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1	Bumblebee visual learning: simple solutions for complex stimuli
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13	Highlights:
14	Bumblebees are highly efficient in prioritising the most consistent elements in
15	multicomponent visual stimuli.
16	• Bees trained on horizontal and vertical cues exhibit differences in how they
17	memorise visual cues.
18	• Two phenomena can explain how bees preferentially select, memorise and use
19	visual cues in this experiment: generalisation and overshadowing.
20	Bumblebees as generalist foragers are well-suited to study visual cognition.
21	
22	Keywords: discrimination, generalisation, overshadowing, salient cues, visual
23	learning.
24	
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27 Abstract

Natural visual stimuli are typically complex. This presents animals with the challenge 28 29 of learning the most informative aspects of these stimuli while not being confused by 30 variable elements. How animals might do this remains unclear. Here, we tested bumblebees' ability to learn multicomponent visual stimuli composed of a simple 31 32 constant bar element and a grating element that was consistent in orientation but varied in width and number of gratings. Bees rapidly and successfully learned these 33 34 compound stimuli. Tests revealed learning of the single bar element was more robust than learning of the grating element. Our study highlights how even small-brained 35 invertebrates can rapidly learn multicomponent stimuli and prioritise the most 36 37 consistent elements within them. We discuss how the learning phenomena of 38 generalisation and overshadowing may be sufficient to explain these findings, and caution that complex cognitive concepts are not necessary to explain the learning of 39 40 complex stimuli.

41

42 Introduction

43 Natural stimuli are rarely simple. Flowers, for instance, are multimodal stimuli, and 44 even within just the visual domain flowers vary in colour, size, structure, and 45 luminance. In this study, we challenged bumblebees in a learning assay with 46 multicomponent visual stimuli to explore how bees learn complex stimuli.

For this work, we adopted a definition of visual complexity from computer vision where
complexity encompasses order (repetition and redundancy), variety (Tatarkiewicz
1972, Tsotsos 1990, Simoncelli et al. 2001), compactness, as well as the numbers of

50 lines and edges of varied orientations, and open and closed figures in an image 51 (Biederman 1987, García, Badre et al. 1994, Mirmehdi, Palmer et al. 1999). Complex images typically contain a greater number of edges and less predictable distribution 52 53 of edges across the images, whereas simple images contain redundant and predictable data and are, therefore more compressible (Tatarkiewicz 1972, Tsotsos 54 1990). Both humans and computer learning algorithms recognize simple elements 55 56 present within complex images to facilitate visual learning (Rahardja 1996, Biederman 198, Szeliski 2022), but it is less clear how animals might learn complex visual stimuli. 57

For this guestion, the bee is an excellent model as a very good visual learner, they 58 59 can rapidly learn associations between visual stimuli and punishment or reward (Avargues-Weber et al. 2011, Guiraud et al. 2022). They excel in object recognition 60 and have the capacity to generalize what has been learnt to similar stimuli thereby 61 62 creating categories of objects (Gould 1985, Hateren, Srinivasan et al. 1990, Horridge 2000, Srinivasan 2010, Avargues-Weber, Deisig et al. 2011). In the visual domain, 63 bees can learn to discriminate items very rapidly, even recognise human faces (Dyer, 64 Neumeyer et al. 2005) and prefer global visual cues over local visual cues (Avargues-65 Weber et al. 2015). Moreover, bees have been shown to recognise classes of objects 66 67 by shared "abstract" properties like relative position (above / below for instance: 68 Avargues-Weber et al. 2011, Guiraud et al. 2018) or relative size (Avargues-Weber et al. 2014). 69

Prior studies have suggested that when learning complex visual stimuli bees selectively attend to discrete aspects of visual information and ignore irrelevant perceivable surrounding information (Spaethe, Tautz et al. 2006). For example, bees can select a rewarding configuration of oriented bars over a variable, distractor pattern

74 with the same orientation (Stach and Giurfa 2005). This suggests that bees have an ability to focus on the most salient visual cue present during training. Moreover, the 75 length of training appears to modulate this attention (Stach and Giurfa 2005). 76 77 Presently, we do not know what cognitive abilities might allow bees to selectively attend to the most salient part of a complex stimulus. To explore this issue, we tested 78 bumblebees' learning of visual stimuli that contained two elements. One element was 79 80 simple and constant (either a vertical or horizontal bar). One was more complex and variable (gratings of constant orientation but variable sizes, number of bars and 81 82 widths). During tests, we examined what elements of these complex stimuli had been learned by the bees, and how well they might generalise the learned stimuli. 83

