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6	Computerized stimuli for studying oddity effects
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8	Khia E. Dobbinson ¹ , Paul A. Skarratt ² , Lesley J. Morrell ¹
9	¹ School of Environmental Sciences, University of Hull
10	² School of Life Sciences, University of Hull
11	
12	Correspondence author:
13	Khia E. Dobbinson
14	Address:
15	Hardy Building
16	University of Hull
17	Cottingham Road
18	HU6 7RX
19 20	Email: k.e.dobbinson@2010.hull.ac.uk

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28 Abstract

29 Visually hunting predators must overcome the challenges that prey groups present. 30 One such challenge is the confusion effect where an overburdened visual system 31 means predators are unable to successfully target prey. A strategy to overcome 32 confusion is the targeting of distinct, or odd, individuals (the oddity effect). In live prey 33 experiments, manipulation of group member phenotypes can be challenging and prey 34 may differ on more than the single feature one intends to define as odd. The use of 35 highly controllable computerized stimuli to study predator-prey interactions is increasingly popular in the field of behavioral ecology. However, to our knowledge, 36 37 the validity of computerized stimuli to study the oddity effect has not been established. 38 39 Predator choice experiments were conducted using naive stickleback predators to 40 ascertain whether the oddity effect could be demonstrated in the absence of live prey. 41 We found evidence for both the oddity effect and preferential targeting of group 42 edges and low density regions, as would be predicted if predators targeted prey 43 individuals to minimize confusion. The oddity effect was evident at a low threshold, above which dots were no longer perceived as odd, and no longer attacked more 44 45 often than expected by chance. 46 We conclude that computerized stimuli are an improved, practical method for 47 studying oddity effects while further validating the use of similar methods for studying 48 other aspects of visual predation. In addition to higher control of 'prey' appearance, the replacement of live prey animals with digital stimuli is ethically beneficial and 49 50 reusing code improves experimental efficiency.

- 51 Keywords: oddity effect, confusion effect, visual predation, predator, prey, marginal
- 52 predation, computerized prey

53 Data accessibility

- 54 Analyses reported in this article can be reproduced using the data located at
- 55 DOI:10.5061/dryad.dq0tt96

56 Introduction

57 When predators approach a group of prey they are simultaneously presented with a choice 58 of potential targets. Which prey within a group are selected by predators directly affects the 59 composition of phenotypes within a group, in addition to driving the evolution of prey 60 grouping behaviors (Croft et al., 2009; Rodgers et al., 2015). Visually hunting predators may 61 select prey because of their position in the group (Hamilton, 1971), or because of their 62 appearance (Ohguchi, 1978). Prey may be preferentially targeted because they appear slow 63 or weak (Genovart et al., 2010), because they are the appropriate size to maximize energy 64 gains (Turner, 1982), or because they are visually distinct from the rest of their group (the 65 oddity effect, Almany et al., 2007; Penry-Williams et al., 2018).

66 Landeau and Terborgh (1986) used bass preying on groups of minnow to demonstrate that 67 the presence of visually distinct 'odd' prey mitigates the confusion effect. The confusion effect describes the diminished ability of a predator to successfully target an individual 68 69 within a group, resulting from cognitive limitations (Krakauer, 1995). Landeau and Terborgh 70 (1986) is a well-cited oddity effect study, showing how individual appearance and overall 71 group composition can affect predation decisions and outcome. However, a methodology 72 that uses live, vertebrate prey, which are confined with the purpose of being attacked, is 73 something we are less likely to deem ethically acceptable by today's standards (Buchanan et 74 al., 2012; Brown, 2015; Sloman et al., 2019). A more common predator-prey system for 75 studying confusion and oddity effects is that of stickleback (Gasterosteus aculeatus) preying 76 on Daphnia. Putting aside any philosophical questions about ethics and (the lack of) 77 vertebrae (although see Freelance, 2018), there are potential issues relating to efficiency 78 and perception that may arise here.

