1	Archerfish number discrimination
2	
2 3	Davide Potrich <sup>1</sup> , Mirko Zanon <sup>1</sup> , Giorgio Vallortigara <sup>1</sup>
4	
5	<sup>1</sup> Center for Mind/Brain Sciences, University of Trento, Rovereto, Italy
6	
7 8	Corresponding authors:
9	Davide Potrich, Giorgio Vallortigara
10	Piazza Manifattura,1 38068 Rovereto
11 12	+39 0464808736
13	davide.potrich@unitn.it; giorgio.vallortigara@unitn.it
14	
15	Orcid IDs:
16	Davide Potrich: 0000-0003-0928-628X
17	Mirko Zanon: 0000-0003-4062-1496
10	Giorgia Vallartigara: 0000 0001 8102 0062
18	Giorgio Vallortigara: 0000-0001-8192-9062

# 20 ABSTRACT

21 Debates have arisen as to whether non-human animals actually can learn astract nonsymbolic numerousness or whether they always rely on some continuous physical 22 aspect of the stimuli covarying with number. Here we investigated archerfish (Toxotes 23 jaculatrix) non-symbolic numerical discrimination with accurate control for co-varying 24 continuous physical stimulus attributes. Archerfish were trained to select one of two 25 26 groups of black dots (Exp. 1: 3 vs. 6 elements; Exp. 2: 2 vs. 3 elements); these were 27 controlled for several combinations of physical variables (elements' size, overall area, overall perimeter, density and sparsity), ensuring that only numerical information was 28 29 available. Generalization tests with novel numerical comparisons (2 vs. 3, 5 vs. 8 and 6 vs. 9 in Exp. 1; 3 vs. 4, 3 vs. 6 in Exp. 2) revealed choice for the largest or smallest 30 numerical group according to the relative number that was rewarded at training. None of 31 32 the continuous physical variables, including spatial frequency, were affecting archerfish performance. Results provide evidence of the spontaneous use of abstract relative 33 numerical information in archerfish for both small and large numbers. 34

35

*KEYWORDS:* number, numerical cognition, number discrimination, numerical rule,
 number sense, archerfish.

## 39 INTRODUCTION

Non-symbolic numerical estimation is an important and well-studied cognitive ability that allows humans and other animals to interact successfully with their surroundings. The development of a "sense of number" is associated with fundamental biological needs that in many ecological contexts allow animals to estimate how many companions or enemies are around, or how much food is present in different patches - all important information to maximize fitness and reproductive success in the wild [1].

Typically, in order to assess numerical abilities animals are requested to 46 discriminate between sets of visual stimuli differing in numerosity (review in [2]). This 47 can be done using spontaneous attractive natural stimuli such as food or social 48 49 companion, taking advantage of the animals' natural and spontaneous tendency in some ecological contexts to "go for more". Alternatively, operant conditioning 50 procedures can be used that associate a particular set of stimuli with a reward. 51 52 Extensive evidence supports the use of numerical information in non-human primates (e.g., [3-7]), as well as in other mammals (e.g., [8-13]), in birds (e.g., [14-19]), in 53 amphibians (e.g., [20,21]), in reptiles (e.g., [22,23]), in fish (e.g., [24-26]) and in 54 arthropods (e.g., [27–30]) (see for general reviews in vertebrates [1,31,32]). 55

56 Numerical discrimination seems to be supported by an "Approximate Number 57 System" (ANS, [33,34]), which discriminative accuracy is ratio-dependent in accordance 58 to Weber's law (as the ratio between two numerosity increases, the discrimination gets 59 more difficult). Besides the ANS, an attentional working memory-based system has 60 been claimed for by some authors as providing precise representation of small numbers

(up to 3-4), the so-called "Object Tracking System" (OTS; [35]), though its generality for
non-human animals is debated (discussion in [31,36]).

Studies investigating the neural basis of number representation revealed selectivity of response of neurons in some areas of the brain such as the parietal and prefrontal cortex in humans [37,38] and in monkeys [39,40], the nidopallium caudolaterale in crows [15,41] and the most caudal dorsal-central part of the pallium in zebrafish [42,43], suggesting that common selective pressures led to convergent evolution of numerical representation in different species [44,45].

However, one issue in all these experiments is that animals are dealing with sets of physical elements, and thus numerical information is intrinsically melted with other non-numerical properties of the stimulus, such as the area, the density or the spatial frequency or the elements' arrangement [46]. Recently, some debates have arisen concerning whether bees use abstract numerical information or rather rely on sensory properties of the stimulus for discrimination [47,48].

Taking advantage of the fact that we recently developed a sophisticated script for the automatic generation of visual stimuli that can allow proper randomization and control of continuous physical variables in number sense experiments [49], we decided to perform some very precisely controlled experiments to check whether fish do use number as abstract property.

We selected archerfish (*Toxotes jaculatrix*) for our study. These fish are wellknown for their particular hunting strategy, which consists of spitting at preys above the water surface with a precise jet of water thrown with the mouth. This attacking repertoire makes it very easy to train them to hit targets using operant conditioning (see e.g., [50]).

Still, to date, no studies in archerfish have explicitly investigated abstract numerical 84 abilities. Leibovich-Raveh et al. [51] and colleagues showed that when archerfish make 85 magnitude-related decisions, their choice is influenced by the non-numerical variables 86 that positively correlate with numerosity; for instance, when exposed to two groups of 87 dots differing in number and continuous physical information, archerfish spontaneously 88 89 selected the group containing the larger non-numerical magnitudes and smaller numerosity, switching to the larger numerical set when positively correlated with all the 90 91 non-numerical magnitudes.

Related to magnitude discrimination, archerfish also proved to be able to associate different geometric shapes with different food quantities [52]; this would support the existence of a system dealing with magnitudes, although a specific role of numerical information remains unclear.