84

85 Material and methods

Forty-one bumblebees (Bombus terrestris audax) from nine commercially available 86 87 colonies (Agralan Ltd., Swindon, UK) were trained and tested. Each colony was 88 maintained in a wooden nest box (28 cm L× 16 cm W × 11 cm H). This was connected to a Perspex tunnel (1.5 cm² and 20 cm long) leading to a flight arena (60 cm l × 60 cm 89 90 $L \times 40$ cm H), in which workers could freely forage for 30% sucrose solution (w/w) during non-training periods. Pollen was provided to the colony every two days. The 91 92 arena was covered by ultraviolet-transparent Plexiglas. The walls of the flight arena were covered with a laminated pink and white Gaussian random dot pattern to provide 93 optic flow for the bees and contrast for video recording. High-frequency fluorescent 94 lighting mimicking natural light (containing both UV and the full spectrum of visible 95 light: TMS 24F lamps with HF-B 236 TLD ballasts, Phillips, Netherland; fitted with 96 Activa daylight fluorescent tubes, Osram, Germany) illuminated the arena (Fig. 1). 97

During training, one individual worker could forage from eight feeding stations. The feedings stations were transparent concave Perspex cubes (1,5 cm2 and 0.8 cm high with a hole \emptyset =0.6cm, depth 0.3cm; see Fig. 1). They were positioned vertically (using blue tack) onto the experimental wall presenting the visual stimuli. Each feeding station delivered 15 µl 50% sucrose solution (w/w). The small volume of sugar solution (15 µL) delivered by each feeding station was well under the crop capacity of bumblebee, which encouraged the bee to visit multiple feeders in a foraging trip.

During pre-training, the selected worker would be familiarised with drinking from all the feeding stations. Workers successfully using the feeders were marked with coloured number tags (Opalithplättchen, Warnholz & Bienenvoigt, Ellerau, Germany).



Figure 1. Flight arena. The back if the arena displays eight stimuli with a feeding
station. Half of the stimuli (CS+) provided sucrose solution and the other half (CS-)
provided quinine solution (aversive). Positions and stimuli varied between trials.

112

113 Visual stimuli

114 Visual stimuli (Fig. 1) were printed using a high-resolution colour laser printer. Stimuli were covered with transparent film, allowing them to be cleaned with 70% ethanol after 115 every trial to remove odours and pheromones potentially left by bees. The background 116 of all stimuli was always a blue (RGB colour 0,0,255) 8.5 cm diameter circle on which 117 was printed a red (RGB colour 255,0,0) design. Each stimulus contained multiple 118 elements; therefore, more than one element was associated with the CS+ during 119 training. One half of the stimulus was either a vertical or horizonal bar (width: 12.0 mm, 120 121 length 35.0 mm, see Fig. 1). The other half of the stimulus was a grating oriented at 122 either +45° or -45°. The grating widths varied from 7.0 mm to 57.0 mm and extended 123 from the vertical centre of the circle to its outer perimeter. These visual cues were randomly selected patterns generated by MATLAB. (version 2015b; The MathWorks, 124 125 Inc., Natick, MA, USA), from a set where the number, size and spacing of the bars varied (Supplementary Fig. S1). In total, 15 versions of each of the 'vertical' and 126 127 'horizontal' stimuli were created (Fig. S1). During training, both the orientation of the bar (vertical or horizontal) and the orientation of the gratings (+ or - 45) were reliably 128 129 associated with the CS+.

Four stimulus groups were defined for training based on the rewarding stimuli used
(Fig. 2). The H1 group (10 bees) had for CS+ stimulus a horizontal bar on the left and

132 -45° gratings on the right. The H2 group (10 bees) was the mirror image of this (a horizontal bar on the right and 45° gratings on the left). The V1 group consisted of 11 133 bees with the CS+ stimulus a vertical bar on the left and -45° gratings on the right. For 134 135 the V2 group (10 bees), the CS+ was the mirror image of V1. In each group, the CSwas the opposite of the CS+ (Fig. 2). Comparing the four groups allowed us to test if 136 placement of elements within the stimuli influenced the results. CS+ was associated 137 138 with 15 µl 50% sucrose solution (w/w), while CS- was presented with saturated quinine hemisulfate solution (15 µl). 139

