

1 **Night reveals individuality in a shoaling fish**

2 Laura Härkönen^{a,b,c}, Nico Alioravainen^d, Anssi Vainikka^d & Pekka Hyvärinen^e

3

4 ^a Department of Ecology and Genetics, University of Oulu, Pentti Kaiteran katu 1, P.O. Box 3000,
5 90014 Oulu, Finland

6 ^b Department of Environmental Science, Policy & Management, University of California,
7 Berkeley, CA 94720, USA

8 ^c Natural Resources Institute Finland (Luke), Paavo Havaksen tie 3, 90014 Oulu, Finland

9 ^d Department of Environmental and Biological Sciences, University of Eastern Finland, P.O. Box
10 111, FI-80101 Joensuu, Finland

11 ^e Kainuu Fisheries Research Station, Natural Resources Institute Finland (Luke), Manamansalontie
12 90, 88300 Paltamo, FINLAND

13

14 Corresponding author:

15 Laura Härkönen

16 Natural Resources Institute Finland (Luke)

17 Paavo Havaksen tie 3,

18 90014 Oulu, Finland

19 email: laura.harkonen@luke.fi

20

21 Abbreviated title: Night reveals individuality

22 **ABSTRACT**

23 Many animals rely heavily on visual cues from their environment, and therefore show circadian
24 rhythmicity in their behavioral activities. In group-living animals, individuals' activity rhythms must
25 be synchronized not only with diel light-dark cycle but also with other group members. Increasing
26 evidence has recently shown that circadian behaviors of animals are consistent within individuals and
27 different between individuals, but the sources and consistency of diel activity variation in social
28 context are less known. Using radio frequency identification (RFID) technology, we recorded
29 individual moving activity of the Eurasian perch (*Perca fluviatilis*) in randomly formed groups
30 through 10 full diel cycles in seminatural environment. We found diel changes in trait variability and
31 repeatability estimates both within and between the groups: individual differences in activity were
32 more repeatable in nighttime whereas group differences were more repeatable in daytime. The results
33 suggest that collective group behavior in daylight obscures the expression of individuality, whereas
34 the weak group effects in nighttime reveals a substantially wider continuum of individually consistent
35 activity types. Our findings imply that 1) studying activity variation only on diurnal basis may
36 underestimate the total activity variation among social individuals and may thus bias the repeatability
37 estimates, and 2) accounting for diel variation in social effects may be essential for detecting
38 ecologically realistic behavioral variation within and between animal groups. To conclude, this study
39 highlights the complex interactions between circadian activity rhythms, individual behavioral
40 differences, and group dynamics, and thereby provides new insights for understanding overall
41 behavioral diversity in social animals.

42

43 *Key words:* circadian behavior, group repeatability, locomotor activity, nocturnal activity, social
44 synchrony

45

46

47 **INTRODUCTION**

48 Many behavioral activities of animals are displayed in a rhythmic manner, and those related to
49 circadian periodicity (~24 h dark-light cycle) have recently become an emerging theme in animal
50 behavior and personality research. The biological rhythms of animals are typically adjusted by
51 environmental cues, particularly by photoperiod entraining behavioral activities with local
52 conditions, or more profoundly by circadian clock -mediated intrinsic physiological processes (Bell-
53 Pedersen et al. 2005; Yerushalmi and Green 2009; Prokkola and Nikinmaa 2018). Growing evidence
54 across animal taxa suggests that behaviors mediated by an individual's circadian rhythm are
55 consistently different between individuals (Stuber et al. 2015; Refinetti et al. 2016; Alós et al. 2017).
56 Diel activity patterns have thus been merged into the conceptual framework of animal personality
57 (*i.e.* a correlated suite of individually *consistent* behaviors; Réale et al. 2007; Carere and Maestripieri
58 2013). However, the current evidence is mostly limited to reporting the existence of behavioral
59 chronotypes, *i.e.* individual differences in traits associated with sleep/rest onset, duration and
60 termination (Randler 2014; Stuber et al. 2014; Alós et al. 2017). A fundamental question that has
61 remained unstudied is how the light rhythm shapes the between-individual variation in behavioral
62 activity, and whether its consistency itself shows diel rhythmicity.

63 Many animals live in groups where the social environment induces diverse effects on
64 individuals' activity patterns. The benefits of group-living include safety in numbers against enemies,
65 and support in effective foraging (Ward and Webster 2016). However, gaining those benefits requires
66 that the individuals' activity rhythms be synchronized among group members. While the local light
67 rhythm typically predicts seasonal and diel changes in the activity of predators, parasites or prey, the
68 social encounters and visual or olfactory cues from conspecifics are important stimuli that
69 synchronize the activity rhythms amongst individuals (Davidson and Menaker 2003; Mistlberger and
70 Skene 2004; Favreau et al. 2009). Social synchrony associates closely with behavioral conformity,
71 when individuals tend to compromise between their own behavioral individuality and collective

72 group behavior (Sumpter 2010; Rands 2011). However, inter-individual variation in circadian
73 behaviors are likely present also in social groups, and might relate to *e.g.* conflict reduction within
74 hierarchical groups (Alanärä et al. 2001; Réale and Dingemanse 2010). Yet unexplored questions are
75 whether and how living in a group affects the consistency of individuals' diel activity patterns.

76 The eco-evolutionary importance of intraspecific variation in a behavioral trait is usually
77 based on its repeatability estimate, which sets the upper limit for its heritability and qualifies as a
78 standard measure to statistically assess the consistency of different behavioral types (Bell et al. 2009).
79 Although several studies have shown inter-individual variation in circadian behaviors, only very few
80 have reported their repeatability (Alós et al. 2017; see also Niemelä and Dingemanse 2018). The
81 repeatability estimates are context-dependent and affected by environmental conditions, and also by
82 the temporal scale or the setup of a study (Bell et al. 2009, Killen et al. 2016). For example, to assess
83 ecologically realistic repeatability for behavioral activity may require several days of monitoring until
84 the animals habituate to the experimental conditions (Härkönen et al. 2014). In social animals, the
85 amount of detectable between-individual variation may either decrease due to behavioral conformity
86 (Magnhagen 2012) or increase due to conflict reduction (Hemelrijk and Wantia 2005), but also the
87 groups themselves may differ consistently in behavior (Cronin 2015; Jolles et al. 2018). Thus, the
88 validity and ecological relevance of commonly used individual behavioral tests for social animals
89 have been questioned (Réale and Dingemanse 2010; Magnhagen 2012). For example, social animals
90 studied in isolation may show arrhythmic and more variable circadian cycles than they would do in
91 groups (Yerushalmi and Green 2009). Altogether, studying biological rhythms in social animals
92 requires collecting data with frequent sampling around the clock, over many consecutive 24h cycles,
93 and from individual animals in a social setting (*e.g.* Mistlberger and Skene 2004).

