 299 300 that compensatory growth was permitted by increasing FI but with no improvement of FE. In contrast, Mambrini et al. (2004) in rainbow trout and Oh et al. (2007) in red sea bream Pagrus 301 302 major observed both an improvement of FE measured as the inverse of FCR and a rise of FI during refeeding in fasted fish compared to control unfasted fish. 303

We found significant differences in FCR and RFI between lines only in fi2, while variability in 304 FCR and RFI remains high among the replicates of a given line (Table 2). Over the second FI 305 306 measurement period (*i.e.* fi<sub>2</sub>), the line A22h was the most feed-efficient with values of FCR and RFI of  $0.79 \pm 0.02$  and  $-15.38 \pm 4.15$ , respectively, while A36h was the less feed-efficient 307 line with FCR of  $0.96 \pm 0.10$  and RFI of  $18.58 \pm 19.00$  (Table 2). Few studies investigated the 308 correlations between FCR and RFI in fish. Overall, we found high phenotypic correlations 309 between FCR and RFI measured over the same period, with a slightly lower correlation 310 during the first period (fi<sub>1</sub>; r = 0.79, P < 0.001; Figure 3) and very high during the last two 311 measurement periods (fi<sub>2</sub> and fi<sub>3</sub>; r = 0.99 and 0.97, P < 0.001; Figure 3). These results are in 312

line with the literature on rainbow trout. Indeed, Kause et al. (2016) found strong positive 313 314 phenotypic correlations between FCR and RFI in fish older than two years. Based on the data from Grima (2010) and Grima et al. (2008), we were able to recalculate a positive phenotypic 315 correlation between FCR and RFI in isogenic lines of rainbow trout with fish of comparable 316 size to the individuals used in our experiment. Using ten different isogenic lines, we 317 confirmed genetic-based variation of FE in rainbow trout, a requirement to implement 318 319 breeding programs. However, such variations are not consistent over time, presumably due to the feeding practice. Indeed, while previous works argued that self-feeding minimises 320 competition for feed because feed is more accessible (Boujard et al., 2002; Mambrini et al., 321 322 2004), the observed high variability in FCR and especially RFI between replicates of a given isogenic line suggested that social interactions can strongly affect FE even when fish are fed 323 using self-feeders. Indeed, within the same rearing unit, FI is not necessarily homogeneous 324 325 among fish, and this can be exacerbated using self-feeders where a few high-triggering fish can drive group feeding behaviour, as shown in European sea bass and such social 326 interactions can change over time (Millot and Bégout, 2009). 327

Overall, the correlations between the three FCR and the three RFI values derived from the 328 three FI periods were, as shown in Figure 3, low between FCR<sub>fi1</sub>, RFI<sub>fi1</sub> and the two other 329 measurements (FCR<sub>fi2</sub> and FCR<sub>fi3</sub>: r = 0.11 and 0.12,  $P \ge 0.450$ ; RFI<sub>fi2</sub> and RFI<sub>fi3</sub>: r = 0.14, P 330 331  $\geq 0.468$ ). Interestingly, the correlations were significant only between the last two FCR and the last two RFI measured during CG periods (r = 0.53 and 0.55,  $P \leq 0.003$ ). Such 332 inconsistency over time can be explained by: (1) the difference in age of the fish and/or (2) 333 the fact that the two last FI measurement periods occurred after feed deprivation in large fish 334  $(\geq 350 \text{ g})$  while the first FI period was done during a basal growth period in smaller fish ( $\leq$ 335 200 g). Here, the phenotypic correlations established between the FCR and RFI measured at 336 three different periods indicate that these traits are reliable for phenotyping FE but may 337 require repeated measurements. These results suggest that our measurement methodology, 338

allowing FI recording over several consecutive weeks, exhibits relatively high repeatability.
Nevertheless, although of high experimental interest, the acquisition of individual FI value for
each genotype from fish kept in groups is conditioned by the use of isogenic lines and,
therefore, this method is not directly applicable in a breeding program.