For the tests, three other types of stimuli were produced (Supplementary Fig. S1). In 140 141 the Conflict test, for each group the test stimuli swapped the orientation of gratings between the CS+ and CS- so that the presented stimuli now contained elements of 142 both CS+ and CS- (Fig. 3). Half pattern tests presented stimuli that only contained 143 144 some of the elements or the complex stimuli: only bars or only gratings appearing on the blue background (Fig. 3). Of the eight stimuli presented to bees in the test, bees 145 were presented with two stimuli with only a horizontal bar, two stimuli with only the 146 vertical bar, two stimuli with +45° gratings and two stimuli with -45° gratings. This 147 tested which elements of the compound stimuli had been learned and were most 148 149 preferred by trained bees. For the generalisation test, the same pattern configurations as in the training stimuli groups was used, except the horizontal ('H1', 'H2') or vertical 150 ('V1', 'V2') bars were replaced with two parallel bars (the original one: width: 12 mm, 151 152 length 35 mm; and the second with width 5 mm to 8 mm, length 35 mm, with a 11 mm separation) centred within the respective pattern halves (Fig. 4). This tested whether 153 bees could generalise learning a complex stimulus to a similar stimulus. There were 154 155 eight stimuli shown in each test.

157 Training and tests

Pre-training encouraged the bee to visit each of the feeder locations. For this, all the
stimuli were plain blue disks and all of them provided 15µl of 50% sucrose solution
(w/w).

161 After pre-training, the flight arena was emptied of the bees and thoroughly cleaned with 70% ethanol to remove potential olfactory cues. A selected bee was assigned to 162 one of the four stimulus groups (H1, H2, V1, V2). In each trial, four of the fifteen 163 available pattern variations, for each stimulus group, were pseudo-randomly selected. 164 Each pattern did not appear more than once in consecutive bouts. Eight stimuli were 165 166 shown in each trail: four CS+ and four CS-. These were pseudo-randomly placed on the presentation wall to prevent the bees establishing location biases (Fig. 1). CS+ 167 168 stimuli were replenished with sucrose solution once the bee had landed on all 169 rewarding feeders.

170 In each trial, a choice was considered as each landing a bee made on the feeding stations in the trial. The number of choices usually varied between 8 and 12 before the 171 172 bee went back to the nest. For consistency, and only for the training trials (Fig. 2A), we plotted the bee choices by blocks of 10 choices. The training phase ended when a 173 174 bee exhibited > 80% CS+ choices in the last twenty choices. Due to the nature of this 175 threshold the number of training trials and choices varied between 90 and 180 choices made, with on average 140 choices made before a bee reached the threshold. 176 177 Individual bee training took between 4 and 8 hours to be completed. Three 178 bumblebees failed to complete the training phase (they did not return to the flight arena during the training period) and are not included in these data. For all tests, all choicesare accounted for during a period of 2 minutes.

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182 Following the last training trial, the non-rewarded tests began. During tests, all stimuli 183 offered only 15 µl distilled water. Both the place of stimuli and the sequence of tests 184 were randomized between bees. Bees were exposed to refreshment trials in between 185 tests using the reinforced training stimuli and their performance was assessed. Bees 186 progressed to the next test once they achieved > 80% correct choices over 20 187 consecutive choices. We gave each bee four tests. (1) a learning test with novel stimuli (with similar configurations as the training patterns); (2) a conflict test with conflicting 188 189 stimuli; (3) half-pattern test presented only one side of the patterns, single bar or gratings alone, was presented to bees, from both the rewarding (CS+ 1 and CS+ 2) 190 and aversive pattern stimuli (CS-1 and CS-2). Finally, (4) a generalisation test 191 consisted of similar pattern configurations of that used during training. 192

193

194 Data analysis

Data from the training trials were analysed using a logistic regression *via* a Generalised Linear Mixed Model (GLMM), which evaluated the performance of the four groups of bees. The performance of a bee throughout the training procedure was calculated as the percentage of correct choices for every consecutive block of 10 choices (Fig. 2 for the last 10 trials / 100 choices). The blocks of 10 choices, the four training groups of bees and the interaction between the choice block and the training groups were considered as explanatory variables in the model. Finally, the GLMM's
 parameters were estimated by Maximum likelihood method in MATLAB (2022b).

