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5	Innovation as part of a wider behavioural syndrome in the guppy:
6	the effect of sex and body size
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12	Running headline: Personality and Innovation in Guppies

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20 Abstract

21 Recent work on animal personalities has shown that individuals within populations often 22 differ consistently in various types of behaviour, and that many of these behaviours correlate among individuals to form behavioural syndromes. Individuals of certain species have also 23 been shown to differ in their rate of behavioural innovation in arriving at novel solutions to 24 25 new and existing problems (e.g. mazes, novel foods). Here we investigate whether behaviours 26 traditionally studied in personality research are correlated with individual rates of innovation 27 as part of a wider behavioural syndrome. Guppies (Poecilia reticulata) of both sexes from 28 three different wild population sources were assessed: (i) exploration of an open area; (ii) speed through a three-dimensional maze; (iii) investigation of a novel object; and (iv) 29 attraction to a novel food. The covariance structure (syndrome structure) was examined using 30 31 structural equation modelling. The best model separated behaviours relating to activity in all contexts from rates of exploration/investigation and innovation. Innovative behaviour 32 33 (utilizing new food and moving through a novel area) in these fish therefore forms part of the 34 same syndrome as the traditional shy-bold continuum (exploration of an open area and 35 investigation of a novel object) found in many animal personality studies. There were no clear 36 differences in innovation or syndrome structure between the sexes, or between the three different populations. However, body size was implicated as part of the behavioural 37 38 syndrome structure, and because body size is highly correlated with age in guppies this suggests that individual behavioural differences in personality/innovation in guppies may 39 40 largely be driven by developmental state.

41 **Keywords:** animal personality, behavioural syndromes, behavioural flexibility, habituation,

42 maze exploration, developmental state

43 Introduction

44 Animals are often faced with novel environments and contexts and must respond to these 45 challenges with new or modified behavioural solutions to cope with the new conditions (Reader and Laland 2003b). This is known as innovation and has been defined by Ramsey et 46 al. (2007) as "...the process that generates in an individual a novel learned behaviour that is 47 48 not simply a consequence of social learning or environmental induction". This separates the origin of a new behaviour from the social spread of the behaviour through a population, i.e. 49 50 via cultural transmission (Hoppitt and Laland 2013). Innovation is widespread throughout 51 many taxa (Reader and Laland 2003b), but it is not clear whether and why individuals differ in their propensity to innovate. In addition, what behaviours are considered as innovative 52 seems to vary across different areas of study. Several studies of innovation in primates and 53 54 birds often includes tasks that demands a higher level of cognition, such as tool use and solving man-made physical puzzles (Goodall 1964, Rutz and St Clair 2012). However, 'simpler' 55 56 tasks, such as learning to utilize a new food source (without the use of tools), is also 57 considered an innovative behaviour. This includes milk bottle top opening by blue tits, Cyanistes caeruleus, (Fisher and Hinde 1949), and ring-tailed lemurs (Lemur catta) learning 58 to reach water by dipping their tails in a lake and then licking the water off their tail, thereby 59 avoiding predators on the ground and in the water (Hosey et al. 1997). In this study, we 60 61 consider any new or modified behaviour used in a novel context as innovative behaviours.

Research on animal personalities has shown that individuals within the same population show consistent differences in behaviour, and that these differences are maintained across environmental contexts (Réale et al. 2010a, Carere and Maestripieri 2013). Individual differences in a range of different behaviours have also been shown to covary among

individuals in what are known as 'behavioural syndromes' (Réale et al. 2010a). For example, 66 67 bolder individuals tend to be more aggressive than shy individuals, and more exploratory 68 individuals are often more active than less exploratory individuals (Riechert and Hedrick 1993, 69 Verbeek et al. 1996). If individuals consistently differ in their rate of innovation, innovative 70 behaviours should also be considered as a personality trait (in the broad sense, Réale et al. 71 2010a). This has been shown in both great tits (Parus major) and blue tits (Cyanistes 72 caeruleus), where individuals differed consistently in their ability to solved different artificial 73 foraging tasks (Morand-Ferron et al. 2011). Innovation could also possibly be linked to 74 individual differences in other behaviours traditionally studied in personality research, such as boldness and neophilia (Reader and Laland 2003b). A link between behavioural type and 75 76 cognitive type has already been discussed by Sih and Del Giudice (2012), specifically regarding the idea of a speed-accuracy trade-off in foraging. In addition, innovative behaviours involve 77 novel contexts not before experienced by an individual, and so innovation might have risks 78 79 and/or costs associated with it. This could include increased predation risk, the risk of 80 consuming hazardous foods (Reader and Laland 2003b) and reduced efficiency when utilizing 81 familiar resources. Therefore, bold or more risk-taking individuals might be more innovative 82 than shy or less risk-taking individuals, because they approach and investigate unfamiliar resources at a higher rate (Reader and Laland 2003b, Sih and Del Giudice 2012, Griffin et al. 83 2015). Such individuals will experience more novel situations in which new and flexible 84 85 behaviour might be useful and carry some adaptive advantage. However, slower, more thoroughly exploring individuals tend to gather more information about their surroundings, 86 and to show greater flexibility in their behaviour (Guillette et al. 2011, Mathot et al. 2012). 87 Thus, whilst bold individuals might be more likely to be the innovators, it is the shy individuals 88 89 that seem best suited to the task of social learning needed for the cultural transmission of

successful innovative behaviours (Reader and Laland 2003b). Although there have been 90 91 several studies investigating when an individual should copy others (Templeton and Giraldeau 92 1995), and when to rely on private vs. public information (van Bergen et al. 2004), few studies 93 have investigated whether some individuals are more prone to solve problems while other 94 individuals are more prone to copy behaviours, leading to the spread of the new behaviour through the population. In addition, few studies have investigated if there is a link between 95 96 traditional animal personalities and information use (but see Harcourt et al. 2010). However, 97 there have been studies showing a link between boldness and flexibility of behaviours. 98 Guillette et al. (2009) found that bolder and more exploratory black-capped chickadees (Poecile atricapillus) that enter a novel environment faster were also quicker to learn in an 99 100 acoustic discrimination task, here used as a measure of cognition, as compared with shyer individuals. However, fast-exploring birds have also been shown to be less flexible in a 101 reversal test, where they learned the change between cue and reward slower compared with 102 103 slow-exploring individual (Guillette et al. 2011). Similarly, a study of Indian mynas 104 (Acridotheres tristis) found that more innovative individuals – here measured as time to 105 complete an extractive foraging task – were slower to change their behaviour when there was 106 a change in the significance of the food cue (Griffin et al. 2013). This is consistent with other 107 studies showing that bold proactive individuals are less flexible than shy reactive individuals 108 (Benus et al. 1988, Verbeek et al. 1994). In addition, dominant individuals might be more 109 aggressive than subordinates, and as such they could afford to be less innovative and thus avoid any inherent risks, and instead use their social access to limited resources to take 110 advantage of the discoveries by low-ranking individuals in something akin to a producer-111 112 scrounger game (Katzir 1982, Liker and Barta 2002). However, there have been very few

studies explicitly on the link between performance in personality assays and tests ofinnovation (but see: Matzel et al. 2006, Light et al. 2008).

