

1 **Effects of ambient oxygen and size-selective mortality on growth and maturation**  
2 **in guppies**

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17 **Lay summary**

18 Human activities, e.g., nutrient enrichment (resulting in low oxygen) and selective  
19 fishing (i.e., higher mortality on large fish) affect growth and maturation (key  
20 characteristics determining fish life history). We investigated combined effects of  
21 oxygen and size-dependent mortality on growth and maturation to provide informed  
22 management decision for these events.

23 **Word count:** 6149

24

25 **Summary**

26 Growth, onset of maturity and investment in reproduction are key traits for  
27 understanding variation in life-history strategies. Many environmental factors affect  
28 variation in these traits, but for fish hypoxia and size-dependent mortality have  
29 become increasingly important due to human activities, such as increased nutrient  
30 enrichment (eutrophication), climate warming, and selective fishing. Here we  
31 experimentally study the effect of oxygen availability on maturation and growth in  
32 guppies *Poecilia reticulata* from two different selected lines, one subjected to positive  
33 and the other negative size-dependent fishing. This is the first study to jointly assess  
34 the effects of reduced ambient oxygen and size-dependent mortality in fish. We show  
35 that reduced ambient oxygen led to stunting, early maturation and high reproductive  
36 investment. Similarly, lineages that had been exposed to high mortality on larger-  
37 sized individuals displayed earlier maturation at smaller size, greater investment in  
38 reproduction and faster growth. These life-history changes were particularly evident  
39 for males. The widely reported trends towards earlier maturation in wild fish  
40 populations are often interpreted as resulting from size-selective fishing. Our results  
41 highlight that reduced ambient oxygen, which has received little experimental

42 investigation to date, can lead to similar phenotypic changes. Thus, changes in  
43 ambient oxygen levels can be a confounding factor that occurs in parallel with fishing,  
44 complicating the causal interpretation of changes in life-history traits. We believe that  
45 better disentangling the effects of these two extrinsic factors, which increasingly  
46 affect many freshwater and marine ecosystems, is important for making more  
47 informed management decisions.

48

49 **Key words** Fishing selection, hypoxia, eutrophication, life history, *Poecilia*  
50 *reticulata*, water management

51

## 52 **Introduction**

53 Maturation determines the beginning of the reproductive part of an individual's life  
54 cycle and is costly in terms of survival and energy. The age and size at which an  
55 individual matures are therefore key life-history traits. Growth determines the  
56 relationship between age and size, the latter being also a key determinant of survival  
57 and fecundity. Thus, studying the effects of different extrinsic factors on growth and  
58 maturity is important for understanding the variation in life-history strategies (Roff,  
59 1992; Stearns, 1992; 2000).

60

61 Many different environmental factors, such as food availability, temperature, oxygen  
62 and presence of predators, affect the acquisition and allocation of resources to growth,  
63 maturation and reproduction (Berner and Blanckenhorn, 2007; Enberg *et al.*, 2012).

64 Two factors affecting life-history traits are of particular interest in fishes: oxygen and  
65 size-dependent mortality. Oxygen is one of the most critical physical constraints for  
66 aquatic animals (Ross, 2000; Pauly, 2010): water is a dense, viscous medium that

67 contains little oxygen compared to air, only small quantities of oxygen can be  
68 dissolved, and respiratory areas do not grow as fast as body weight (Pauly, 1981,  
69 2010). Oxygen demand is proportional to rate of metabolism and increases with, e.g.,  
70 body size and stress. Low-oxygen conditions occur naturally in many closed water  
71 bodies and in the oxygen minimum zones of the World Ocean, but oxygen depletion  
72 is also getting increasingly prevalent in freshwater and marine ecosystems due to  
73 increasing eutrophication and temperature (Diaz and Rosenberg, 2008; Doney *et al.*,  
74 2012; Jenny *et al.*, 2016). Importantly, temperature plays a dual role: increasing  
75 temperature reduces the solubility of oxygen, while in ectotherms, it also increases the  
76 metabolic demand for oxygen (Pörtner and Knust, 2007; Holt and Jørgensen, 2015).

77

78 Similar to the oxygen depletion, size-dependent mortality occurs naturally but can be  
79 influenced by human activities. Size-dependent natural mortality is driven by the  
80 presence of predators that commonly prey more heavily on smaller size-classes, i.e., is  
81 negatively size-selective (Sogard, 1997; Lorenzen, 1996; Gislason *et al.*, 2010). In  
82 contrast, fishing most often targets large-sized fish (i.e., is positively size-selective).  
83 Fishing pressure has increased since the middle of the past century, mainly targeting  
84 large individuals and higher trophic levels (Pauly *et al.*, 2002; Kolding *et al.*, 2016).  
85 Importantly, reduced oxygen levels and increased size-selective fishing co-occur in  
86 many aquatic ecosystems, for instance in lake Victoria (Kolding *et al.*, 2008b),  
87 Swedish west coast (Kattegat and Skagerrak; Cardinale and Svedäng, 2004), and the  
88 northern Benguela system (Utne-Palm *et al.*, 2010).

89

90 Reduced oxygen and overexploitation cause reduced abundance and recruitment in  
91 demersal fish (Diaz and Rosenberg, 2008). Low oxygen saturation in water is a

92 proximate factor driving reduced asymptotic maximum size, as the limited oxygen  
93 available is allocated to maintenance rather than somatic growth (Pauly, 2010; 1981;  
94 van Dam and Pauly, 1995; Chabot and Claireaux, 2008). Little is known on the effect  
95 of hypoxia on reproduction, but extreme levels of hypoxia can impair it (Wu *et al.*,  
96 2003; Landry *et al.*, 2007; Chabot and Claireaux, 2008). However, it is predicted that  
97 at moderate levels of hypoxia, stunting is caused by earlier maturation and increased  
98 reproductive investment at early ages (Kolding, 1993; Kolding *et al.*, 2008a).  
99 However, similar changes in maturation and post-maturation growth are expected  
100 from evolutionary change caused by fisheries-induced selection (Heino *et al.*, 2015).