In our study archerfish were trained to select one of two arrays, involving either a 96 97 small and a large numerosity (Exp. 1: 3 vs. 6 elements) or small numerosities only (Exp. 2: 2 vs. 3 elements). After reaching a learning criterion, archerfish were tested with 98 novel numerical comparison (2 vs. 3, 5 vs. 8 and 6 vs. 9 in Exp 1; 3 vs. 4, 3 vs. 6 in Exp 99 100 2) to check whether the rule they used in the training phase was based on a relative judgement (select the "largest" or "smallest" group) or on an absolute judgment (select a 101 102 specific number of item). All of the different continuous physical variables such as 103 radius, total area, total perimeter, convex hull and inter-distance were carefully controlled for and alternately balanced across trials, ensuring that the animals could not 104 105 rely on them to perform their judgment (Figure 1). Furthermore, a statistical analysis 106 was run for a posteriori evaluation of whether any of these variables influence the

107 archerfish responses, confirming that they were not used as a cue for numerical

- 108 evaluation.
- 109
- 110

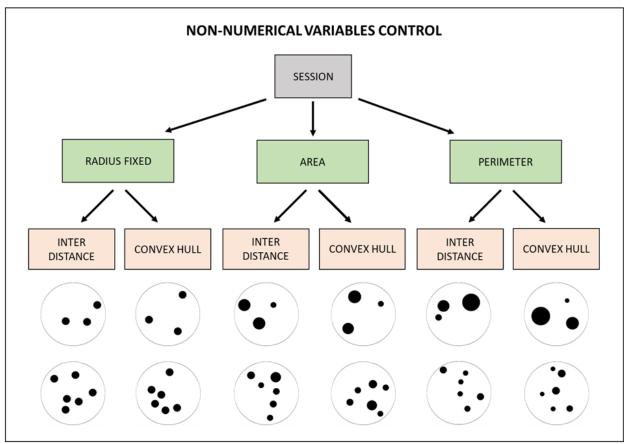


Figure 1. Schematic representation of the non-numerical physical controls applied to
 the stimuli in each session.

113 114

## 116 **RESULTS**

### 117 EXPERIMENT 1

Eight archerfish were trained to discriminate between two groups of black dots in a 3 *vs.* 6 numerical comparison; four fish were trained to select the number 3, while the other four were rewarded with the number 6. No difference has been found in the number of trials needed to reach the learning criterion between the group trained with 3 elements (mean±SEM= 451.25±106.77) and the group trained with 6 elements (mean±SEM= 413.25±73.14) (Independent Samples t-Test: t(6)=0.294, *p*=0.779).

124 Once the learning criterion was reached, all the fish performed three different tests.

TEST 1: This test was the main discriminator to understand whether at training fish 125 represented numerosity as relative or absolute. Fish trained to select the smallest 126 number 3 at training (i.e. the smallest set in the 3 vs. 6) were presented at test with a 127 novel discrimination 2 vs.3, while fish trained to select the number 6 at training (i.e., 128 largest set in the 3 vs. 6) were tested with a 6 vs. 9 condition. The use of "relative" 129 information (go for the smallest or largest) should lead the fish to choose the novel 130 numerosity at test, while the use of "absolute" information would reflect in the choice of 131 132 the stimulus with the same number of elements as at training.

TEST 2: The second test aimed to clarify the role of the incorrect (i.e., unrewarded) training stimulus and its relevance for the fish. When fish are trained to select the numerosity 3, thus avoiding number 6, once presented with the new comparison 6 *vs.* 9 (or *vice versa* 2 *vs.* 3, if trained to select 6), do they choose the group according to the relative information even if it coincides with the absolute numerosity to avoid at training?

TEST 3: In the last test, fish behaviour was observed in a comparison involving novel numerosities never experienced during the training, i.e., 5 vs. 8. This allowed observing whether zebrafish applied a relative representation (go for the "smallest" or "largest"), or if the choice was at the chance level, since no absolute numerical information experienced at training was present here.

144 Results at tests for Experiment 1 are reported in Figure 2. Choices for the relative numerosity were analyzed using a generalized linear mixed model fit by maximum 145 146 likelihood (Laplace Approximation), binomial GLMM with a logit link in R. Four fixed 147 effects (type of Training -3 or 6 dots-; type of Test -2 vs. 3, 5 vs. 8 and 6 vs. 9-; type of geometrical control -radius fixed, overall area controlled, overall perimeter controlled-: 148 type of spatial disposition control -inter-distance controlled; convex-hull controlled-) and 149 one random intercept effect (fish) were considered. Analysis on the random effect 150 showed not to affect the model and no significant differences were found between 151 effects of groups, nor group interactions (comparisons between different models 152 considering various effects and interactions reported always p> 0.05, suggesting to 153 adopt the simplest model described by the only choice with no contribution from any 154 155 effects). Only a trend for the contribution of the type of geometrical control was observed, driven by a non-significant difference between the "radius fixed" and "overall 156 area controlled" conditions (post-hoc non-parametric tests adjusted with Tukey method: 157 158 p = 0.063); within this trend, every single condition was statistically significant by chance level in the direction of the relative choice ("radius fixed": probability of success = 159 71.18%, p < 0.001; "overall area controlled": probability of success = 81.25%, p < 0.001; 160 161 "overall perimeter controlled": probability of success = 73.61%, p < 0.001).

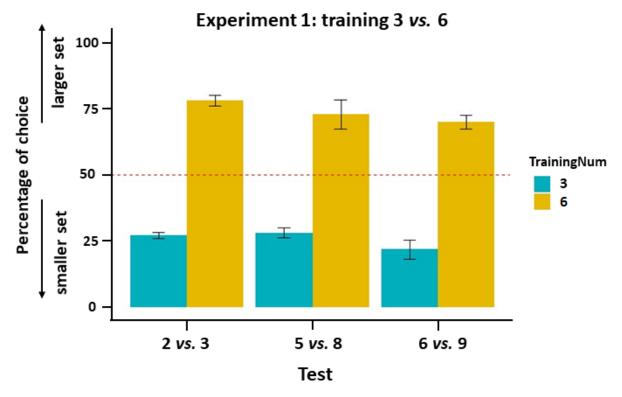


Figure 2. Percentage of choice for the larger/smaller set (mean ± SEM) displayed by
 fish in the novel comparison tests for the groups trained to select the smaller (3) or
 larger (6) set.

166

Overall, considering the previous discussion, a binomial test shrinking all the data together was performed to investigate the final findings: fish showed a strong significant preference for the relative numerosity (probability of success: 74.3%, p < 0.001).