115 Many studies of animal personality are methodologically quite similar to studies investigating 116 innovation. Boldness is often measured as the time an animal takes to emerge from a refuge 117 or the latency before approaching a novel object (Verbeek et al. 1994, Niemela et al. 2012). Approaching a novel area, object or food is therefore equivalent to tests of neophobia versus 118 neophilia, an important component of innovation (Webster and Lefebvre 2001, Reader and 119 Laland 2003b). In a study by Dingemanse et al. (2007) on three-spined sticklebacks 120 (Gasterosteus aculeatus), the response to novel food was classified as an exploratory 121 122 behaviour, which is very similar to tests in much of the literature concerning innovative behaviour, i.e. the ability to utilize a novel food sources (Reader and Laland 2003b). 123 124 Conversely, many studies on innovation may represent equally good studies of animal 125 personality behaviours. For example, in a study by (Laland and Reader 1999a), innovation was measured as the latency before guppies (*Poecilia reticulata*) went through a maze, where on 126 the other side they were presented with a novel food. Individuals that were able to figure out 127 the maze fastest and ate the novel food first were classified as more innovative than the 128 slower individuals. However, they could just as easily have been classified as bolder or more 129 130 exploratory individuals, or just more active. Thus, measures of innovation appear to be confounded or to covary with several aspects of other behaviours currently studied in the 131 context of animal personality. Research is clearly needed that investigates the role of such 132 133 innovative behaviours in the context of animal personality assays, therefore making it possible to examine the structure of possibly wider behavioural syndromes of individual 134 boldness versus shyness. 135

In this study, we investigate behavioural syndrome structures in guppies, specifically to see 136 137 whether innovative behaviours are part of a wider behavioural syndrome involving aspects of 138 the bold-shy personality continuum. We only investigated innovative behaviours as defined 139 above, however, and not the social transmission of the behaviour through a population. The 140 guppy is an ideal study organism in this regard, because innovation rate has already been well-studied (Laland and Reader 1999a, b, Reader and Laland 2000), which makes it easier to 141 142 link innovation to any wider bold-shy behavioural syndrome of the type detected in guppies 143 (Smith and Blumstein 2010), and other small fish species in aquarium studies (e.g. 144 Dingemanse et al. 2007). Individuals with higher activity levels were predicted to explore faster and to be more innovative in novel tasks than less active individuals. Irrespective of 145 activity levels, we also predict that bolder individuals showing more neophilic behaviours in 146 novel environments and situations will tend to show higher rates of innovation. We also 147 tested whether sex, body size and population of origin had an effect on the expression of 148 these different behaviours. In a study by Laland and Reader (1999b), it was shown that female 149 150 guppies were significantly more innovative than males. The authors suggested that this might be due to skewed parental investment, which is exclusively female in guppies, and this is 151 supported by evidence that size has a greater effect on fecundity in females than in males 152 153 (Laland and Van Bergen 2003). Females in our study were therefore expected to be more exploratory and innovative than the males. Laland and Reader (1999a) also showed that state-154 155 dependence can affect innovative behaviour in guppies, because individuals with higher hunger levels were more innovative than individuals with a lower hunger level. In guppies, 156 like most fish with indeterminate growth, body size correlates significantly with age, and 157 during scramble competition younger, smaller individuals are expected to be less competitive. 158 Indeed, latency before completion of a novel foraging task has been shown to be shorter for 159

160 younger compared to older male guppies (Laland and Reader 1999b). Smaller, younger 161 individuals should therefore be more exploratory and innovative in general compared to 162 larger individuals, since their lower competitive ability should increase their hunger and 163 motivation for searching for new food sources (Laland and Reader 1999a).

164 Methods

165 Study species

Guppies are small freshwater fish found in rivers and lakes on tropical islands in the general 166 167 area of the Caribbean. The guppies used in this experiment were laboratory-reared at NTNU 168 Norway, but originated from wild stocks from three rivers in Trinidad: Paria (10°47'N, 169 61°15'W); Campo (10°41'N, 61°13'W); and Quare (10°39'N, 61°12'W). Approximately 500 170 individuals were collected from each river, and the three populations have been kept 171 separated in six large aquaria (two per population, 400-500 l), approved by the Norwegian 172 Animal Research Authority (licence number 7). The Paria population was collected in 1991, 173 while the Campo and Quare populations were collected in 1998. Predation pressure was low in both the Paria and Campo rivers, but high in the Quare river (Endler and Houde 1995, 174 175 Pélabon et al. 2013). The lab populations have not been exposed to predators during the last 176 20 years, and any selection due to the regular captive environment is expected to be the same for all three populations. Among-population differences are therefore considered to have a 177 178 historical genetic basis. The guppies were maintained on a 09:00-21:00 light-dark cycle at 25°C and were fed daily with dry flakes and freshly hatched brine shrimps (Artemia nauplii). 179

180 Experimental setup

In this study, each individual guppy was run through four behavioural tests: (i) exploration of a novel arena, (ii) three-dimensional maze solving, and introduction to both (iii) a novel object and (iv) a novel food. Activity level was measured in each test. Most innovative behaviours in animals involve consummation of new food items, or inventing a new way to better process already known food items (Reader and Laland 2003b). It therefore seemed appropriate to include a novel food (iv) as one of our innovation tests. In addition, in (ii) we wanted to mimic the innovative assays involving a maze carried out by Laland and Reader (1999a), as these behaviours have already shown clear differences between the sexes. Exploration, activity and boldness to novel arenas and objects are behaviours traditionally used in the animal personality literature (e.g. Dingemanse et al. 2007), and (i) and (iii) were therefore chosen as such standard tests that would allow us to link them with any individual differences in innovative behaviours. The dataset contained 19 males and 19 females from each of the three populations, adding up to a total of 114 individuals.

One male and one female guppy were randomly selected from each of the three populations 194 and placed together in small isolation tanks (22x14.5x14 cm) in the same room as the 195 196 experiment was conducted – one for each population – where they were food deprived for 197 seven days prior to the experiment. Laland and Reader (1999b) showed that hunger level 198 affected the innovation rate of male guppies, where hungrier individuals where more 199 innovative (i.e. moved faster through a maze apparatus). By properly food depriving the guppies, hunger level was effectively standardized across all individuals, controlling out any 200 201 differences in behaviour caused by contrasting hunger levels among individuals. We also hoped that this would increase motivation for approaching and eating the novel food, as well 202 as activity in general by increasing the need to search for food. There were no deaths during 203 204 or after the experiment, indicating that the food deprivation did not harm the guppies during the course of the experiment. Guppies of different body sizes were selected to ensure enough 205 206 variation to estimate any effect of body size on the different behaviours. Since there is a 207 strong correlation between body size and age in guppies (Reznick et al. 1996), we have included a wide age range in our subjects and some of the guppies included here might even 208 have been considered juveniles. 209