343 3.3. Correlations between feed efficiency and weight variations

We did not find significant phenotypic correlations between TGC recorded in basal growth 344 periods (TGC<sub>bg1</sub> and TGC<sub>bg2</sub>) and FE traits (FCR and RFI) (Figure 3). In livestock species, FE 345 is generally correlated with growth, but this is still debatable in fish. In rainbow trout, while 346 Silverstein (2006) estimated negative phenotypic correlations between TGC and RFI (r = -347 348 0.57 to -0.31), Kause et al. (2016) found no phenotypic correlations between daily weight 349 gain (DWG) and RFI (r = 0.08). Interestingly, strong genetic correlations have been highlighted between DWG and FCR (r = -0.63  $\pm$  0.30; Kause et al., 2016) and between BW 350 and inverse of FCR (r = 0.63-0.99; Henryon et al., 2002). Nevertheless, no significant genetic 351 correlations have been found between DWG and RFI (Kause et al., 2016). 352

In practice, fish breeders expect to improve FE by selecting the fasted growing fish, 353 hypothesising that faster-growing fish will be more efficient (Besson et al., 2020; Kause et al., 354 2016; Knap and Kause, 2018). Still, few selection response studies have investigated the 355 correlated response in FE to selection for growth and provided contrasting results. Recently, 356 Vandeputte et al. (2022) estimated realised genetic gains on FCR and other traits in a 357 commercial population of rainbow trout selected for improved growth, carcass yield and fillet 358 359 fat over ten generations. The authors demonstrated significant improvement in FCR even if the trait was not directly included in the breeding goal. 360

We based our study on previous works showing that performance traits (i.e. weight variations) during successive FD periods can be correlated to FE in fish (e.g. Grima et al., 2010; Li et al., 2005). In our experiment, an assessment of the relationship between FE traits (FCR and RFI)

calculated over the three FI measurement periods and growth-related traits (TGC) revealed no 364 365 significant correlation. In particular, the correlations between RFI during the basal growth period (i.e.  $RFI_{fi1}$ ) and  $TGC_{fd1}$  or  $TGC_{fd2}$  were very low (r = 0.08 and r = -0.14, respectively; 366 Figure 3). The only exception was the significant negative correlations between  $TGC_{fd2}$  and 367 FCR<sub>fi2</sub> or RFI<sub>fi2</sub> with respective r = -0.49 and -0.47 ( $P \le 0.006$ ) (Figure 3). These results 368 suggest that the fish that had lost the least weight during the second phase of FD were the 369 most feed efficient during the previous CG period (fi<sub>2</sub>). Using weight loss during FD periods 370 as an indirect criterion to select FE required that it is genetically correlated to RFI, the most 371 interesting FE trait in selection (see Section 2.4.2). Here, we found limited phenotypic 372 correlations between the TGC measured during FD periods (TGC<sub>fd1</sub> or TGC<sub>fd2</sub>) and RFI 373 measured either during basal growth (RFI<sub>fi1</sub>:  $r \le 0.08$ ,  $P \ge 0.471$ ) or during the second CG 374 period (RFI<sub>fi3</sub>:  $r \le 0.18 P \ge 0.184$ ) (Figure 3), raising questions about the interest of such a 375 criterion to evaluate FE in rainbow trout. Indeed, based on our estimates of phenotypic 376 377 correlations, we can reasonably assume that the genetic correlations between these traits are probably weak. Nevertheless, in Nile tilapia, although de Verdal et al. (2018b) found a weak 378 phenotypic correlation between RFI and TGC during the FD period (r = 0.09), the genetic 379 380 correlation was high (r = 0.70), indicating that TGC during FD period could be a promising selection criterion for FE in this species. Such a relationship needs to be confirmed in rainbow 381 trout, and based on current knowledge, there is no strong evidence of the interest in using 382 such an indirect selection criterion for FE in rainbow trout. 383