To assess whether performance differed between the four groups during the tests, 203 non-parametric statistical tests were used. In the tests, for each bee, we calculated 204 the percentage of correct choices (CS+ stimulus) in a two-minute period. A Kruskal-205 206 Wallis test was used to determine whether there was any difference between the 207 training groups of bees when they were confronted with novel stimuli in the learning and generalisation test. A Wilcoxon signed-rank test was applied to all tests to 208 compare the performance of bees against the performance level expected by chance, 209 210 and to identify visual cue (bars or gratings) preference in individuals (half-pattern test). The same test was used to compare the responses of bees to test stimuli where H1 211 and H2 were pooled to form the H group, and V1 and V2 were pooled to form the V 212 213 group. All statistical analyses were conducted with MATLAB (MathWorks, 2022b). Data is presented in figures using SEM. 214

215 Results

Bees from all groups significantly increased their number of correct choices over time (GLMM P= 1.407×10^{-43} , Table 1, Fig. 2A). No significant difference in the proportion of

correct choices between groups of bees was found (GLMM, P=0.105; Table 1).

	Estimate	SE	tStat	pValue
Intercept	-0.150	0.125	-1.197	0.231
Group index2	-0.235	0.158	-1/486	0.137
("H" or "V")				
Bee group	0.113	0.069	1.622	0.105
Trials	0.099	0.006	15.104	1.407 e-43

220 Table 1. Summary of the Generalised Linear Mixed Model (GLMM) examining factors that contribute to variation in performance during training. The 221 222 dependent variable was the number of correct choices from the block of 10 choices. Fixed factors such as group, beegroupHV, and trial were examined in the model. Bee 223 index was considered in the model as a random factor. Formula: response ~ 1 + trials 224 225 + beegroupHV + beegroup + (1 | bee index). Model fit statistics: AIC= 1077.5, BIC= 226 1099.2, LogLikelihood= -533.76, Deviance=1067.5. This model is the best model with lower BIC value that provides a better trade-off between fit and complexity (number of 227 228 parameters). The length of the training until bees reached the training criteria was not statistically different between groups (Supplementary table 1A. Kruskal-Willis test 229 df=39, Chi-sq=2.47, p=0.48). 230

Bees from all groups successfully recalled the association of the visual stimulus with the sucrose reward as they performed above 80% correct choices on average during the learning test (Supplementary Table 1B. difference to chance level: Wilcoxon signed rank test p<0.05 for each group, Fig. 2B). No difference in the performance of

bees between groups was observed (Supplementary Table 1B. Kruskal-Wallis test:





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Figure 2. Performances of bees during the training and the learning test. A. The 238 mean percentage and standard error of the last 100 choices by the bees are 239 240 plotted as a function of blocks of 10 choices for the four training groups (mean **± SEM**). Training concluded when a bee reached the performance threshold (>80%) 241 correct choices over 20 trials) hence all bees made a different number of choices 242 243 during training. Here we plotted the last 100 choices (by blocks of 10 choices) and the x axis counts these blocks down to threshold (block -10 to 0). B. Percentage of 244 correct choices of each bee in the unrewarded learning test for the four training 245 groups (mean ± SEM). 246

248 Half-pattern test

249 The half-pattern test examined what elements of the visual stimuli the bees had 250 learned (Fig. 3A). In all four training groups, bees clearly learned the orientation of the simple bar stimulus, showing a strong preference for the rewarded orientation over the 251 252 punished orientation (Fig. 3A). The gratings element was learned less well. Only bees 253 in the H groups (where CS+ was associated with the horizontal single bar and related gratings) preferred the rewarded grating orientation to the punished grating orientation. 254 Bees in the V groups (where CS+ was associated with the vertical single bar and 255 related gratings) did not differ in their choice of rewarded or punished grating 256 257 (Supplementary Table 2). Bees in all groups chose the rewarded bar more than the 258 rewarded grating, but this difference was only significant for bees in the V groups (Fig. 3A, Supplementary Table 2). 259





Figure 3. A. Percentage of choices by each bee for each stimulus element in the

half pattern test. Bars indicate training groups. For each group (H1, H2, V1, V2) the correct CS1+ (part 1 of the conditioned stimulus) and the correct CS2+ (part 2 of the conditioned stimulus) are to be found in Supplementary Table 1 (mean \pm SEM). **B. Percentage of CS1+CS2- choices by each bee in the four groups during the conflict test.** Only bees trained on the vertical stimuli choose the CS1+CS2- above chance level (red dotted line) (mean \pm SEM). **p<0.05, **p<0.01 and ***p<0.001 vs. random choice.