The result obtained in Experiment 1 showed that archerfish, when trained to select one of two simultaneously displayed groups of dots with different numerosities (i.e., 3 *vs.* 6 dots), use a relative numerical rule to perform novel numerical comparisons. These results confirm findings in other fish species such as angelfish [55] and guppy [56] but they are different from those obtained in bees which showed instead a preference for the absolute number [57]. An important difference between fish and bees studies is related to the numerical comparison used: respectively large numbers (> 4

elements) for fish and small numbers ( $\leq 4$  elements) with bees. This might engage 177 different systems (see Introduction) thus explaining the discrepancy. The training 178 discrimination used here in Experiment 1 involved two numbers (3 vs. 6) that belong 179 one to the hypothesized "small" and the other to "large" systems, respectively. This is 180 different than in previous fish studies which involved only large numerosities; thus, it 181 182 remains to be tested how fish would deal when trained with small numerosities only. In principle, the presence of a large number in the comparison in Exp. 1 may be enough to 183 lead the archerfish to follow a relative rule. If trained with a numerical discrimination 184 involving only small numbers, would the animals still use a relative numerosity 185 judgement or would they turn to absolute judgement? This was tested in Experiment 2. 186

187

#### 188 EXPERIMENT 2

Four subjects were trained to select the largest number in a 2 *vs.* 3 comparison (i.e., the number 3). Fish judgment was then observed in two tests (i.e. 3 *vs.* 4 and 3 *vs.* 6) involving a comparison between the previously trained numerosity (3) and a novel numerosity (4 or 6).

All fish reached the learning criterion, showing an ability to discriminate between the two numbers (trials to criterion $\pm$ SEM= 506.5  $\pm$  97.8). Results at test are reported in Figure 3. A GLMM model with three fixed effects (type of test -3 *vs.* 4 and 3 *vs.* 6-; type of geometrical control -radius fixed, overall area controlled, overall perimeter controlled-; type of spatial disposition control -inter-distance controlled; convex-hull controlled-) and one random intercept effect (fish) showed no random effect of fish, neither significant differences between groups or groups' interactions (Chi-Square tests between all

different models with different effects and interactions report always p> 0.05, suggesting
to adopt the simplest model based on the only fish choice -for the relative or absolute
number- and no effects of controls).

An Exact binomial test considering a merge of the data showed a highly significant preference for the relative number (probability of success: 69.79%, p < 0.001).

In Experiment 2, archerfish showed to be able to discriminate between two 206 207 different numerical groups of dots within the small numerical range. At test, fish 208 preferred the novel numerosity to the familiar 3 items, in both 3 vs. 4 and 3 vs. 6 comparisons, confirming the use of a relative rather than absolute numerical rule. This 209 evidence does not match with findings in bees, tested in the same numerical conditions, 210 suggesting that the spontaneous engagement of relative/absolute rule to extract 211 numerical information may be guided by different ecological pressures experienced by 212 213 different species in their phylogenetic history. The spontaneous use of relative rules suggests that among fish, it is more important to learn a general rule that is applicable 214 to novel comparisons. It cannot be excluded that this strategy is adopted because it 215 216 could be less demanding as to memory load than an absolute judgement strategy.



218

Figure 3. Percentage of choice for the larger/smaller set (mean ± SEM) displayed by fish in the novel comparison tests for the group trained to select the larger (3) set.

222 Considering the results of Experiment 2 and Experiment 1, it is apparent that 223 archerfish can easily discriminate between small and large numerosity using the same 224 rules, providing evidence in favour of a unique system underlying numerical 225 discrimination as found in other fish species [26,58].

226

## 227 NUMEROSITY AND SPATIAL FREQUENCY

The stimuli used in our Experiments were visual collections of black dots differing in numerosity. As described in the method section, for each numerical comparison, the physical properties of each array were equalized for the geometry (radius, area and perimeter) and spatial disposition (inter-distance (density) and convex-hull; see Figure

1). Since we are dealing with images, each figure could also be described in terms of 232 spatial frequency. Spatial frequency can be thought of as the number of repeating 233 elements in a pattern per unit distance, and it is mathematically described by the Fourier 234 transform theory. No control was applied to the spatial frequency of our stimuli. Thus, in 235 order to check whether spatial frequency could influence archerfish choice, we 236 237 calculated spatial frequency variation across all different numerosities and control conditions (see Methods section). Within each numerical test comparison, different 238 spatial frequencies were found (see Figure 4). The different constraints applied to the 239 240 stimuli (control of the area, perimeter or elements radius) showed to influence differently the spatial frequency between the two numerosities. In detail, when the elements' radius 241 was fixed between the two numerical arrays, the total power of the spatial frequency 242 was higher in the smaller group than in the larger one, while the opposite was found in 243 the groups in which the overall perimeter was balanced (total power higher in the more 244 245 numerous group). Interestingly, this trend was maintained in all the numerical comparisons used, irrespective of the number of elements to be compared. 246

To investigate the influence of spatial frequency in the numerical task, we analyzed whether a correlation between the performance accuracy and the spatial frequency was apparent, for all possible control configurations (see Methods section). Results are reported in Figure 4, showing no correlations between any comparison (test 2 vs. 3: r(4) = -0.17, p=0.83; test 3 vs. 4: r(4)= 0.15, p=0.77; test 3 vs. 6: r(4)= -0.35, p=0.50; test 5 vs. 8: r(4)= -0.08, p=0.88; test 6 vs. 9: r(4)=-0.42, p=0.41.

253 These data strongly suggest that the spatial frequency was not influencing archerfish

254 performance in the numerical task.