210 Male and female guppies from each population were randomly assigned to one of six 211 experimental tanks (see Fig.1), where individuals were run separately through each of the 212 four behavioural assays. Above each tank there was a mounted camera that recorded the 213 movements of the fish. The walls of the tanks were covered in black plastic to keep individuals 214 visually isolated from each other. Individuals were first placed in acclimation cages at one end of the tank where they were allowed ten minutes to settle prior to the start of the trial (Fig. 215 216 1). After the acclimation period, the fish was gently encouraged to leave the cage, and the 217 door was closed behind them to prevent re-entry. This was done to ensure that all guppies 218 had the same amount of time to explore the tank, and thus avoid any issues arising from individual differences in acclimation time versus exploration time among fish. The guppies 219 220 were (i) given 30 minutes to explore the open area before the maze door was raised, and they were gently encouraged to enter the maze using a small landing net drawn slowly through 221 the water. The fish did not seem to be affected by this procedure, as their swimming speed 222 223 did not increase markedly at the time or immediately following. Again, this procedure was 224 carried out to avoid any individually determined differences in the time available to different fish to explore the maze. The maze door was then closed, and the guppies had (ii) 30 minutes 225 226 to get to the end of the 3-dimentional maze. There was no food reward or hiding place at the 227 end of the maze, hence the maze only represented innovation in terms of moving in a novel way through a novel environmental set-up (Laland and Reader 1999a). After the 30 minutes 228 229 in the maze, the guppies were removed from the maze with a landing net and transferred back into the main exploration area where they were (iii) presented with a novel object (an 230 aquarium decoration), which had been placed in the middle of the exploration area; 10 cm 231 from the maze wall (see Fig.1). After 15 minutes the novel object was removed, and the 232 233 guppies were presented with (iv) salmon food in a glass bowl, which was a novel food for these populations. The glass bowl had been placed in the tank before the start of the trial and was therefore part of the novel environmental in (i), and thus should not have represented a novel object in itself during (iv). The novel food was placed in the middle of the tank, 10 cm from where the novel object had been, as indicated in Fig.1.

We measured body size after the guppies had completed all four behavioural trials. The guppies were sedated in ice water at 8°C and photographed individually with a 1cm ruler next to them, before being put back into their isolation tanks where they recovered immediately. Body length was measured on the digitized image using tpsDIG, where landmarks were placed on the tip of the nose and the back of the tail (tail fin not included) and the distance assessed relative to landmarks placed on the ruler.

244 37 guppies ate the salmon food, meaning that it was perceived as a possible food source. The (i) exploration of the new area and (iii) of the novel object can here be seen as traditional 245 246 personality tests of exploration and boldness respectively (Sih et al. 2004), while (ii) the maze and (iv) the novel food represents innovative behaviours (Laland and Reader 1999a). 247 248 Alternatively, the (i) exploration test and (ii) the maze can be seen as spatial tests, while 249 approach of the (iii) novel object and (iv) novel food can be seen as non-spatial tests. Guppies 250 from different predatory regimes have been shown to differ in their exploratory strategies 251 (Burns and Rodd 2008), with guppies living in high predator environments using more time to decide which chambers to explore in a maze, while guppies in low predatory environment 252 made faster but less accurate decisions. Behaviours used in exploring an open field versus a 253 maze might therefore be more strongly correlated with each other than with behaviours used 254 255 in the approach of a novel object or a novel food item.

256 Video analysis

All experiments were recorded using Sony high-resolution colour CCD cameras (model NC1381W) mounted above each of the six experimental tanks. Cameras were connected to H-264 Portable Mini Video Surveillance Recorders from LUPUS TEC (Recording resolution and frame rate: 704x576@25 FPS, 352x280@25 FPS (PAL)) on a 16 MbScanDisk memory card.

Data recording started within 30 seconds of fish release from the acclimation cage, at the 261 point when the surface water was sufficiently still to allow observations. To quantify the 262 263 recorded data of (i) the exploration of a new area and (ii) the maze, twenty-four squares were drawn on a transparent sheet and placed over the monitor screen for both trials (see Fig.S1). 264 265 Most individuals explored all 24 squares, making results on the number of new squares 266 explored highly skewed to the maximum possible number. However, because not all individuals completed the assays, time to completion would also not fully represent all of the 267 268 individual variation measured in these assays, because it would not differentiate between individuals that did and did not explore all of the squares. This problem of partial completion 269 of the task was also the case for the other three assays, and the count and timing 270 271 measurements for the different assays were therefore converted into rates (squares per time) 272 prior to statistical analysis in order to capture all aspects of individual variation in behaviour. Exploration was quantified as the time an individual used to explore the total number of new 273 274 squares divided by the total number of new squares explored. This created a rate 275 representing the time used to enter/explore each square, where a low value indicates fast exploration. Speed through the maze was assessed by measuring the maximum distance 276 reached by counting number of steps (12 steps in total with 2 squares per step; Fig.S1) each 277 278 guppy moved through the maze. A ratio with time to reach the maximum point in the maze 279 divided by maximum point (step) reached was created to represent a rate of movement 280 through the maze. Investigation of both the novel object and the novel food was quantified 281 by how close the guppies got to the item, and the time taken to reach this distance. This was 282 done by drawing 5 concentric circles 1 cm apart on a new transparent sheet placed on the monitor around the novel object and novel food (Fig.S1). If the guppies did not enter any of 283 the circles, they were given a score of one, while if they crossed the first circle they were 284 285 scored with a value of two, and so on to the innermost circle where they were scored a value 286 of six. Again, a ratio with time to reach minimum distance divided by minimum distance reach 287 was created to represent the rate of approach towards the novel object and the novel food. Activity was measured in all four trials (i-iv) as the total number of squares visited in the first, 288 289 middle and last 5 minutes of each trial. In the novel object trial it was measured for the first, middle and last 3 minutes, and the data were scaled up to equivalent values for 5 minutes for 290 291 comparison in the other activity measures. Also, the smaller square sizes in the maze (see 292 Fig.S1) required further correction for activity during the maze trial to allow comparison with 293 spatial activity in the main tank area. In this way, the activity level in terms of distance travelled per time period was equalized across the different types of assays. 294

295 Statistical analysis

All the statistical analyses were carried out in R, version 3.1.1 (R Development Core Team 2015). Activity measures where square-root transformed prior to all statistical analyses to satisfy the assumption of normality.

299 Univariate ANCOVAs were carried out separately on all the eight behavioural variables (i.e. 300 rate of exploration (i), speed through the 3-dimentional maze (ii), approach of both novel 301 object (iii) and novel food (iv), and on activity measures for all four trials) to see if there were 302 any mean differences between the three populations, sexes or any effect of body sizes, or 303 their interactions. Full models with all interactions are presented in all cases. Experimenter 304 identity (which of the two experimenters conducted the experiment), observer identity 305 (which of the two experimenters analysed the videos) and tank identity were added as fixed 306 effects to all the models, but subsequently removed from all results presented as they were shown to have no systematic effects. Mixed effect models were also used to calculate short-307 308 term repeatability for activity, as well as to investigate the habituation in activity level across 309 the trials (see Supplementary materials).

Bivariate correlations between the eight different behavioural variables (i.e. the four rates and the four activity measures) were calculated using Pearson's correlation coefficients. This correlation matrix was produced for the overall results, and for the two sexes separately (see Tables S5, S7 and S8). To then study the wider structure of these covariances between the different behaviour variables, structural equation modelling (SEM) was carried out using the correlation matrix in the lavaan package in R. Seven hypothesized covariance structures were proposed with different underlying latent variables (Fig.2 and Fig.3).

317 After running the first four hypotheses (Fig.2), we found no difference in ability to explain the 318 data, suggesting that none of these models (H1-H3) really captured the actual patterns of 319 covariance. For example, we know that there was a high across-trial individual repeatability 320 (Table S1) and strong correlations between all the activity variables (Table S5), and that the rate variables seemed correlated (in the non-spatial latent variable in H3). Therefore, 321 exploratory principal component analyses (PCA's) were conducted to investigate possible 322 323 syndrome structures not yet considered. The PCA's were run without a rotation and with a varimax rotation. A standard PCA adds principal components (PC) where there is most 324

variation left orthogonal to the previous PC, while a varimax rotation rotates all PCs to find the structure that explains the most variation. Both versions of the PCA's where therefore run to better investigate the covariation structure of the data. From these results three new *a posteri* hypothetical models were constructed and tested in SEM, as presented in Fig.3.