101

102 Despite the fact that low oxygen level and fishing may co-occur and drive similar  
103 changes in life-history traits, little effort has been made in studying their joint effect  
104 (Kolding *et al.*, 2008b). Studying the combined effect of several factors is crucial to  
105 better understand and inform management and conservation plans of natural resources  
106 and fish populations in particular (Jackson *et al.*, 2016). For instance, Kolding *et al.*  
107 (2008b) concluded that low oxygen, rather than overfishing, was the most important  
108 threat for Nile perch, *Lates niloticus*, in lake Victoria. Similarly, the reduction in  
109 individual size and maturation observed in Nile perch (Mkumbo and Marshall, 2015)  
110 and Dagaa, *Rastrineobola argentea*, (Sharpe *et al.*, 2012) in Lake Victoria could be  
111 driven by hypoxia. Crucially, mitigating actions depend on the driver. If reduced  
112 oxygen is the culprit, then changing the environment is needed (Rabalais *et al.*, 2007),  
113 and in the best case, the management response is rapid (Beutel and Horne, 1999). On  
114 the other hand, if dwarfing reflects evolutionary adaptation to fishing, then the fishing  
115 pattern needs to be changed, and even in the best case, response is likely slow (Law,  
116 2000; Heino *et al.*, 2015).

117

118 Here we test how oxygen level affects maturation schedules and growth in fish  
119 populations exposed to different size-selective mortality regimes. We expect that both  
120 low oxygen and exposure to positive size-selective fishing result in earlier maturation  
121 and reduced growth. This is the first study to jointly assess the effects of reduced  
122 ambient oxygen and size-dependent mortality in fish. Thus, little is known about their  
123 relative importance in driving changes in key life-history traits. For this purpose we  
124 utilized populations of guppies, *Poecilia reticulata* in laboratory conditions. This  
125 model species was also used to demonstrate Bertalanffy's theory of growth  
126 Bertalanffy (1938), study the effect of fishing on population dynamics (Silliman and  
127 Gutsell, 1958), and assess the effect of predatory size-selection mortality in life-  
128 history traits (Reznick and Ghalambor, 2005). Moreover, similar laboratory  
129 experiments have been shown useful to inform conservation and management plans  
130 (see e.g., Stockwell and Weeks, 1999; Conover and Munch, 2002; Reznick and  
131 Ghalambor, 2005; Diaz Pauli and Heino, 2014).

132

### 133 **Materials and methods**

134 We used guppies from a life-history experiment designed to study evolutionary  
135 consequences of size-selective fishing (Diaz Pauli *et al.*, 2014). The test fish were first  
136 generation (F1) offspring from six replicate laboratory populations that had  
137 experienced size-selective mortality for 3.1 years (approximately 4 generations).  
138 These populations represent two treatments, with three replicates each: 1) positive  
139 size-selected line, where large individuals (above 16 mm standard length SL) were  
140 removed from the population every 6<sup>th</sup> week and 2) negative-size selected line where  
141 individuals smaller than 16 mm were removed at equal intervals.

142

143 Twenty females per population were housed together in 10-L tanks and feed ad lib  
144 with newly hatched *Artemia salina* in the morning and fish flakes (tetraMin, Tetra) in  
145 the afternoon. Tanks were checked twice a day for new-borns, which were collected  
146 and immediately transferred to 2-L individual isolation aquaria where they were  
147 randomly assigned one of two oxygen treatments: 1) high oxygen with  $95 \pm 5\%$   
148 oxygen saturation, corresponding to about  $7.9 \pm 0.4 \text{ mg L}^{-1}$ , and 2) low oxygen with  
149  $64\% \pm 6\%$  oxygen saturation ( $5.3 \pm 0.5 \text{ mg L}^{-1}$ ). All tanks were covered with a  
150 tightly-fitting piece of Styrofoam covering the whole water surface. The cover  
151 prevented surface breathing and minimized the gas exchange with the atmosphere. In  
152 the high-oxygen treatment, high oxygen saturation was maintained with an air stone.  
153 This resulted in a 2x2 full factorial experiment with oxygen level and inherited  
154 background (past size-selective mortality) as the treatments. Ten males and ten  
155 females from each of the six populations were assigned to each oxygen treatment,  
156 resulting in a total of  $N = 240$  fish (1:1 sex ratio).

157

158 Test fish were maintained in individual isolation at constant temperature  $25 \pm 0.5^\circ\text{C}$   
159 and under a 12:12 light regime. During the first two weeks each fish was fed daily  $38$   
160  $\pm 6 \mu\text{l}$  of 3% solution of living filtered *Artemia salina*, at 2-weeks of age this was  
161 increased to  $76 \mu\text{l}$  per day, and at 4-weeks of age it was increased to  $114 \mu\text{l}$ , which  
162 was maintained until the fish reached maturation and the experiment was terminated.  
163 Fish were anaesthetized in a  $0.3 \text{ g L}^{-1}$  solution of metacaine, measured for standard  
164 length (SL) and weight, and assessed for maturation weekly. Non-invasive assessment  
165 of maturation is reliable only in males; this is achieved by following the development  
166 of the gonopodium (modified anal fin used in insemination). Initiation of maturation