384 3.4. Feeding behaviour and its link with FE

One of the originalities of this work was the assessment of the relationship between FE traits (FCR and RFI) and feeding behaviour assessed by the number of feed demands over a given period and the proportion of the demands made before noon. The daily profile of feeding behaviour during the three FI measurement periods is presented in Figure 4A; more details on the number of total feed demands per hour per line over the three FI measurement periods are

available in the Supplementary Material (Figure A1). Over the three periods, feeding 390 391 behaviour changed over the hours (P < 0.001). Nocturnal demands were only occasional, as expected, because demands were rewarded only during the daylight hours. Even if limited re-392 rankings were observed between lines, the daily feed demand profiles remained similar 393 between fi1 and fi2, with, on average, 37-72% and 56-80% of the feed demands occurring in 394 the morning. The morning feeding activity of fish is even more pronounced in fi3, with 76-395 90% of demands recorded before noon (Figure 4A). There is limited information on how 396 these seasonal or circannual rhythms influence feeding behaviour in fish, making it complex 397 to give a straightforward conclusion about feeding activities and associated seasonal changes 398 399 (Assan et al., 2021). Nevertheless, we can reasonably assume that the seasonal difference between the fi periods (autumn for fi1 and spring-summer for fi2 and fi3) may, at least 400 partially, explain the changes observed in the daily feeding profile (Figure A1). 401

Significant differences in the daily profile of feed demands among the ten isogenic lines were 402 found for the first FI measurement periods (fi<sub>1</sub> and fi<sub>2</sub>;  $P \leq 0.001$ ). Significant interactions 403 between lines and time of the day were found ( $P \leq 0.001$ ), suggesting that the effects of time 404 405 of day were line-dependent. In fi<sub>3</sub>, daily feeding activity remained similar between lines (P =0.421), while the number of feed demands per day remained constant between lines (P =406 0.227, Figure 4B). Mambrini et al. (2004) highlighted, in brown trout, that a line selected for 407 growth over five generations exhibited a more important morning feeding activity than the 408 409 control line, maintained under the same rearing conditions, even if the variations in feeding 410 activity between lines were not constant over time. Here, we did not find significant correlations between the proportion of the feed demand occurring in the morning and the 411 TGC (Figure 3), suggesting that growth performances in isogenic lines are not related to the 412 feeding profile of the fish. 413

In our study, the daily distribution of feed demands and their number were recorded asphenotypes for feeding behaviour. Indeed, the self-feeders allow continuous recording of feed

demands (rewarded or not, as described in Section 2.4.2) without disturbing the behaviour of 416 417 the fish group in the tank. Interestingly, we found significant positive correlations between RFI calculated from the first feed intake measurement period (RFI<sub>fi1</sub>) and feeding behaviour, 418 assessed as the number of feed demands (*i.e.* rewarded, unrewarded and both of them) over 419 the same period (r = 0.42-0.49,  $P \leq 0.022$ ; Figure 3). It is interesting to note that the fact that 420 the requests are rewarded or not has no influence on the correlations with the RFI. While the 421 number of rewarded demands reflects FI, this is, by definition, not the case for unrewarded 422 demands. Thus, we can hypothesise that this latter phenotype better reflects the motivation of 423 fish for food (i.e. appetite). In other words, in the described rearing conditions, the most feed 424 425 efficient isogenic lines (lower FCR and RFI) were the ones that requested less feed via the 426 self-feeders and presumably had less appetite. In fi3, we found significant negative correlations between FCR or RFI and the proportion of the feed demands done in the morning 427 (r = -0.41 and -0.38,  $P \leq 0.038$ ; Figure 3), meaning that the most efficient fish had a higher 428 feeding activity in the morning. 429

The assessment of feeding behaviour in fish is done through various criteria (e.g., number of 430 feed demands, feeding latency, feeding consistency and total feeding time), making 431 comparisons between studies difficult. Nevertheless, our results are in accordance with 432 previous results in African catfish (Martins et al., 2006) and Nile tilapia (Martins et al., 433 2011a) that found significant positive phenotypic correlations between feeding behaviour 434 (measured as feeding latency, feeding time and the number of feeding acts) and RFI while 435 436 they did not find significant correlations with FCR. In another study in Nile tilapia, Martins et al. (2011b) found that the correlations between feeding behaviour, measured using the same 437 traits as described above, and RFI depends on the age of the fish. Mas-Muñoz et al. (2011) 438 439 also highlighted that consistency in feeding activity might be related to FE in common sole Solea solea. They found that fish which feed more consistently over time (within the day and 440 over days) showed higher FI and growth but tend to be less feed efficient. 441

442 Overall, the feeding behaviour differences we observed between isogenic lines highlight the 443 interest to look at the genetic basis of fish feeding behaviour. There is growing evidence of a 444 relationship between FE traits, especially RFI, and feeding behaviour traits in fish, and this 445 study confirms such relationships in rainbow trout while highlighting the need for repeated 446 measurements over time. Therefore, special attention should be paid to feeding behaviour that 447 may be of interest in breeding programs for fish.

