

1 **Evolution under fluctuating conditions and exposure to**
2 **heatwaves in the seed beetle, *Callosobruchus maculatus***

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15 **Keywords:** thermal adaptation, heatwaves, fluctuating temperatures, climate
16 change, fitness, *Callosobruchus maculatus*

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30 **Abstract**

31 Heatwaves, temporary periods of elevated temperatures, are increasing both in
32 magnitude and in frequency and have been shown to have devastating negative
33 effects on a wide range of taxa. However, to date, most studies investigating the
34 impacts of heatwaves have either focus on populations that have evolved under
35 constant conditions prior to assaying or, more importantly, only investigated the
36 short-term outcomes of periods of elevated temperatures. Here, using the seed
37 beetle, *Callosobruchus maculatus*, we investigate both the short- and long-term
38 effects of evolution after 43 generations of fluctuating temperature with added
39 heatwave exposure (a +2°C increase in diurnal temperature peaking at 42°C) on two
40 important life history traits, development time and lifetime reproductive success
41 (LRS). We found that when individuals were assayed under fluctuating conditions,
42 those that evolved under heatwave conditions developed at a similar rate but had
43 reduced LRS than those evolved and assayed under the same fluctuating conditions.
44 In contrast, when individuals were assayed under a novel benign temperature of
45 29°C, both thermal regimes developed slower and had a similar LRS that was
46 significantly greater than the number produced when treatments were assayed in the
47 stressful fluctuating environment. All together, this suggests that long-term evolution
48 under periods of elevated temperatures may lead to increased resilience both in the
49 long-term with exposure to repeated heatwaves, but also in the short-term when
50 individuals are exposure to rapid environmental change. This study further
51 underscores the importance of using natural diel fluctuations to enhance our
52 understanding of organisms' responses to climate change. Additionally, it
53 emphasises the potency of investigating long-term multigenerational exposure to
54 heatwaves.

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58 **Introduction**

59 Natural populations are responding to global temperature increases by
60 shifting ranges, declining in abundance, or ultimately, going extinct (Parmesan &
61 Yohe, 2003; Thomas *et al.*, 2004; Chen *et al.*, 2011). Not only are average annual
62 temperatures rising, but extreme climatic events (ECEs) such as heatwaves are
63 becoming far more frequent (Wang *et al.*, 2024). Heatwaves, defined as three or
64 more consecutive days of temperature above the 90th percentile for each
65 calendar day (Perkins & Alexander, 2013), have been shown to negatively affect
66 the persistence and adaptation of natural populations (Stillman, 2019; Ma *et al.*,
67 2021; Murali *et al.*, 2023), including plant and animal life (Smith, 2011; Smale &
68 Wernberg, 2013), with broad-scale simultaneous effects on marine and terrestrial
69 ecosystems (Ruthrof *et al.*, 2018). These effects are particularly alarming given
70 that heatwaves are predicted to continue to increase across all scales and impact
71 all inhabited regions of the globe (Perkins-Kirkpatrick & Lewis, 2020;
72 Intergovernmental Panel on Climate Change (IPCC), 2023).

73 Much of the research investigating the effects of heatwaves has been
74 conducted under controlled laboratory conditions. Such studies have been
75 particularly helpful in highlighting the devastating impact that exposure to extreme
76 elevated temperatures can have on organismal function. For instance, exposure
77 to these periods of persistent elevated temperature has been shown to reduce
78 growth and biomass in plants and reduce reproductive success and increase
79 mortality in a wide variety of animals. In the two tree species *Pinus taeda* and
80 *Quercus rubra*, monthly heatwaves of +12 °C significantly reduced total growth as
81 well as leaf, stem and root biomass (Bauweraerts *et al.*, 2012). In male
82 stickleback fish (*Gasterosteus aculeatus*), short-term heatwaves at 23°C for five
83 days were found to suppress parental care, delay hatching, reduce hatching

84 success, and negatively impact offspring body condition and swimming
85 performance (Barrett & Stein, 2024). In the zebra finch (*Taeniopygia guttata*),
86 exposure of males to 30°C or 40°C temperatures daily for 14 consecutive days
87 led to an increase in cloacal temperature and a reduction in the proportion of
88 sperm with normal morphology (Hurley *et al.*, 2018).