94 The fundamental aim of this study was to gain better understanding of the sources and
95 consistency of circadian activity variation in social animals. We used a predominantly day-active and
96 naturally shoaling freshwater fish, the Eurasian perch (*Perca fluviatilis*) as a model species. We

97 monitored the moving activity of 320 individuals in eight randomly formed groups over ten
98 consecutive 24h diel cycles. We recorded individual movements in large semi-natural enclosures
99 under natural light rhythm with a state-of-the-art radio frequency identification (RFID) system. Using
100 the high-precision dataset, we extracted activity traits that would capture the daily total variation in
101 activity among the study fish, and specifically under contrasting light conditions (diurnal vs.
102 nocturnal activity). We applied linear mixed models to quantify trait variances and adjusted
103 repeatability estimates at individual- and group-level. Our leading hypothesis was that the light
104 rhythm shapes the proportion of total variance attributable to between-individual differences through
105 the strength of group effects. First, we tested if the detectable between-individual activity variation
106 differs under conditions typically presuming either social synchrony or asynchrony (*i.e.* light vs. dark,
107 respectively). Based on the assumption on stronger behavioral conformity in daylight than in
108 darkness, we predicted lower between-individual than between-group variability in diurnal activity
109 (see Magnhagen 2012), and that the overall variability in activity in darkness is lower than in daylight.
110 Second, we tested if the groups express more repeatable differences in diurnal than nocturnal activity.
111 We further assumed that the high social synchrony in daylight leaves proportionally less variance to
112 be explained by between-individual differences in diurnal activity than in nocturnal activity.

113

114 **MATERIAL AND METHODS**

115 *Model species*

116 The Eurasian perch is a native freshwater fish in the Northern Hemisphere and has been widely used
117 as model species in behavioral ecology. The perch is a highly social fish that forms relatively large
118 shoals, particularly at a young age. When shoaling, the behaviors of individual perch are influenced
119 by social environment, but individual differences persist regardless of high social coordination
120 (Magnhagen 2012). However, the general movements of perch are driven particularly by feeding
121 motivation influenced by light and temperature but also by predator avoidance and prey abundance

122 (Heermann et al. 2013; Nakayama et al. 2018). The piscivorous perch are visual predators and thus
123 they usually show higher activity in daylight and crepuscular conditions than in darkness (Ylönen et
124 al. 2007). In darkness the shoals break up, and perch are observed to rest on the bottom (Imbrock et
125 al. 1996). However, the typical circadian activity pattern varies across seasons. It is less rhythmic
126 during long-day conditions in the summer, and elevated levels of nocturnal activity have been found
127 in summer and early fall (Jacobsen et al. 2002; Nakayama et al. 2018).

128

129 *Experimental setup*

130 We performed the study at Kainuu Fisheries Research Station (KFRS, www.kfrs.fi, location 64°24'
131 N, 27°50' E) of the Natural Resources Institute Finland. Our study fish comprised F₁ progeny of wild
132 Eurasian perch ($n = 300$; 100–500 g in body weight) originating from Lake Oulujärvi. We assumed
133 the potential truncation of behavioral variation due to the trapping of the parent fish irrelevant for this
134 study. The offspring produced at KFRS in May 2012 were raised with natural food resources in a
135 seminatural forest pond (6.5 ha) through two growth seasons 2012–2013. There were no other
136 piscivorous fish species in the pond, but in addition to potential cannibalism, the juveniles were
137 naturally exposed to terrestrial predators (*e.g.* birds, mustelids). In September 2013, the pond was
138 drained and ca. 17 000 perch (a mean weight of 10 g) were harvested and habituated to flow-through
139 hatchery conditions (details in Härkönen et al. 2017). The fish were maintained under a natural
140 temperature regime and artificial lighting following natural changes in photoperiod. The fish were
141 fed during the daytime with minced prey fish (smelt *Osmerus eperlanus*) and the diet was
142 supplemented with commercial dry feed pellets (VERONESI VITA 1.0 / 1.5 / CIRCUIT 1.7,
143 Raisioagro, Finland) *ad libitum*.

144 In September 2015, 320 perch (at age 3+) were randomly dip-netted from the holding
145 tanks and anesthetized with a standard solution of benzocaine (40 mg l⁻¹) for processing. The fish
146 were measured (1 mm), weighed (0.1 g), and a 12.0 mm half-duplex passive integrated transponder

147 (HDX PIT) tag (OregonRFID Inc. USA) was implanted under the skin next to the dorsal fin. The
148 mean fish size (SD, range) was 165.5 mm (20.4 mm, 125.0 – 229.0 mm) and 50.0 g (22.5 g, 18.6 –
149 139.9 g). After processing, the fish were observed in large tanks (15 m²) for a week to ensure full
150 recovery from the tagging.

151 To quantify components of behavioral variation under natural light rhythm, we
152 performed a 10-day experiment on 2 – 12 October 2015. We assigned the perch randomly to eight
153 groups of 40 individuals and released the fish in seminatural outdoor enclosures (see Fig. 1 for
154 details). The body length did not vary significantly between the replicate groups (One-way ANOVA:
155 $F_{7,319} = 0.890$, $P = 0.515$). We recorded the movements of PIT-tagged individuals continuously with
156 RFID system recording the antenna bypasses 9 times per second (see details in Vainikka et al. 2012).
157 In the study site, the photoperiod varies greatly according to the season potentially affecting the perch
158 activity pattern. We performed the experiment right after the autumnal equinox, when the day and
159 night periods are equal in length: at the onset of the experiment, sunrise was at 7:19 and sunset at
160 18:36, and at the end of the experiment, the respective times were 7:49 and 18:00.

161 The water running in the enclosures came from the adjacent Lake Kivesjärvi. It is a
162 humic, mesotrophic lake with water color (CNS, mean \pm SD) of 103.2 ± 41.3 mg/l Pt and turbidity
163 of 1.1 ± 0.4 FNU (mean values 2006-2016; Surface waters – water quality database by the Finnish
164 Environment Institute and the Centre for Economic Development, Transport and the Environment).
165 The temperature of the incoming water varied naturally regarding the seasonal conditions (the range
166 of daily measurements $6.9^{\circ}\text{C} - 10.6^{\circ}\text{C}$). The gravel bottom and incoming water provided natural prey
167 items during the experiment, including plankton, benthos and occasionally small-sized prey fish
168 (smelt, roach *Rutilus rutilus* and ruffe *Gymnocephalus cernua*). The incoming water from the lake
169 may have also transferred highly diluted olfactory cues of common day- and night-active predators
170 (pike *Esox lucius* and burbot *Lota lota*, respectively; Ylönen et al. 2007).

171

172 **Data analyses**

173 The high precision movement data were recorded automatically using computers connected to RFID
174 antennae to detect ecologically realistic behavioral variation without human disturbance or observer
175 bias. All the signal detections were first processed using PIT Data software package
176 (<http://pitdata.net/>) to calculate section crosses (see Fig. 1) for each individual per hour (*i.e.* for 243
177 hours). An individual was removed from further analyses if no signal detection was recorded ($n = 3$)
178 or the tag stopped operating ($n = 4$) during the experiment. To produce applicable behavioral variables
179 for further analyses, the one-hour resolution data were processed using custom algorithms included
180 in AV Bio-Statistics software (developed by A.V.). We calculated three activity scores describing
181 general moving activity within different temporal slots. An individually repeated measure of *total*
182 *activity* was calculated as the mean of hourly antenna bypasses within each 24h cycle. The data were
183 processed accordingly to separate *diurnal activity* and *nocturnal activity* based on the closest full hour
184 of sunset and sunrise (see above). The obtained activity scores do not provide any information on
185 individual behavior between the signal detections (*e.g.* resting, feeding or sheltering). To obtain a
186 variable that would capture the differences in individual activity types among individuals, we
187 calculated a *circadian score* as the proportion of an individual's diurnal activity to the total activity
188 within each full diel cycle.