To conclude, we highlighted, using repeated measurements of FE traits (FCR and RFI), that 448 the growth performances observed during FD periods are not easily linked to variations in FE 449 measured in rainbow trout, suggesting that such indirect criteria for FE are not appropriate in 450 selection. Interestingly, we highlighted some relationships between FE and feeding behaviour 451 (*i.e.* number of feed demands over a period and the proportion of the demands made before 452 453 noon) while the use of isogenic lines demonstrated the genetic basis of feeding behaviour. Overall, these results support the interest in exploring phenotypes of feeding behaviour as 454 455 potential proxies of FE for improving RFI in rainbow trout through selective breeding.

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#### 693 Captions to Figures

Figure 1. Schematic outline and time frame of the experiment performed using ten rainbow trout isogenic lines. All the different experimental periods are indicated: basal growth periods ( $bg_1$  and  $bg_2$ ), feed deprivations periods ( $fd_1$  and  $fd_2$ ) and compensatory growth periods ( $cg_1$ and  $cg_2$ ) and the different traits recorded as well: Thermal Growth Coefficients (TGC), Residual Feed Intake (RFI) and feed demands.

Figure 2. Temperature profile (A) and growth kinetics of the ten isogenic lines (B) over the experiment. Values are Means  $\pm$  SD (n = 3). The different experimental periods are indicated in black: basal growth periods (bg<sub>1</sub> and bg<sub>2</sub>), FD periods (fd<sub>1</sub> and fd<sub>2</sub>) and CG periods (cg<sub>1</sub> and cg<sub>2</sub>). Letters denote significant differences in final weights between lines.

703 Figure 3. Correlation coefficients of all the measured phenotypes related to (1) Feed efficiency (FCR and RFI) and feed intake (FI) estimated during the three feed intake 704 705 measurements periods (fi); (2) Weight assessed as TGC over all the experimental periods (bg, fd and cg); and 3) Feed demands over the three feed intake measurements periods considering 706 all the demands ("Demands"), the unrewarded demands ("Demands U"), the rewarded 707 demands ("Demands\_R") or the proportion of the demands made before noon 708 ("Morning %"). The size and the colour gradient of the squares denote the intensity of the 709 correlations. Significant correlations (p < 0.05) are highlighted in red. 710

Figure 4. (A) Feeding behaviour expressed as the cumulative feed demands (% h<sup>-1</sup>) in the ten isogenic lines fed using self-feeders: from d 129 to d 161 (fi<sub>1</sub>), from d 301 to d 335 (fi<sub>2</sub>) and from d 388 to d 415 (fi<sub>3</sub>). In order to facilitate reading, values are the means of three replicates and SD were not represented. (B) Daily demands of the ten isogenic lines over fi<sub>1</sub>, fi<sub>2</sub> and fi<sub>3</sub> periods. Letters denote significant differences in daily feed demands between lines.



716 Figure 1



717 Figure 2



718 Figure 3





Table 1. Correlations between body weight variations (BWG; %) over FD periods ( $fd_1$  and  $fd_2$ ) and CG periods ( $cg_1$  and  $cg_2$ ) and Thermal Growth Coefficients (TGC) calculated for the same experimental periods. Significant correlations are highlighted in bold.