167 is indicated by the increase from nine to ten segments in the third ray of the anal fin,  
168 while complete maturation is marked by the growth of the fleshy hood over the tip of  
169 the gonopodium and the number of segments in the third ray being over 27 (Turner,  
170 1941; Reznick, 1990). Gonopodium development correlates with the development of  
171 the gonadotrophic zone in the adenohipophysis and the maturation of the testis  
172 (Kallman and Schreibman, 1973; Schreibman and Kallman, 1977; Greven, 2011). The  
173 initiation of maturation stage correlates with initial enlargement of the testis,  
174 proliferation of spermagonia and possibly spermatocytes (van den Hurk, 1974; Koya  
175 *et al.*, 2003), while at the completion stage there are several layers of spermagonial  
176 cysts, sperm cells and developed testicular ducts with enzyme activity and  
177 spermatozeugmata (sperm bundles) are present (Schreibman *et al.*, 1982; Koya *et al.*,  
178 2003). We consider initiation of maturation to be a better representation of male  
179 maturation ‘decision’ in guppies; it is the time when they commit to maturation,  
180 reflecting more accurately the factors that affect maturation (Tobin *et al.*, 2010;  
181 Harney *et al.*, 2012; Diaz Pauli and Heino, 2013). Therefore, in the present study we  
182 assess the effect of oxygen and size-selection on initiation of maturation, from now on  
183 referred as maturation. Female maturation cannot be assessed non-invasively, thus  
184 from them we only obtained growth data, from which we later estimated maturation  
185 (see below). Females were kept in the experiment until two weeks after a male from  
186 the same brood reached the last stage of maturation.

## 187 STATISTICAL ANALYSIS

### 188 *Growth*

189 All analyses were performed in R (version 3.2.4; R Core Team 2016). To assess  
190 treatment effects on individual growth we used the biphasic growth model of Boukal  
191 *et al.* (2014), which is derived from the model by Quince *et al.* (2008), within the



192 “nlme” R package (version 3.1-125; Pinheiro *et al.*, 2016). The model mechanistically  
 193 describes somatic growth pre- and post-maturation, based on the principles of  
 194 allometry and energy allocation. Surplus energy acquisition rate, which is equal to  
 195 maximum potential somatic growth, is related to somatic weight  $W$  by the coefficient  
 196  $c$  and the allometric exponent  $\beta$ :

$$197 \quad \frac{dW}{dt} = cW^\beta \quad (1)$$

198 Assuming that juveniles allocate surplus energy only to growth (reproductive  
 199 investment  $r_a = 0$ ), the juvenile growth curve for weight at age  $a$  is as follows:

$$200 \quad W_a = \sqrt[1-\beta]{W_0^{1-\beta} + c(1-\beta)a} \quad (2)$$

201 The post-maturation (adult) growth curve takes into account reproductive investment  
 202  $r$  for mature individuals, i.e., for  $a \geq a_{mat}$ :

$$203 \quad W_a = \sqrt[1-\beta]{R^{a-a_{mat}} (W_0^{1-\beta} + Hb^{1-\beta}a_{mat}) + \frac{RHb^{1-\beta}}{1-R} (1 - R^{a-a_{mat}})},$$

204 (3)

205 where  $H = c(1-\beta)b^{-(1-\beta)}$ ,  $R = 1/[1+(1-\beta)r]$  and  $W_0$  is weight at birth.

206

207 Growth curves were estimated for males and females separately. Weight at birth was  
 208 affected neither by sex ( $F_{213, 1} = 1.68$ ,  $p = 0.19$ ) nor by size-selection treatment ( $F_{4.3, 1}$   
 209  $= 0.07$ ,  $p = 0.79$ ) according to a linear mixed effect model with population as random  
 210 factor. These linear mixed models were performed with lme4 R package (version 1.1-  
 211 11; Bates *et al.*, 2015).  $P$ -values and degrees of freedom are obtained with the R  
 212 package “lmerTest” (version 2.0-29; Kuznetsova *et al.*, 2015). Therefore, weight at  
 213 birth  $W_0 = 0.007$  g was used for both males and females. In males, age at maturation

214  $a_{\text{mat}}$  is included in the model as a known individual-specific variable (age at which  
215 initiation of maturation occurs), but in females it is estimated as a model parameter.  
216 Reproductive investment  $r$  and the coefficient in allometric growth rate-weight  
217 relationship  $c$  were estimated for both males and females, while the allometric  
218 exponent in growth rate-weight relationship  $\beta$  is estimated for males but kept constant  
219 for females as  $\beta = 0.8$  because simultaneous estimation of  $\beta$  and  $a_{\text{mat}}$  was not possible.  
220 Initial exploration of our data showed that  $\beta = 0.8$  was the most appropriate value for  
221 our data and similar values have been suggested by Boukal *et al.* (2014).

222

223 The parameters were estimated with a non-linear mixed effect model in the R package  
224 “nlme” (Pinheiro *et al.*, 2016) with fish ID as random factor for  $r$  and  $c$  for both males  
225 and females. Including fish ID as random factor for  $\beta$  and  $a_{\text{mat}}$  for males and females,  
226 respectively, did not improve the models (males:  $\Delta\text{AIC} = 6.1$ , likelihood ratio statistic  
227  $= 0.09$ ,  $p = 0.99$ ; females:  $\Delta\text{AIC} = 6.0$ , likelihood ratio statistic  $= 0.0002$ ,  $p = 1$ ).  
228 Oxygen, size-selection line and their interaction were tested as fixed effects on  $r$ ,  $c$   
229 and  $\beta$  for males and  $r$ ,  $c$  and  $a_{\text{mat}}$  for females. The model that yielded the lowest AIC  
230 (Akaike Information Criterion) is considered the best approximating model, i.e. the  
231 model that best describes the data. We also discuss models that differ from the best  
232 ranked-model with AIC values smaller than 2 ( $\Delta_i = \text{AIC}_i - \text{AIC}_{\text{best}}$ ), as these are  
233 considered essentially as good as the best model (Burnham and Anderson, 1998). We  
234 also calculated the probabilities of a model being the best model, referred as Akaike  
235 weights ( $w_i$ ). Notice that the approach chosen here does not involve significance  
236 testing of the model parameters.