79 In order to understand how phenotype contributes to the oddity effect, prey group 80 members should ideally only differ on a single feature. Many studies examining predator 81 selection of odd prey require prey individuals to be sorted by size and dyed, usually with 82 food coloring (Landeau and Terborgh, 1986; Wilson et al., 1990; Richards et al., 2011; 83 Rodgers et al., 2013; Penry-Williams et al., 2018). This process is time consuming and largely 84 reliant on a human judgment of prey similarity. Perception is highly subjective, even 85 between members of the same species (Brainard and Hurlbert, 2015) and consequently this 86 raises potential issues for repeatability. In addition, studies of confusion and oddity effects 87 use the human visual system to establish uniformity of prey appearance, yet stickleback, for 88 example, are able to see ultraviolet (UV) light (Modarressie and Bakker, 2007; Rick et al., 89 2012). Hence, what might appear to be a largely homogenous stimulus group in visible light 90 might not be the case elsewhere in the electromagnetic spectrum. Although there are ways 91 to overcome between-species perceptual differences (e.g., Rowe et al, 2006), we submit 92 below that rendering digital stimuli monochromatically and through a UV-filter affords the 93 highest standard of stimulus control.

94 An alternative to altering prey appearance is to use color-morphs of the same species. In the 95 case of Daphnia, morphs can be obtained through manipulating water chemistry (Ohguchi, 96 1978). However, different behavioral phenotypes often present themselves alongside 97 differences in appearance. For example, higher levels of aggression are seen in melanic vs. 98 silver mosquito fish (Gambusia holbrooki, Horth, 2003) and blue vs. yellow cichlids 99 (Astatotilapia burtoni, Dijkstra et al., 2017). Black springbok (Antidorcas marsupialis) have 100 lower activity levels than their white or standard colored counterparts (Hetem et al., 2009), 101 and while both black and white mollies (Poecilia latipinna) shoal with color-matched 102 conspecifics, white morphs have a stronger overall shoaling tendency (Rodgers et al. 2013).

103 Uncontrolled differences in behavioral phenotype have the potential to confound studies104 that are aiming to isolate a feature that may influence predator choice.

105 As we suggest above, a possible solution to improve experimental efficiency and to better 106 control prey phenotype is to use computerized stimuli in place of live prey. Individuals 107 within simulated 'prey' groups can be manipulated to differ from their group-mates only in 108 the specific, measurable ways intended by the experimenter. The use of computerized 109 stimuli to study visual search and attentional capture is well established in experimental 110 psychology (Bundesen and Habekost, 2008). There is also considerable research in the field 111 of behavioral ecology examining the confusion effect, with human predators preying on 112 computerized targets (Ruxton et al., 2007; Scott-Samuel et al., 2015; Hogan et al., 2017a; Hogan et al., 2017b). Computerized stimuli are also gaining popularity for studying some 113 114 aspects of visual predation in non-humans (Ioannou et al., 2012; Woo et al., 2016; Duffield 115 and Ioannou, 2017; Ioannou et al., 2019). However, to our knowledge, the effectiveness of 116 similar methods for studying oddity is yet to be validated for non-human predators. 117 Here, we use stickleback targeting computerized prey-dots to establish the value of this 118 approach to the study of the oddity effect, defined here as the preferential targeting of a 119 minority phenotype (Ohguchi, 1978; Penry-Williams et al., 2018; Raveh et al., 2019). If the 120 use of digital stimuli is a valid methodology for exploring oddity effects, we would expect to 121 see that a minority phenotype becomes preferentially targeted below a certain threshold of 122 representation within the group. For applicability to the general study of visual predation, 123 predators should target computerized prey groups as they do live prey groups. Thus, we

124 would expect, in line with work on live prey, to also see preferential predation of those on

the edges of groups (Hirsch and Morrell, 2011).

126

127 Methods

128 Stickleback sourcing and maintenance

129 Three-spined stickleback (n=56) were sourced from Thwaite Hall Gardens, Cottingham, UK 130 (grid reference: TA 055 326) in October, 2015. A further 200, wild caught stickleback were 131 sourced from The Carp Co. (Bourne Valley Fish Farm, Kent, UK) in September, 2016. Fish 132 from the Thwaite Hall Gardens source were caught using telescopic landing nets and 133 transported back to the laboratory, by car, in a 20L bucket filled with pond water. No fish 134 died in transit or immediately after being transferred to the laboratory tanks. 135 All fish were quarantined for 3 weeks in two 150L tanks, aerated with two Tetra APS 50 air 136 pumps and two 30 mm air stones per tank. Manual water changes of 25-50% were made 2-3 137 times per week. After this period, fish were housed in groups of 12 on a closed, freshwater 138 system with ~20% new water introduced per week. Fish were fed daily on defrosted frozen 139 bloodworms and Daphnia spp. (Ings Lane Garden Centre, Hull, UK). Water temperature was 140 kept between 10-12°C and the day:night light cycle was set at 12:12 h to prevent the onset 141 of breeding condition. As a result, no attempt was made to determine the sex of individual 142 fish. Experimentation took place between 09:00 and 18:30 h, as stickleback are diurnal, 143 visual predators (Wootton, 1976; FitzGerald and Wootton, 1986).

