

1   **Consistency of fish shoal social network structure under laboratory conditions**

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10   Running head: Consistency of social network structure

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17 We investigated the consistency of association network structure for groups of sticklebacks  
18 *Gasterosteus aculeatus*. Each group was observed twice and we varied the duration between  
19 observations and the size of the experimental arena that they were observed in. At the dyad level  
20 we found positive correlations between dyad interaction frequencies across observations. At the  
21 group level we found variation in four network metrics between observations but only in  
22 treatments where the duration between observations was short. Specifically, fish formed more  
23 and smaller groups in the second observation in this treatment. Fish were also organised into  
24 more subunits in the larger arenas. Finally, we saw positive correlations between some group  
25 network metrics across observations suggesting relative consistency at the group level. There are  
26 several processes that might drive these interaction patterns. Our findings have implications for  
27 experimental design and the comparison and integration of findings of experiments from  
28 different studies carried out under different conditions.

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30 KEY WORDS: Assortment; Group; Shoaling; Social behaviour; Social information; Social  
31 organisation

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33 INTRODUCTION

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35 Group living in one form or another is extensive among animals, shaping and shaped by a range  
36 of ecological and evolutionary processes (Krause and Ruxton 2002; Ward and Webster 2016).

37 The nature and distribution of interactions between group living animals, and the consequences  
38 of these, can be complex. Social network analysis encompasses statistical approaches designed to  
39 aid in quantifying such behaviour, and has proved invaluable in recent years in enabling  
40 researchers to describe, model and predict the outcomes of interactions between group members  
41 (Croft et al 2009; Wey et al. 2008; Whitehead 2008; Pinter-Wollman et al. 2013; Krause et al.  
42 2015).

43

44 Social network analyses have been used to investigate interactions ranging from courtship and  
45 mating patterns (McGregor 2005) to the distribution of potentially cooperative interactions  
46 (Croft et al. 2006), and the social consequences of personality variation (Pike et al. 2008; Croft et  
47 al. 2009; Krause et al. 2010; Aplin et al. 2013; Wilson et al 2013). Such approaches have also  
48 been used to study diffusions, such as the transmission of parasites and diseases through  
49 populations (Cross et al. 2004; Hamede et al. 2009; Weber et al. 2013), potentially allowing  
50 researchers to predict the types of interaction dynamics that might lead to rapid or sustained  
51 outbreaks. Similar approaches have been used to study the transmission and spread of  
52 information (Atton et al. 2012; 2014; Webster et al. 2013; Boogert et al. 2014; Farine et al. 2015;  
53 Wilson et al. 2015; Firth 2016), enabling the identification of directed social learning and  
54 providing insight into the development of local traditions and cultures (Allen et al. 2013; Aplin et  
55 al. 2015).

56

57 The ultimate aim of many research projects utilising social network analysis is to gain an  
58 understanding of the nature and distribution of the social interactions that take place under  
59 natural conditions and populations living in the wild, and there have been many advances to this  
60 end (e.g. Lusseau 2003; Croft et al. 2004; Wolf et al. 2007; Farine et al. 2012; Allen et al. 2013;  
61 Aplin et al. 2013; 2015). On the other hand, laboratory experiments can be valuable too, because  
62 they allow for well controlled manipulations to be performed and also because they allow for  
63 replication, something that is not always possible when studying wild populations in the field.

64

65 While a number of studies have investigated factors influencing social network structure under  
66 laboratory conditions, little is known about the extent to which measures of network structure are  
67 repeatable for groups of animals. Consistency can be considered at two levels. At the level of the  
68 dyad, we may ask who interacts with whom, and whether individuals interact in similar ways  
69 over multiple observation periods. Repeated patterns of interaction may be expected between  
70 dyads with particular affiliative bonds, such as between members of mated pairs or parents and  
71 offspring, but may also be expected between phenotypically similar individuals, or individuals  
72 with similar travelling speeds or habitat preferences (Krause and Ruxton 2002; Ward and  
73 Webster 2016). At the level of the group it would be informative to determine whether particular  
74 conditions consistently give rise to groups with similar network characteristics. Such information  
75 can potentially guide researchers in designing experiments, applying the findings of studies to  
76 different groups and in making predictions about the responses of populations to changing  
77 environmental conditions.

78

79 To address these questions we quantified various social network metrics in shoals of threespine  
80 sticklebacks (*Gasterosteus aculeatus* L.). This species is a well-established model organism in  
81 behavioural ecology (von Hippel 2010) and has previously been used to study social networks  
82 under laboratory conditions (Atton et al. 2012; 2013; Webster et al. 2013). Groups were  
83 observed on two occasions each, and using a fully factorial experimental design we varied the  
84 size of the arena in which they were observed, and the length of time between the two  
85 observations. We quantified both pairwise interactions and group level metrics. The latter  
86 included the total proportion of pairwise interactions observed and whether these were evenly  
87 distributed or skewed, leading to the formation of cliques. We also recorded the number of  
88 smaller units into which the shoals split, and the size of the largest of these.