237

238 *Maturation*

239 Maturation in males is described by the probabilistic maturation reaction norm  
240 (PMRN; Heino *et al.*, 2002), estimated with generalized linear mixed models with  
241 binomial error distribution using the lme4 package in R (version 1.1-11; Bates *et al.*,  
242 2015). Fish ID nested within population was included as random factor, while age,  
243 weight, oxygen, size-selection line, and all their first order interactions were included  
244 as fixed effects. As for the growth models, we used AIC to select the final model. The  
245 logistic curve for the probability of maturation is given by equation:

$$246 \quad \text{logit}(p) \sim c_0 + c_1a + c_2w + c_3o + c_4s + \dots c_n, (4)$$

247 where  $\text{logit}(p) = \log_e[p/(1-p)]$  is the link function,  $c_0$  is the intercept and  $c_1$  to  $c_n$  are  
248 the regression parameters of the model for the different explanatory variables (age  $a$ ,  
249 weight  $w$ , oxygen  $o$ , size-selection line  $s$ , interactions, etc.). To facilitate the  
250 interpretation of the model coefficients, weight and age were standardized to zero  
251 mean and unity standard deviation (SD). In males, mean age was  $\bar{X} \pm \text{SD} = 87.6 \pm 27$   
252 days and mean weight was  $\bar{X} \pm \text{SD} = 0.055 \pm 0.012$  g. The PMRN midpoints (i.e. the  
253 estimated age-specific weight at which the probability of maturing is 50%; also  
254 referred as  $W_{p50}$ ) were used to illustrate the estimated reaction norms and are roots of  
255 equation (4) for weight  $w$ .

256

257 For females, maturation cannot be assessed non-invasively and age at maturation  $a_{\text{mat}}$   
258 was estimated from the biphasic growth model. This implies a definition of  
259 maturation that is purely energetic and corresponds to the (assumed) abrupt start of  
260 allocating significant proportion of energy to reproduction; it is not possible to link  
261 this definition to male maturation based on different criteria.

262

## 263 **Results**

264 MALES

265 Growth in males showed high inter-individual variability (Fig. 1a). Nevertheless,  
266 growth models suggested significant effects of both oxygen treatment and parental  
267 size-selection line (Fig. 1b, Table 1). No single model was superior, but all highest-  
268 ranking models were broadly similar and suggested significant effects of oxygen  
269 and/or size selection on all parameters (Table 1). The model that explained the data  
270 best (M1) included oxygen and size-selection effects on reproductive investment  $r$  and  
271 on the coefficient  $c$  in growth rate-weight relationship, while there was an effect of  
272 size-selection line only on the allometric exponent  $\beta$  of growth rate-weight  
273 relationship (Table 1). This model was superior to the model that did not include any  
274 treatment effect (M0;  $\Delta\text{AIC} = 25.99$ , likelihood ratio test statistic = 35.99,  $P < 0.001$ ).  
275 Males under low ambient oxygen from each selection line reached lower predicted  
276 weights at age 210 days than their counterparts with high ambient oxygen (Fig. 1b;  
277 Table 1), but their size-specific maximum potential growth rate was higher (growth  
278 rate theoretically attained in the absence of reproduction, Fig. 2a). Similarly, males  
279 that descended from the positive size-selection lines reached higher predicted weights  
280 at age 210 days (Fig. 1b) and presented higher size-specific maximum potential  
281 growth rate than those descending from the negative size-selection lines (Fig. 2a).  
282 Results are similar for the other models with high probability for explaining our data  
283 (M2–M4); also these models showed effect of our treatments on the growth  
284 parameters, particularly with an effect of size-selection line on allometric growth and  
285 oxygen in reproductive investment (Table 1). Only one model (M3) included an  
286 interaction effect between oxygen and size-selection, suggesting that the effect of  
287 oxygen on reproductive investment  $r$  was reversed for the negatively compared to  
288 positively size-selected lines (Table 1).

289

290 Under high oxygen conditions, males from the lines exposed to negative size-selective  
291 mortality matured at  $0.065 \pm 0.010$  g (mean  $\pm$  SD) and  $111 \pm 25$  days old, while those  
292 from positive size-selective mortality matured at  $0.060 \pm 0.008$  g and  $97 \pm 23$  days  
293 (Fig. 3). Under low oxygen availability, males matured at  $0.048 \pm 0.008$  g and  $75 \pm 19$   
294 days old, and  $0.044 \pm 0.007$  g and  $66 \pm 12$  days old for negative and positive size-  
295 selection, respectively. Thus, both low oxygen and positive size-selective mortality  
296 resulted in earlier maturation at smaller size, but the effect of oxygen was larger than  
297 that of size-selective mortality.

298

299 Mean age and size at maturation are also influenced by growth. Maturation tendency  
300 can be expressed independently from growth by calculating age- and size-dependent  
301 maturation probabilities, i.e., probabilistic maturation reaction norms (PMRNs).  
302 Nearly horizontal PMRNs (Fig. 3) show that maturation is primarily determined by  
303 size, with only a weak, positive effect of age. The size (weight) at 50% maturation  
304 probability at a given age was significantly smaller under low oxygen conditions and  
305 for positive size-selection lines (Fig. 3). The oxygen availability had the strongest  
306 effect, with the odds of maturation under low oxygen about 61 times higher than  
307 under high oxygen conditions (estimate  $\pm$  SE =  $4.11 \pm 0.9$  in log(odds),  $z = 4.68$ ,  $df =$   
308  $1$ ,  $P < 0.001$ ). This is in line with the results obtained from analyzing growth curves  
309 showing that males under low oxygen also invested more in reproduction (higher  $r$ )  
310 than those reared in high oxygen. Descending from the positive size-selection line had  
311 a weaker positive effect, increasing the odds of maturation compared to negative size-  
312 selection by a factor of 3.1 (estimate  $\pm$  SE =  $1.12 \pm 0.5$  in log(odds),  $z = 2.33$ ,  $df = 1$ ,  
313  $P = 0.02$ ).