189 We analyzed the effect of fish size on overall variation in each activity variable (*i.e.* on
190 10 repeated measures for ln-transformed *total activity*, *diurnal activity*, *nocturnal activity* and
191 *circadian score*) by fitting linear mixed-effects models (GLMM) in SPSS 22.0 for Windows (IBM
192 Corp. Released 2014). To account for repeated measures of individuals, subject identity was entered
193 as a random effect (incl. random intercept). We added a random group-effect, which not only
194 represented the differences between randomly created social groups but also included uncontrolled
195 differences between the seminatural enclosures (*e.g.* food availability and distribution of sheltering
196 structures, among other "tank effects"). The influence of total body length and weight were tested

197 separately with mean-standardized values to facilitate meaningful comparison of the models. Owing
198 to lower AIC, we present only the models with the body length.

199 We fitted LMM-based models to the data to obtain size-adjusted repeatability estimates
200 (R_{adj}) for temporal consistency of individual- and group-level variation in the behavioral variables
201 using the package ‘rptR’ in R version 3.5.1 (R Core Team 2017; Stoffel et al. 2017). In a typical
202 experimental setup for estimating individual repeatability, the behavioral variation among study
203 subjects is assessed as the variance attributable to between individual differences compared to the
204 total variation including also the within-individual variance (Dingemanse and Dochtermann
205 2013). Based on variance components, behaviors that show relatively low within-individual variance
206 compared to high between-individual variance are more repeatable. In our group setup, the total
207 variance additionally included the variance due to between-group differences. Our model-based
208 estimates at individual-level thus represent the typical behavioral repeatability, *i.e.* the unstandardized
209 variance component that is attributable to between-individual differences relative to the total
210 variance, while group-level estimates represent the proportion of variance explained by the between-
211 group differences. To quantify the uncertainty of model-based repeatability estimates, all estimations
212 including 95% confidence intervals (CIs) were based on bootstrapping with 1000 resamples. We
213 assessed the statistical significance of the repeatability estimates by means of likelihood ratio tests
214 (LRT). We considered two estimates of repeatability significantly different if their CIs did not overlap
215 with another or zero (Payton et al. 2003).

216

217 **RESULTS**

218 The continuously tracked perch displayed a clear diel pattern in the mean moving activity through 10
219 diel cycles (Fig. 2). The LMMs revealed statistically significant positive effects of body length on all
220 activity scores (*Total activity* $b \pm SE = 0.251 \pm 0.028$, $F_{1, 295.813} = 77.487$, $P < 0.001$; *Diurnal activity*
221 $b \pm SE = 0.051 \pm 0.024$, $F_{1, 295.596} = 4.635$, $P = 0.032$, and *Nocturnal activity* $b \pm SE = 0.382 \pm 0.039$,

222 $F_{1, 262.249} = 95.864, P < 0.001$). The *circadian score* decreased with body length ($b \pm SE = -0.055 \pm$
223 $0.007, F_{1, 291.248} = 69.610, P < 0.001$), 291, in *i.e.* the proportion of *nocturnal activity* increased with
224 body size. Therefore, all repeatability estimates were adjusted with respect to body length. All size-
225 adjusted repeatability estimates presented in Table 1 were statistically significant (LRT: $P < 0.001$),
226 revealing that the perch expressed temporally consistent activity variation among both individuals
227 and shoals.

228 On average, the perch were less active in daylight, and the overall variation in moving activity
229 was substantially greater at night (Table 1, Fig. 2). Consequently, there was a difference in how the
230 total variation in *diurnal activity* and *nocturnal activity* was distributed between individuals and
231 groups (Table 1, Fig. 3). The individual-level repeatability in *nocturnal activity* was higher than the
232 group-level repeatability, while the opposite difference was found in *diurnal activity*. The high
233 variation among individuals in *nocturnal activity* resulted in the highest individual-level repeatability
234 estimate ($R_{adj} = 0.40$, 95% CI 0.308 to 0.500) whereas the repeatability of *diurnal activity* was
235 significantly lower ($R_{adj} = 0.22$, 95% CI 0.143 to 0.305). The group-level point estimate for
236 repeatability was higher for *diurnal activity* ($R_{adj} = 0.35$) than for *nocturnal activity* ($R_{adj} = 0.21$), but,
237 due to overlapping CI's, this difference was not considered statistically significant.

238 The between-individual variation in *circadian scores* was significantly repeatable (R_{adj}
239 $= 0.35$), indicating predictable differences among individuals in their tendency for diurnal vs.
240 nocturnal activity. Based on individual mean scores, 21 % of the perch were proportionally more
241 active in daylight, while 79 % were more active in nighttime. We illustrate the activity differences
242 between these circadian behavioral types in Figure 4. For example, the fish exhibiting a consistently
243 high total activity through the experiment displayed higher activity in nighttime, while low activity
244 types were more active in daylight. The group-level variance in circadian scoring was substantially
245 low, and only 10 % of the total variation was explained by consistent differences between the groups
246 (Table 1).

247

248 **DISCUSSION**

249 The moving activity of perch showed clear circadian rhythmicity, but there were also systematic
250 changes in variability and repeatability estimates of the behavioral activity between day and night.
251 To be more specific, the decomposition of total variance in the activity scores revealed a diel turnover
252 in the proportion of variance attributable to between-individual vs. between-group differences: the
253 individual differences were more repeatable in nighttime whereas the group differences were more
254 repeatable in daytime. The relatively low variability in *diurnal activity* between individuals in a group
255 together with the proportionally high between-group variability supported our predictions of social
256 synchrony at daylight, and aligned with the earlier findings by Magnhagen and Bunnefeld (2009) on
257 group conformity. The randomly formed groups, *per se*, showed repeatable differences particularly
258 in *diurnal activity* that persisted regardless of the consistent individual differences within the groups.
259 Unexpectedly, the perch showed great total variability in *nocturnal activity* between individuals
260 whereas the group-level differences were smaller than in daytime. This indicates that the individuals
261 remained differently active once they scattered for the night. Altogether, our main results imply that
262 high conformity in daylight may obscure the expression of individual differences in a behavior,
263 whereas stronger individuality becomes detectable in the nighttime once the group effects weaken.