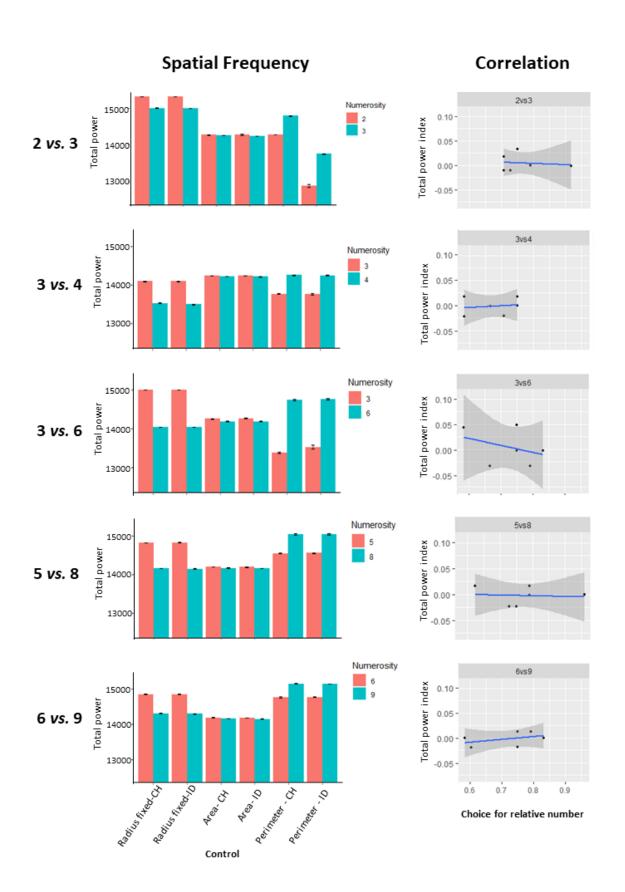


Figure 4. The histograms (on the left) show the spatial frequency (Total power) for each numerical comparison among the different control groups (non-numerical variables control). The different constraints applied to the stimuli (control of the area, perimeter or elements radius) showed to influence the spatial frequency between the two compared numerosities. The regression lines (on the right) show the correlation between fish' performance accuracy (choice for the relative numerosity) and the spatial frequency (total power index between the two total power values), for all numerical comparisons.

## 264 DISCUSSION

265

Overall, our results showed that when trained to select a specific group of elements between two numerical arrays, archerfish spontaneously generalize at test to novel numerical comparison according to a relative numerical rule (select the largest/smallest) rather than an absolute numerical rule (select the specific number of items). These findings are in agreement with previous results from other fish species and humans [55,56], while differing with respect to bees [57].

Interestingly, archerfish uses a general relative judgement even when trained to 272 discriminate between numerosities that belong to different systems, namely small and 273 large numerosities (for a review see [61]). In Experiment 1, archerfish were trained with 274 a 3 vs. 6 contrast and then observed in test conditions with a 2 vs. 3, 6 vs. 9 and 5 vs. 8 275 comparison. In all the tests, archerfish showed to spontaneously use a general relative 276 rule. In Experiment 2, subjects' performance was observed in a numerical discrimination 277 involving at training only small numerosities (i.e., 2 vs. 3). Once again, at test, fish 278 followed the relative rule, selecting the largest group in the test comparisons 3 vs. 4 and 279 3 vs. 6, thus ignoring the absolute number of elements (3). 280

Taken together, our results support the hypothesis of a unique system for representing numerosities in archerfish, working both for small and large numbers, obeying the ANS. Evidence from other fish species supports this claim [26,58].

The reason for which archerfish primarily rely on the relative information of 284 numerical groups may have ecological reasons, being more adaptive in a natural 285 286 environment that constantly require numerical/quantity judgement. Selecting the largest social group of companions or the largest food patch are easy rules that can be more 287 288 efficient than using an absolute rule. Moreover, the use of relative information may be 289 less cognitively expensive (in terms of memory load) than the absolute one, since it does not require storing the information about the precise number of elements: the 290 discrimination could work on a simple relative comparison between numerosities, 291 guided by the numerical ratio between the two. Nevertheless, the engagement of 292 relative rules requires a good level of abstraction and the creation of a general rule to be 293 294 applied to [62].

295 In fish, the use of an absolute rule may not be as convenient as the relative one, given that in most ecological contests there is not a specific optimal amount of food, 296 297 partners or companions. However, this seems not to be the case for species such as bees, which showed instead a spontaneous use of absolute numerical information, 298 299 suggesting that this rule may be more informative and useful in their ecological 300 environment. Similar evidence has been found in spiders, that, in a natural predatory strategy context, settle their attack based on the specific number of conspecifics at the 301 302 nest [29].

Note, however, that the spontaneous use of a relative or absolute rule does not imply that animals are unable to use both. Vertebrates can be trained to learn a specific number of items in a set if forced to do it [6,56,63,64]. Similarly, bees can be trained to the numerical concepts of "greater than" or "smaller than" [47]. The spontaneous engagement of one of the two criteria is therefore justified probably by a combination of natural constraints and/or less cognitive demand motivations that better fit for the individuals' fitness in their particular niches of adaptation.

Lastly, with respect to the main question of our paper, the results showed that 310 311 archerfish are capable of abstract numerical discrimination, not influenced by other continuous physical variables. We tested archerfish with numerical arrays well 312 controlled for all the possible non-numerical variables (e.g., total area, perimeter, inter-313 distance (density), convex hull), thus ensuring that the discrimination made by the 314 animals was based on purely numerical information. The results of the statistical 315 316 analyses showed no influence whatsoever of the different control conditions on the fish choices. Moreover, we showed that even the different spatial frequencies of the stimuli 317 were not influential on archerfish performance. The total power of the spatial frequency 318 319 has been described in the literature to positively increase with numerosity [48]; however, in our stimuli, the different geometrical constraints showed that it can be reversed as 320 321 well. Moreover, elements area and perimeter seem to play a crucial role in the 322 distribution of the spatial frequencies' energy with respect to the elements disposition (inter-distance and sparsity). All our analyses suggested that the amplitude component 323 324 of the spatial frequency was not influencing archerfish numerical evaluation during our 325 experiments.

Note, however, that in all studies carried out so far (including our own analysis), 326 the focus was on the amplitude of the spatial frequency as the main component, which 327 provides information on the alternation rate of different elements in the image. It is likely 328 that a more specific role on computation of numerosity is played by the spatial 329 330 frequency phase component (related to elements' spatial coherence and 331 distribution) which directly relates to figure-ground aggregation and unity formation.

In conclusion, our results provide clear evidence that under conditions of strict control of continuous physical variables archerfish can encode an abstract concept of number to support relative numerical judgement for both small and large numerosities.