89 In insects, extreme high temperatures (EHTs) are known to alter fitness-
90 related life history traits such as survival, development, and reproduction (Ma *et*
91 *al.*, 2021). Among these traits, reproductive potential is predicted to be the most
92 susceptible to impacts from EHTs (Zhang *et al.*, 2015; Walsh *et al.*, 2019). The
93 fruit fly, *Drosophila melanogaster*, is known to display reproductive sensitivity to
94 temperature, with the over half of males (above 50% median) becoming sterile
95 when temperatures exceed 30°C (Rohmer *et al.*, 2004; David *et al.*, 2005). In the
96 flour beetle, *Tribolium castaneum*, experimental heatwave conditions reduce male
97 fertility and sperm competitiveness, resulting in reduced reproduction and a
98 decrease in the lifespan of offspring (Sales *et al.*, 2018).

99 Most laboratory studies investigating the impact of heatwaves have used
100 populations that have evolved under constant temperature conditions rather than
101 exposing them to realistic daily temperature fluctuations (Hurley *et al.*, 2018;
102 Sales *et al.*, 2018, 2024; Breedveld *et al.*, 2023; Barrett & Stein, 2024; although
103 see Weaving *et al.*, 2024). Fortunately, the need to consider the effects of thermal
104 fluctuation is now well documented (Vasseur *et al.*, 2014; Colinet *et al.*, 2015;
105 Sinclair *et al.*, 2016; Bagni *et al.*, 2024), and a number of studies have
106 incorporated realistic thermal regimes into experimental designs, including
107 changes to both the mean and variability of temperatures (Hokanson *et al.*, 1977;
108 Niehaus *et al.*, 2012; Paaijmans *et al.*, 2013; Vasseur *et al.*, 2014; Bozinovic *et*
109 *al.*, 2016; Matsubara, 2018; Schaum *et al.*, 2018, 2022; Buckley & Kingsolver,
110 2021; but see Bagni *et al.*, 2024). For instance, a study by Weaving *et al.*, (2024)
111 investigated the effects of heatwaves on male and female tsetse flies (*Glossina*

112 *pallidipes*) by exposing the flies to fluctuating temperatures peaking at 36°C,
113 38°C, or 40°C for two hours. At all heatwave temperatures, males and females
114 experienced equivalent fertility loss. At 38°C in particular, the combination of
115 declining mortality and fertility resulted in a 10.8% population decline compared to
116 the control treatment. In contrast, 40°C resulted in 100% mortality of individuals.
117 Despite this, there is still a lack of data on the long-term evolutionary impacts of
118 exposure to heatwaves (Gutschick & BassiriRad, 2003; van de Pol *et al.*, 2017).
119 Some evidence suggests that populations exposed to realistic fluctuating
120 conditions may end up responding better to both short- and long-term changes in
121 environmental conditions (Ivimey-Cook *et al.*, 2024). This underscores the need
122 to study the long-term evolution of population exposed to heatwaves in
123 combination with realistic diel fluctuations.

124 Here, we investigated the effect of long-term exposure to heatwaves on
125 the lifetime reproductive success (hereafter, LRS) and development time of the
126 seed beetle, *Callosobruchus maculatus*, after multiple generations of evolving
127 under realistic fluctuating conditions in a laboratory setting. In a previous
128 experiment, we examined the impacts of short- and long-term exposure to
129 fluctuating temperatures (with no exposure to heatwaves) on *C. maculatus* life
130 history (Ivimey-Cook *et al.*, 2024). Briefly, we found that evolving within a
131 fluctuating environment leads to increased reproductive performance upon
132 exposure to constant benign conditions. In contrast, we found no difference in
133 LRS between those that evolved and were assayed under fluctuating or constant
134 conditions (i.e. experienced no change in environment). In this follow-up study,
135 we exposed these same populations to periods of elevated extreme
136 temperatures. Although evolving under realistic diel fluctuations can promote a
137 broadening of thermal niche (Ivimey-Cook *et al.*, 2024), we might predict that
138 exposure to short-term extreme heat will ultimately contribute to a reduction in
139 reproductive fitness and impaired development (Sales *et al.*, 2018, 2021;

140 Weaving *et al.*, 2024). Alternatively, beetle populations exposed to long-term
141 repeated heatwaves might exhibit improved tolerance and resistance to elevated
142 temperatures, resulting in reproductive fitness and rates of development that are
143 similar to populations evolving under purely fluctuating temperatures (French *et*
144 *al.*, 2019; Ahrens *et al.*, 2021; Xu *et al.*, 2021). Furthermore, as shown in Ivimey-
145 Cook *et al.*, (2024) and Ketola *et al.*, (2013) evolving under fluctuating conditions
146 may have beneficial effects on reproductive performance when individuals are
147 exposed to a constant benign environment. We may therefore expect a similar
148 increase in fitness upon exposure to a constant environment for those that
149 evolved under fluctuating conditions with repeated heatwaves.