264 Fish generally express social behavior by synchronizing their locomotor activity, and,
265 accordingly, the individual perch appeared to conform to the average moving activity of the group in
266 daylight. This is common in animals that use social information for avoidance of predators or
267 parasites, foraging and consensus decision-making on movements (Webster and Laland 2012; Aplin
268 et al. 2015; Ramos et al. 2015). Despite the high degree of behavioral conformity, individuality in
269 diurnal activity was not entirely lost in groups, which is in line with earlier studies on perch
270 personality (Magnhagen 2012; Kekäläinen et al. 2014). The study perch also expressed repeatable
271 between-group differences particularly in diurnal activity. In addition to uncontrolled tank effects,

272 the between-group differences can be provoked by the phenotypic differences among individuals
273 (Pinter-Wollman et al. 2012; Herbert-Read et al. 2013; Cronin 2015). The consistent group
274 differences may emerge if the groups differ in the average behavior of their members (Carere et al.
275 2018), or alternatively if the groups differ in the behavioral composition (Brown et al. 2014). For
276 example, bold and explorative behaviors of group leaders can contribute to foraging and collective
277 behavior of the whole group (Pruitt et al. 2013; Aplin et al. 2014), whereas groups with a more
278 effective leadership can move consistently faster or more cohesively than the others (Couzin et al.
279 2005; Jolles et al. 2017). Accordingly, bold and explorative individuals tend to occupy the front
280 positions of the perch shoals (Magnhagen and Bunnefeld 2009; Härkönen et al. 2016), and it should
281 be further studied if behavioral differences between the shoal leaders could explain the higher group
282 repeatability during the daytime than in nighttime.

283 Most visually oriented animals, including the perch, usually show diurnal activity, and
284 sleep/rest during the night (Siegel 2008). Thus, it was somewhat surprising that nighttime produced
285 substantially greater diversity in activity among the perch compared to daytime. Group-living animals
286 may modify their activity rhythms to balance the trade-off between the antipredator benefits and the
287 costs of increased feeding competition (Vainikka et al. 2005). In this study, high overall nocturnal
288 activity may relate to predator-free experimental design, since the absence of predators is known to
289 increase nocturnal activity even in diurnal species (Carnevali et al. 2016). Nocturnal foraging may
290 also reduce the competition over food but it also reduces the feeding efficiency (Alanära et al. 2001).
291 This study was conducted in mid-fall when decreasing temperatures and shortening day length may
292 limit food availability. Elevating (nocturnal) activity levels when visibility is low and/or food is
293 limited may increase the encounter probability with prey. Body size and energy levels often
294 contribute to the activity differences among individuals through feeding motivation (Sih et al. 2015).
295 Accordingly, variation in all activity scores, including the proportion of nocturnal activity, correlated
296 positively with perch size. Large perch are shown to adopt alternative strategies to allocate more time

297 to foraging (Jacobsen et al. 2015), whereas elevated levels of nocturnal activity may relate to fulfilling
298 the increased foraging demands (Nakayama et al. 2018).

299 The perch expressed different activity types assessed as showing higher activity either in
300 daytime or in nighttime. This preference was consistent within individuals and different between
301 individuals ($R_{adj} = 0.35$), but also least affected by group-level effects. Individual fish may have
302 preferences for diurnal or nocturnal activity (Reebs 2002): for example Závorka et al. (2016) showed
303 that salmonid individuals that are inactive in diurnal conditions may be highly active in nocturnal
304 conditions. In some fish species, social environment modifies individual activity rhythms. The sea
305 bass (*Dicentrarchus labrax*) tested alone are active in nighttime, but in a group they adopt a diurnal
306 activity rhythm (Anras et al. 1997), whereas rainbow trout (*Oncorhynchus mykiss*) are almost
307 exclusively diurnal when tested in isolation, but may display both diurnal and nocturnal activity in
308 groups (Chen et al. 2002a; Chen et al. 2002b). Our study showed that individuality in diel activity
309 rhythm may be expressed in groups. The consistency of diel activity differences among the study
310 perch also suggests that different activity rhythms can be under natural selection. In theory, individual
311 specialization on separate activity times could increase fitness by reducing intraspecific competition
312 for foraging opportunities (Brännäs and Alanära 1997; Alanära et al. 2001) but also expose
313 individuals differentially to *e.g.* day- and night-active predators (Ylönen et al. 2007). Further studies
314 are needed to understand how individually different activity rhythms within groups add variation to
315 other personality dimensions and life history, and how those link to fitness in different ecological and
316 evolutionary contexts.

317

318 **Conclusions**

319 Modern technological applications have made it feasible to shift from individual behavioral tests in
320 laboratory towards studying animals under more ecologically realistic conditions. Using an RFID
321 system built in large seminatural enclosures, we found that the Eurasian perch expressed individually

322 consistent behavioral activity under natural light rhythm, but that individual repeatability was the
323 highest in nighttime while group repeatability was the highest in daytime. The results imply that
324 accounting for the diel variation in social effects may be essential to detect realistic behavioral
325 variation among group-living individuals. Altogether, this study highlights how meaningful
326 interpretation of behavioral heterogeneity from ecological datasets requires understanding of
327 potential interactions between natural activity rhythms, individual behavioral differences, and group
328 dynamics.

329

330 **FUNDING**

331 This work was supported by the Academy of Finland (grant number 287700 to L.H.).

332

333 All applicable international, national, and institutional guidelines for the care and use of animals were
334 followed. The study was conducted under an animal experiment license admitted by ELLA – Animal
335 Experiment Board of Finland (ESAVI/3443/04.10.07/2015).

336

337 We thank the staff at Kainuu Fisheries Research Station for taking care of the study fish; Maria
338 Tuomaala for her help in conducting the experiment; the anonymous reviewers, Jonathan Pruitt and
339 Laetitia Wilkins for their comments that greatly improved our manuscript.

340

341 Data accessibility: Analyses reported in this article can be reproduced using the data provided
342 by Härkönen et al. 2019.

343

344

345 .

346

347 **REFERENCES**

- 348 Alanärä A, Burns MD, Metcalfe NB. 2001. Intraspecific resource partitioning in brown trout: the
349 temporal distribution of foraging is determined by social rank. *J Anim Ecol.* 70:980–986.
- 350 Alós J, Martorell-Barceló M, Campos-Candela A. 2017. Repeatability of circadian behavioural
351 variation revealed in free-ranging marine fish. *R Soc Open Sci.* 4:160791.
- 352 Anras M-LB, Lagardère JP, Lafaye J-Y. 1997. Diel activity rhythm of seabass tracked in a natural
353 environment: group effects on swimming patterns and amplitudes. *Can J Fish Aquat Sci.*
354 54:162–168.
- 355 Aplin LM, Farine DR, Mann RP, Sheldon BC. 2014. Individual-level personality influences social
356 foraging and collective behaviour in wild birds. *Proc R Soc B Biol Sci.* 281:20141016–
357 20141016.
- 358 Aplin LM, Firth JA, Farine DR, Voelkl B, Crates RA, Culina A, Garroway CJ, Hinde CA, Kidd LR,
359 Psorakis I, et al. 2015. Consistent individual differences in the social phenotypes of wild great
360 tits, *Parus major*. *Anim Behav.* 108:117–127.
- 361 Bell-Pedersen D, Cassone VM, Earnest DJ, Golden SS, Hardin PE, Thomas TL, Zoran MJ. 2005.
362 Circadian rhythms from multiple oscillators: lessons from diverse organisms. *Nat Rev Genet.*
363 6:544–556.
- 364 Bell AM, Hankison SJ, Laskowski KL. 2009. The repeatability of behaviour: a meta-analysis. *Anim*
365 *Behav.* 77:771–783.
- 366 Brown C, Irving E, R Y, PJB H, J K, RC Y, HHT P, J K. 2014. Individual personality traits influence
367 group exploration in a feral guppy population. *Behav Ecol.* 25:95–101.
- 368 Brännäs E, Alanärä A. 1997. Is Diel Dualism in Feeding Activity Influenced by Competition Between
369 Individuals? *Can J Zool.* 75:661–669.
- 370 Carere C, Audebrand C, Rödel HG, d’Ettorre P. 2018. Individual behavioural type and group
371 performance in *Formica fusca* ants. *Behav Processes.* 157:402–407.