314

315 The effect of oxygen availability on maturation was strong also in comparison to the  
316 effect of growth. An increase in weight by 1 SD (0.012 g) corresponds to an increase  
317 in odds of maturing by a factor of 11.0 (estimate  $\pm$  SE =  $2.41 \pm 0.5$  in log(odds),  $z =$   
318  $5.12$ ,  $df = 1$ ,  $P < 0.001$ ). Age influenced maturation only through its interaction with  
319 weight; the effect was weak but significant (odds ratio = 0.59 for 1 SD increase in  
320 weight and age, estimate  $\pm$  SE =  $-0.53 \pm 0.1$  in log(odds),  $z = -3.75$ ,  $df = 1$ ,  $P < 0.001$ ),  
321 which resulted in a decreasing PMRN for older ages (Fig. 3).

322

### 323 FEMALES

324 As with males, inter-individual variability in female growth was high but contained  
325 significant effects related to oxygen availability and parental size-selection line (Fig.  
326 4a). The best ranked-model (F1) showed an effect of oxygen level, selection line and  
327 their interaction on age at maturation, and effect of oxygen and size selection on  
328 reproductive investment and on the growth coefficient (Table 2). Females reared  
329 under low oxygen conditions showed lower predicted weight at age 190 days relative  
330 to females reared under high oxygen conditions (Fig. 4b). Similarly to the males, this  
331 was probably a result of a higher investment in reproduction and earlier age at  
332 maturation (Table 2), rather than size-specific maximum potential growth rate that  
333 was higher under low oxygen (Fig. 2b). While females from the positive size-  
334 selection line reached bigger predicted weight at 190 days (Fig. 4b), their size-specific  
335 maximum potential growth rate was lower than that of females in negative size-  
336 selection lines (Fig. 2b, Table 2). Females from positive size-selection lines presented  
337 lower reproductive investment and older age at maturation (Table 2) relative to  
338 females from negative size-selection lines. The model showing these treatment effects

339 (F1) was superior to the null model considering no treatment effects (F0;  $\Delta\text{AIC} =$   
340 48.11, likelihood ratio test statistic = 62.10,  $P < 0.001$ ). Similar results are obtained  
341 with the second-ranked model (F2; Table 2). Both best-ranked models suggest an  
342 interaction effect between oxygen and size-selection, either for age at maturation (F1)  
343 or reproductive investment (F2; Table 2).

344

345 Age at maturation for females could not be directly observed, but the estimates from  
346 the growth model show a pattern similar to the one obtained for males (Table 2).  
347 Mean age at maturation is lower under low-oxygen conditions compared to high-  
348 oxygen conditions. However, females from lines with negative size-selective  
349 mortality have lower age at maturation than those from lines with positive size-  
350 selective mortality. The highest mean age at maturation is from females under high-  
351 oxygen conditions for females from lines with positive size-selective mortality (65  
352 days). These estimates are lower than the observations for males (treatment-specific  
353 mean 66–111 days), but the estimates are not directly comparable as they are based on  
354 different ways of defining and estimating maturation.

355

## 356 **Discussion**

357 Oxygen saturation in ambient water and prior ancestral exposure to size-selective  
358 mortality affected maturation, growth and reproductive investment in similar ways.  
359 Reduced ambient oxygen led to stunting, early maturation and high reproductive  
360 investment. Fish exposed to high mortality on larger-sized individuals displayed  
361 earlier maturation at smaller size, greater investment in reproduction and faster  
362 growth. These results were clearer for male guppies compared to females.

363

364 OXYGEN

365 Exposure to low oxygen saturation resulted in lower size at age and higher investment  
366 in reproduction relative to exposure to normoxic conditions, as expected if reduced  
367 oxygen supply triggers the shift from somatic growth to maturation (Pauly, 1984;  
368 Kolding, 1993; Kolding *et al.*, 2008a). Both males and females also matured at earlier  
369 age and smaller size when reared under low oxygen relative to high oxygen  
370 conditions. The low oxygen treatment was not severe enough to hamper fish  
371 maturation as observed in some other studies (e.g., Wu *et al.*, 2003; Landry *et al.*,  
372 2007; Chabot and Claireaux, 2008).

373

374 Low oxygen resulted in faster juvenile size-specific maximum growth rate. Iles  
375 (1973) predicted such an increase in juvenile growth rate of wild tilapia due to low  
376 oxygen availability, although his prediction might be a result of lack of  
377 standardization of the growth rates. In any case, it should be noticed that a reduction  
378 in growth rate associated with low oxygen levels is only detectable after maturation  
379 (van Dam and Pauly, 1995; Pauly, 1981). Other studies of adult growth in guppies did  
380 see a decrease in growth rate due to oxygen limitation (Weber and Kramer, 1983).  
381 The lack of decrease in growth rate in our experiment was not due to surface  
382 respiration, as our experimental set-up prevented it. Aquatic surface respiration (ASR)  
383 is initiated in guppies at around 30% oxygen saturation (Kramer and Mehegan, 1981),  
384 and hence even if it had been allowed in our study it might not have been important.  
385 Thus, our modest reduction in oxygen availability led to slightly faster juvenile  
386 growth rate and triggered earlier maturation and increased reproductive allocation,  
387 which resulted in stunting in both males and females—despite higher maximum  
388 potential growth rates.



389

390 SIZE-SELECTIVE MORTALITY

391 Positive size-selective mortality implies a higher mortality risk for large individuals  
392 relative to small individuals. In the present study the size limit for culling was set at  
393 16 mm SL, slightly under normal guppy maturation length (Magurran, 2005). Positive  
394 size-dependent mortality favours fast life-history strategies involving early  
395 maturation, high investment in reproduction and, in many cases, faster growth rate  
396 prior to maturation (Charlesworth, 1994; Law, 2000; Enberg *et al.*, 2012; Réale *et al.*,  
397 2010).