# 335 MATERIALS AND METHODS

## 336 SUBJECTS AND REARING CONDITIONS

Sixteen adult archerfish, Toxotex jaculatrix (fish size ranged between 8 and 10 cm in 337 length) were provided by a local commercial supplier ("Acquario G di Segatta Stefano"). 338 339 Four animals were excluded because they did not show any consistent motivation in hitting the screen. A group of fish (N=8) took part in Experiment 1, while a second group 340 (N=4) took part in Experiment 2. All fish were housed in large aquariums (100 x 40 x 40 341 342 cm) in groups of 10 individuals. Prior to the experiment, each archerfish was moved into 343 individual aquaria (40 x 30 x 50 cm) filled with freshwater maintained at 25°C and enriched with gravel and a shelter. Water quality was kept by suitable filters (Sera fil 344 345 60). The system was illuminated under a 10:14 light /dark cycle (Sylvania luxline plus 346 F36W/840 cool white). Fish were fed with food pellets (Hikari cichlid gold baby pellet).

## 347 APPARATUS

Both the apparatus and the training method were set up based on previous studies 348 conducted with archerfish on visual discrimination tasks (i.e., [52,53]). Each 349 experimental tank consisted of a rectangular aquarium with a monitor screen located 350 above it (20", DELL 2009Wt), held at 30 cm from the water level (Figure 5a). Each tank 351 was surrounded by white opaque panels to ensure that the fish was not distracted by 352 external cues. Each tank was raised 8 cm off the table thanks to lateral supports, 353 354 allowing the positioning of a video camera under the centre of the pavement's tank to record a bottom view of the fish and the screen (see video example in the 355 supplementary materials). 356

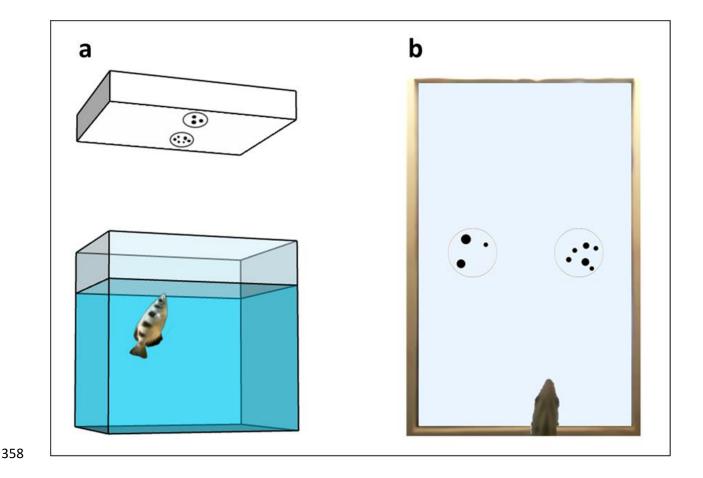


Figure 5. a) Schematic representation of the experimental setup; b) Bottom view of the tank from the camera placed below the tank's pavement.

361

362 STIMULI

The stimuli presented in the training phase consisted of groups of black dots confined 363 into a black outline circle (6 cm diameter). The dots size was ranging between 3 and 12 364 mm, and the visual angle was in the range 0.43° and 1.72°, which has been proven to 365 be well perceived by archerfish [54]. In every trial, a couple of stimuli was 366 simultaneously presented in the centre of the screen (horizontally aligned to the shortest 367 monitor's side, see Figure 5b). All the stimuli were created using the software GeNEsIS 368 [49], a Matlab program that allows to create numerical collections of stimuli controlled 369 for several non-numerical magnitudes. Given that it is mathematically impossible to 370 balance all the non-numerical magnitudes simultaneously in two different numerical 371 groups, different sets of stimuli were created for each numerosity, controlling for some 372 373 visual physical property; all the possible properties were covered across the different sets during a session (see Figure 1 for a view of all the combinations applied in a 374 session). Pictures from each set were randomly presented, making the numerical 375 376 information the only reliable cue to differentiate the two stimuli across all the various trials. 377

### 378 GENERAL PROCEDURE

379 Pre-training phase

Before starting the experiment, fish underwent a pre-training phase in which they were gradually habituated to spit (hit with a jet of water) at the training stimulus on the screen. This was accomplished throughout a shaping procedure to facilitate the task. The

silhouette of an insect was initially presented, inducing the fish reaction to spit at the
prey; once hit, fish were rewarded with a food pellet. The insect was gradually replaced
by a black dot and finally with the effective training stimulus. Once the fish
accomplished all these stages, the training phase was initiated.

387 Training phase

Fish were trained to spit at the correct target presented on the monitor above the tank. 388 The stimuli to discriminate consisted of two groups of dots with different numerosity. 389 Every trial started with the appearance of a blinking black square (1.6 cm, three blinks 390 of 100 milliseconds) at the centre of the screen to catch the fish's attention towards the 391 screen. Then, the two training stimuli were displayed one next to the other (distance 7 392 393 cm) on the two sides of the monitor. Only one of the two numerosities was rewarded with a food pellet when hit, while the choice for the incorrect stimulus caused the stop of 394 the trial, which in every case, in absence of choice, was stopped after 5 minutes. At the 395 396 end of each trial, the screen was cleaned from the water drops and a new trial started. In the first training session only, a corrective method was applied: the stimuli remained 397

398 on the screen until the subject selected the correct target, even if the incorrect stimulus 399 was hit, allowing the fish to correct its choice.

Fish were trained with daily sessions of 48 trials, in which continuous physical variables were controlled and changed according to the scheme reported in Figure 1, and the position of the target stimulus on the screen (right-left) was randomized. Fish generally responded 70% to 100% of the trials. The learning phase was considered completed when the fish reached a learning criterion of at least 75% of correct choices

for two consecutive days (binomial test: p < 0.01), allowing the fish to take part in the test phase.

407

### 408 Test phase

Generally, each test condition consisted of the presentation of a couple of stimuli with a 409 novel numerical comparison, aiming to see if the numerosity target learned in the 410 training phase was represented as a relative or an absolute numerical information. Each 411 412 test was composed of 24 probe trials not rewarded, divided into three testing days of 8 trials. In each test session, the 8 test trials were shuffled and interspersed with 413 rewarded recall training trials (32 recall in total), to maintain the fish motivation high 414 415 during the whole test duration. The order of the tests was randomized among the fish to exclude that the performance could be influenced by their order. At the end of each test, 416 the fish underwent a complete daily session of retraining to further exclude potential 417 interference among the tests. 418

### 419 Statistical analyses and data analysis

Data were analyzed using R software (R-4.1.0). In Experiment 1, an independent t-test was used to compare the number of trials to reach the criterion between the two groups at training. At test (Exps. 1 and 2), choices for the relative numerosity were analyzed using a generalized linear mixed model fit by maximum likelihood (Laplace Approximation), binomial GLMM with a logit link. A binomial test was used to compare the distribution of the choices for the relative and absolute numerosities.