89

90 We predicted that within groups we would see positive correlations between the strengths of  
91 pairwise associations between the two observation trials. This is reasonable since active choice  
92 and passive factors such as swimming speed and fine-scale habitat preferences are known to play  
93 a significant role in shaping fish shoal composition, such that shoals are frequently found to be  
94 sorted by a range of phenotypic factors, rather than randomly structured (Hoare et al. 2000a;  
95 2000b; Krause et al. 2000). We also predicted that arena size would have the greatest effect upon  
96 group level metrics, given that the larger arena permitted groups to disperse further and reduced  
97 the likelihood of smaller units reencountering one another, leading to more subunits forming and  
98 persisting, with fewer overall interactions and the occurrence of cliquey interactions.

99

## 100 METHODS

101

102 Subjects

103

104 Threespine sticklebacks were collected from the Kinnessburn stream in St Andrews, U.K.

105 (56°20'5.70"N, 2°47'14.95"W) during October 2014 (main experiment) and again in October

106 2016 (time-of-day effects experiment) and held in 90 l aquaria in groups of around 50 fish each.

107 The aquaria contained coarse sand and artificial plants and were fitted with an external filter.

108 They were maintained at 8° C with a 12:12 dark to light photoperiod for the duration of the

109 experiment. Fish were fed daily with frozen bloodworms. Experiments were conducted between

110 December 2014 and February 2015 (main experiment) and in January 2017 (time-of-day effects

111 experiment).

112

113 Fish were organized into experimental groups the day before observations began. In total we

114 tested 40 such groups. In the main experiment we quantified social network structure for each of

115 20 groups on two occasions, according to a fully factorial experimental design in which we

116 varied the size of the arena in which they were tested (small or large) and the amount of time

117 between the two observations (5 or 48 h), testing five groups in each of the four treatment

118 combinations, as described below. We tested a further 20 groups in the time-of-day experiment,

119 five in each of the arena size and morning / afternoon treatments, also described below. Each

120 replicate group consisted of eight adult fish measuring 35-40 mm in standard length. All eight

121 fish were taken from the same holding tank to control for familiarity, ensuring as far as possible

122 that all fish within each replicate group were equally familiar to one another, since familiarity

123 has been shown to have a weak effect on social network structure in this species (Atton et al.

124 2014). Fish showing signs of being in reproductive state were not used, as this has been shown to

125 affect social behaviour in other stickleback species (Webster and Laland 2011). Fish were  
126 unsexed and groups were presumed to contain both non-reproductive males and females. To  
127 enable us to recognise individual fish, each was fitted with a unique, non-invasive tag on the first  
128 dorsal spine. These consisted of 5 mm coloured plastic discs. These do not affect shoaling  
129 preference or behaviour in this species (Webster and Laland 2009). Reds and oranges, colours  
130 associated with male reproductive colouration, were not used. Each group was housed in its own  
131 30 l aquarium with coarse sand and an internal filter.

132

133 *Experimental arenas*

134

135 Two arena sizes were used. These consisted of plastic pools lined with white vinyl laminate  
136 sheets. The larger arena measured 152 cm in diameter (approximately  $18100 \text{ cm}^2$  in area) and the  
137 smaller one 91.5 cm diameter ( $6600 \text{ cm}^2$  in area). Both were filled with water to a depth of 10  
138 cm. To provide structure, inverted white paper cups were added to the arenas. These were fitted  
139 with white lids and filled with aquarium sand to hold them on the arena floor. The cup diameter  
140 was 8 cm at the top (the base of the inverted cup in this experiment) tapering to 5 cm, and 12 cm  
141 tall. These were arranged in a regular pattern, with eight cups in the small arena and 20 in the  
142 large arena, a density of  $0.001 \text{ cups cm}^{-2}$ . The arenas were placed within a shelter constructed  
143 from white corrugated plastic measuring 240 cm x 290 cm and 190 cm tall. This prevented  
144 disturbance of the fish during the observations and helped to ensure even lighting by reflecting  
145 light from wall-mounted LED banks from the ceiling into the arenas. Experiments were recorded  
146 using high definition webcams (Logitech C920, [www.logitech.com](http://www.logitech.com)) mounted above the arenas.

147

148 *Experimental procedure*

149

150 For each observation the group of fish to be tested was taken from its holding aquarium and  
151 introduced to the arena, close to the edge. They were allowed to settle and move throughout the  
152 arena for 12 min before the observations began. These lasted for a further 138 min, during which  
153 time the entire arena was filmed. Each group was filmed in the arena on two occasions, separated  
154 by either 5 or 48 h. Following the first observation the fish were removed and returned to their  
155 holding aquarium. At the end of the second observation the tags were removed from the fish and  
156 they were transferred to a separate housing aquarium, playing no further role in the study.