- 372 Carere C, Maestriperi D. 2013. *Animal Personalities*. University of Chicago Press.
- 373 Carnevali L, Lovari S, Monaco A, Mori E. 2016. Nocturnal activity of a “diurnal” species, the
374 northern chamois, in a predator-free Alpine area. *Behav Processes*. 126:101–107.
- 375 Chen W-M, Naruse M, Tabata M. 2002a. Circadian rhythms and individual variability of self-feeding
376 activity in groups of rainbow trout *Oncorhynchus mykiss* (Walbaum). *Aquac Res*. 33:491–500.
- 377 Chen W-M, Naruse M, Tabata M. 2002b. The effect of social interactions on circadian self-feeding
378 rhythms in rainbow trout *Oncorhynchus mykiss* Walbaum. *Physiol Behav*. 76:281–287.
- 379 Couzin ID, Krause J, Franks NR, Levin SA. 2005. Effective leadership and decision-making in
380 animal groups on the move. *Nature*. 433:513–516.
- 381 Cronin AL. 2015. Individual and Group Personalities Characterise Consensus Decision-Making in
382 an Ant. Wright J, editor. *Ethology*. 121:703–713.
- 383 Davidson AJ, Menaker M. 2003. Birds of a feather clock together – sometimes: social
384 synchronization of circadian rhythms. *Curr Opin Neurobiol*. 13:765–769.
- 385 Dingemanse NJ, Dochtermann NA. 2013. Quantifying individual variation in behaviour: mixed-
386 effect modelling approaches. van de Pol M, editor. *J Anim Ecol*. 82:39–54.
- 387 Favreau A, Richard-Yris MA, Bertin A, Houdelier C, Lumineau S. 2009. Social influences on
388 circadian behavioural rhythms in vertebrates. *Anim Behav*. 77:983–989.
- 389 Heermann L, Emmrich M, Heynen M, Dorow M, König U, Borcherdig J, Arlinghaus R. 2013.
390 Explaining recreational angling catch rates of Eurasian perch, *Perca fluviatilis*: The role of
391 natural and fishing-related environmental factors. *Fish Manag Ecol*. 20:187–200.
- 392 Hemelrijk CK, Wantia J. 2005. Individual variation by self-organisation. *Neurosci Biobehav Rev*.
393 29:125–136.
- 394 Herbert-Read JE, Krause S, Morrell LJ, Schaerf TM, Krause J, Ward AJW. 2013. The role of
395 individuality in collective group movement. *Proceedings Biol Sci*. 280:20122564.
- 396 Härkönen L, Alioravainen N, Vainikka A, Hyvärinen P. 2019. Data from: Night reveals individuality

397 in a shoaling fish. *Dryad Digital Repository*. <https://doi.org/10.5061/dryad.1qb07gs/>

398 Härkönen L, Hyvärinen P, Mehtätalo L, Vainikka A. 2017. Growth, survival and interspecific social
399 learning in the first hatchery generation of Eurasian perch (*Perca fluviatilis*). *Aquaculture*.
400 466:64–71.

401 Härkönen L, Hyvärinen P, Niemelä PT, Vainikka A. 2016. Behavioural variation in Eurasian perch
402 populations with respect to relative catchability. *Acta Ethol*. 19:21–31.

403 Härkönen L, Hyvärinen P, Paappanen J, Vainikka A. 2014. Explorative behavior increases
404 vulnerability to angling in hatchery-reared brown trout (*Salmo trutta*). *Can J Fish Aquat Sci*.
405 71:1900–1909.

406 IBM Corp. Released. 2014. IBM SPSS Statistics for Windows, Version 22.0. 2014.

407 Imbrock F, Appenzeller A, Eckmann R. 1996. Diel and seasonal distribution of perch in Lake
408 Constance: a hydroacoustic study and in situ observations. *J Fish Biol*. 49:1–13.

409 Jacobsen L, Berg S, Baktoft H, Skov C. 2015. Behavioural strategy of large perch *Perca fluviatilis*
410 varies between a mesotrophic and a hypereutrophic lake. *J Fish Biol*. 86:1016–1029.

411 Jacobsen L, Berg S, Broberg M, Jepsen N, Skov C. 2002. Activity and food choice of piscivorous
412 perch (*Perca fluviatilis*) in a eutrophic shallow lake: a radio-telemetry study. *Freshw Biol*.
413 47:2370–2379.

414 Jolles JW, Boogert NJ, Sridhar VH, Couzin ID, Manica A. 2017. Consistent Individual Differences
415 Drive Collective Behavior and Group Functioning of Schooling Fish. *Curr Biol*. 27:2862–
416 2868.e7.

417 Jolles JW, Laskowski KL, Boogert NJ, Manica A. 2018. Repeatable group differences in the
418 collective behaviour of stickleback shoals across ecological contexts. *Proc R Soc B Biol Sci*.
419 285:20172629.

420 Kekäläinen J, Podgorniak T, Puolakka T, Hyvärinen P, Vainikka A. 2014. Individually assessed
421 boldness predicts *Perca fluviatilis* behaviour in shoals, but is not associated with the capture

422 order or angling method. *J Fish Biol.* 85:1603–1616.

423 Killen SS, Adriaenssens B, Marras S, Claireaux G, Cooke SJ. 2016. Context dependency of trait
424 repeatability and its relevance for management and conservation of fish populations. *Conserv*
425 *Physiol.* 4:cow007.

426 Magnhagen C. 2012. Personalities in a crowd: What shapes the behaviour of Eurasian perch and other
427 shoaling fishes? *Curr Zool.* 58:35–44.

428 Magnhagen C, Bunnefeld N. 2009. Express your personality or go along with the group: what
429 determines the behaviour of shoaling perch? *Proc Biol Sci.* 276:3369–3375.

430 Mistlberger RE, Skene DJ. 2004. Social influences on mammalian circadian rhythms: Animal and
431 human studies. *Biol Rev Camb Philos Soc.* 79:533–556.