150

151 **Methods**

152 *Study system*

153 *Callosobruchus maculatus* is a globally widespread agricultural pest native to Africa
154 and Asia. Females of this species deposit their eggs on the surface of dried legumes,
155 such as mung beans (*Vigna radiata*) or black-eyed beans (*Vigna unguiculata*). Upon
156 emergence, the larvae burrow into the bean, eclosing as adults 21-27 days later.
157 Adult seed beetles are facultatively aphagous, obtaining all necessary resources
158 during their larval stage within the bean. Adults without food or water can live up to
159 two weeks, while adults with access to nutrients can live three weeks or more (Fox,
160 1993; Ursprung *et al.*, 2009). As soon as they emerge from their beans, adult
161 females of this species can start mating and laying eggs immediately (Beck &
162 Blumer, 2014).

163 In this experiment, we used a strain of *C. maculatus* originating from South
164 India (SI). The original SI beetles were collected in Tirunelveli, India, in 1979
165 (Mitchell, 1991) and were subsequently raised at the University of Kentucky USA
166 (hereafter referred to as SI USA). We obtained this strain from Uppsala University in

167 Sweden in 2015 and have since maintained it at the American University of Paris.
 168 Stock populations have been cultured exclusively on mung beans and kept in climate
 169 chambers at a constant 29°C, 50% relative humidity, and 12:12h light:dark cycle.

170 Prior to the experiment, beetles were kept in one liter jars containing 250
 171 grams of beans, and approximately 250-350 newly hatched beetles were moved to
 172 fresh jars with beans every 24 days. Adequate beans were provided to allow each
 173 female to lay just one egg per bean, thus preventing competition among multiple
 174 larvae within a single bean (Berg & Maklakov, 2012; Berg *et al.*, 2019). This is
 175 important as larval competition has been found to significantly reduce fitness (Vamosi
 176 & Lesack, 2007) and body mass (Colegrave, 1993; Vamosi, 2005) at emergence.
 177 Indeed, within populations with high larval competition, females readily avoid laying
 178 additional eggs on seeds that have already been used (Fox & Messina, 2018).

179

180 *Thermal evolution lines and assay conditions*

181 See Fig. S1 for a detailed diagram. Before establishing treatment groups, we
 182 maintained a single ancestral population of SI USA beetles in two distinct climate
 183 chambers. These chambers were maintained under identical humidity and light
 184 conditions but differed in their long-term thermal regime. One population was
 185 maintained at a fluctuating thermal regime (hereafter, “Fluctuating”) for 130
 186 generations whilst another was maintained for 43 generations at the same fluctuating
 187 thermal regime but experienced regular heatwaves (hereafter, “Heatwave”). This
 188 provided ample time for the populations to adapt to these conditions. For the
 189 “Fluctuating” thermal regime, the seed beetles were subjected to a daily temperature
 190 cycle consisting of 12 separate 2 hour periods of constant temperature T_i ,

$$193 \quad T_i = T_{mean} + \Delta T \sin\left(\frac{i - 12}{12} \pi\right),$$

191 where $T_{mean} = 33^\circ\text{C}$, $\Delta T = 7^\circ\text{C}$, and $i = 0, 1, \dots, 11$. This was a stepwise sinusoidal
 192 temperature cycle with $T_{max} = 40^\circ\text{C}$ and $T_{min} = 26^\circ\text{C}$ which mimics typical late spring

194 condition in Southern India, where this species evolved. For the “Heatwave” thermal
 195 regime, the beetles were exposed to an increase of 2°C over the entire diurnal cycle,
 196 reaching a T_{max} of 42°C, consistent with a heatwave in Southern India.

$$197 \quad T^h_i = T_i + 2 = T_{mean} + \Delta T \sin\left(\frac{i-12}{12}\pi\right) + 2$$

198 Here, T^h_i is the temperature of the chamber during the heatwave regime at step “i”,
 199 over a period of 7 days starting at 6:00 am (the point of T_{min}). To mimic the random
 200 character of the occurrences, the “Heatwave” regime was initiated on different days
 201 during the lifecycle of the beetles. Specifically, during each generation the
 202 “heatwave” regime was initiated a day earlier relative to the prior one.