157 Groups in the 5 h inter-trial period treatment were observed on the morning and afternoon on the  
158 same day, with the first trial taking place at 09:00 hours. Groups in the 48 h inter-trial period  
159 treatment were tested at either 09:00 or 15.00 hours for both of their observations.

160

161 From the videos, the location of each fish was recorded every 6 min using the tracking program  
162 LoggerPro (Vernier Software and Technology, [www.vernier.com](http://www.vernier.com)) Fish were considered to be  
163 associating if the distance between them was less than 7.5 cm (corresponding to approximately 2  
164 standard body lengths). A ‘gambit of the group’ approach was used (Croft et al. 2008), with all  
165 members of a group connected to at least one other member by less than 7.5 cm considered to be  
166 associating. Pairwise association data were used to construct association matrices describing the  
167 frequency of associations of all members of each group. From this, the network metrics  
168 described below were determined, and compared between groups. Blinded methods were not  
169 used.

170

171 *Controlling for time-of-day effects*

172

173 Because the 5 h inter-trial duration group were tested twice on the same day, in the morning and  
174 afternoon, any differences in their behaviour may have reflected time-of-day effects rather than  
175 have arisen in response to being tested twice in the arena. Time-of-day effects may be due to  
176 circadian or diel rhythms (Reebs 2002), learned behaviour (*e.g.* food anticipatory behaviour,  
177 Leblond & Reebs 2006) or may have been due to other underlying mechanisms. In order to  
178 control for such effects 20 further groups were established, as described above. These were  
179 tested in the morning (commencing 09.00 hours) or afternoon (16.00 hours), in the small or large  
180 arena, according to a factorial experimental design ( $n=5$  groups per treatment combination).  
181 Here, each group was only tested once. The test procedure was otherwise identical.

182

183 *Statistical Analyses*

184

185 Pairwise interactions

186

187 Association matrices were produced for each observation. The association matrices were  
188 compared for each pair of observations within each of the treatment combinations using Mantel  
189 permutation tests with 1000 iterations. The Mantel tests generated a Pearson correlation  
190 coefficient for each pair of observations. For each treatment combination the Pearson correlation  
191 coefficients were meta-analysed using Stouffer's weighted z method (Whitlock 2005).

192

193 Network metrics

194

195 Using the association data we calculated separate network metrics. These were: *Network density*,  
196 the number of pairwise interactions observed divided by the total number of possible pairwise  
197 interactions. *Network differentiation*, a measure of the evenness of the distribution of the total  
198 pair-wise interactions between individuals within an association matrix (Edenbrow 2011), was  
199 derived from the co-efficient of variation (standard deviation of observed interactions for a given  
200 pair within the group / mean number of interactions per pair for the group). A greater network  
201 differentiation score suggests more variation in the extent to which individuals associate with  
202 one another. *Number of elements* described the number of subunits (lone individuals or groups of  
203 individuals) that were separated from other subunits by more than 2 body lengths. *Size of largest*  
204 *element* referred to the number of fish seen in the largest subunit. Network density and  
205 differentiation were calculated from the association matrices compiled for each observation. For  
206 the number of elements and the size of the largest element we used mean values (determined  
207 from the number of elements and size of the largest element recorded at each 6 min sampling  
208 interval) for each group. These were analysed using repeated measures GLMs, comparing data  
209 for the first and second observation, with arena size (small or large) and duration between  
210 observations (5 or 48 h) included as categorical covariates. A separate GLM was performed for  
211 each of the four metrics.

212

213 Time-of-day effects

214

215 We first used GLMs to compare the four metrics between the groups tested in the morning and  
216 afternoon, including arena size, time of testing and the interaction between these as effects. We

217 then compared these to the metric scores obtained for the first and then the second trials in the 5  
218 h inter-trial period treatment groups. This allowed us to determine whether any change in any of  
219 the metrics seen in 5 h inter-trial groups was due to a time-of-day effect on behaviour that may  
220 have been independent of the testing regime. Here we used GLMs with time (morning, afternoon  
221 and first or second trial), arena size and the interaction between these as factors. These data were  
222 used in multiple analyses. We did not perform any correction for multiple testing here (*e.g.*  
223 Bonferroni correction), since these have been criticised for being overly conservative when the  
224 number of comparisons is low (Moran 2003).

225

226 Within-group consistency

227

228 We looked for consistency in each of the four metrics, network density and differentiation,  
229 number of elements and size of largest element, comparing the scores obtained for the first and  
230 second observations in each of the four treatment combinations using Spearman's rank  
231 correlations. Ranked data were used because of the changes in metrics seen between the first and  
232 second observations in some treatments (see Results).