	BWG <sub>fd1</sub>	TGC <sub>fd1</sub>	$BWG_{cg1}$	TGC <sub>cg1</sub>	BWG <sub>fd2</sub>	TGC <sub>fd2</sub>	BWG <sub>cg2</sub>	TGC <sub>cg2</sub>
BWG <sub>fd1</sub>		-	-	-	-	-	-	-
TGC <sub>fd1</sub>	0.99		-	-	-	-	-	-
BWG <sub>cg1</sub>	-0.38	-0.37		-	-	-	-	-
TGC <sub>cg1</sub>	-0.49	-0.53	0.90		-	-	-	-
BWG <sub>fd2</sub>	0.09	0.05	-0.15	-0.02		-	-	-
TGC <sub>fd2</sub>	0.20	0.19	-0.23	-0.21	0.96		-	-
BWG <sub>cg2</sub>	-0.02	0.04	0.16	-0.04	-0.23	-0.14		-
TGC <sub>cg2</sub>	-0.27	-0.28	0.34	0.39	-0.04	-0.12	0.80	

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Table 2. Thermal growth coefficient (TGC) in 10 rainbow trout isogenic lines during two basal growth periods ( $bg_1$  and  $bg_2$ ), followed by two periods of FD (fd<sub>1</sub> and fd<sub>2</sub>) alternated with two periods of CG ( $cg_1$  and  $cg_2$ ); Feed intake, FCR and RFI calculated from the three feed intake measurement periods (fi<sub>1</sub>, fi<sub>2</sub> and fi<sub>3</sub>). Values are Means ± SD. Letters denote significant differences (p < 0.05).