203 Prior to conducting experimental assays, we subdivided beetles from the two
 204 different thermal regimes into three replicates each ($n = 6$, 2 thermal regimes x 3
 205 replicates). For both thermal regimes, beetles from each of the three replicates were
 206 used to create a final six groups, which were either kept at their ancestral conditions
 207 or were acclimatized for two generations without selection to Constant conditions at
 208 29°C (with a sample size of 50 beetle pairs each; *total n of treatments* = 12, 2
 209 thermal regimes x 3 replicates x 2 environmental conditions). The assay conditions
 210 were as follows:

- 211 1. **Fluctuating–Constant:** Beetles that had evolved under Fluctuating
 212 conditions and then kept for two generations at Constant conditions of 29°C
 213 prior to assaying. This was done in order to control for any possible parental
 214 effects and to separate genetic adaptation from phenotypic plasticity (Lind *et*
 215 *al.*, 2014; Lymbery *et al.*, 2020).
- 216 2. **Heatwave–Constant:** Beetles that had evolved under Heatwave conditions
 217 and then kept for two generations at Constant conditions of 29°C prior to
 218 assaying (see above).
- 219 3. **Heatwave–Fluctuating:** Beetles that had evolved under Heatwave conditions
 220 and remained in these conditions prior to assaying. Note that, Fluctuating and

221 Heatwave conditions are the same except when a periodic heatwave is
222 happening. No heatwaves were applied during the assay period (see below).

223 4. **Fluctuating–Fluctuating:** Beetles that had evolved under Fluctuating
224 conditions and remained in these conditions prior to assaying.

225

226 For the Fluctuating-Constant and the Heatwave-Constant assays, the following
227 steps were performed. First, we transferred beans containing fertilized eggs from jars
228 into a 48-well virgin chamber (aerated plastic culture plates with a separate well for
229 each individual) with one bean allocated per well. The virgin chambers were then
230 moved to the Constant climate chamber where they were kept at constant 29°C.

231 Once at least 50 males and 50 females from each virgin chamber had hatched,
232 we randomly paired one-day-old males and females and placed them in petri dishes
233 with 100 beans and returned these to the Constant chamber. *C. maculatus* females
234 lay a maximum of 100 beans in their lifetime (Berg & Maklakov, 2012) and we
235 ensured that each petri dish contained a sufficient number of beans to allow females
236 to lay only one egg per bean, thereby minimizing larval competition. To further
237 reduce larval competition, we removed adult beetle pairs from the petri dishes after
238 72 hours (Berg & Maklakov, 2012; Berg *et al.*, 2019). 19 days later, before any
239 offspring eclosed, we transferred up to 48 beans with eggs from each dish into
240 separate, labelled 48-well virgin chambers. One day following eclosion, we randomly
241 selected and paired 50 females and 50 males (taking care not to pair full siblings)
242 and placed them into 50mm petri dishes, each containing 80 beans. After 72 hours,
243 the adult males and females were removed from the petri dishes. We repeated this
244 process for one additional generation: once again, before eclosion, beans containing
245 fertilized eggs from each petri dish were transferred into separate 48-well virgin
246 chambers. We used the offspring that hatched out of these chambers for the
247 development time (time from laying until hatching) and reproductive fitness assays
248 (below).

249 For the Fluctuating-Fluctuating and Heatwave-Fluctuating treatments, we
250 omitted the acclimatization steps, as controlling for the influence of parental effects
251 was unnecessary here (see above) and directly transferred beans containing
252 fertilized eggs into virgin chambers prior to hatching. These were kept at the same
253 conditions that the beetles had evolved in, however, for the "Heatwave" thermal
254 regime, we avoided applying heatwaves during the assay period to avoid any
255 unintended effects of elevated heat exposure on larval development. This allowed us
256 to test the effects of heatwaves on adult reproductive fitness specifically. For all
257 assays, one-day-old males and females were randomly selected.

258

259 *Development time and reproductive fitness assays*

260 Development time and fitness assays were conducted simultaneously. We paired 50
261 one-day-old male and female beetles and placed them into 60-mm Petri dishes
262 containing 70 beans. After 24 hours, each pair was transferred together into a fresh
263 60-mm petri dish containing 60 beans, while the initial dish was set aside in the same
264 climate chamber. The following day, this procedure was repeated. The beetles were
265 left in the third and last set of dishes, containing 50 beans, until their death. The
266 number of beans in the dishes always exceeded the total number of eggs any female
267 could lay in a single day at that age. The initial dishes for each pair were labeled as
268 "Day 0," the second dishes were labeled as "Day 1," and the final set of dishes were
269 labeled as "Day 2+." 18 days after each dish was set up, before any new beetles
270 could hatch, all beans with fertilized eggs were transferred into virgin chambers.
271 These were then monitored daily to record the date of eclosion and the sex of all
272 offspring. To calculate development time, we counted the number of days between
273 the date that an egg was laid and the date the adult offspring eclosed. LRS was
274 calculated as the total number of offspring that emerged from each pair, across all
275 three reproductive days (and dishes; Days 0, 1, and 2+).