233

## 234 RESULTS

235

236 *Pairwise interactions*

237

238 Pairwise association strengths were positively correlated between the first and second  
239 observation for the majority of groups across the four treatment combinations (Fig. 1). Meta-

240 analysis using Stouffer's weighted z method identified positive correlations in each of these  
241 (small arena, 5 h:  $n=5$ ,  $P<0.001$ ; small arena, 48 h:  $n=5$ ,  $P<0.001$ ; large arena, 5 h:  $n=5$ ,  
242  $P<0.001$ ; large arena, 48 h:  $n=5$ ,  $P<0.005$ ).

243

244 *Network metrics*

245

246 For all four network metrics we saw variation between the first and second observations, with  
247 these differences largely being driven by changes in behaviour in the shorter inter-observation  
248 duration treatments (Fig. 2). In general, fish in these treatments interacted less frequently in the  
249 second observation than in the first, engaging in fewer pair-wise interactions and forming more  
250 and smaller subunits. For network density an effect of arena size was seen too, with density  
251 being lower in the smaller arenas. Weaker effects of arena size were seen upon the number of  
252 separate elements and the size of the largest element as well; there were fewer elements in the  
253 smaller arenas, with more fish in the largest unit. Test statistics are presented in Table I.

254

255 *Time of day effects*

256

257 We saw no differences in any of the four network metrics between groups of fish tested in the  
258 morning or afternoon (Table II). We then compared these metrics between groups tested in the  
259 morning and afternoon and those of the main experiment groups tested twice in the short inter-  
260 observation period treatment of the main experiment, comparing them to their first and second  
261 test metrics. We saw no differences in any of these metrics obtained from their first test of the  
262 main experiment groups. We did however see differences for all four metrics recorded from the

263 second test of the main experimental groups: density was higher and differentiation was lower in  
264 the groups tested for the second time compared to those tested only once in the morning or the  
265 afternoon. Similarly, the fish were organised into fewer and smaller elements in the groups tested  
266 for the second time (there were also effects of arena size for these metrics, Fig. 2 and Table II).

267

268 These findings imply that the change in behaviour of the fish in the second test compared to the  
269 first, and the resulting changes in observed network metrics, resulted from repeated exposure to  
270 the test arena and did not reflect time-of-day effects upon behaviour.

271

272 *Within-group consistency*

273

274 We saw significant positive correlations between the first and second observations for the size of  
275 the largest element in all treatment combinations, while other metrics were also significantly  
276 correlated in some treatment groups (Table III).

277

278 DISCUSSION

279

280 In this study we investigated the consistency of dyadic and shoal-level interactions in small,  
281 replicated laboratory groups of sticklebacks. Considering first dyadic interactions, between the  
282 two observation periods we saw positive correlations between pairwise association strengths for  
283 most of the groups. While the strength of these correlations was variable, they do suggest that to  
284 a lesser or greater degree some individual fish tended to associate with the same groupmates  
285 across both trials. Non-random assortment can occur through a number of different mechanisms

286 (Hoare et al. 2000a; 2000b; Krause et al. 2000). Animals may associate through active  
287 preference; shoaling fishes have been shown to form associations based upon a range of factors  
288 including body size (Ward and Krause 2001; Croft et al. 2009a), relatedness (Frommen et al.  
289 2004; 2007; Piyapong et al. 2011), familiarity (Griffiths and Magurran 1997; Croft et al. 2004;  
290 Frommen et al. 2004; Ward et al. 2009), chemical cues derived from similar diet or habitat use  
291 patterns (Ward et al. 2004; 2005; 2007; 2009; Webster et al. 2007; 2008a; 2008b; Kleinhappel et  
292 al. 2014; 2016) and competitive ability (Metcalf and Thomson 1995). Assortment may also arise  
293 passively through shared habitat preference or site fidelity (Croft et al. 2003; Webster et al. 2011;  
294 Ward et al. 2013), similar swimming speeds (Krause et al. 2005) or similar patterns of activity,  
295 risk aversion or cover use linked to personality traits (Pike et al. 2008; Croft et al. 2009b). The  
296 processes or mechanisms behind the positively correlated association patterns seen in this study  
297 are not clear; many of the above factors known to affect group composition, such as size,  
298 familiarity and habitat and diet use background were held constant as far as possible in our study  
299 and are therefore unlikely to be responsible. Personality traits have been shown to play a role in  
300 generating assortment in similar studies (e.g. Pike et al. 2008) and may have been involved here  
301 too. Should similar association patterns be expected in species that form free-entry groups under  
302 natural conditions? On the one hand, greater opportunity to disperse might limit the likelihood of  
303 individuals reencountering one another after splitting, though this effect may be countered  
304 somewhat if they exhibit site fidelity. Being part of a larger population and immigration by  
305 individuals from other areas might also mitigate against repeated encounters, by providing a  
306 greater number of opportunities for interaction and a greater pool of potential groupmates to  
307 select between. On the other hand, the greater heterogeneity often associated with natural  
308 habitats might actually facilitate repeated interactions, if sheltered areas or feeding grounds are

309 patchily distributed. The net outcome of these and other factors upon association patterns  
310 between individuals in unclear and further work in this area is necessary.