144

145 **Experimental tank setup**

Experiments took place in a modified glass aquarium (figure 1). The aquarium was split into
a companion area spanning the full width of the tank at one end (10 cm x 20 cm, figure 1a)

148 and a larger focal area (20 cm x 20 cm, figure 1b). The companion area contained 3 non-149 experimental fish. The companion fish acted to reduce stress to the test fish by providing a 150 social environment for this shoaling species (Jones and Godin, 2009; Voellmy et al., 2014). A 151 transparent, perforated partition allowed visual and olfactory contact between the 152 companion fish (in the companion area) and the focal fish (in the focal area). The walls of 153 the companion area were covered with black, opaque plastic to minimize brightness, and 154 therefore stress (Maximino et al., 2010), to the companion fish. An opaque lid covered the 155 companion area so companion fish were not disturbed when focal fish were netted in and 156 out of the experimental tank. The focal area of the tank was partially divided by a black, 157 opaque barrier. This provided a shaded refuge area for the test fish, from which the 158 projection (see below) was not visible. A plastic plant within the experimental area provided further refuge for the test fish. 159

Simulated prey (see below for details of the simulation) were rear-projected onto a selfadhesive, rear projection film (model: GR/Gray, brand: ARCHISTAR) adhered to the tank wall (figure 1b). A Sony VPL-DX122 LCD projector connected to a Toshiba Portégé Z30-B-10G Ultrabook was used to project the simulated prey. The progressive scanning of the 60Hz LCD screen and the constant lamp output of the projector ensured that the critical flicker frequency of stickleback, thought to be higher than humans (Healy et al., 2013), is unlikely to be an issue here (for full explanation see Künzler and Bakker, 2001, pp 681-682).

To reduce brightness and glare, the projector was placed behind a screen (Solar Control
High Reflective Silver Window Film, The Window Film Company UK Ltd, Chesham, UK). The
screen also functioned to reduce heat and UV transmission by 77% and 99% respectively.
Two webcams (Microsoft LifeCam Cinema), connected to a second laptop (Samsung NP-

R780-JT3BUK) were placed outside of the tank, facing the projection wall, to allow for data
collection (see Experimental Procedure, below). Webcam 1 (figure 1) was positioned above
the waterline and allowed observation of the fish exploring the tank and approaching the
projection. Webcam 2 was placed directly below webcam 1 and allowed underwater
observation of the fish attacking the simulated prey group.

176

177 Simulation of prey

178 All simulations were carried out using OpenSesame v3.0.7 (Mathôt et al., 2012), using a 179 screen resolution (canvas) of 1360 x 768 pixels. The canvas was colored an intermediate 180 shade of grey, RGB(129,129,129). N_{qroup} dots ($N_{qroup} = 16$) were positioned on the canvas by 181 selecting pseudorandom integer values from a uniform distribution between x_{min} and x_{max} , 182 and between y_{min} and y_{max} for each dot *i* (see supplementary table 1 for details of 183 parameters used in the simulation). The minimum and maximum values of x and y were 184 chosen to define an active area of the canvas suitable for projection onto the experimental 185 tank, and gave an approximate projected array area of 3 x 7 cm. Each dot had a radius r of 186 7.5 pixels, centered on (x_i, y_i) , and a pseudorandom orientation (movement direction, d_i) 187 between 0 and 2π radians. Dots were colored (c_i) according to whether they were odd or a 188 distractor (the remainder of the group). Dots $1 \le i \le N_{odd}$ were colored as specified by shade 189 of the odd dot, and the remainder the shade of the distractors (see table 1 for number of 190 odd dots). 'Dark' dots were defined as RGB(1,1,1) and 'light' dots as RGB(255,255,255). Dots 191 therefore differed from one another in luminance, but not color. The combination of 192 achromatic stimuli presented through a UV-filter ensured that prey stimuli could not be 193 differentiated on the basis of hues that are invisible to humans (Oliveira et al., 2000; Baldauf

et al., 2008). A circular dot shape was chosen to represent the prey. This avoided the
assumption that other projected shapes, such as those of natural prey, would be viewed as
such by the stickleback.