276

277 *Statistical Analysis*

278 All code was run using R v.4.4.2 (R Core Team, 2021) and is available on GitHub at
279 ElvimeyCook/Heatwave_Beetles. Linear and generalized linear mixed were run
280 initially in {glmmTMB} v.1.1.10 (Brooks *et al.*, 2017; Magnusson *et al.*, 2017) with
281 residual diagnostics including detection of zero-inflation and dispersion using
282 {DHARMA} v.0.4.7 (Hartig, 2017). Bias-corrected estimated marginal means were
283 then extracted from these models using {emmeans} v.1.10.7 (Lenth *et al.*, 2019)
284 corrected for by a multivariate t distribution (mvt). Data was imported, cleaned, and
285 tidied using {readr} v.2.1.5, {tidyr} v.1.3.1, {dplyr} v1.1.4 (Wickham *et al.*, 2019),
286 {hablar} v.0.3.2 (Sjoberg, 2020), {janitor} v.2.2.1 (Firke, 2020), and {data.table}
287 v.1.17.0 (Dowle *et al.*, 2019). Data was then visualised using {ggplot2} v.3.5.1
288 (Wickham, 2011). Heteroscedasticity was detected in the linear model for
289 development time even after adding a predictor into the dispersion formula of the
290 glmmTMB model so was instead run using {robustlmm} v.3.3-1 (Koller, 2016). All
291 other packages used are found in the “renv” folder stored using the {renv} v.1.0.7
292 (Ushey, 2023) package and contained within the session.info section of the code
293 README within the repository.

294

295 For the model of lifetime reproductive success (or total reproduction across Days 0,
296 1, 2+) we added fixed categorical predictors of thermal regime (fluctuating and
297 heatwave) in a two-way interaction with assay environment (constant and
298 fluctuating). A 16-level random effect of population (see above) was also added. The
299 following model procedure was followed. Three models were initially fitted (a Poisson
300 model, with and without an object-level random effect, and a Conway-Maxwell
301 Poisson model) and tested for overdispersion and zero-inflation. If significant zero-
302 inflation was still detected, we instead compared a zero-inflated Poisson model (with
303 and without an object-level random effect) to a zero-inflated Conway-Maxwell
304 Poisson model and compared these via Akaike Information Criterion. Lastly, if

305 significant dispersion or heterogeneity of residuals were still detected after
306 accounting for zero-inflation, we performed model selection on parameters in the
307 dispersion formula (including adding a 12-level fixed factor of group, as random
308 effects are not allowed within the dispersion formula). Note, no model selection
309 occurred on the main part of the model.

310

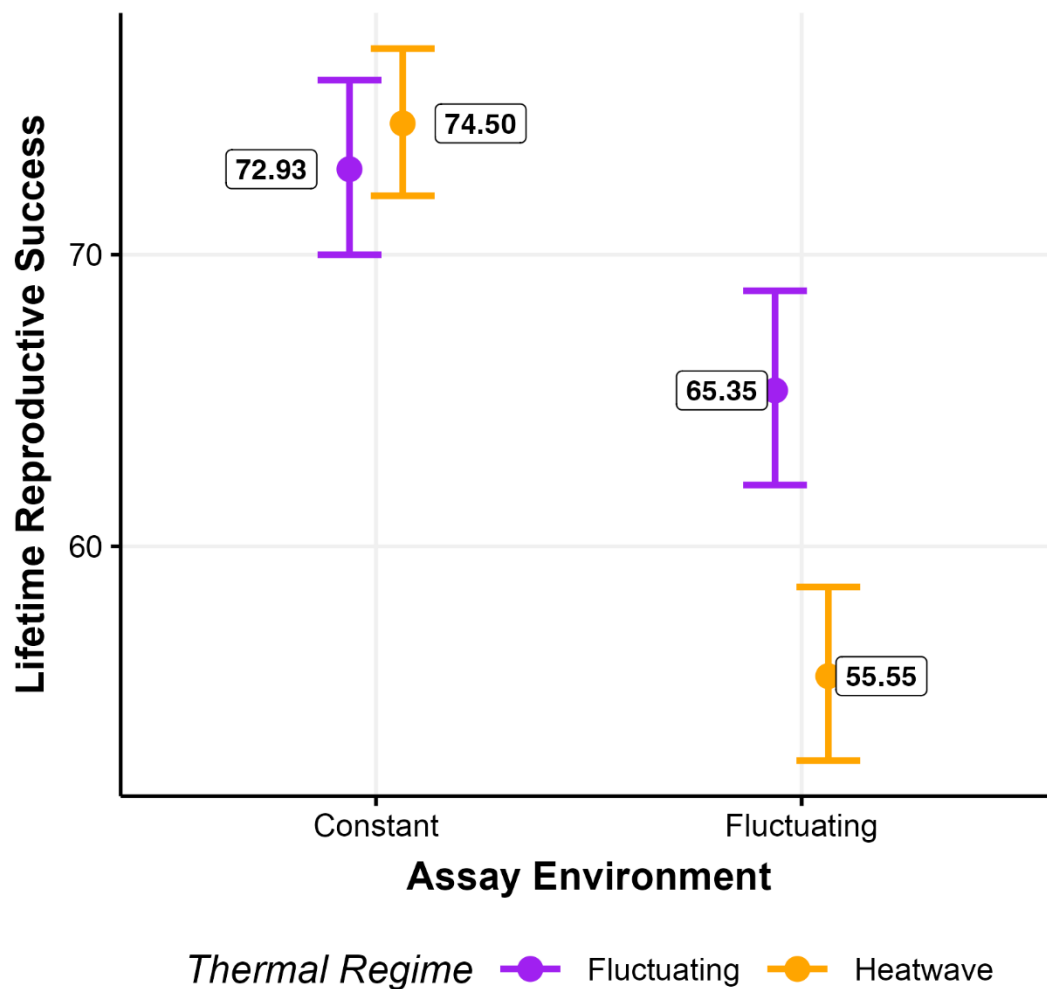
311 Development time was log-transformed and ran in a Gaussian model with the same
312 random (albeit with an additional random intercept of pair ID nested within the
313 random factor of group to account for non-independence) and fixed effects with
314 interactions as above. Similar model selection took place on the dispersion formula of
315 the model. However, even with this added dispersion parameter, significant
316 heteroscedasticity was identified in residuals. This led to the use of a robust linear
317 mixed effect model (see above). P values for the robust linear model were obtained
318 using the {sjPlot} v. 2.8.17 package (Lüdecke, 2013). The qualitative results did not
319 vary between either method.