311

312 At the level of the group, the four network metrics that we quantified in this study -density,  
313 differentiation, mean number of separate elements and the mean size of the largest element- all  
314 varied over the two observation periods, a pattern that was driven by an interaction with the  
315 inter-observation duration. Arena size in contrast, which had a limited effect upon network  
316 metrics, did not impact changes in metrics recorded between the first and second observation  
317 periods. Specifically, we saw that only the shorter inter-observation treatment was associated  
318 with changes in these metrics. In the second observation trial the fish formed more subunits than  
319 they did in the first, with correspondingly fewer fish in the largest element, as well as lower  
320 density (indicating fewer pairwise associations) and increasing network differentiation. This final  
321 finding indicates that these associations were spread less evenly between dyads, suggesting  
322 ‘cliquier’ networks were formed in the second observation trial. Why this effect was seen in the  
323 shorter, but not in the longer inter-observation duration treatment is unclear. One possibility is  
324 that the fish were able to remember their recent experience of the arena, and were less fearful or  
325 stressed during the second observation period, forming more and smaller groups in response.  
326 They may have behaved similarly in both observation periods of the longer duration treatment  
327 because they could not recall their experience over this longer time period. This line of  
328 speculation could be tested by observing fish in one arena type and then testing them again after  
329 a short period in either the same arena or in a different one. If familiarity with the arena lies  
330 behind their change in behaviour then we would expect to see them form smaller groups during  
331 the second observation period in the original arena configuration, but not in the altered one.

332 While not explicitly investigating network characteristics, Ward (2012) found that shoals of  
333 mosquitofish *Gambusia holbrooki* Girard 1859 became less exploratory over time, suggesting  
334 that familiarity with the experimental arena can indeed lead to changes in behaviour. The  
335 biological significance of the interaction between duration between observation and network  
336 metrics in our study may be unclear, but this finding nevertheless has significant implications  
337 both for the design of experiments and for the extent to which comparisons can be drawn  
338 between the findings of separate studies that sample network structure over different time  
339 intervals.

340

341 A final and unexpected finding of our study was that some group network metrics, most  
342 prominently the size of the largest subunit, were positively correlated across observation periods.  
343 Because the sample sizes within each treatment were low and because this observation was not  
344 something we set out to investigate, we suggest these findings be treated as provisional and that  
345 they need to be followed up with further research that explicitly investigates the consistency of  
346 these and other metrics. Nonetheless, these data do at least suggest the possibility of group-level  
347 stability in certain behavioural measures, functionally similar to, and potentially arising from  
348 individual level personality differences. A growing number of studies have recognised the  
349 potential for personality trait expression to both shape and be shaped by social interactions in a  
350 number of ecologically relevant ways (reviewed by Webster and Ward 2011; Magnhagen 2012;  
351 Wilson et al. 2013; Wolf and Krause 2014). Further research into how group composition affects  
352 group-level behaviour and function, and especially the degree to which this is consistent and  
353 predictable would be useful. Such work could go beyond quantifying network metrics, as we  
354 have done here, to also consider behaviours more functionally related to the kinds of personality

355 traits quantified in individual animals, such as activity, exploration rate and use of risky areas of  
356 the environment.

357

358 In summary, our study provides evidence of consistency in association network structure, both at  
359 the dyad- and group-level. We have shown that arena size can affect certain group level metrics  
360 in laboratory studies and, more interestingly, that the length of the duration between observations  
361 can substantially affect network structure. While the biological basis and implications of this  
362 finding are not immediately clear, we suggest that this is an important factor that should be  
363 accounted for by researchers designing experiments that call for repeated observations of  
364 interactions between social groups of animals.

365

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367

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- 609

610 FIGURE CAPTIONS

611

612 **Figure 1.** Scatter plots showing the relationships between the association strength rank of each pairwise  
613 interaction for each replicate group of fish in the four treatment combinations. The four experimental  
614 treatments (small pool 5h, interval between tests; small pool 48h interval; large pool 5h interval; large  
615 pool 48h interval) are arranged by column, with each column displaying a plot for each of the five  
616 replicate groups. Within plots each point represents a dyad. Test statistics show Pearson's *r* correlation  
617 coefficients and P values obtained using Mantel tests. There were 8 fish in each group, for a total of 28  
618 association dyads. In some groups multiple dyads had the same association ranks in both trials resulting in  
619 fewer than 28 data points being depicted in some plots.