SEM results were ranked according to the Akaike information criterion (AIC), and the best 329 model was used to further explore any structural differences caused by the different sexes 330 and populations, and to see if there was any influence of body size. The best model was run 331 separately for each sex and population, with both free parameters and with parameters 332 constrained to the factor loadings of the opposite sex or the two other populations 333 334 (Dingemanse et al. 2010). The best model was also run with body size covarying or not with the latent variables to see if it was implicated in the behavioural syndrome. AIC values were 335 336 again used to see which of these models provided the best fit.

337 **Results**

338 Univariate tests of the variances in each behavioural variable

There were very few significant effects of population, sex or body size on the average levels of each of the eight behavioural response variables, especially given the number of tests (Table 1, Fig.4). In the novel food test, males did have a higher activity level than females, and smaller individuals were somewhat more active than larger ones, but the interaction term shows that this effect was largely restricted to females with their larger range of body sizes (Table 1; Fig.S3). Population had no significant effect on any of the measured behaviours.

Activity level was highly individually repeatable across the assays in both sexes and all three populations, even with the inclusion of the maze trial (total R = 0.50 (0.456-0.537); Table S1). However, this is repeatability across contexts and is only short-term repeatability, which might explain why it is perhaps higher than any true repeatability in activity assessed using the same assay or context over a sufficiently long period of different days or months (Bell et al. 2009).

351 Non-rotated and varimax rotated PCAs

PCAs were conducted to further investigate the co-variance structure between the eight behaviour variables. These were done without a rotation (Table 2) and with a varimax rotation (Table 3). In the un-rotated PCA, all the activity variables in addition to rate during the novel food test dropped out in the first principal component (PC), while all the other rates dropped out in PC2. These were the only significant PC's (eigenvalue >1) with eigenvalue 3.33 and 1.38 respectively. In the varimax rotated PCA, all the activity measurements dropped out as PC1, while the rates dropped out singularly as PC2-PC5. Only the first PC was significant though,with an eigenvalue of 1.97.

360 SEM of covariance patterns between the behavioural variables

To investigate the structure of the behavioural syndrome, seven SEM models were compared 361 (see Methods, Figs. 2 & 3). The H0 hypothesis, where none of the observed variables 362 correlate, had the worst fit (see Table 4), which indicates that there is some sort of syndrome 363 involving these variables. However, there were no meaningful differences between H1 (all 364 behaviours correlate), H2 (personality vs. innovation) and H3 (spatial vs. non-spatial) – see 365 Fig.2, which is why we included three new models based on the results from the PCA (see 366 367 Methods). Of these, H5 (activity vs. rate) emerged as clearly the best model (Fig.5a), with H4 (activity driven) and H6 (only activity) actually having higher AIC scores than H1-3 (Table 4). 368 This suggests that the rates of exploration/innovation were not simply driven by the activity 369 370 level during the different assays, but that the rate variable in themselves constitute a separate set of covariances captured by the second latent variable, which then covaries with the latent 371 variable containing the activity measures (Fig.5a). The factor loadings for activity in H5 are 372 373 higher than those for the rate variables, indicating that activity has a stronger effect within 374 the syndrome, although H5 does allow us to conclude that there was a separate lesser covariance within the rate variables as well. The covariance between the latent variables is 375 376 negative, as expected, since more active individuals were more likely to complete the tasks 377 faster, such as explore the new area or get through the maze (note that lower rates refer to a faster completion of a trial). All loadings for the rate variables were positive, thus bolder 378 379 and more exploratory individuals were also more innovative. There were no significant differences in the syndrome structure for this model between the sexes or between the three
populations (see supplementary materials; Table S6, S7 and S8).

382

Including body size as part of the activity syndrome of the best model (H5) gave the best fit 383 384 (Table 5, Fig.5b). However, because the ΔAIC value is less than 2, it does not have better fit than models where body size is part of the rate latent variable or linked to both latent 385 variables. However, it is better than H5 with only the variance term for body size included in 386 the model ($\Delta AIC > 2$), indicating that body size covaried with the behavioural syndrome 387 388 structure in the guppies in some way. Body size had a negative factor loading (see Fig.5b), 389 which confirms the effects seen above (Table 1, Fig.S3). Smaller individuals were more active than larger individuals, suggesting that the behavioural syndrome identified here may be 390 condition-dependent in terms of differences in the level of individual indeterminate growth 391 392 and/or development.

393 **Discussion**

394 In this study, we show that innovative behaviours covary with traditional personality 395 behaviours as part of a wider behavioural syndrome in guppies. Since the best model including activity and rates as separate latent variables (H5) had a better fit than a model with 396 covariances in only activity (H6), it is clear that covariation between the 397 398 exploration/investigation rates also contributed to the syndrome, and that they were not 399 merely driven by their covariance with levels of activity within the same test (i.e. model H4, 400 see Fig.3). The innovative behaviours (maze solving and exploitation of novel food) and classical behaviours measured in studies of animal personality (exploration and boldness 401 towards a novel object) did not divide into separate latent variables (model H2, see Fig.2). It 402 therefore seems that the classification of the innovation versus classical animal personality 403 404 behaviours in this way might be an artificial construct arising from the different research traditions (e.g. see the different books: Reader and Laland 2003a, Carere and Maestripieri 405 406 2013). Approaching a novel object and novel food might not be any different in any 407 fundamental way for the guppies, even though they could be categorized by different groups 408 of researchers as boldness versus innovation behaviours, respectively. Thus, the innovative 409 behaviours we measured (i.e. the maze and novel food trials) might not necessarily have been 'innovation' behaviours at all, and might just reflect differences in boldness and shyness in 410 411 the exploration of novelty. However, these assays were specifically chosen because they are similar to tests that have previously been used to measure innovation for guppies in studies 412 by Laland and Reader (1999a). As previously mentioned, the utilization of a novel food is the 413 most common form of innovative behaviour and has become a focus of many studies in this 414 area (Reader and Laland 2003a). Since the exploration/investigation rate variables here 415

constitute a single latent variable, and all the loadings for the rates where positive, this 416 417 suggests that this variation could be driven by individual differences in curiosity, 418 neophilia/neophobia, boldness and hence a tendency to innovate. This therefore suggests 419 that individuals that explore faster are also in general more bold and innovative. The negative correlation between the latent variables for activity and rates also indicates that more active 420 individuals finished the different tasks quicker than less active individuals (as mentioned 421 422 above, a lower rate score refers to fast completion of the tasks), showing that bolder and 423 more innovative individuals were also more active.

Population and sex had no effect on the behavioural syndrome structure. These guppies have 424 425 been in captivity for over 20 years, and they have not been under any specific selection pressure, such as predation or food limitation, during this time. Dingemanse et al. (2007) 426 427 showed that three-spine sticklebacks living in predator-free environments had weaker 428 syndrome structures compared with sticklebacks that lived in areas with predators. Predation pressure is the main difference between our guppy populations in their original sites, where 429 predator fish were absent in Paria and Campo, whereas Quare experienced high predation 430 risk (Reznick et al. 1996, Pélabon et al. 2013), and behavioural differences between wild guppy 431 populations due to difference in predation pressure have been shown previously (e.g. Burns 432 433 and Rodd 2008, Harris et al. 2010). The lack of any predator pressure on all the three populations over many generations in captivity might therefore have reduced such 434 behavioural differences among these populations. In other animals, captive strains can exhibit 435 substantial changes in behaviour after only a few generations (Smith and Blumstein 2008, 436 Williams and Hoffman 2009, Larsen et al. 2011, Bolstad et al. 2012). It is therefore problematic 437

to come to any firm conclusions regarding our comparisons between the decedents of thesethree natural populations.