To obtain an estimate of the spatial frequency we adopted an approach already performed in other studies [48,59,60]: the fast Fourier transform of our images was

calculated, a radial average of the signal amplitude in the frequency domain was
performed, and lastly, all the frequency contributions of its power spectrum were
summed up. In this way, a value related to the total energy of each frequency
component inside a given image is obtained.

To investigate the influence of spatial frequency in the numerical task, we analyzed 432 433 whether a correlation between the performance accuracy (choice for the relative numerosity) and the spatial frequency (normalized total power difference between the 434 two compared numerosities) was apparent, for all possible control configurations. To 435 436 compare two numerosities we reported a normalized difference (total power index) between the two total power values (difference between the total power of the biggest 437 numerosity and the smallest, divided by their sum). All the frequency calculations were 438 performed with a custom script in Matlab, while the statistical comparisons were 439 calculated in R. For each of them a Pearson's correlation coefficient was calculated 440 441 comparing the choice for the relative numerosity and the normalized difference between numerosities (as explained above). 442

# 444 Ethical regulation

The present research was carried out at the Animal Cognition and Neuroscience Laboratory (ACN Lab) of the CIMeC (Center for Mind/Brain Sciences), at the University of Trento (Italy). All husbandry and experimental procedures complied with European Legislation for the Protection of Animals used for Scientific Purposes (Directive 2010/63/EU) and were approved by the Scientific Committee on Animal Health and Animal Welfare (Organismo Preposto al Benessere Animale, OPBA) of the University of Trento and by the Italian Ministry of Health (Protocol n. 932/2020-PR).

## 452 **Competing interests**

453 We declare we have no competing interests.

# 454 Funding

- 455 This project has received funding from the European Research Council (ERC) under the
- 456 European Union's Horizon 2020 research and innovation program (grant agreement No
- 457 833504 SPANUMBRA to G.V.) and Progetti di Rilevante Interesse Nazionale (PRIN
- 458 2017 ERC-SH4–A 2017PSRHPZ to G.V.)
- 459 Authors' contribution

D.P. and G.V conceived the study. D.P. G.V and M.Z. designed the experiment. D.P.
 performed the experiments. All authors interpreted the data and contributed to the
 manuscript writing.

# 464 **BIBLIOGRAPHY**

Nieder A. 2020 The Adaptive Value of Numerical Competence. *Trends Ecol. Evol.* 35, 605–617. (doi:10.1016/j.tree.2020.02.009)

- 467 2. Agrillo C, Bisazza A. 2014 Spontaneous versus trained numerical abilities. A
  468 comparison between the two main tools to study numerical competence in non469 human animals. *J. Neurosci. Methods* 234, 82–91.
  470 (doi:10.1016/j.jneumeth.2014.04.027)
- Anderson US, Stoinski TS, Marr MJ, Smith AD, Bloomsmith MA, Maple TL. 2005
  Relative numerousness judgment and summation in young and old Western
  lowland gorillas. *J. Comp. Psychol.* **119**, 285–295. (doi:10.1037/07357036.119.3.285)
- 475 4. Beran MJ, Evans TA, Leighty KA, Harris EH, Rice D. 2008 Summation and
  476 quantity judgments of sequentially presented sets by capuchin monkeys (Cebus
  477 apella). Am. J. Primatol. **70**, 191–194. (doi:10.1002/ajp.20474)
- 478 5. Beran MJ, Beran MM. 2004 Chimpanzees Remember the Results of One-by-One
  479 Addition of Food Items to Sets Over Extended Time Periods. *Psychol. Sci.* 15,
  480 94–99. (doi:10.1111/j.0963-7214.2004.01502004.x)
- 481 6. Cantlon JF, Brannon EM. 2007 How much does number matter to a monkey
  482 (Macaca mulatta)? *J. Exp. Psychol. Anim. Behav. Process.* 33, 32–41.
  483 (doi:10.1037/0097-7403.33.1.32)
- 484
  7. Smith BR, Piel AK, Candland DK. 2003 Numerity of a Socially Housed
  485 Hamadryas Baboon (Papio hamadryas) and a Socially Housed Squirrel Monkey
  486 (Saimiri sciureus). *J. Comp. Psychol.* **117**, 217–225. (doi:10.1037/0735487 7036.117.2.217)
- Abramson JZ, Hernández-Lloreda V, Call J, Colmenares F. 2013 Relative
  quantity judgments in the beluga whale (Delphinapterus leucas) and the
  bottlenose dolphin (Tursiops truncatus). *Behav. Processes* 96, 11–19.
  (doi:10.1016/j.beproc.2013.02.006)
- Benson-Amram S, Heinen VK, Dryer SL, Holekamp KE. 2011 Numerical
  assessment and individual call discrimination by wild spotted hyaenas, Crocuta
  crocuta. Anim. Behav. 82, 743–752. (doi:10.1016/j.anbehav.2011.07.004)
- McComb K, Packer C, Pusey A. 1994 Roaring and numerical assessment in
  contests between groups of female lions, Panthera leo. *Anim. Behav.* 47, 379– 387. (doi:10.1006/anbe.1994.1052)
- Perdue BM, Talbot CF, Stone AM, Beran MJ. 2012 Putting the elephant back in
   the herd: Elephant relative quantity judgments match those of other species.