620

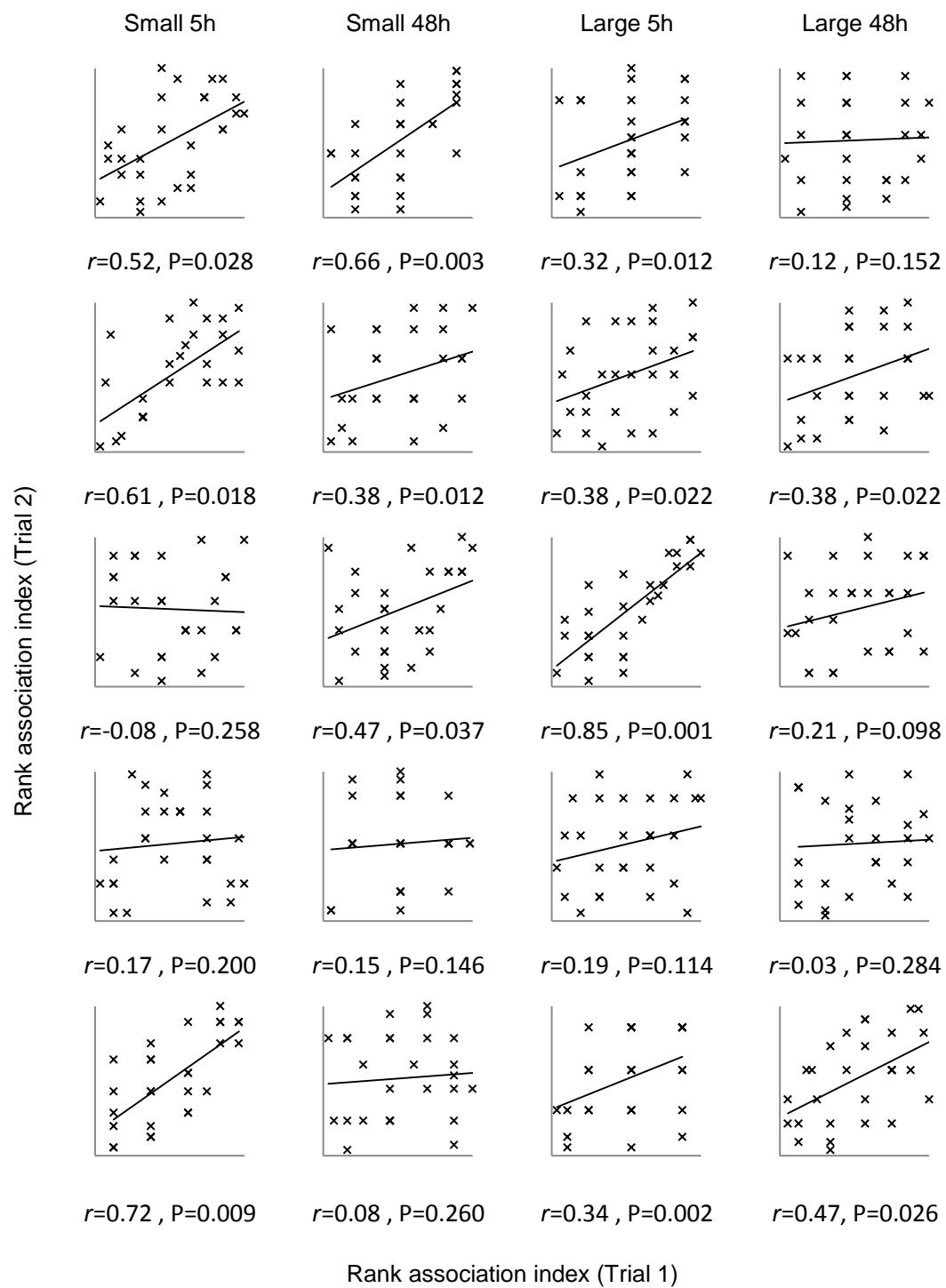
621 **Figure 2.** The mean (+/- 95% confidence interval) score per group for each of four network metrics.

622 Groups were either tested twice in small or large arenas at 5 or 48h intervals (main experiment), or only  
623 once in the morning or afternoon in the time-of-day effects experiment. See Main Text and Tables I and II  
624 for further details.