440 From the univariate analysis, no effect of sex was found on the exploration/investigation rate variables, including anything that could be described as innovation. However, there were 441 442 some differences between the sexes in activity levels, which interestingly involved larger females being less active than males (that showed no effect of body size over their smaller 443 range of body sizes; Fig.S3), and the effect was especially clear in the context of a novel food. 444 Female fitness depends more in longevity since larger, and thus older, females produce more 445 offspring. In addition, females can store sperm and do not necessarily need to seek out males 446 447 to produce more broods (Reznick and Yang 1993). Males, on the other hand, constantly need to seek out new mates to increase their reproductive outcome as females are the choosy sex, 448 449 and thus perhaps males have to take more risks (Houde 1988). Female guppies caught in the 450 wild show more cautious behaviour when emerging from a shelter, as compared to males (Harris et al. 2010). In our study, the guppies were not allowed to emerge from the shelter by 451 their own accord, but the lower activity level in females might reflect their more cautious 452 nature in this new environment. In addition, female guppies tend to spend more time in 453 shoals than males (Magurran et al. 1992), and the females in our study might therefore have 454 been more affected by the separation from the rest of the shoal than the males were, 455 resulting in their relatively lower activity levels. Boldness has been shown to correlate with 456 sociality in female guppies (Trompf and Brown 2014), and this might explain our results in 457 458 terms of differences we find in solitary assays of activity and exploration between the sexes. However, these arguments are hard to reconcile with published work on innovation in this 459 460 species (Laland and Reader 1999a, b, Laland and Van Bergen 2003). Namely, we found none

of the predicted sex differences in innovation found in these previous studies. One reason for 461 462 the contrasting results here versus accounts in the published literature concerning both 463 population and sex differences in guppy behaviour could be due to the different origins and 464 holding conditions of the fish used in the different labs. It is therefore hard to interpret these sorts of results from different aquarium studies of different populations that have been 465 domesticated for varying periods of time, with or without more or less natural selective 466 forces. This has been shown in another model species in behavioural studies, the zebra finch 467 468 (Taeniopygia guttata), where domesticated populations were found to differ significantly 469 from the wild population in many important aspects of their behaviour, and also from each other (Forstmeier et al. 2007). Clearly, more standardised comparisons of this type are 470 471 needed, and behavioural studies like this should preferably be carried out on exclusively 472 recently wild-caught populations or captive populations of known selective differences to be 473 able to draw any ecological or evolutionary conclusions.

Body size was part of the syndrome structure, where smaller individuals were more active 474 475 than larger individuals. Among-individual differences in body size might therefore have been driving the whole behavioural syndrome in this study system. The univariate tests also 476 reflected this effect of body size on activity, but mostly in females with their larger range of 477 478 body sizes. Males were significantly more active than females, and not simply due to their smaller size compared with females. All of these effects were most obvious in the novel food 479 trial, which was the only trial that involved food being present, clearly suggesting a foraging 480 481 context for these differences. Body size is expected to be an important factor for female fecundity (Reznick and Yang 1993), which might cause smaller females to search more for 482 food and thus be more active than both males and larger females. Because body size was 483

fixed over the timescale of the experiment, and highly correlated with age in guppies (Reznick 484 et al. 1996), activity level might be driven by the relative developmental state of the 485 486 individual. Smaller fish might need to search more for new sources of food, either due to more 487 energy needed for growth or lower competitive ability around already discovered foods. To show that the behaviours here reflect animal personalities, repeated measures must be taken 488 at different developmental states, in order to show individual behavioural consistency over a 489 490 longer time period independent of developmental state. In this way, it might also be possible to examine whether differences in individual growth rates affect the syndrome structure we 491 492 identified here. Individuals with a more rapid growth might be expected to take more risks in 493 the form of exploration and innovation, as part of a 'pace-of-life' syndrome where fast-494 growing individuals live fast and die young (Réale et al. 2010b).

495 **Conclusions**

For our guppy populations, the behavioural syndrome structure was a mixture of personality and innovation behaviours, with no biological basis for this dichotomy in behaviours apart from their respective research traditions. Classifying behaviours as innovation and animal personalities might therefore be arbitrary, and reconciling these two fields might be beneficial for a better understanding of how different aspects of animal behaviour is integrated.

501 The lack of any effects of both sex and population in behaviours, where they have been shown to differ in earlier studies, indicates the difficulty in obtaining consistent results when 502 503 comparing traits between different domesticated populations. In addition, most of the 504 natural selection pressures that might have been responsible for any patterns in these 505 behaviours might have been weakened or removed entirely from such long-term 506 domesticated populations. It is therefore challenging to find firm answers to predictions 507 based on the ecology of the original wild habitat for such long-term captive populations. We 508 suggest that future experiments of this type should be conducted on wild-caught populations, where populations where the natural selection pressures are known, and then tested in a 509 510 laboratorial set-up where it is possible to control for any confounding (e.g. social) effects on 511 behavioural variation within and between individuals.

512 Body size appeared to be part of the behavioural syndrome here, and we therefore suggest 513 that differences in individual developmental state might actually drive the whole syndrome 514 documented here. To get a better understanding of how developmental state affects activity 515 levels, repeated behavioural measures would be required for the same individuals in different 516 developmental states. This could also be used to see if there is any particular developmental 517 state when innovative behaviours are more important in creating individual differences, either because more food resources are needed at that point due to rapid growth (or reproduction), or just because smaller, younger individuals have lower competitive abilities and need to innovate and find their own food resources. By following individuals over a longer period of time it might also be possible to record individual differences due to contrasting early life experiences. For instance, how food availability during early development affects mean levels of behaviour and wider syndrome structures, and this could confirm if our results here are part of a wider pace-of-life syndrome (sensu Réale et al. 2010b).

In conclusion, behaviours across different areas of study, such as innovation and cognitive problem-solving, should be added to the animal personality research to get a better picture of how behaviours across a wider range of adaptive contexts are integrated. In addition, such studies of wider behavioural syndromes should be carried out on wild populations under natural selection, as well as across different developmental timeframes to get a better understanding of the origins behind the structure of behavioural syndromes.

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662	Table 1. The effect of sex, population, body size and their interactions on the eight behaviour
663	variables: (a) activity movement (_act) and (b) rates of exploration/innovation (_rate) in the four trials:
664	exploration (expl_), maze (maze_), novel object (no_) and novel food (nf_). See text for details.
665	Because of the number of tests, significant effects were set to p < 0.01, and are shown in bold, while
666	the standard significant effects (p < 0.05) are outlined by borders. The effect degrees of freedom are
667	given for each parameter, and the error degrees of freedom was 102 in all models.