500 Anim. Cogn. **15**, 955–961. (doi:10.1007/s10071-012-0521-y)

- Vonk J, Beran MJ. 2012 Bears 'count' too: Quantity estimation and comparison in
  black bears, Ursus americanus. *Anim. Behav.* 84, 231–238.
  (doi:10.1016/j.anbehav.2012.05.001)
- 504
   13.
   West RE, Young RJ. 2002 Do domestic dogs show any evidence of being able to count? Anim. Cogn. 5, 183–186. (doi:10.1007/s10071-002-0140-0)
- Bogale BA, Aoyama M, Sugita S. 2014 Spontaneous discrimination of food
  quantities in the jungle crow, Corvus macrorhynchos. *Anim. Behav.* 94, 73–78.
  (doi:10.1016/j.anbehav.2014.05.012)
- 509 15. Ditz HM, Nieder A. 2016 Numerosity representations in crows obey the Weber-510 Fechner law. *Proc. R. Soc. B Biol. Sci.* **283**. (doi:10.1098/rspb.2016.0083)
- 511 16. Garland A, Low J, Burns KC. 2012 Large quantity discrimination by North Island
  512 robins (Petroica longipes). *Anim. Cogn.* 15, 1129–1140. (doi:10.1007/s10071513 012-0537-3)
- 17. Pepperberg IM. 2006 Grey parrot (Psittacus erithacus) numerical abilities:
  Addition and further experiments on a zero-like concept. *J. Comp. Psychol.* 120,
  1–11. (doi:10.1037/0735-7036.120.1.1)
- 18. Rugani R, Vallortigara G, Regolin L. 2013 Numerical Abstraction in Young
  Domestic Chicks (Gallus gallus). *PLoS One* 8, 4–9.
  (doi:10.1371/journal.pone.0065262)
- Scarf D, Colombo M. 2011 Knowledge of the Ordinal Position of List Items in
  Pigeons. J. Exp. Psychol. Anim. Behav. Process. 37, 483–487.
  (doi:10.1037/a0023695)
- 523 20. Krusche P, Uller C, Dicke U. 2010 Quantity discrimination in salamanders. *J. Exp.* 524 *Biol.* 213, 1822–1828. (doi:10.1242/jeb.039297)
- Stancher G, Rugani R, Regolin L, Vallortigara G. 2015 Numerical discrimination
  by frogs (Bombina orientalis). *Anim. Cogn.* 18, 219–229. (doi:10.1007/s10071014-0791-7)
- 528 22. Gazzola A, Vallortigara G, Pellitteri-Rosa D. 2018 Continuous and discrete
  529 quantity discrimination in tortoises. *Biol. Lett.* 14, 1–4.
  530 (doi:10.1098/rsbl.2018.0649)
- Petrazzini MEM, Bertolucci C, Foà A. 2018 Quantity discrimination in Trained
  lizards (Podarcis sicula). *Front. Psychol.* 9, 1–6. (doi:10.3389/fpsyg.2018.00274)
- 533 24. Gómez-Laplaza LM, Díaz-Sotelo E, Gerlai R. 2018 Quantity discrimination in 534 angelfish, Pterophyllum scalare: a novel approach with food as the discriminant.

535 Anim. Behav. **142**, 19–30. (doi:10.1016/j.anbehav.2018.06.001)

- Potrich D, Rugani R, Sovrano VA, Regolin L, Vallortigara G. 2019 Use of
  numerical and spatial information in ordinal counting by zebrafish. *Sci. Rep.*9:18323. (doi:10.1038/s41598-019-54740-8)
- Stancher G, Sovrano VA, Potrich D, Vallortigara G. 2013 Discrimination of small
  quantities by fish (redtail splitfin, Xenotoca eiseni). *Anim. Cogn.* 16, 307–312.
  (doi:10.1007/s10071-012-0590-y)
- 542 27. Dacke M, Srinivasan M V. 2008 Evidence for counting in insects. *Anim. Cogn.* 11, 683–689. (doi:10.1007/s10071-008-0159-y)
- 544 28. Gross HJ, Pahl M, Si A, Zhu H, Tautz J, Zhang S. 2009 Number-based visual
  545 generalisation in the honeybee. *PLoS One* 4, e4263.
  546 (doi:10.1371/journal.pone.0004263)
- Nelson XJ, Jackson RR. 2012 The role of numerical competence in a specialized
  predatory strategy of an araneophagic spider. *Anim. Cogn.* 15, 699–710.
  (doi:10.1007/s10071-012-0498-6)
- 30. Rodríguez RL, Briceño RD, Briceño-Aguilar E, Höbel G. 2015 Nephila clavipes
  spiders (Araneae: Nephilidae) keep track of captured prey counts: testing for a
  sense of numerosity in an orb-weaver. *Anim. Cogn.* 18, 307–314.
  (doi:10.1007/s10071-014-0801-9)
- Vallortigara G. 2017 An animal's sense of number. In *The nature and development of mathematics. Cross disciplinary perspective on cognition, learning and culture* (ed A Adams, J. W., Barmby, P. & Mesoudi), pp. 43–65.
  Routledge, New York.
- Bortot M, Regolin L, Vallortigara G. 2021 A sense of number in invertebrates. *Biochem. Biophys. Res. Commun.* 564, 37–42. (doi:10.1016/j.bbrc.2020.11.039)
- 560 33. Butterworth Brian. 1999 *The mathematical brain*. Macmillan. London.
- 34. Nieder A, Dehaene S. 2009 Representation of number in the brain. *Annu. Rev. Neurosci.* 32, 185–208. (doi:10.1146/annurev.neuro.051508.135550)
- Trick LM, Pylyshyn ZW. 1994 Why are small and large numbers enumerated
  differently? A limited-capacity preattentive stage in vision. *Psychol. Rev.* 101, 80–
  (doi:10.1037/0033-295X.101.1.80)
- 36. Vallortigara G. 2014 Foundations of number and space representations in
  precocial species. In *Evolutionary origins and early development of number processing* (ed K Geary, D. C., Bearch, D. B. & Mann Koepke), pp. 35–66. New
  York: Elsevier.

Kutter EF, Bostroem J, Elger CE, Mormann F, Nieder A. 2018 Single Neurons in
the Human Brain Encode Numbers. *Neuron* 100, 753-761.e4.
(doi:10.1016/j.neuron.2018.08.036)