625

626 **Figure 1.**

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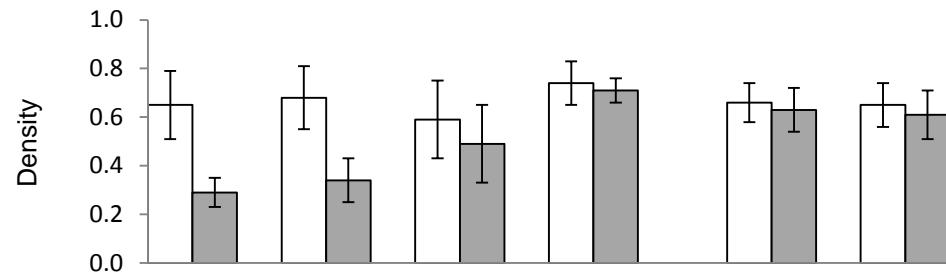
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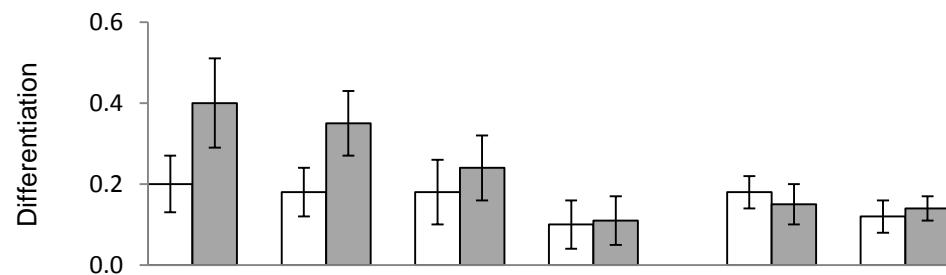
631 **Figure 2.**

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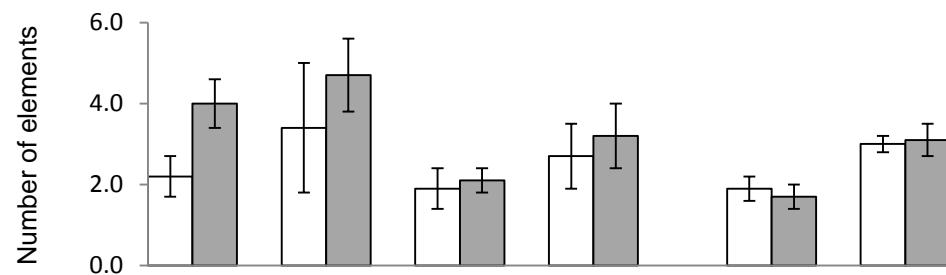
(a) Network density



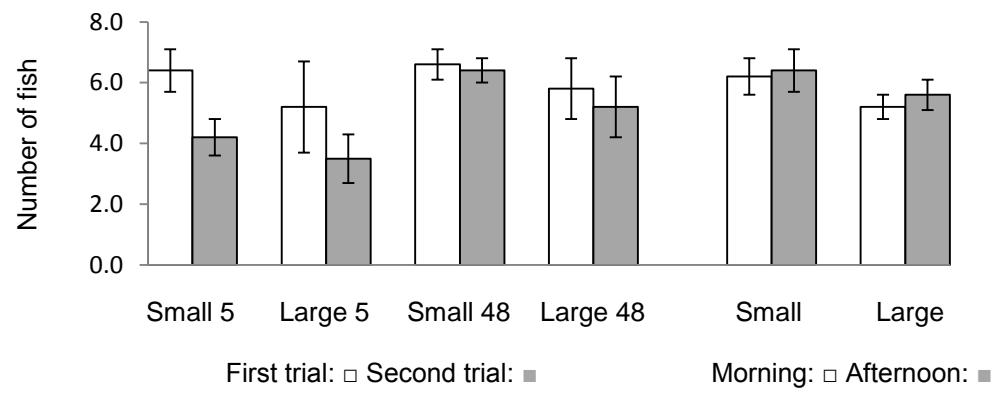
(b) Network differentiation



(c) Number of separate elements



(d) Size of largest element



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635

636 **Table I.** Output from repeated measures GLMs investigating the effects of arena size and inter-  
 637 trial duration on four different network metrics.

		<i>d.f.</i>	<i>F</i>	<b>#38</b>
<b>(a) Density</b>	<i>(i) Within subjects effects</i>			
	Trials	1	25.56	<0.001
	Trials*Arena size	1	0.01	0.989
	Trials*Inter-trial duration	1	11.15	0.004
	Trials*Arena size* Inter-trial duration	1	0.99	0.341
	Error	16		
	<i>(ii) Between subjects effects</i>			
	Arena size	1	5.12	0.036
	Inter-trial duration	1	7.48	0.015
	Arena size* Inter-trial duration	1	0.09	0.763
	Error	16		
<b>(b) Differentiation</b>	<i>(i) Within subjects effects</i>			
	Trials	1	8.87	0.009
	Trials*Arena size	1	0.11	0.745
	Trials*Inter-trial duration	1	3.59	0.076
	Trials*Arena size* Inter-trial duration	1	0.26	0.616
	Error	16		
	<i>(ii) Between subjects effects</i>			
	Arena size	1	2.86	0.110
	Inter-trial duration	1	5.85	0.028
	Arena size* Inter-trial duration	1	0.23	0.635
	Error	16		
<b>(c) Separate elements</b>	<i>(i) Within subjects effects</i>			

Trials	1	34.19	<0.001
Trials*Arena size	1	0.11	0.750 640
Trials*Inter-trial duration	1	14.28	0.002
Trials*Arena size* Inter-trial duration	1	1.57	0.227
Error	16		