197 In each timestep *t*, the position of each dot was updated such that:

198
$$x_{i(t+1)} = x_{i(t)} + v * cos(d_i)$$

199
$$y_{i(t+1)} = y_{i(t)} + v * sin(d_i)$$

200 The value of v (v = 1.5) was selected such that the dots appeared to move smoothly and

201 continuously to a human observer. To ensure that the dots did not move in straight lines,

after the position of dots had been altered, their orientation was adjusted such that:

203 $d_{i(t+1)} = d_{i(t)} + a_{max}^* (b_i - 0.5)$, where b is a pseudorandom number between 0 and 1.

204 Random motion is common in many zooplankton species (Seuront et al., 2003; Komin et al.,

205 2004; Strickler et al., 2005) and the random elements of swimming behavior will elicit attack

from predatory fish (Matsunaga and Watanabe, 2012).

For any dots that left the canvas (where any of $x_i > x_{max}$, $x_i < x_{min}$, $y_i > y_{max}$ or $y_i < y_{min}$),

orientation was updated such that $d_{i(t+1)} = d_{i(t)} + \pi$, meaning that they reversed direction and 'bounced' back into the group. This ensured that the group did not become more dispersed during the simulation, mimicking natural groups where compaction is maintained (Seghers, 1974; Magurran and Pitcher, 1987). The simulated dots will henceforth be referred to as

212 'prey-dots'.

213

214 Experimental procedure

215 The experimental tank (figure 1) was filled to a depth of 13 cm of system water, with an 216 olfactory cue added to stimulate predatory feeding behavior (Johannesen et al., 2012). The 217 olfactory cue was made by defrosting 2 blocks of Gamma brand frozen Daphnia in 20ml 218 system water. The *Daphnia* were then strained through a fine mesh net to ensure that the 219 cue contained no solids. Three non-experimental fish were carefully netted into the 220 companion area (figure 1a) 5-10 min before experimentation commenced. Companion fish 221 had visual and olfactory contact with the focal fish in both the refuge area (figure 1a) and 222 experimental area (figure 1b), but their view into the experimental area was partially 223 obstructed by a plastic plant. Companion fish were not used as test fish. 224 At the start of each trial, the focal fish was netted from the holding tank into the refuge 225 area, and the prey simulation was started. Within a single trial a fish was presented with up 226 to 7 arrays (prey-dot groups). Fish were allowed 20 min to attack the first group of prey-dots 227 within a trial. For each subsequent prey group, fish were allowed up to 10 min to attack. The 228 additional 10 min of time to attack the first group was to allow for acclimatization and tank 229 exploration. If an individual continued to show interest in the stimuli, by attacking prey-dots 230 within the allotted time, it was presented with up to 7 treatments out of a possible 11 (table 231 1). In a first set of trials (N=35 fish) prey-dot groups were homogenous (0-odd, 16 dark or 16 232 light prey-dots), equal (8-odd), 2-odd and 4-odd (table 1). In a second set of trials (N=34 fish) 233 prey-dot groups were homogenous, equal, 1-odd and 3-odd (table 1). Groups in both sets 234 were presented in a random order.

Each individual trial ended either when the fish made an attack towards a prey-dot, or when
the allotted attack time expired. As the fish attacked, the experimenter froze the moving
prey-dots by pressing the spacebar, then used the mouse to click at the position of the

238 attack. The coordinates and phenotype of each prey-dot, in addition to the coordinates of 239 the mouse click, were recorded for use in analysis. If the experimenter froze the array > 0.45 240 sec before or after the fish made contact with the screen this was noted as a failed trial and 241 the experimenter moved on to the next prey-dot group. 0.45 sec was equivalent to a 242 timescale where the dots had visually (to a human observer) shifted position. This occurred 243 on 93 out of 339 occasions in total. The proportion of these occurrences were similar across each treatment type, with no significant difference between the greatest number of 244 245 occurrences (9/27 trials in the 4 light:12 dark array) and the fewest (4/27 trials in the 3 246 dark:13 light array; proportion test: x = 1.621, p = 0.203).

247

At the end of the trial, fish were measured to the nearest 0.1 mm (standard length) using dial calipers before being put back in their system tank. A total of 87 fish were tested, however 18 fish did not make a first attack within 20 min and 2 fish were removed from analysis due to experimenter error, resulting in a final sample size of n=67, (standard length 28.4-51.7 mm), see table 1 for breakdown of sample sizes by treatment. A total of 197 attacks were made, with a mean of 2.95 attacks per fish.