398

399 Our results agree with these expectations, particularly in the case of male guppies.  
400 Males descending from lines exposed to positive size-selective mortality had higher  
401 probability of maturing at a given age and size, which led to maturation at smaller size  
402 and younger age compared to males from the lines subjected to negative size-  
403 selection. Males also had higher investment in reproduction. Our estimates are  
404 comparable with earlier studies on guppies and other poeciliids for reproductive  
405 investment (Baatrup and Junge, 2001; Schlupp *et al.*, 2006) and size and age at  
406 maturation (Magurran, 2005; Reznick and Bryga, 1987); it should be noticed that  
407 most studies considered completion of maturation, rather than initiation of maturation  
408 (but see Diaz Pauli and Heino, 2013). Similar directional changes in maturation and  
409 reproductive investment have been observed in several exploited fish populations  
410 (Heino *et al.*, 2015) and in other selection experiments (van Wijk *et al.*, 2013; Uusi-  
411 Heikkilä *et al.*, 2015).

412

413 Males presented faster maximum potential and realized growth rates in lines exposed  
414 to positive size-dependent mortality. Studies on the effect of (positive) size-selective  
415 fishing mortality have often concluded that growth rates decreased rather than  
416 increased, but in most cases such reduction was a secondary effect from increased  
417 allocation in reproduction (reviewed in Enberg *et al.*, 2012; Heino *et al.*, 2015) and  
418 applies to post-maturation growth. This contrasts with the simplistic expectation that  
419 killing large fish should always favour smaller fish and thus slower growth. While this  
420 expectation is largely warranted for adult fish, expectations for juvenile growth are  
421 less straightforward (Enberg *et al.*, 2012). Dunlop *et al.* (2009) concluded that one key  
422 factor that determines whether positively size-selective fishing favours increased or  
423 decreased juvenile growth rate is the size limit at which the harvesting takes place.  
424 When the minimum size is set under the size at maturation, as it occurred in our  
425 experiment, juvenile growth is expected to accelerate to reach maturation earlier in  
426 life (Dunlop *et al.*, 2009). Positive size-selection also led to faster juvenile growth rate  
427 in zebrafish (*Danio rerio*; Uusi-Heikkilä *et al.*, 2015).

428

429 Males from the lines exposed to positive size-selective mortality had larger predicted  
430 size at age 210 days (the maximum age in the experiment). This occurred because of  
431 their high maximum potential growth rate, and despite their earlier maturation and  
432 higher investment in reproduction. This result is contrary to theoretical expectations  
433 (Heino *et al.*, 2015) and other experimental studies (Walsh *et al.*, 2006; van Wijk *et al.*,  
434 2013; Uusi-Heikkilä *et al.*, 2015). A possible explanation is that because we  
435 sacrificed our fish soon after maturation, we have little information on how their  
436 realized growth and reproductive allocation would have developed through their  
437 adulthood, which was estimated in former studies (Walsh *et al.*, 2006; van Wijk *et al.*,

438 2013; Uusi-Heikkilä *et al.*, 2015; Heino *et al.*, 2015). Ultimate size at adulthood is  
439 affected by the maximum potential somatic growth rate as well as the continued  
440 investment in reproduction in this iteroparous species and might have resulted in  
441 smaller-sized individuals later in life in positive size-selected lines. Our estimates of  
442 realized growth rate are similar to those of Auer *et al.* (2010). The values of  $\beta$   
443 estimated from our model are on the lower range of the great variation in the values of  
444 the allometric exponent  $\beta$  (Killen *et al.*, 2010; Boukal *et al.*, 2014), which is  
445 associated with determinate/indeterminate growth. Male poeciliids are typically  
446 considered to have determinate growth, although they do not completely cease growth  
447 after maturation (Snelson, 1982). Nevertheless, because fish were sacrificed well  
448 before reaching their maximum sizes, our estimates of  $\beta$  might be downward biased.  
449 In practice, the estimations of  $\beta$  and reproductive investment  $r$  are confounded, and  
450 the truncated adult life span may have aggravated this problem.

451

452 Whether the differences between size-selected lines represent evolutionary (i.e.,  
453 genetic) change is ambiguous, as our experimental set-up only controlled for  
454 environmental differences among the fish subjected to the oxygen treatments, but not  
455 those of their parents. It is generally accepted that lines should be maintained for at  
456 least two generations in common garden conditions to be able to clearly discern  
457 genetic changes using phenotypic data (Reznick and Ghalambor, 2005). The  
458 differences could therefore represent parental effects, genetic differences, or—perhaps  
459 most likely—a combination of both. Nevertheless, the phenotypic changes were in  
460 agreement with the predictions from life-history theory.

461

462 Estimates for reproductive investment, growth rate and age at maturation in females  
463 are comparable with values obtained in other studies (Magurran, 2005; Auer *et al.*,  
464 2010; Rocha *et al.*, 2011). Still, since maturation in females could not be visually  
465 determined, the study of life-history changes in them was not as thorough as with  
466 males. Exposure to positive size-selective mortality led to estimated maturation at  
467 older, rather than younger ages, and to a lower investment in reproduction. This is  
468 opposite to what was observed in males in this study and earlier selection experiments  
469 (Walsh *et al.*, 2006; Uusi-Heikkilä *et al.*, 2015). However, these results refer to age at  
470 maturation inferred with the growth model and which might be inaccurate, rather than  
471 to directly observed maturation, as with males. In addition, females in the positive  
472 size-selected line presented lower maximum potential size-specific growth rates, but  
473 higher realized growth, contrary to what observed in males. The estimation of  
474 maximum growth rate was only based on one parameter ( $c$ , coefficient in growth rate-  
475 weight relationship), while the allometric exponent  $\beta$  was kept constant. For males, it  
476 was the allometric exponent  $\beta$  that showed the strongest effect of size-selection line  
477 and the parameter that affected growth rate the most. If the growth model for females  
478 is performed to estimate  $\beta$  by keeping  $c$  constant at  $0.01 \text{ g}^{1-\beta} \text{ day}^{-1}$ , the results remain  
479 very similar (results not shown). Nevertheless, the differences between positive and  
480 negatively size-selected lines were smaller for females than for males, despite being  
481 significant in all cases.