- 38. Piazza M, Izard V, Pinel P, Le Bihan D, Dehaene S. 2004 Tuning curves for
  approximate numerosity in the human intraparietal sulcus. *Neuron* 44, 547–555.
  (doi:10.1016/j.neuron.2004.10.014)
- Nieder A, Freedman DJ, Miller EK. 2002 Representation of the quantity of visual items in the primate prefrontal cortex. *Science* 297, 1708–1711.
  (doi:10.1126/science.1072493)
- 579 40. Nieder A, Merten K. 2007 A labeled-line code for small and large numerosities in
  580 the monkey prefrontal cortex. *J. Neurosci.* 27, 5986–5993.
  581 (doi:10.1523/JNEUROSCI.1056-07.2007)
- 582 41. Ditz HM, Nieder A. 2015 Neurons selective to the number of visual items in the
  583 corvid songbird endbrain. *Proc. Natl. Acad. Sci. U. S. A.* **112**, 7827–7832.
  584 (doi:10.1073/pnas.1504245112)
- Messina A, Potrich D, Schiona I, Sovrano VA, Fraser SE, Brennan CH,
  Vallortigara G. 2020 Response to change in the number of visual stimuli in
  zebrafish: A behavioural and molecular study. *Sci. Rep.* 10:5769.
  (doi:10.1038/s41598-020-62608-5)
- 43. Messina A, Potrich D, Schiona I, Sovrano VA, Fraser SE, Brennan CH,
  Vallortigara G. 2021 Neurons in the Dorso-Central Division of Zebrafish Pallium
  Respond to Change in Visual Numerosity. *Cereb. Cortex* 00, 1–11.
  (doi:10.1093/cercor/bhab218)
- 593 44. Nieder A. 2021 The Evolutionary History of Brains for Numbers. *Trends Cogn.* 594 *Sci.* 25, 608–621. (doi:10.1016/j.tics.2021.03.012)
- 595 45. Vallortigara G. 2021 *Born Knowing: Imprinting and the Origins of Knowledge*. 596 Cambridge, Ma: MIT PRESS.
- Leibovich T, Katzin N, Harel M, Henik A. 2017 From 'sense of number' to 'sense of magnitude': The role of continuous magnitudes in numerical cognition. *Behav. Brain Sci.* 40. (doi:10.1017/S0140525X16000960)
- 47. Howard SR, Avarguès-Weber A, Garcia JE, Greentree AD, Dyer AG. 2018
  Numerical ordering of zero in honey bees. *Science* 360, 1124–1126.
  (doi:10.1126/science.aar4975)
- 48. Maboudi H Di *et al.* 2021 Non-numerical strategies used by bees to solve
  numerical cognition tasks. *Proc. R. Soc. B Biol. Sci.* 288, 20202711.
  (doi:10.1098/rspb.2020.2711)

- 49. Zanon M, Potrich D, Bortot M, Vallortigara G. 2021 Towards a standardization of
   non-symbolic numerical experiments: GeNEsIS, a flexible and user-friendly tool to
   generate controlled stimuli. *Behav. Res. Methods* (doi:10.3758/s13428-021 01580-y)
- 50. Newport C, Schuster S. 2020 Archerfish vision: Visual challenges faced by a
  predator with a unique hunting technique. *Semin. Cell Dev. Biol.* 106, 53–60.
  (doi:10.1016/j.semcdb.2020.05.017)
- 51. Leibovich-Raveh T, Raveh A, Vilker D, Gabay S. 2021 Magnitude integration in
   the Archerfish. *Sci. Rep.* **11**, 1–11. (doi:10.1038/s41598-021-94956-1)
- Karoubi N, Leibovich T, Segev R. 2017 Symbol-value association and discrimination in the archerfish. *PLoS One* **12**, 1–16.
  (doi:10.1371/journal.pone.0174044)
- 53. Newport C, Wallis G, Temple SE, Siebeck UE. 2013 Complex, context-dependent
  decision strategies of archerfish, Toxotes chatareus. *Anim. Behav.* 86, 1265–
  1274. (doi:10.1016/j.anbehav.2013.09.031)
- 54. Ben-Simon A, Ben-Shahar O, Vasserman G, Ben-Tov M, Segev R. 2012 Visual acuity in the archerfish: Behavior, anatomy, and neurophysiology. *J. Vis.* 12, 1–
  623 19. (doi:10.1167/12.12.18)
- Miletto Petrazzini ME, Agrillo C, Izard V, Bisazza A. 2016 Do humans (Homo sapiens) and fish (Pterophyllum scalare) make similar numerosity judgments. *J. Comp. Psychol.* 130, 380–390. (doi:10.1037/com0000045)
- Miletto Petrazzini ME, Agrillo C, Izard V, Bisazza A. 2015 Relative versus
  absolute numerical representation in fish: Can guppies represent "fourness"? *Anim. Cogn.* 18, 1007–1017. (doi:10.1007/s10071-015-0868-y)
- 57. Bortot M, Agrillo C, Avarguès-Weber A, Bisazza A, Petrazzini MEM, Giurfa M.
  2019 Honeybees use absolute rather than relative numerosity in number
  discrimination. *Biol. Lett.* **15**, 5–9. (doi:10.1098/rsbl.2019.0138)
- 58. Potrich D, Sovrano VA, Stancher G, Vallortigara G. 2015 Quantity discrimination
  by zebrafish (Danio rerio). *J. Comp. Psychol.* **129**, 388–393.
  (doi:10.1037/com0000012)
- Adriano A, Girelli L, Rinaldi L. 2021 The ratio effect in visual numerosity
  comparisons is preserved despite spatial frequency equalisation. *Vision Res.* 183, 41–52. (doi:10.1016/j.visres.2021.01.011)
- 60. Felisatti A, Laubrock J, Shaki S, Fischer MH. 2020 A biological foundation for
  spatial-numerical associations: the brain's asymmetric frequency tuning. *Ann. N. Y. Acad. Sci.* 1477, 44–53. (doi:10.1111/nyas.14418)

- 61. Hyde DC. 2011 Two systems of non-symbolic numerical cognition. *Front. Hum. Neurosci.* 5, 1–8. (doi:10.3389/fnhum.2011.00150)
- 644
  62. Pepperberg IM, Brezinsky M V. 1991 Acquisition of a relative class concept by an
  African gray parrot (Psittacus erithacus): discriminations based on relative size. *J.*646
  646
  647
  648
  648
  649
  649
  649
  640
  640
  640
  640
  640
  640
  640
  640
  640
  641
  641
  642
  642
  644
  644
  644
  644
  644
  645
  645
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
  646
- 647 63. Pepperberg IM. 1994 Numerical competence in an African gray parrot (Psittacus 648 erithacus). *J. Comp. Psychol.* **108**, 36–44. (doi:10.1037/0735-7036.108.1.36)
- 649 64. Smirnova AA, Lazareva OF, Zorina ZA. 2000 Use of Number By Crows:
- Investigation By Matching and Oddity Learning. J. Exp. Anal. Behav. 73, 163–
- 651 176. (doi:10.1901/jeab.2000.73-163)