(a) Activities									
		expl_a	ict	maze_	act	no_ac	t	nf_act	
	d.f.	F	Р	F	Р	F	Р	F	Р
Рор	2	1.14	0.324	1.32	0.272	0.85	0.429	1.77	0.175
Sex	1	4.90	0.029	3.74	0.056	0.73	0.395	7.42	0.008
Size	1	5.02	0.027	3.53	0.063	3.55	0.062	8.05	0.005
Pop:sex	2	1.28	0.284	0.67	0.512	0.16	0.856	1.51	0.226
Pop:size	2	0.48	0.618	0.54	0.585	0.26	0.775	1.14	0.323
Sex:size	1	4.72	0.032	3.76	0.055	0.63	0.430	7.19	0.009
Pop:sex:size	2	1.32	0.272	0.64	0.531	0.13	0.874	1.27	0.284
(b) Rates									
		expl_r	ate	maze_	maze_rate		no_rate		e
	d.f.	F	Р	F	Р	F	Р	F	Р
Рор	2	1.85	0.163	0.18	0.836	0.79	0.455	1.62	0.203
Sex	1	0.99	0.321	6.74	0.012	0.86	0.357	0.08	0.773

0.01

3.92

0.24

5.98

3.71

0.693

0.979

0.187

0.273

0.939

0.937 0.88

2.28

0.47

0.63

2.24

0.023

0.788

0.016

0.028

0.351

0.108

0.626

0.428

0.111

0.43

0.83

1.56

0.15

0.70

0.512

0.438

0.215

0.695

0.501

Size

Pop:sex

Pop:size

Sex:size

Pop:sex:size

1

2

2

1

2

0.16

0.02

1.71

1.21

0.06

668 **Table 2.** Results from the un-rotation PCA. Eigenvalues and the proportion of the variance explained

are given for all the PCs, in addition to the loadings for each variable within these PCs. Strong loadings

670 (> 0.30) are shown in bold.

	PC1	PC2	PC3
Eigenvalue	3.33	1.38	0.96
Proportion of variance	0.42	0.17	0.12
Cumulativo varianco	0.42	0 50	0 71
	0.42	0.39	0.71
expl act	0.84	0.05	0.05
expl_rate	-0.18	0.58	0.61
mana ant	0.02	0.10	0.24
maze_act	0.83	0.18	0.24
maze_rate	-0.14	-0.71	-0.38
no_act	0.89	0.15	-0.02
no rate	-0.18	0.65	-0.37
no_rate	0.10	0.00	0.07
nf_act	0.91	0.12	0.01
6 .	• • • •	0.05	
nf_rate	-0.49	0.23	0.49

672 **Table 3.** Results from the PCA with a varimax rotation. Eigenvalues and the proportion of the variance

673 explained are given for all the PCs, in addition to the loadings for each variable within these PCs. Strong

674 loadings (> 0.30) are shown in bold.

	PC1	PC2	PC3	PC4	PC5
Eigenvalue	1.97	1.03	1.01	1.01	1.00
Proportion of variance	0.25	0.13	0.13	0.13	0.13
Cumulative variance	0.25	0.38	0.51	0.64	0.77
expl_act	0.42	-0.15	-0.04	-0.04	-0.05
expl_rate	-0.05	0.08	0.09	0.99	0.05
maze_act	0.49	-0.07	-0.09	0.04	0.01
maze_rate	0.01	0.03	0.98	0.09	0.13
no act	0.91	-0.16	0.05	-0.05	-0.06
	0.0-	0.20	0.00	0.00	0.00
no_rate	-0.05	0.05	0.13	0.05	0.99
nf act	0 83	-0 15	-0 03	-0.06	-0 02
m_act	0.03	0.13	0.03	0.00	0.02
nf_rate	-0.17	0.97	0.03	0.09	0.05

Table 4. Comparison of the seven SEM models (see Fig.2 and 3) using AIC values, where K is the number of parameters estimated. The H5 (activity vs. rates) has a better fit than the other models $(\Delta AIC > 2)$.

Model	Name	К	AIC	ΔΑΙΟ
H5	Activity vs. rates	17	2283.92	0.00
H3	Spatial vs.non-spatial	17	2287.59	3.67
H1	All correlates	16	2287.68	3.76
H2	Personality vs.innovation	17	2289.59	5.67
H6	Only activity	12	2298.15	14.23
H4	Activity driven	16	2300.85	16.93
HO	No correlations	8	2596.11	312.19

680 Table 5. Further SEM comparisons using just the best model (H5 – activity vs. rate - see Fig.5) was 681 done to see if body size had any effect on the syndrome structure, using AIC values, where K is the number of parameters estimated. Body size was included in the best model (H5 – activity vs. rate) as 682 683 a variance term with either no covariance with any of the latent variables or as part of either the 684 activity syndrome or the rate syndrome, or both. The model with the best fit is the one where body 685 size is included as part of the 'activity syndrome' (see Fig.5b), and this model is better than the 'no 686 body size syndrome' model where only the variance term for body size is included. It is, however, not 687 better than when body size is added as part of the 'rate syndrome' or 'both syndromes'.

Model	К	AIC	ΔΑΙC
Activity syndrome	19	2606.22	0.00
Rate syndrome	19	2607.00	0.78
Both syndromes	20	2608.00	1.78
No body size syndrome	18	2608.43	2.21

689 Figure 1. Tank set-up without the black plastic covering the walls. The tank was 61x25x24.5 cm, and 690 water was filled up to 18 cm, similar to the tank size used by Laland and Reader (1999a; 1999b). The 691 maze (on the right-hand side of the tank) consisted of two partitions that ran across the width of the 692 tank 10 cm apart, with small square holes (6x6 cm) at the bottom at opposite corners. Between these 693 two partitions and between the inner partition and the glass wall, four additional partitions were 694 fitted. The first and the third additional partitions were mounted 4 cm above the ground, while the 695 second and fourth were 5 cm and 8 cm from the ground up, respectively, creating a 3-dimensional 696 maze. In the novel arena (on the left-hand side of the tank), the white spot indicates the position of 697 the novel object, while the grey spot indicates the position for the novel food. These locations were 698 indicated during the trials by dark grey and light grey tape on the top of the glass wall. The box to the 699 far left indicates the acclimation cage - see the text for more details. The maze door, not included in 700 this figure, consisted of a place placed over the hole in the first partition of the maze shown at the 701 front of the tank (see Fig.S1 for a view from above).

702 Figure 2. Causal diagrams of the four original hypotheses (H0-H3): (a) model H0 (with no arrows active) 703 where there is no covariance between any of the variables, and model H1 (arrows active) where all 704 variables covaries into one behavioural syndrome; and (b) model H2 (solid arrows active) where 705 traditional personality behaviours and innovative behaviours constitute two separate latent variables, 706 and model H3 (dashed arrows active) where spatial and non-spatial behaviours constitute two 707 separate latent variables. Doubled-headed arrows between latent variables indicate covariance 708 allowed between them. 'act' indicates activity level measured in all trials, 'Expl' indicates exploration 709 in trial 1, whilst 'NO' indicates novel object and 'NF' novel food.

Figure 3. Causal diagrams for the three additional models inspired from the results of PCA (Table 2 and 3): (a) model H4 where activity constitutes a latent variable, but activity correlates with the rate variable within the same test, hence activity within each trial drives the syndrome; and (b) model H5 (all arrows active; based on the un-rotated PCA) where activities and rates constitute two separate latent variables, and H6 (only solid arrows active; based on the varimax rotated PCA) with only activity
as a latent variable, and the rates only added as variance terms. 'act' indicates activity level measured
in all trials, 'Expl' indicates exploration in trial 1, whilst 'NO' indicates novel object and 'NF' novel food.