482

#### 483 INTERPLAY OF EFFECTS ON LIFE HISTORY TRAITS AND IMPLICATIONS

484 Manipulating oxygen level resulted in bigger changes in reproductive investment and  
485 maturation compared to manipulating size-selective mortality in parental generations.  
486 Positive culling led to an estimated increase in reproductive investment of 33%

487 relative to negative culling (under high oxygen conditions), while low oxygen led to  
488 an increase of more than 100% relative to high oxygen. Similar results were obtained  
489 for age and size at maturation; the odds of maturing were 60 times higher under low  
490 oxygen compared to high oxygen, but only 3 times higher for positive lines compared  
491 to negative lines.

492

493 However, direct comparison of the importance or strength of these two different  
494 drivers is difficult for two reasons. First, the two treatments are conceptually very  
495 different: the oxygen treatment was affecting the ambient environment of the very  
496 same fish that we observed during the experiment, whereas the size-selective  
497 mortality treatment represented conditions that the parental generations of the test fish  
498 had experienced over the course of three years (approximately 4 generations). The  
499 actual treatments levels are in both cases somewhat arbitrary (i.e., the specific oxygen  
500 saturation level, and the duration and intensity of past size selection). Second, the  
501 mechanisms through which the treatments affect life histories are different. Oxygen is  
502 a strong proximate driver of phenotypic change in maturation and growth, triggering  
503 direct plastic responses (Kolding *et al.*, 2008a; Pauly, 1984), while the effect of size-  
504 selective mortality on life histories occurs through both genetic change (evolution)  
505 and phenotypic plasticity, including inter-generational plasticity (parental effects).  
506 Although hypoxia could also lead to evolutionary changes in life history (Riesch *et*  
507 *al.*, 2010), this was not considered in our experiment that followed only a single  
508 generation of fish.

509

510 Our results do not suggest strong interactions between ambient oxygen and prior size  
511 selection under controlled laboratory conditions, that is, that the effects of oxygen

512 level would depend on adaptations to contrasting size selectivity regimes. For males,  
513 only one of the four top-ranking growth models included an interaction between size  
514 selection and oxygen (affecting a single parameter), whereas for females, both top-  
515 ranking models contained a single interaction each. These provide some evidence for  
516 the oxygen depletion-induced increase in reproductive investment being stronger in  
517 the lines that had been subjected to negative size-selective mortality. Most effects,  
518 however, were simply additive.

519

520 We believe it is essential to consider both proximate and ultimate factors to gain a  
521 better understanding of life-history variation and how populations evolve under the  
522 influence of these factors. Hypoxia and size-dependent mortality—including that  
523 induced by fishing—not only co-occur, but can also drive similar life-history changes.  
524 Thus, investigating the interplay of fishing- and hypoxia-induced changes is necessary  
525 to perform ecosystem-based predictions on the sustainability of the fishery (Kolding  
526 *et al.*, 2008b). To our knowledge this is the first study looking at the combined effect  
527 of oxygen and size-dependent mortality on life-history traits. Despite being an  
528 experimental study, our results illustrate the risks of trying to infer the process from  
529 patterns. This is a well-known problem, much discussed in the context of using  
530 observational field data to study life-history changes in exploited fish populations  
531 (e.g., Kraak, 2007; Dieckmann and Heino, 2007; Browman *et al.*, 2008; Kuparinen  
532 and Merilä, 2008; Jørgensen *et al.*, 2008). The potential role of low oxygen levels in  
533 driving phenotypic change, however, has until now been overlooked (e.g., Sharpe *et*  
534 *al.*, 2012). We encourage performing further studies linking these factors to changes  
535 in life-history, behavioural and physiological traits, and considering the confounding

536 effect of oxygen along with other environmental factors when studying the effects of  
537 size-selective fishing in exploited populations.

538

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## Tables

Table 1. Male biphasic growth model estimates for reproductive investment,  $r$ , growth coefficient,  $c$ , and allometric exponent,  $\beta$ . Support for a particular model is given by the change in the Akaike Information Criterion (AIC) relative to the model with the lowest AIC ( $\Delta_i$ ), and by the Akaike weights ( $w_i$ ). All models follow equations (2)–(3) but differ in which of the parameters (if any) are affected by the treatment(s) as well as presence of treatment interactions (denoted with “\*” in the model formulae). Results are shown for the four best-ranked non-linear mixed effect models (M1–4; the model with the lowest AIC and all models for which  $\Delta_i < 2$ ) as well as for the null model (M0) without any effects of experimental treatments (formula “~1” means that parameter is unaffected by the treatments).