432 Nakayama S, Doering-Arjes P, Linzmaier S, Brieger J, Klefoth T, Pieterrek T, Arlinghaus R. 2018.
433 Fine-scale movement ecology of a freshwater top predator, Eurasian perch (*Perca fluviatilis*), in
434 response to the abiotic environment over the course of a year. *Ecol Freshw Fish.* 27:798–812.

435 Niemelä PT, Dingemanse NJ. 2018. On the usage of single measurements in behavioural ecology
436 research on individual differences. *Anim Behav.* 145:99–105.

437 Payton ME, Greenstone MH, Schenker N. 2003. Overlapping confidence intervals or standard error
438 intervals: What do they mean in terms of statistical significance? *J Insect Sci.* 3:34.

439 Pinter-Wollman N, Gordon DM, Holmes S. 2012. Nest site and weather affect the personality of
440 harvester ant colonies. *Behav Ecol.* 23:1022–1029.

441 Prokkola JM, Nikinmaa M. 2018. Circadian rhythms and environmental disturbances –
442 underexplored interactions. *J Exp Biol.* 221:jeb179267.

443 Pruitt JN, Grinsted L, Settepani V. 2013. Linking levels of personality: personalities of the “average”
444 and “most extreme” group members predict colony-level personality. *Anim Behav.* 86:391–399.

445 R Core Team. 2017. R: A Language and Environment for Statistical Computing. R Found Stat
446 Comput Vienna, Austria. 0:{ISBN} 3-900051-07-0.

447 Ramos A, Petit O, Longour P, Pasquaretta C, Sueur C. 2015. Collective decision making during group
448 movements in European bison, *Bison bonasus*. *Anim Behav.* 109:149–160.

449 Rands SA. 2011. *Collective Animal Behavior*. Princeton University Press, Princeton, NJ, USA,
450 (2010). *Appl Anim Behav Sci.* 134:83–84.

451 Réale D, Dingemanse NJ. 2010. Personality and individual social specialization. In: *Social*
452 *Behaviour: Genes, Ecology and Evolution*. p. 417–441.

453 Réale D, Reader SM, Sol D, McDougall PT, Dingemanse NJ. 2007. Integrating animal temperament
454 within ecology and evolution. *Biol Rev Camb Philos Soc.* 82:291–318.

455 Reeb SG. 2002. Plasticity of diel and circadian activity rhythms in fishes. *Rev Fish Biol Fish.*
456 12:349–371.

457 Refinetti R, Wassmer T, Basu P, Cherukalady R, Pandey VK, Singaravel M, Giannetto C, Piccione
458 G. 2016. Variability of behavioral chronotypes of 16 mammalian species under controlled
459 conditions. *Physiol Behav.* 161:53–59.

460 Siegel JM. 2008. Do all animals sleep? *Trends Neurosci.* 31:208–213.

461 Sih A, Mathot KJ, Moirón M, Montiglio PO, Wolf M, Dingemanse NJ. 2015. Animal personality and
462 state-behaviour feedbacks: A review and guide for empiricists. *Trends Ecol Evol.* 30:50–60.

463 Stoffel MA, Nakagawa S, Schielzeth H. 2017. rptR: repeatability estimation and variance
464 decomposition by generalized linear mixed-effects models. *Methods Ecol Evol.* 8:1639–1644.

465 Stuber EF, Dingemanse NJ, Kempenaers B, Mueller JC. 2015. Sources of intraspecific variation in
466 sleep behaviour of wild great tits. *Anim Behav.* 106:201–221.

467 Stuber EF, Grobis MM, Abbey-Lee R, Kempenaers B, Mueller JC, Dingemanse NJ. 2014. Perceived
468 predation risk affects sleep behaviour in free-living great tits, *Parus major*. *Anim Behav.* 98:157–
469 165.

470 Sumpter DJT. 2010. *Collective animal behavior*. Princeton University Press.

471 Vainikka A, Huusko R, Hyvärinen P, Korhonen PK, Laaksonen T, Koskela J, Vielma J, Hirvonen H,

472 Salminen M. 2012. Food restriction prior to release reduces precocious maturity and improves
473 migration tendency of Atlantic salmon (*Salmo salar*) smolts. *Can J Fish Aquat Sci.* 69:1981–
474 1993.

475 Vainikka A, Jokelainen T, Kortet R, Ylonen H. 2005. Predation risk allocation or direct vigilance
476 response in the predator interaction between perch (*Perca fluviatilis* L.) and pike (*Esox lucius*
477 L.)? *Ecol Freshw Fish.* 14:225–232.

478 Ward A, Webster M. 2016. *Sociality: The Behaviour of Group-Living Animals.* Cham: Springer
479 International Publishing.

480 Webster MM, Laland KN. 2012. Social information, conformity and the opportunity costs paid by
481 foraging fish. *Behav Ecol Sociobiol.* 66:797–809.

482 Yerushalmi S, Green RM. 2009. Evidence for the adaptive significance of circadian rhythms. *Ecol*
483 *Lett.* 12:970–981.

484 Ylönen H, Kortet R, Myntti J, Vainikka A. 2007. Predator odor recognition and antipredatory
485 response in fish: does the prey know the predator diel rhythm? *Acta Oecologica.* 31:1–7.

486 Závorka L, Aldvén D, Näslund J, Höjesjö J, Johnsson JI. 2016. Inactive trout come out at night:
487 Behavioral variation, circadian activity, and fitness in the wild. *Ecology.* 97:2223–2231.

488

489

491 **Tables and table legend**

492

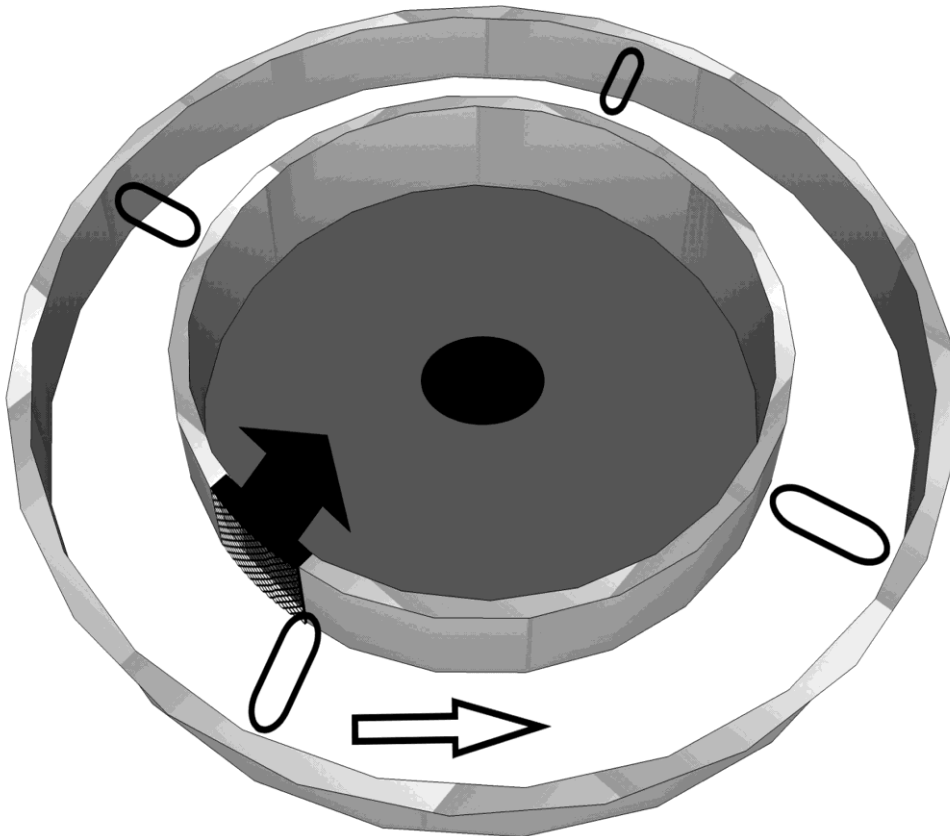
493 **Table 1.** LMM-based, size-adjusted variance and repeatability estimates (with 95 % confidence
 494 intervals) for individuals and groups in all behavioral variables. All repeatability estimates are
 495 statistically significant at the level of $P < 0.001$.