717 Figure 4. Mean±SE for the two sexes in all three populations for: (a) activity during the exploration 718 trial (number of squares visited); (b) exploration rate (time to explore new squares divided by 719 number of new squares visited); (c) exploration of the maze (time to get to maximum point divided 720 by maximum point reached); (d) approach to the novel object (time to reach minimum distance to 721 the novel object divided by minimum distance reached); and (e) approach to the novel food (time to 722 reach minimum distance to the novel food divided by minimum distance reached). The activity 723 measurements (the total number of squares visited in the first, middle and last 5 minutes) for the 724 maze, the novel object, and the novel food trials were all qualitatively similar to the exploration trial 725 results in (a) and are therefore not shown here for reasons of brevity. See Methods for more 726 information on each measure.

Figure 5. The best model (H5 - activity vs. rate) with factor loadings (one-headed arrows) and error variance of the observed variables (squares) that is left unexplained by the latent variable (circles). The double-headed arrow between the latent variables show the correlation between them: (a) without body size (as in Table 4); and (b) body size included in the latent variable for activity (as in Table 5). Negative factor loadings for body size shows that smaller individuals were more active than larger individuals.















Figure 3



Figure 4.





1 Supplementary materials

2

3



4 **Figure S1**. The tank seen from above with the grids for the video analysis. Both the exploration area

5 and the maze were divided into 24 squares to measure activity and exploration. The maze is also

6 divided into 12 steps (2 squares per step) to measure the maximum distance reached by each guppy.

7 Concentric circles were placed over both the novel object and the novel food to measure approach.

8 The blue rings show the novel object and the red rings show the novel food.

9 <u>Repeatability and Habituation Analyses</u>

Although our design did not include true repeated measures, because activity was measured 10 repeatedly throughout the four trials it was possible to assess the individual repeatability over 11 the short period of the test, as well as any habituation effects over time. In both the 12 13 repeatability and habituation mixed effect models, fish identity was added as a random effect. In addition, both models were run with and without the maze trial included, since the maze 14 represents a somewhat different environment, possibly confounding any effects of both 15 repeatability and habituation on activity. The first, middle and last 5 minutes measures of 16 17 activity in each trial were used test for habituation (i.e. a reduction in activity over time) and 18 an additional short-term repeatability within each trial for this behaviour. A mixed-effect model in the rpt2 package was used to estimate repeatability with confidence intervals. The 19 twelve different periods of activity measurement (three times from each of the four 20 21 treatments) were added as a fixed effect to control for any difference in activity level due to 22 the different test conditions and for any habituation over time. Parametric boot-strapping 23 based on model estimates was then used to derive a distribution of repeatability estimates 24 (Table S1). In the habituation model, the twelve periods were instead added to this model as continuous 'time' covariate to see how the activity level changed systematically over time, 25 26 while the four different tests (i-iv) were added as a factor. Sex and body size were also added as fixed effects to see if they affected rates of habituation (Table S2). The degrees of freedom 27 and appropriate p-values were calculated with a Satterthwaite approximation. The full model 28 29 contained a lot of non-significant interactions (Table S3), so a model simplification procedure 30 based on p-values and AIC-values was performed (see Forstmeier and Schielzeth 2011; Table S4). 31

32 **Table S1.** Repeatability (R) in individual activity calculated for combinations of the different 33 populations and sexes for the 12 repeats (3 time intervals for each of the 4 trials). Since the maze is a 34 somewhat different environment, the results are shown with and without the maze data included. 35 The confidence intervals (CI) are provided in brackets.

Population	Sex	R (CI) with maze	R (Cl) without maze
Paria	Both	0.516 (0.433-0.577)	0.526 (0.438-0.601)
Paria	Male	0.545 (0.430-0.622)	0.543 (0.408-0.641)
Paria	Female	0.480 (0.358-0.575)	0.498 (0.361-0.606)
Campo	Both	0.450 (0.362-0.527)	0.516 (0.423-0.597)
Campo	Male	0.503 (0.388-0.604)	0.555 (0.434-0.656)
Campo	Female	0.386 (0.265-0.496)	0.467 (0.339-0.581)
Quare	Both	0.427 (0.340-0.499)	0.443 (0.346-0.530)
Quare	Male	0.424 (0.292-0.533)	0.460 (0.309-0.576)
Quare	Female	0.429 (0.311-0.538)	0.390 (0.242-0.528)
All	Male	0.518 (0.452-0.570)	0.543 (0.472-0.603)
All	Female	0.475 (0.409-0.526)	0.498 (0.418-0.565)
All	Both	0.501 (0.456-0.537)	0.527 (0.477-0.568)

36

Table S2. Habituation in the activity measures including trial (exploration, maze, novel object and novel food), time within each trial, body size, sex and all the two-way interactions (see Table S3 for the full model). Since the maze represented a somewhat different environment, results are shown for models with and without the maze data included. Effect and error degrees of freedom are given. Because of the number of tests, significant effects were set to p < 0.01, and are shown in bold, while the standard significant effects (p < 0.05) are outlined by borders.</p>

	With maze				Witho	out maze
Variables	df	F	р	df	F	р
Test	3, 1239	7.44	<0.001	2, 901	4.95	0.007
Time	1, 1239	20.26	<0.001	1, 901	14.04	<0.001
Size	1, 823	7.32	0.007	1, 867	5.91	0.02
Sex	1, 138	7.67	0.006	1, 149	6.76	0.01
Test:Time	3, 1239	0.85	0.47	2, 901	1.16	0.31
Test:Size	3, 1239	6.82	<0.001	2, 901	5.68	0.004
Test:Sex	3, 1239	0.79	0.50	2, 901	0.55	0.58
Time:Size	1, 1239	14.23	<0.001	1, 901	9.91	0.002
Time:Sex	1, 1239	1.76	0.18	1, 901	0.95	0.33
Size:Sex	1, 110	6.47	0.01	1, 110	6.22	0.01





Figure S2. Change in activity level within and between the four different trials over time for (a) large
individuals (> median) and; (b) small fish (< median). The slope is not significantly different between
the different trials (see Table S2).

Table S3. Results from the full habituation model with test, time, body size and sex and all the interactions as fixed effects, and fish identity as a random effect. Both the effect degrees of freedom and the error degrees of freedom are given in each case. Because of the number of tests, significant effects were set to p < 0.01, and are shown in bold, while the standard significant effects (p < 0.05) are outlined by borders. Most of the moderately significant effects of the three-way interactions disappeared when the four-way interaction was removed. The sample size was 1368 for the models including the maze and 1026 for the model without the maze.