320

321 **Results**

322 *Lifetime reproductive success*

323 Lifetime reproductive success was significantly influenced by the interaction between
324 thermal regime (Heatwave and Fluctuating) and assay environment (Constant and
325 Fluctuating; Fig 1; $p < 0.001$; Table S2). More specifically, when assayed under
326 fluctuating conditions, individuals that evolved under heatwave conditions had
327 reduced LRS compared to those that evolved under fluctuating conditions ($p < 0.001$;
328 Table S3). This difference in LRS disappeared when assayed under constant benign
329 conditions ($p = 0.701$; Fig. 1: Table S3). For both thermal regimes, LRS under
330 constant conditions was higher than fluctuating conditions (both $p < 0.001$; Fig. 1;
331 Table S3).



332

333 **Figure 1.** Lifetime reproduction success of individuals from heatwave (orange) and
 334 fluctuating (purple) thermal regimes assayed in constant or fluctuating environments.

335 Points with error bars represent mean values with accompanying 95% asymptotic

336 confidence levels taken from the final model of lifetime reproductive success.

337

338 *Development time*

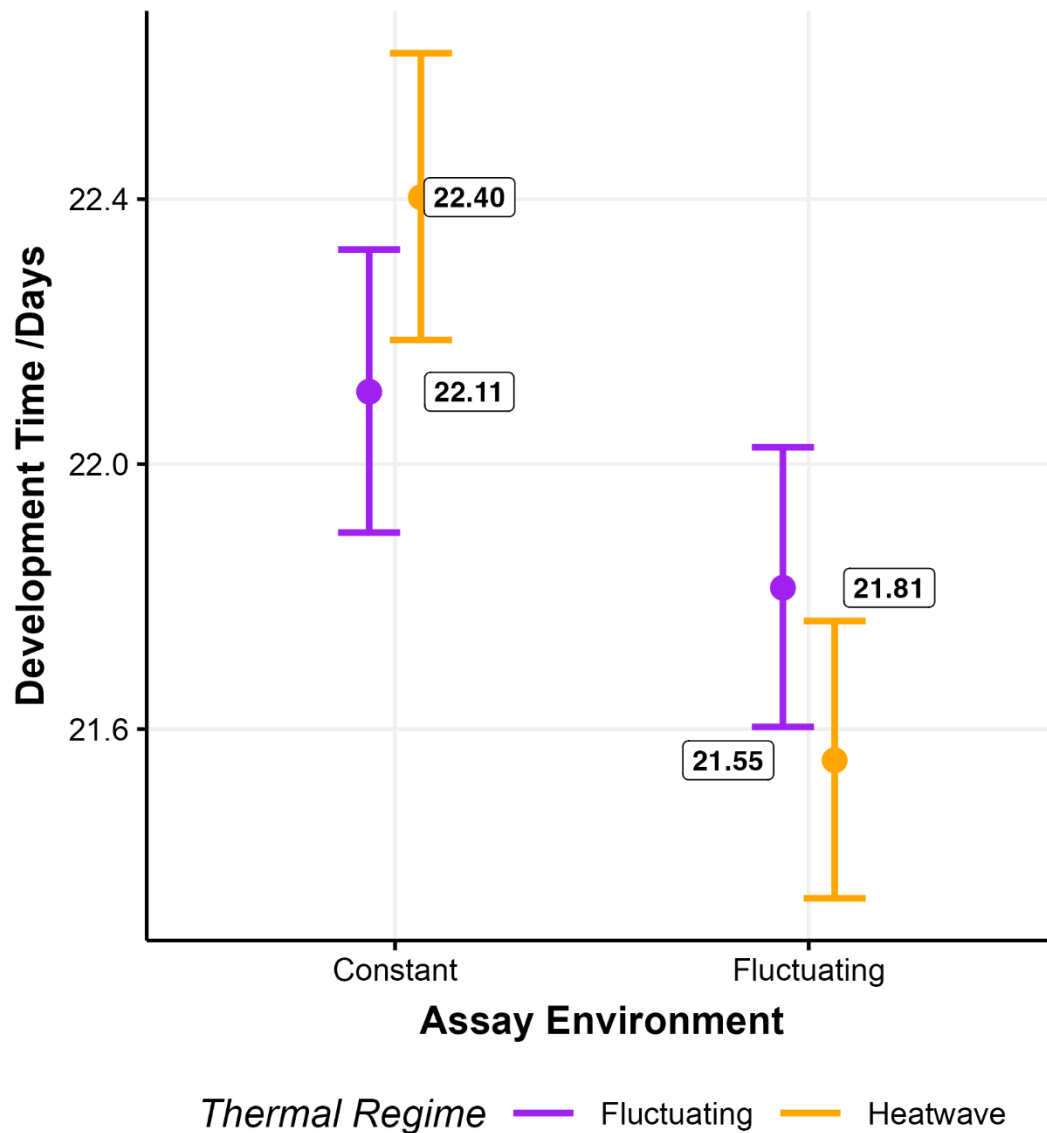
339 In a similar manner to LRS, the development time of individuals was influenced by
 340 the interaction between assay environment and thermal regime ($p = 0.001$; Fig. 2;

341 Table S4). However, estimated marginal means corrected for by a multivariate t

342 distribution indicated no significant difference between Fluctuating and Heatwave

343 regimes within the Constant or Fluctuating assay environments ($p = 0.565$ and 0.098 ,

344 respectively; Fig. 2; Table S5). However, there were differences between