(ii) *Between subjects effects*

Arena size	1	4.32	0.054
Inter-trial duration	1	5.99	0.026
Arena size* Inter-trial duration	1	0.01	0.952
Error	16		

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<b>(d) Largest element</b>	(i) <i>Within subjects effects</i>			
Trials	1	83.87	<0.001	
Trials*Arena size	1	0.09	0.768	
Trials*Inter-trial duration	1	35.89	<0.001	
Trials*Arena size* Inter-trial duration	1	2.71	0.119	
Error	16			

(ii) *Between subjects effects*

Arena size	1	4.12	0.059
Inter-trial duration	1	5.91	0.027
Arena size* Inter-trial duration	1	0.96	0.969
Error	16		

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641 **Table II.** Output from GLMs (i) investigating the effects of time of testing (morning or afternoon) and  
 642 arena size for four different network metrics, and comparing these behaviours in fish tested in the  
 643 morning or afternoon against those tested in the first (ii) and second (iii) trial in the repeated measures  
 644 experiment.

645

		<i>d.f.</i>	<i>F</i>	<i>P</i>
<b>(a) Density</b>	<i>(i) Time of testing: AM versus PM</i>			
	Arena Size	1	0.04	0.842
	Time	1	0.32	0.577
	Arena size* Time	1	0.01	0.957
	Error	16		
	<i>(ii) Time of testing and first test of repeated measure</i>			
	Arena Size	1	0.19	0.663
	Time	2	0.30	0.739
	Arena size* Time	2	0.55	0.579
	Error	34		
	<i>(iii) Time of testing and second test of repeated measure</i>			
	Arena Size	1	0.42	0.522
	Time	2	5.73	0.007
	Arena size* Time	2	0.88	0.420
	Error	34		
<b>(b) Differentiation</b>	<i>(i) Time of testing: AM versus PM</i>			
	Arena Size	1	1.64	0.217
	Time	1	0.05	0.828
	Arena size* Time	1	1.04	0.324
	Error	16		
	<i>(ii) Time of testing and first test of repeated measure</i>			
	Arena Size	1	2.27	0.141
	Time	2	1.25	0.299
	Arena size* Time	2	0.93	0.402
	Error	34		
	<i>(iii) Time of testing and second test of repeated measure</i>			
	Arena Size	1	1.94	0.173
	Time	2	5.67	0.007
	Arena size* Time	2	0.88	0.422
	Error	34		

<b>(c) Separate elements</b>	(i) <i>Time of testing: AM versus PM</i>			
	Arena Size	1	41.9	<0.001
	Time	1	0.14	0.708
	Arena size* Time	1	0.50	0.489
	Error	16		
	(ii) <i>Time of testing and first test of repeated measure</i>			
	Arena Size	1	13.74	0.001
	Time	2	0.14	0.873
	Arena size* Time	2	0.11	0.896
	Error	34		
<b>(d) Largest element</b>	(iii) <i>Time of testing and second test of repeated measure</i>			
	Arena Size	1	11.84	0.002
	Time	2	6.59	0.004
	Arena size* Time	2	0.17	0.842
	Error	34		
	(i) <i>Time of testing: AM versus PM</i>			
	Arena Size	1	8.14	0.012
	Time	1	1.02	0.326
	Arena size* Time	1	0.08	0.786
	Error	16		
<b>(d) Largest element</b>	(ii) <i>Time of testing and first test of repeated measure</i>			
	Arena Size	1	2.12	0.154
	Time	2	0.26	0.771
	Arena size* Time	2	0.26	0.773
	Error	34		
	(iii) <i>Time of testing and second test of repeated measure</i>			
	Arena Size	1	6.37	0.016
	Time	2	4.77	0.015
	Arena size* Time	2	0.17	0.983
	Error	34		

648 **Table III.** Spearman correlation co-efficients for two measures of each of four different network  
 649 metrics.

	<i>n</i>	<i>r</i>	<i>P</i>
<b>(a) Small arena, 5h inter-trial duration</b>			
Network Density	5	0.70	0.188
Network differentiation	5	0.60	0.285
Number of separate elements	5	0.67	0.219
Size of largest element	5	1.00	<0.001
<b>(b) Small arena, 48h inter-trial duration</b>			
Network Density	5	0.56	0.320
Network differentiation	5	0.20	0.747
Number of separate elements	5	0.90	0.037
Size of largest element	5	0.97	0.005
<b>(c) Large arena, 5h inter-trial duration</b>			
Network Density	5	0.60	0.285
Network differentiation	5	1.00	<0.001
Number of separate elements	5	0.70	0.188
Size of largest element	5	1.00	<0.001
<b>(d) Large arena, 48h inter-trial duration</b>			
Network Density	5	1.00	<0.001
Network differentiation	5	0.70	0.118
Number of separate elements	5	0.70	0.118
Size of largest element	5	1.00	<0.001

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651