254

255 Data Analysis

Data were analyzed in R v.3.3.1 (R Development Core Team, 2015). A binomial test was used
to assess whether the proportion of attacks made towards light and dark targets differed
from random expectation in the equal ratios treatment. As there was no significant
deviation from random (13 attacks to dark, 21 attacks to light; binomial test, p = 0.230), fish

260 could be said to express no particular preference for light or dark dots, so data were pooled261 by the number of odd individuals for all further analysis.

262 We used generalized linear mixed effects models (package lme4 1.1–12; Bates et al. 2015) 263 to explore the effects of oddity status (odd or not), number of odd individuals (treatment), 264 position (center or edge of the group) and local density (distance to the nearest neighbor), 265 and their interactions on whether or not a dot was targeted (target = 1, not target = 0). Trial 266 number nested within fish ID was added as a random effect (random intercepts) to account 267 for the repeated measures nature of the data (multiple dots per trial and multiple trials per 268 fish). An observation-level random effect (random intercepts) was also added to account for 269 over dispersion in the data (Harrison, 2014). There was no collinearity between the main 270 effects (VIF≤2.5). Body length and the site from which fish were sourced were initially 271 checked and found to have no effect on target choice (supplementary table 2). Both were left out of further analysis to focus on variables of interest. 272

273 We identified a set of candidate models, including all possible combinations of pairwise 274 interactions between the four variables, plus the model including all three-way (and lower 275 order) interactions and the model containing the 4-way interaction (and all lower order 276 interactions). Every model contained the 4 main effects. This gave a total of 66 candidate 277 models. We ranked these models by AIC_c scores and assigned them Akaike weights (ω_m) 278 based on these scores (package MuMIn 1.40.0, Barton, 2017). All models with AIC_c within 2 279 of the best model AIC_c (Δ AIC_c \leq 2) were included in the top model set. We calculated full 280 averaged estimates for each variable and interaction appearing in the top model set (i.e. 281 model-weighted averages of predictor estimates over all top set models including those that 282 did not contain the predictor). We also calculated the relative importance of explanatory

283	variables (ω_p ; the sum of Akaike weights of all top set models containing the variable). We
284	reanalyzed our data using the mean distances to the 2-4 closest neighbors in place of the
285	distance to the nearest neighbor and found the results to be broadly consistent
286	(supplementary table 3).
287	Further binomial tests were used to assess whether fish attacked odd individuals more often
288	than expected by chance given their frequency in the group, and a proportion test was used
289	to assess whether edge individuals were attacked more often than expected by chance,
290	given the likelihood of an individual being defined as 'edge'.
291	
292	Ethical statement
293	Experiments were approved by the University of Hull's School of Biological, Biomedical and
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All models in the top model set (table 2) contained an interaction between oddity status and
the number of odd individuals in the array on the likelihood of a particular dot being
attacked (table 3). Odd individuals were more likely to be attacked, but only when there

305 were 1 or 2 (rather than 3 or 4) in the array (binomial tests: table 4; figure 2a). The models also highlighted that edge individuals (table 3; proportion test: X^2 =63.874, df=1, p<0.001; 306 307 figure 2b) were attacked more often than those in the center of the group. These results 308 were broadly robust to the choice of nearest neighbor distance as a measure of local density 309 (supplementary table 3), however, including 3 or 4 neighbors (but not 2) in the measure of 310 local density showed that those with higher average nearest neighbor distances (low local 311 density, or more isolated individuals) were more likely to be attacked (supplementary table 312 3b and c; figure 2c).

313

314 Discussion

315 Using luminance oddity, we have validated the use of computerized stimuli to study the 316 oddity effect. We were able to demonstrate preferential targeting of a minority phenotype, 317 in line with the oddity effect (Ohguchi, 1978; Penry-Williams et al., 2018). 2D arrays were 318 attacked as you would expect if they were 3D, confusing prey group, with preferential 319 targeting of the edges and low density regions (e.g. Hirsch and Morrell, 2011; Duffield and 320 Ioannou, 2017). Other studies have used virtual stimuli to successfully examine the 321 confusion effect (Scott-Samuel et al., 2015; Hogan et al., 2017b), marginal predation 322 (Duffield and Ioannou, 2017), the coordination of prey movement (Ioannou et al., 2012; 323 Lemasson et al., 2016) and the targeting success of humans predating odd prey (Ruxton et 324 al., 2007). However, to our knowledge, this is the first demonstration of the oddity effect 325 using a naïve, non-human predator preying on computerized prey. 326 The predatory response of fish to the 2D prey group adds to the work validating the use of

virtual prey for studying visually mediated predation (Ioannou et al., 2012; Woo et al., 2016;