Variable	Estimation for ID		Estimation for Group	
	<i>Var</i>	<i>R_{adj}</i>	<i>Var</i>	<i>R_{adj}</i>
<i>Total activity</i>	7.00 [5.76 – 8.20]	0.31 [0.22 – 0.42]	7.36 [1.57 – 17.30]	0.33 [0.10 – 0.52]
<i>Diurnal activity</i>	2.84 [2.31 – 3.39]	0.22 [0.14 – 0.31]	4.59 [0.97 – 10.0]	0.35 [0.10 – 0.55]
<i>Nocturnal activity</i>	23.60 [19.60 – 27.90]	0.40 [0.31 – 0.50]	12.20 [2.41 – 26.90]	0.21 [0.05 – 0.38]
<i>Circadian score</i>	0.03 [0.02 – 0.03]	0.35 [0.30 – 0.41]	0.01 [0.00 – 0.02]	0.10 [0.02 – 0.21]

496

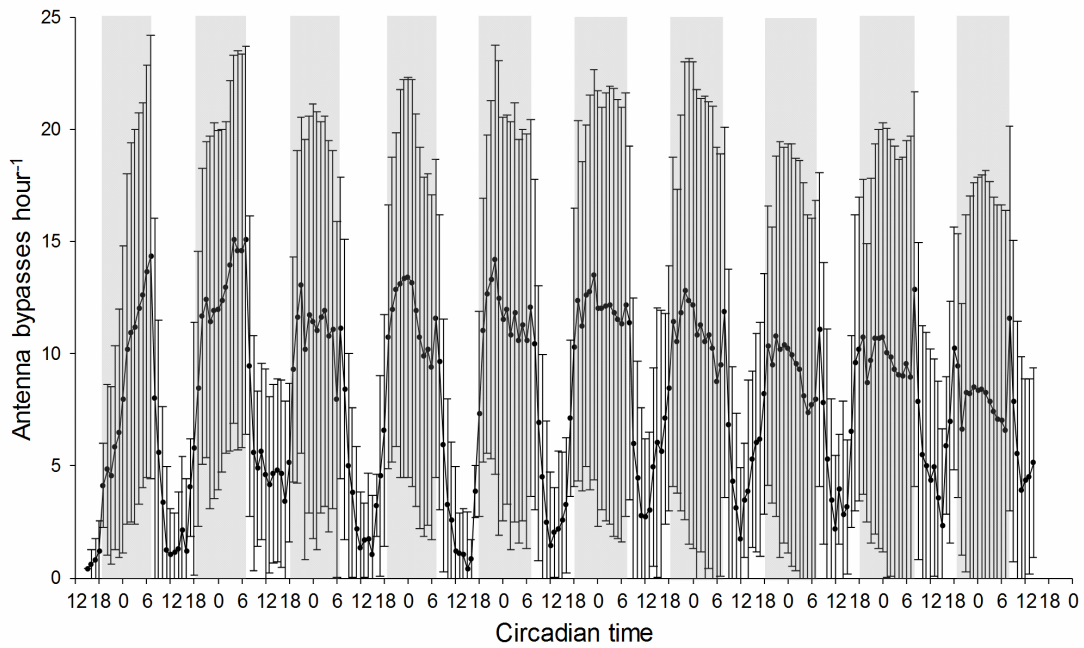
497 **Figure legends**

498



499

500 Figure 1. An illustration of a seminatural enclosure ($n = 8$) used in the behavioral experiment. Outer
501 circumference of the channel is 30.1 m, inner circumference 21.4 m, and width 1.5 m. Water depth
502 is on average 0.3 m. The white arrow indicates the direction of the water flow (ca. $0.11 \text{ m} \times \text{s}^{-1}$ / 55 l
503 $\times \text{s}^{-1}$) and the position of the water inlet. The black arrow indicates the water running out of the
504 system. The bottom of the streams is fully layered with approximately 20 cm of gravel (size 10–20
505 mm) and pebbles (20–100 mm). In addition, four concrete masonry units (size 200 x 500 mm) were
506 scattered on the bottom to provide shelter for the fish. Four plastic loops divide the channel into four
507 sections (distance between two loops 6.5 m). Each loop is equipped with an RFID-antenna and
508 connected to a computer that continuously records signal detections from the bypassing PIT-tagged
509 fish.