345 environments, with all individuals, regardless of thermal regime, developing slower
346 under the constant conditions ($p = 0.050$ and <0.001 ; Table S5), although this effect
347 appeared larger for heatwave individuals (Fig. 2)



348

349 **Figure 2.** Development time (in days) of individuals from heatwave (orange) and
350 fluctuating (purple) thermal regimes assayed in constant or fluctuating environments.
351 Points with error bars represent mean values with accompanying 95% asymptotic
352 confidence levels taken from the final model of development time.

353

354 **Discussion**

355 The aim of this study was to investigate the effects of long-term heatwave exposure
356 on seed beetles (*C. maculatus*) that had evolved under natural diel temperature
357 fluctuations. Beetles adapted to fluctuating temperatures were exposed for 43
358 generations to periodic heatwaves and then assayed in either the ancestral
359 fluctuating conditions or in a novel constant environment. We hypothesized that long-
360 term exposure to heatwaves would result in either 1) decreased fitness and impaired
361 or delayed development relative to beetles that had not evolved with heatwaves
362 (Sales *et al.*, 2018, 2024), or conversely 2) improved resistance and tolerance to
363 elevated temperatures (French *et al.*, 2019; Ahrens *et al.*, 2021; Xu *et al.*, 2021).
364 Additionally, we hypothesized that individuals from both the fluctuating and heatwave
365 conditions would react in a similar manner when exposed to a novel constant (or
366 benign) environment, similar to what Ivimey-Cook *et al.* (2024) found in a previous
367 experiment.