Model	Effects	Support		Parameter estimates			
		$\Delta_i$	$w_i$	Treatment	$r$	$c$ ( $\text{g}^{1-\beta}\text{day}^{-1}$ )	$\beta$
M1	$r \sim \text{size-selec.} + \text{O}_2$	0	0.28	High $\text{O}_2$ & neg. s-s.	0.0006	0.0009	0.16
	$c \sim \text{size-selec.} + \text{O}_2$			High $\text{O}_2$ & pos. s-s.	0.0009	0.0013	0.25
	$\beta \sim \text{size-selec.}$			Low $\text{O}_2$ & neg. s-s.	0.0025	0.0010	0.16
				Low $\text{O}_2$ & pos. s-s.	0.0028	0.0014	0.25
M2	$r \sim \text{O}_2$	0.07	0.27	High $\text{O}_2$ & neg. s-s.	0.0007	0.0009	0.17
	$c \sim \text{size-selec.}$			High $\text{O}_2$ & pos. s-s.	0.0007	0.0013	0.25
	$\beta \sim \text{size-selec.} + \text{O}_2$			Low $\text{O}_2$ & neg. s-s.	0.0023	0.0009	0.14
				Low $\text{O}_2$ & pos. s-s.	0.0023	0.0013	0.22
M3	$r \sim \text{size-selec.} * \text{O}_2$	0.11	0.26	High $\text{O}_2$ & neg. s-s.	0.0002	0.0009	0.16
	$c \sim \text{size-selec.} + \text{O}_2$			High $\text{O}_2$ & pos. s-s.	0.0014	0.0013	0.24
	$\beta \sim \text{size-selec.}$			Low $\text{O}_2$ & neg. s-s.	0.0029	0.0010	0.16
				Low $\text{O}_2$ & pos. s-s.	0.0020	0.0014	0.24
M4	$r \sim \text{O}_2$	0.81	0.19	High $\text{O}_2$ & neg. s-s.	0.0007	0.0009	0.16
	$c \sim \text{size-selec.} + \text{O}_2$			High $\text{O}_2$ & pos. s-s.	0.0007	0.0013	0.24
	$\beta \sim \text{size-selec.}$			Low $\text{O}_2$ & neg. s-s.	0.0026	0.0010	0.16
				Low $\text{O}_2$ & pos. s-s.	0.0026	0.0014	0.24
M0	$r \sim 1$	25.99	0.00	n.a.	0.0013	0.001	0.18
	$c \sim 1$						
	$\beta \sim 1$						

Table 2. Female biphasic growth model estimates for reproductive investment,  $r$ , growth coefficient,  $c$ , and age at maturation,  $a_{\text{mat}}$ . Results are shown for the two best-ranked non-linear mixed effect models (F1–2, i.e. the model with the lowest AIC and the only other model for which  $\Delta_i < 2$ ) as well as for the null model (F0) without any effects of experimental treatments. See Table 1 for further explanations.

Model	Effects	Support		Parameter estimates			
		$\Delta_i$	$w_i$	Treatment	$r$	$c$ ( $\text{g}^{1-\beta}\text{day}^{-1}$ )	$a_{\text{mat}}$ (day)
F1	$r \sim \text{size-selec.} + \text{O}_2$	0	0.48	High $\text{O}_2$ & neg. s-s.	0.011	0.013	53.7
	$c \sim \text{size-selec.} + \text{O}_2$			High $\text{O}_2$ & pos. s-s.	0.009	0.012	65.2
	$a_{\text{mat}} \sim \text{size-selec.} * \text{O}_2$			Low $\text{O}_2$ & neg. s-s.	0.014	0.014	53.6
				Low $\text{O}_2$ & pos. s-s.	0.012	0.013	62.8
F2	$r \sim \text{size-selec.} * \text{O}_2$	0.95	0.30	High $\text{O}_2$ & neg. s-s.	0.010	0.012	54.4
	$c \sim \text{O}_2$			High $\text{O}_2$ & pos. s-s.	0.009	0.012	63.7
	$a_{\text{mat}} \sim \text{size-selec.} + \text{O}_2$			Low $\text{O}_2$ & neg. s-s.	0.012	0.013	53.5
				Low $\text{O}_2$ & pos. s-s.	0.014	0.013	62.9
F0	$r \sim 1$	48.11	0.00	n.a.	0.011	0.013	60.6
	$c \sim 1$						
	$a_{\text{mat}} \sim 1$						



## Figures

Figure 1: Growth trajectories for males from a) raw data and b) biphasic growth model estimates. In a) symbol type represents the size-selection treatment and colour the oxygen treatment. Filled symbols depict the observations when initiation of maturation was scored. In b) colour represents oxygen treatments, respectively and line type refers to size-selection line. Growth curves are based on the best-ranked model (M1) and growth parameter values are given in Table 1.

Figure 2: Maximum potential size-specific growth rates for a) males and b) females in high (black lines) and low (grey lines) oxygen treatments and that belonged to the positive size-selection lines (dashed lines) or the negative size-selection lines (dotted lines). Growth rates are based in a) males on the allometric exponent  $\beta$  and coefficient  $c$  in growth rate-weight relationship estimated with the best-ranked model (M1, Table 1), while in b) females on the allometric coefficient  $c$  in growth rate-weight relationship estimated with the best-ranked model (F1) and the exponent  $\beta$  had the value of 0.8 for all treatments (Table 2). Realized growth rates are lower when energy is allocated to reproduction; the predicted growth curves in Figs 1b and 4b account for this, for males and females respectively.

Figure 3: Weight and age-based probabilistic maturation reaction norms for males represented by the midpoints (weight with 50% maturation probability,  $W_{p50}$ ) at high (black line) and low (grey line) oxygen conditions and for positive (dashed line) and negative (dotted line) size-selected lines. Black and grey triangles (negative size-selection line) and inverted triangles (positive size-selection line) represent the

observed weights (g) and ages (days) at maturation for high and low oxygen, respectively.

Figure 4: Growth trajectories for females from a) raw data and b) biphasic growth model estimates. In a) inverted triangles represent the positive size-selected line and triangles the negative size-selected line, while black refers to high oxygen and grey to low oxygen. In b) black and grey lines represent high and low oxygen treatments, respectively; and dashed lines refer to males that belonged to the positive size-selection line while dotted lines, the negative size-selection line. Growth curves are based on the best-ranked model (F1) and growth parameter values are given in Table 2.