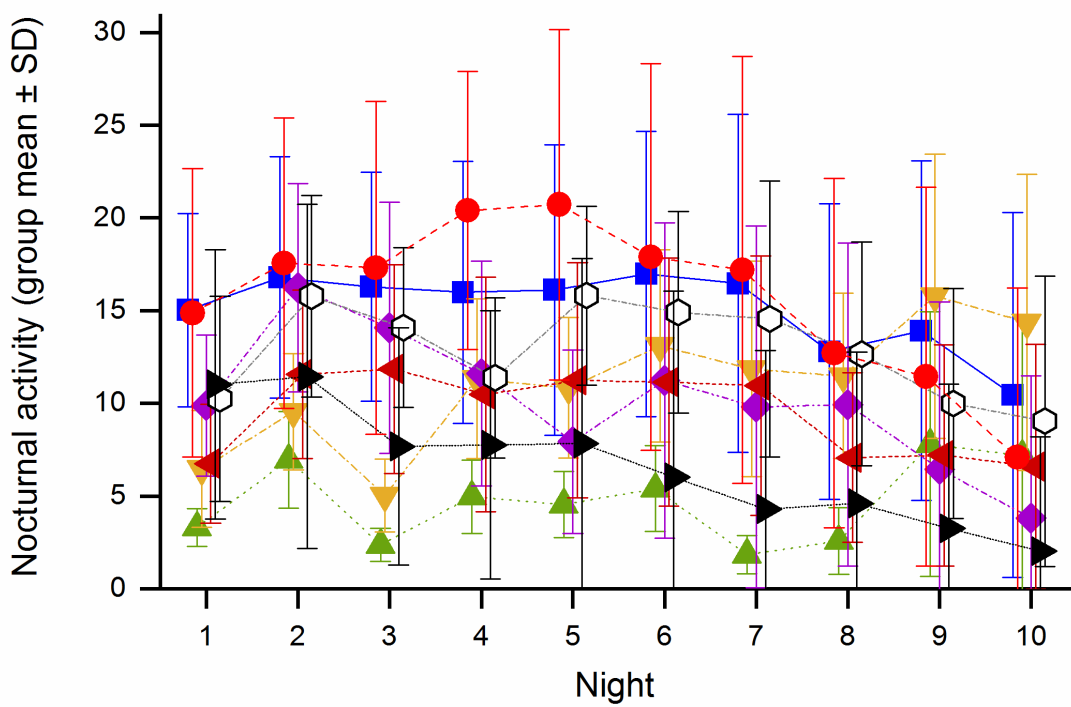
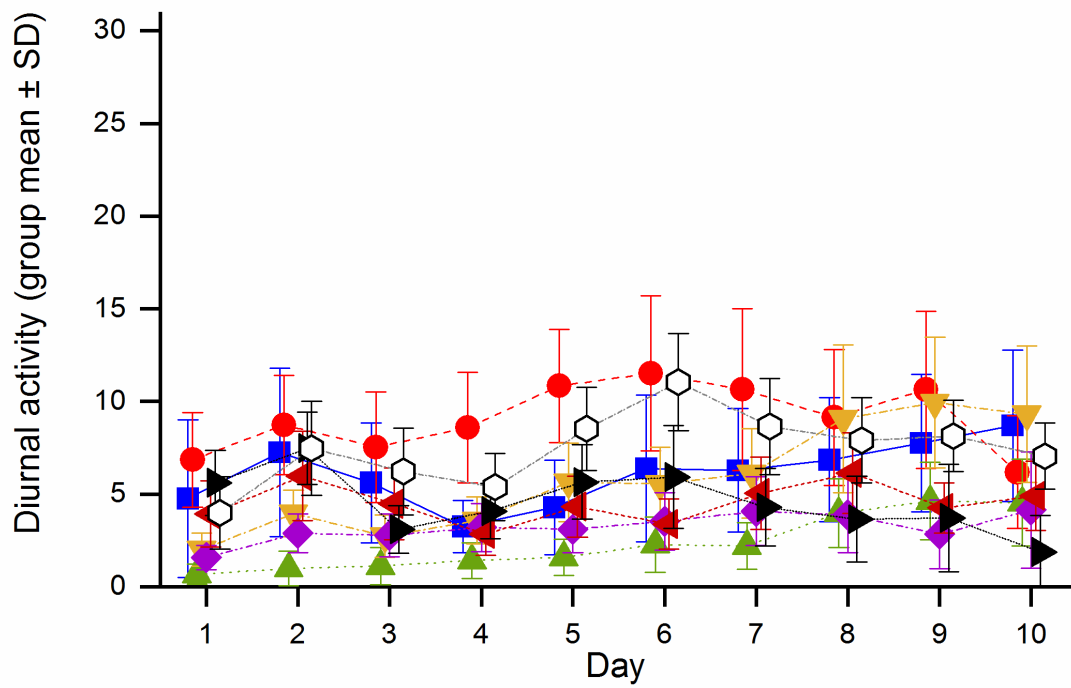


510

511 Figure 2. Circadian activity pattern of the study perch ($n = 313$) represented as mean number (\pm SD)
 512 of hourly signal detections through 10 diel cycles. Shaded areas indicate the periods from sunset to
 513 sunrise.

514

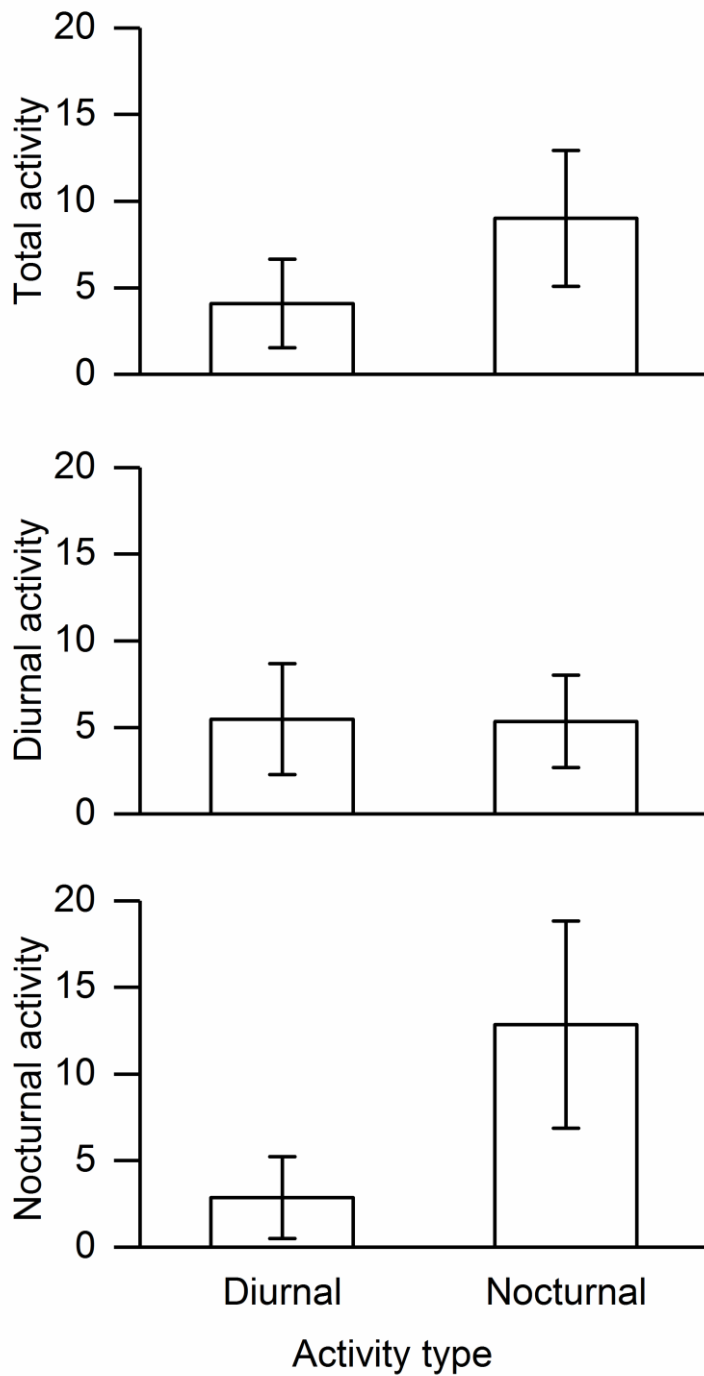
515



516

517 Figure 3. Diurnal and nocturnal activity variation between and within the eight study shoals (group
 518 mean \pm SD) through 10 diel cycles.

519



520

521 Figure 4. Differences in individual mean activity scores (\pm SD) between the activity types. The
 522 activity types are based on circadian scoring describing whether an individual was proportionally
 523 more active diurnally or nocturnally.