368

369 In fact, we found that individuals from populations exposed to regular heatwaves had
370 significantly lower fitness than individuals from populations without this exposure.
371 This negative effect of heatwave exposure aligns with previous research across a
372 variety of species across both sexes (Sales *et al.*, 2018; Martinet *et al.*, 2021; Siegle
373 *et al.*, 2022; Ratz *et al.*, 2024; Weaving *et al.*, 2024). This decline is to be expected if
374 there is negative effect of repeated and sustained elevation of heat shock proteins
375 (Feder & Hofmann, 1999; Sørensen *et al.*, 2003; Siegle *et al.*, 2022). Among males,
376 reproductive success might decline if heatwaves lead to reduced sperm count or
377 motility or alter sperm morphology (Sales *et al.*, 2021; Ratz *et al.*, 2024). We may
378 also expect this decrease if females suffered reproductive abnormalities, such as
379 those found in the female tsetse fly after exposure to 30°C heat (Mellanby, 1937;

380 Weaving *et al.*, 2024). Furthermore, given that the occurrence of heatwaves was
381 random, this difference in LRS could be a result of temporal misalignment between
382 required phenotype and environment, or from the cost of evolving the necessary
383 mechanisms to detect changes within the environment (such as heatwaves) and to
384 produce appropriate phenotypes sufficiently rapidly (Burggren, 2020; Hoffmann &
385 Bridle, 2021). However, it should be noted that the LRS between these two groups,
386 although significant, is not markedly different (i.e, heatwave individuals exposed are
387 still able to reproduce), suggesting either some form of reproductive recovery or
388 repair after prolonged heatwaves exposure (Ma *et al.*, 2018; Sales *et al.*, 2021), or
389 the evolution of improved tolerance and resistance to elevated temperatures (French
390 *et al.*, 2019). Future work involving these long-term evolution lines should therefore
391 aim to compare the physiological differences, such as levels of expression of heat
392 shock proteins or reproductive impairment, after one generation of heatwave
393 exposure versus after multiple generations.

394

395 Although long-term exposure to heatwaves appeared to have a negative impact on
396 reproduction when the beetles were assayed at fluctuating conditions, we found that
397 individuals from both fluctuating and heatwave conditions had increased reproductive
398 fitness when assayed in a novel but constant 29°C environment. This is analogous to
399 the results found in Ivimey-Cook *et al.*, (2024), where two different strains of *C.*
400 *maculatus* (SI USA and Leicester) that had evolved under diel fluctuations had higher
401 LRS when assayed within a constant 29°C environment than when assayed under
402 fluctuating conditions. This suggests that evolution in a fluctuating environment can
403 select for individuals with a broadened thermal niche that are more robust after
404 generations of mutation removal and selective mortality (Rankin & Sponaugle, 2011;
405 Ketola *et al.*, 2013, Ivimey-Cook *et al.* 2024). Also, if an individual has narrowed their
406 thermal niche and postponed critical functions that only occur within a specific
407 temperature window, as in the diel narrowing hypothesis (Kefford *et al.*, 2022), then

408 reproductive performance should increase when individuals are placed within a
409 constant and benign environment (Gilchrist, 1995; Kefford *et al.*, 2022). This is an
410 important result, which further highlights how evolution under fluctuating
411 environments can lead to an improved response to short-term changes in
412 environment, regardless of heatwave exposure.

413

414 Lastly, we found no negative effect of heatwave exposure on individual development
415 time. Beetles from both thermal backgrounds developed more quickly (and equally
416 quickly) in fluctuating environments, where the average mean temperature was 4°C
417 hotter than constant conditions. This is similar to the result found in the previous
418 experiment involving the same thermal conditions (Ivimey-Cook *et al.*, 2024), with the
419 fastest development occurring within a fluctuating environment. The lack of a
420 detrimental effect of long-term heatwave exposure on development time is counter to
421 what has been found previously. Some studies have shown a positive effect of
422 elevated temperature exposure, such as in the parasitoid *Cotesia glomerata*, which
423 developed twice as quickly in higher temperatures (Chen *et al.*, 2019). Other studies
424 have shown negative effects, for instance in the solitary bee *Osmia lignaria*, which
425 developed more slowly under 37°C heatwave conditions than the no-heatwave
426 control (Melone *et al.*, 2024). However, in both of these cases, individuals were
427 exposed to just one generation of heatwave rather than testing them after multiple (in
428 our case 43) generations. Therefore, we may see a reduction in effect over time
429 when individuals are exposed to more repeated heatwaves and become more
430 resilient to environmental change (Ahrens *et al.*, 2021; Xu *et al.*, 2021).

431

432 In conclusion, we found that populations evolving under repeated heatwaves within
433 naturally fluctuating environments can not only become resilient to exposure in the
434 long term, but are also able to cope with rapid environmental change, reaching
435 maximal performance when conditions suddenly become benign. This study

436 highlights the importance of considering long-term diel fluctuations together with
 437 multi-generational exposure to heatwaves in order to better understand natural
 438 population responses to climatic warming.

439

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443

444 **Conflict of Interest**

445 The authors declare no conflict of interest.

446

447

448 **References**

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