328 Duffield and Ioannou, 2017; Ioannou et al., 2019). We found that individuals on the 329 periphery of the group were significantly more likely to be targeted than those in the center. 330 This aligns with what would be expected of a pursuit predator attacking a prey group (Hirsch and Morrell, 2011), and with studies examining marginal predation in relation to confusion 331 332 effects (Duffield and Ioannou, 2017). Targets were significantly more likely to be further 333 away from their nearest neighbors, i.e. they had lower local density, or were more isolated 334 within the group. These findings are contrary to the idea that denser regions of a group 335 attract attention due to higher conspicuousness (Ioannou et al., 2009), but in line with 336 findings that show increased risk to prey at lower local densities (Ioannou et al., 2009; 337 loannou et al., 2019).

338 Detection and selection occur at different stages of the predation process. Fish may be 339 initially drawn to denser regions of the group at the detection stage but choose to target less dense (and less confusing) regions at the attack stage (Milinski, 1977). While we did not 340 341 measure success, evidence suggests that attacks are more successful when local prey 342 density is lower (stickleback preying on *Daphnia*; Ioannou et al., 2009) or prey individuals 343 are isolated from the group (geckos Eublepharis macularius and marmosets Callithrix 344 *jacchus* preying on mealworms, Schradin, 2000). Consequently, a targeting preference for 345 less dense regions can be considered a strategy for overcoming the confusion effect.

Attacking dense regions is more perceptually challenging and therefore takes more focus, at
the expense of awareness of surroundings. Stickleback are less likely to notice a predator
when attacking a dense swarm, and when they are exposed to a predator before being
presented with a prey group, they will target areas of lower local density (Milinski, 1984).
Bees have increased difficulty finding a target flower within a group of higher density

distractor flowers (Spaethe et al., 2006). In humans, increased density, or visual clutter,
contributes to crowding effects, impairing the identification of targets (Whitney and Levi,
2011), although this phenomenon can be overcome if targets are salient because they are
visually distinct i.e. they are odd (Põder, 2002).

355 Odd prey-dots were significantly more likely to be targeted when groups contained 1 or 2 356 odd prey-dots, but not when there were 3 or 4. These results suggest that joining a majority 357 unmatched group may not necessarily increase predation risk for minority phenotype 358 individuals, above a low threshold. However, we cannot say whether this threshold is an 359 absolute number or proportion as we only tested a single group size of 16 individuals. 360 Landeau and Terborgh (1986) found that when 1 or 2 odd colored minnow, but not 4, were 361 present within a prey group of 8, bass were significantly more likely to make a successful 362 attack to any group member, odd or otherwise. This effect did not scale up to group sizes of 363 15, where no 5 minute trials ended in a successful attack, and thus the question of absolute 364 or proportional thresholds could not be answered. In longer experimental trials, lasting 24 365 hours, Theodorakis (1989) demonstrated bass preferentially targeting size-odd minnow 366 below a threshold of 5, but again this was only in a single group size of 30.

Fish are commonly used to study the oddity effect, however a diverse array of animal species respond to digitally generated stimuli (e.g. blue jays *Cyanocitta cristata*, Bond and Kamil, 2002; baboons *Papio papio*, Fagot et al., 2009; chameleons *Chamaeleo chamaeleo*, Katz et al., 2015; jacky dragon *Amphibolurus muricatus*, Woo et al., 2016) and therefore computerized stimuli to study oddity, and other aspects of visual predation are applicable across species. Computerized stimuli form the foundation of studies of attentional capture in experimental psychology (Bundesen and Habekost, 2008) but little is known about

attentional capture in other species, particularly fish. Adaptations of the present

375 methodology could be used to address the dearth of research in this area.