Variables	١	Nith maze		W	ithout maze	9
	df	F	р	df	F	р
Test	3, 1226	5.48	0.03	2, 892	1.06	0.35
Time	1, 1226	23.85	<0.001	1, 892	19.99	<0.001
Size	1, 1291	5.15	0.02	1, 1001	4.16	0.04
Sex	1, 1291	0.08	0.77	1, 1001	0.26	0.61
Test:Time	3, 1226	0.40	0.81	2, 892	3.62	0.03
Test:Size	3, 1226	0.48	0.75	2, 892	0.86	0.42
Test:Sex	3, 1226	0.51	0.67	2, 892	5.44	0.02
Time:Size	1, 1226	17.98	<0.001	1, 892	15.85	<0.001
Time:Sex	1, 1226	3.29	0.04	1, 892	5.44	0.02
Size:Sex	1, 1260	0.81	0.44	1, 1001	0.32	0.57
Test:Time:Size	3, 1226	2.60	0.05	2, 892	3.17	0.04
Test:Time:Sex	3, 1226	0.04	0.84	2, 892	1.24	0.29
Test:Size:Sex	3, 1226	0.001	0.98	2, 892	0.34	0.71
Time:Size:Sex	1, 1226	5.27	0.02	1, 892	6.31	0.01
Test:Time:Size:sex	3, 1226	1.64	0.18	2, 892	1.52	0.22

Table S4. Comparison of the habituation models, both with and without the maze. The full model (Model 1) contains all interactions; Model 2 contains all the two – and three-way interactions; Model 3 contains all the two-way interactions in addition to the three-way interaction between time, size and sex, since this was shown to be significant in Model 2 ($F_{1,1229} = 5.26$, p = 0.02); and Model 4 contains only the two-way interactions (see text for more information). The three-way interaction between time, test and size was not significant in Model 3 ($F_{1,1238} = 2.46$, p = 0.12). Due to parsimony, Model 4 was presented in this study (see Table S2). K is the number of parameters estimated.

К	AIC	ΔΑΙϹ
17	4487.36	0.00
18	4494.38	7.02
24	4507.74	20.38
26	4512.40	25.04
	17 18 24 26	174487.36184494.38244507.74264512.40

Table S5. Pair-wise correlations between the eight behavioural variables. The significant correlations

	Exploration		Maze	Novel ob		ject Novel		el food	
	Activity	Rate	Activity	Rate	Activity	Rate	Activity	Rate	
Exploration activity	1	r=-0.10 p=0.31	r=0.63 p<0.001	r=-0.09 p=0.33	r=0.66 p<0.001	r=-0.11 p=0.24	r=0.68 p<0.001	r=-0.34 p<0.001	
Exploration rate		1	r=0.02 p=0.87	r=0.19 p=0.04	r=-0.11 p=0.25	r=0.12 p=0.21	r=-0.12 p=0.19	r=0.19 p=0.05	
Maze activity			1	r=-0.13 p=0.16	r=0.68 p<0.001	r=-0.03 p=0.76	r=0.73 p<0.001	r=-0.22 p=0.02	
Maze rate				1	r=0.03 p=0.77	r=0.27 p<0.001	r=-0.05 p=0.57	r=0.07 p=0.43	
Novel object activity					1	r=-0.12 p=0.21	r=0.83 p<0.001	r=-0.35 p<0.001	
Novel object rate						1	r=-0.08 p=0.38	r=0.11 p=0.23	
Novel food activity							1	r=-0.34 p<0.001	
Novel food rate								1	

are marked in bold, while correlations within the same tests are in frames.





Figure S3. Activity level (quantified as the mean number of squares visited) during the novel food test regressed against body size for females (blue dots and line, y = -8.62x + 327.27) and males (red dots and line, y = 16.94x - 82.81).

76 <u>Structural Equation Modelling</u>

For both the Campo and Quare populations, the models with free parameters had the highest AIC value (see Table S6) meaning that the factor loadings from the other populations could explain the (co-)variance just as well as freely estimated parameters. For the Paria population, however, the model with free parameters had the best fit, but was hardly distinguishable from when it was constrained with the parameters for Quare. Thus, it appears that there were no significant differences in syndrome structure between any of the three populations.

Table S6. A comparison for the three populations between model H5 (activity vs. rate) with free
parameters and parameters constrained to the factor loading of the two other populations. K is the
number of parameters estimated.

	Paria		Campo		Quare	
	К	AIC	К	AIC	К	AIC
Free parameters	17	742.54	17	788.47	17	783.18
Constrained parameters (Paria)	-	-	11	789.20	11	777.64
Constrained parameters (Campo)	11	757.13	-	-	11	779.83
Constrained parameters (Quare)	11	742.81	11	785.49	-	-

When H5 (activity vs. rates) was run separately for the two sexes, the model would not 87 88 converge properly for the male subset, thus it was not possible to compare the syndrome 89 structure between the two sexes for the best model. Given that the sample sizes for the two 90 sexes was the same, it might well be that it is a difference in the co-variance matrices that enables us to run H5 for females but not for males. When looking at the correlation matrices 91 92 for the two sexes we can see that the correlations for some of the rates are somewhat lower 93 in males than in females (see Table S7 and S8 respectably), and these low correlations could suggest a different structure, and might also cause the model to collapse when run on the 94 95 subset for males. The comparison of males and females was possible for the H6 model (only activity), where the models with free parameters had higher AIC values (1139.59 for males 96 97 and 1176.76 for females) than the models with constrained parameters (1136.93 for males and 1173.29 for females) for both sexes, thus no difference in syndrome structure in activity 98 between males and females. 99

Table S7. Pair-wise correlations between the 8 behavioural variables for males. The significant
 correlations are marked in bold, while correlations within the same tests are in frames.

	Exploration		Maze		Novel object		Novel food	
	Activity	Rate	Activity	Rate	Activity	Rate	Activity	Rate
Exploration	1	r=-0.01	r=0.70	r=-0.02	r=0.66	r=-0.23	r=0.72	r=-0.33
activity		p=0.93	p<0.001	p=0.84	p<0.001	p=0.01	p<0.001	p<0.001
Exploration		1	r=0.10	r=0.15	r=-0.04	r=-0.02	r=-0.09	r=0.16
rate			p=0.27	p=0.10	p=0.69	p=0.83	p=0.33	p=0.09
Maze			1	r=0.04	r=0.71	r=-0.04	r=0.79	r=-0.20
activity				p=0.62	p<0.001	p=0.71	p<0.001	p=0.04
Maze rate				1	r=0.16	r=0.36	r=0.04	r=0.01
					p=0.09	p<0.001	p=0.69	p=0.89
Novel object					1	r=-0.13	r=0.83	r=-0.36
activity						p=0.18	p<0.001	p<0.001
Novel object						1	r=-0.07	r=0.39
rate							p=0.48	p<0.001
Novel food							1	r=-0.33
activity								p<0.001
Novel food								1
rate								

Table S8. Pair-wise correlations between the 8 behavioural variables for females. The significant
 correlations are marked in bold, while correlations within the same tests are in frames.

	Exploration		Maze		Novel object		Novel food	
	Activity	Rate	Activity	Rate	Activity	Rate	Activity	Rate
Exploration	1	r=-0.15	r=0.56	r=-0.27	r=0.63	r=0.05	r=0.61	r=-0.33
activity		p=0.12	p<0.001	p=0.004	p<0.001	p=0.61	p<0.001	p<0.001
Exploration		1	r=-0.07	r=0.29	r=-0.16	r=0.24	r=-0.13	r=0.20
rate			p=0.47	p=0.002	p=0.09	p=0.01	p=0.18	p=0.03
Maze			1	r=-0.52	r=0.64	r=-0.02	r=0.64	r=-0.24
activity				p<0.001	p<0.001	p=0.85	p<0.001	p=0.01
Maze rate				1	r=-0.27	r=0.13	r=-0.27	r=0.19
					p=0.004	p=0.16	p=0.003	p=0.04
Novel object					1	r=-0.10	r=0.83	r=-0.33
activity						p=0.30	p<0.001	p<0.001
Novel object						1	r=-0.09	r=-0.16
rate							p=0.34	p=0.10
Novel food							1	r=-0.35
activity								p<0.001
Novel food								1
rate								