Troite	Isogenic lines									
Traits	A02h	A03h	A22h	A36h	AB1h	AP2h	B45h	B61h	N38h	R25h
Thermal growth coefficients (TGC)										
$bg_1$	$2.00\pm0.10^a$	$1.81\pm0.16^a$	$1.80\pm0.04^{a}$	$1.80\pm0.03^{a}$	$1.87\pm0.11^{a}$	$1.94\pm0.15^{\rm a}$	$1.88\pm0.06^{a}$	$1.89\pm0.11^{a}$	$1.99\pm0.11^{a}$	$1.91 \pm 0.08^a$
$bg_2$	$1.95\pm0.07^{a}$	$1.54\pm0.10^{bc}$	$2.01\pm0.35^{ab}$	$1.65\pm0.26^{abc}$	$2.04\pm0.15^a$	$1.58\pm0.23^{abc}$	$1.71\pm0.12^{abc}$	$1.61\pm0.10^{abc}$	$0.67\pm0.22^{\rm c}$	$1.33\pm0.28^{c}$
$\mathrm{fd}_1$	$\textbf{-1.49} \pm 0.07^{ab}$	$\textbf{-0.87} \pm 0.09^{c}$	$\textbf{-1.58} \pm 0.38^{ab}$	$\textbf{-1.15}\pm0.35^{abc}$	$\textbf{-1.17} \pm 0.16^{abc}$	$\textbf{-1.15} \pm 0.26^{abc}$	$\textbf{-1.62}\pm0.22^{a}$	$\textbf{-0.97} \pm 0.26^{bc}$	$\textbf{-0.72} \pm 0.23^{c}$	$\textbf{-1.09} \pm 0.10^{abc}$
$cg_1$	$3.94\pm0.22^{a}$	$3.52\pm0.29^{a}$	$3.73\pm0.20^a$	$3.66\pm0.06^a$	$3.58\pm0.03^a$	$3.18\pm0.48^a$	$3.73\pm0.31^{a}$	$3.61\pm0.11^a$	$3.25\pm0.52^{a}$	$3.73\pm0.17^a$
$\mathrm{fd}_2$	$\textbf{-0.49} \pm 0.03^{ab}$	$\textbf{-0.51} \pm 0.02^{ab}$	$\textbf{-0.51} \pm 0.01^{ab}$	$\textbf{-0.68} \pm 0.15^a$	$\textbf{-0.50} \pm 0.08^{ab}$	$\textbf{-0.44} \pm 0.03^{b}$	$\textbf{-0.59} \pm 0.02^{a}$	$\textbf{-0.55} \pm 0.05^{ab}$	$\textbf{-0.50} \pm 0.01^{ab}$	$\textbf{-0.58} \pm 0.05^a$
$cg_2$	$3.52\pm0.07^{ab}$	$3.75\pm0.15^a$	$3.72\pm0.17^{ab}$	$3.50\pm0.09^{ab}$	$3.66\pm0.10^{ab}$	$3.30\pm0.49^{ab}$	$3.86\pm0.23^a$	$3.64\pm0.09^{ab}$	$3.40\pm0.09^{b}$	$3.53\pm0.07^{ab}$
Feed intake $(g kg^{-1} d^{-1})$										
$fi_1$	$14.4\pm0.81^{ab}$	$13.5\pm2.39^{ab}$	$12.1\pm2.11^{ab}$	$15.5\pm1.15^{ab}$	$11.7\pm2.78^{ab}$	$11.8 \pm 1.94^{ab}$	$16.3\pm1.73^a$	$15.0\pm0.50^{ab}$	$10.2\pm1.63^{\text{b}}$	$14.0\pm0.84^{ab}$
$fi_2$	$14.6\pm0.96^a$	$14.9 \pm 1.74^{a}$	$13.6\pm0.64^{a}$	$16.6\pm0.82^{a}$	$13.3\pm0.54^{a}$	$12.3\pm1.94^{a}$	$14.1 \pm 1.41^{a}$	$13.5\pm0.31^a$	$13.4\pm3.12^{a}$	$15.8\pm0.95^{a}$
$fi_3$	$20.5\pm0.80^a$	$24.6\pm1.55^a$	$22.7\pm2.07^a$	$23.9\pm1.66^a$	$21.8\pm0.95^a$	$20.7\pm4.37^{a}$	$23.6\pm1.81^a$	$22.6\pm1.75^a$	$22.7\pm0.71^a$	$22.4\pm0.90^a$
Feed conversion ratio (FCR)										
$fi_1$	$0.78\pm0.05^{a}$	$0.94\pm0.06^{a}$	$0.79\pm0.01^{a}$	$0.83\pm0.06^{a}$	$0.82\pm0.08^{a}$	$0.90\pm0.05^{a}$	$0.83\pm0.08^{a}$	$0.82\pm0.05^{a}$	$0.88\pm0.08^{\rm a}$	$0.81\pm0.02^{a}$
$fi_2$	$0.86\pm0.02^{abc}$	$0.90\pm0.02^{ab}$	$0.79\pm0.02^{c}$	$0.96\pm0.10^{ab}$	$0.84\pm0.03^{abc}$	$0.84\pm0.03^{abc}$	$0.83\pm0.02^{abc}$	$0.82\pm0.03^{ac}$	$0.87\pm0.07^{abc}$	$0.94\pm0.03^{b}$
$fi_3$	$0.95\pm0.02^{a}$	$0.95\pm0.03^{a}$	$0.91\pm0.02^{a}$	$0.99\pm0.02^{a}$	$0.93\pm0.03^{a}$	$0.92\pm0.10^{a}$	$0.93 \pm 0.04^{a}$	$0.94\pm0.05^{a}$	$0.96\pm0.04^{a}$	$0.99\pm0.01^{a}$
Residual feed intake (RFI)										
$fi_1$	$-2.85\pm4.02^{a}$	$4.18\pm0.27^{a}$	$\textbf{-4.92} \pm 2.50^{a}$	$1.53\pm5.02^{a}$	$\textbf{-2.97} \pm 5.08^a$	$2.09\pm3.45^{\rm a}$	$3.47\pm8.08^{a}$	$0.78\pm4.36^a$	$\textbf{-0.58} \pm 3.83^a$	$\textbf{-0.72} \pm 1.80^{a}$
$fi_2$	$-3.41\pm4.74^{abcd}$	$5.73\pm3.76^{abc}$	$\textbf{-15.38} \pm 4.15^d$	$18.58 \pm 19.00^{ac}$	$-4.74\pm5.81^{abcd}$	$\textbf{-2.57} \pm 4.03^{abcd}$	$\text{-}7.05\pm3.34^{abd}$	$\textbf{-9.49} \pm 5.82^{bd}$	$1.78 \pm 11.12^{abcd}$	$16.56\pm8.07^{c}$
$fi_3$	$-0.90\pm5.30^{\mathrm{a}}$	$2.49\pm8.45^a$	$\textbf{-10.39} \pm 5.96^a$	$13.29\pm5.65^a$	$\textbf{-6.57} \pm 9.88^a$	$\textbf{-3.17} \pm 21.89^a$	$-6.91 \pm 11.63^{a}$	$-3.26 \pm 15.71^{a}$	$4.70\pm9.75^{a}$	$10.73\pm3.03^{\rm a}$
727										