376 Computerized stimuli appear to be a viable and practical method for studying oddity effects, 377 but there is still much to learn about when and why oddity effects occur. While we have 378 demonstrated a preference for odd targets at a low threshold within a group, we cannot 379 make conclusions about what drives the preference we have observed here. The targeting 380 of odd prey may have resulted from attentional capture by odd targets, or because targeting odd prey reduces confusion effects. Further work, using a similar methodology to 381 382 that presented here, could be used to establish the threshold of 'useful' oddity, i.e. oddity 383 that improves attack success, and how this interacts with prey group size. In addition, while 384 we found no evidence that oddity interacted with the preference for edge and low density 385 regions, 386 We propose that the use of computerized 'prey' is an improved method for studying oddity 387 effects, for the following reasons: 388 1. Digital stimuli are highly controllable and reduce the potential for confounding 389 factors. 390 2. Ethical practice is improved because the number of live prey required for 391 experiments are reduced.

392 3. Once written, code can be shared and reused, greatly improving experimental
393 efficiency and output.

394

- 395
- **Table 1** The 11 possible prey-dot group compositions, including the number of experimental

Group type	N experiments	N _{odd}	dark : light	Set
1-odd	16	1	1:15	2
1-odd	15	1	15:1	2
2-odd	15	2	2:14	1
2-odd	19	2	14:2	1
3-odd	17	3	3:13	2
3-odd	15	3	13:3	2
4-odd	21	4	4:12	1
4-odd	12	4	12:4	1
equal	35	8	8:8	1 & 2
homogenous	16	0	16:0	1 & 2
homogenous	16	0	0:16	1 & 2

397 trials (*N* experiments) per treatment.

- **Table 2:** The top model set according to AIC, drawn from models including and excluding
- interaction terms. Terms in bold are significant at p<0.05 assessing the impact of individual
- 400 terms in the model (table 3 & supplementary table 4).

Rank	Single variable terms	Interaction terms	df	AIC _C	∆AIC _C
1	Oddity status	Oddity status * number odd	10	1274.018	0
	Number odd	Position * local density			
	Position				
	Local density				
2	Oddity status	Oddity status * number odd	9	1275.100	1.081
	Number odd				
	Position				
	Local density				
3	Oddity status	Oddity status * number odd	11	1275.280	1.261
	Number odd	Oddity status * local density			
	Position	Position * local density			
	Local density				
4	Oddity status	Oddity status * number odd	11	1275.756	1.737
	Number odd	Number odd * local density			
	Position	Position * local density			
	Local density				
5	Oddity status	Oddity status * number odd	11	1275.930	1.912
	Number odd	Oddity status * position			
	Position	Position * local density			
	Local density				
6	Oddity status	Oddity status * number odd	11	1276.011	1.993
	Number odd	Position * local density			
	Position	Position * number odd			
	Local density				

401

402

Variance and standard deviation of random effects was <0.001 in the best-fitting model

- 403 **Table 3:** Model-averaged parameters from the GLMM output with attack status (target or
- 404 not) as the response variable.

Fixed term	β	95% CI	ω _p	Z
(Intercept)	-3.883			
Position	1.281	0.865, 1.697	1	6.033
Local density	-0.104	-0.560, 0.352	1	0.446
Number odd	0.072	-0.031, 0.175	1	1.366
Oddity status	1.049	0.453, 1.646	1	3.448
Oddity * number odd	-0.125	-0.234, -0.015	1	2.234
Position * local density	0.309	-0.054, 0.805	0.82	1.262
Oddity * local density	0.019	-0.146, 0.378	0.16	0.273
Local density * number odd	0.001	-0.018, 0.031	0.13	0.169
Position * oddity	0.014	-0.589, 0.820	0.12	0.105
Position * number odd	< 0.001	-0.063, 1.697	0.11	0.049

405 Full model-averaged estimates (β), 95% confidence intervals (CIs), relative importance (ω_p) and Z are

406 shown for all models appearing in the top model set ($\Delta AIC_c \le 2$). Predictor CIs that do not overlap

407 with zero are shown in bold. Candidate models: 66, top set models: 6 (see table 2).

- 408 **Table 4** Binomial test output where the number of attacks to odd individuals were
- 409 compared to what would be expected if odd shaded dots were targeted at random, with
- 410 respect to overall group size and baseline probability (chance). Significance level is indicated

Treatment	# trials odd targeted in	total # trials	Expected	р
			probability	
1 odd	9	31	0.063	<0.001 **
2 odd	9	34	0.125	0.026 *
3 odd	9	32	0.188	0.139
4 odd	11	32	0.25	0.154

- 411 by terms in bold, with * for p<0.05, ** for p< 0.01 and *** for p<0.0001***.
- 412

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