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270 Conflict test

In the conflict test, stimuli combined elements of the rewarded and unrewarded stimuli
(Fig. 3B). Similarly, to the 'half-pattern' test, only bees trained on the pattern containing
a single vertical bar and 45° gratings (V1 and V2) choose more often the conflicting
pattern containing the single vertical bar over the other one (Supplementary Table 1).
Bees trained on the pattern containing the single horizontal bar choose both conflicting
patterns equally (Supplementary Table 3). No difference in performance was found
depending on each groups' cues side (H1 and H2, V1 and V2).

278

279 Generalisation test

No group of bees were able to generalise the trained stimuli to a new stimulus with
two bars, and no difference was found between groups (Fig. 4, Supplementary Table
4).

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Figure 4. Percentages of correct choices by each bee from the four groups
 during the generalisation test. Data are presented as the mean ± S.E.M.

286

287 Discussion

In our study, all bees were able to learn the complex visual stimulus (Fig. 2), but bees 288 289 learned the simple bar element of the complex visual stimulus better than the grating element (Fig. 3). Following training on the compound stimulus, all groups of bees 290 291 learned to prefer the orientation of the single bar over the oriented gratings (Fig. 3). 292 For the gratings, only bees in the groups where the CS was associated to the horizonal single bar and the 45° gratings (H groups) showed a significant preference for the 293 294 rewarded orientation over the punished orientation. This can be partly explained by their scanning behaviour when approaching these patterns (MaBouDi et al. 2021), but 295 also due to the nature of their visual system (Guiraud et al. 2023). All four groups 296 297 chose bar elements more than grating elements, but this difference was only

significant for bees from the group that associated the CS+ with the vertical single bar
and the 45° gratings (V groups, Fig. 3A).

300 In our experiment, the bar element was simpler than the grating element in that it had fewer lines and edges (according to computer vision definition, Szeliski et al. 2022). It 301 was also less variable since it did not vary in shape or position during training. By 302 contrast, grating elements had a constant orientation but the number, width and 303 304 spacing of the gratings varied during training trials. In our training, bees had to simply learn to discriminate the horizontal and vertical bars, whereas for the gratings they had 305 to learn to discriminate categories of +45° and -45° gratings. Learning to discriminate 306 307 categories of stimuli is slower than learning to discriminate individual stimuli in bees and other animals (Zhang et al. 2004, Wehner 1967, 1971, Bernard et al. 2006 Stach 308 et al. 2004, 2005). This difference likely contributed to the stronger learning of the 309 310 single bar seen in our data.

If the bar element was learned faster than the grating element in training, then the bar 311 312 may have overshadowed learning of the grating. Overshadowing is a well-established 313 learning phenomenon in many animals. It describes a phenomenon where if an animal is conditioned with a compound stimulus AB, the subsequent response to B would be 314 less than if it had received a similar amount of training with B alone (Brembs & 315 316 Heisenberg 2001, Linster & Smith 1997, Pavlov I.P. 1927). Overshadowing can be asymmetric, with the most salient element of the compound stimulus more likely to 317 overshadow the less salient (Smith et al. 1994). 318

In bees, overshadowing has been demonstrated in olfactory conditioning (Linster & Smith 1997, Pelz et al. 1997, Schubert et al. 2015). Linster & Smith (1997) have argued that it is not necessary to invoke attentional and higher-order cognitive

322 processes to explain overshadowing. They have proposed a model that can explain the overshadowing phenomenon as a result of processing between the olfactory 323 glomeruli and reinforcement neurons within the antennal lobe. Overshadowing is 324 325 considered a key element of many fundamental learning theories, and it has been demonstrated in visual and olfactory learning domains in many vertebrates 326 (Mackintosh 1971, Tennant et al. 1975, Sherratt et al. 2015). Brembs & Heisenberg 327 328 (2001) ague that in principle overshadowing is possible in visual learning paradigms with Drosophila. If overshadowing occurred in our paradigm, then the faster learning 329 330 of the single bar may have partially blocked the slower learning of the grating categories. 331

We observed differences in learning between the bees trained with the CS+ containing the vertical single element and the horizontal single element. Ours is not the first to report bees learn visual and horizontal stimuli at different rates (MaBouDi et al. 2021, Guiraud et al. 2023). Why this may be not clear, but our data are consistent with bees learning the vertical bar as rewarded faster than the horizontal bar as rewarded. This has been seen in other studies (Srinivasan et al. 1999, Wang, Tie et al. 2014, Wolf et al. 2015, Guiraud et al. 2023).

Our experiment shows that bees can rapidly learn multicomponent visual stimuli. Our data are consistent with bees "attending to" the simplest and most consistent element of a multicomponent stimulus, but we do not need to invoke attentional processes to explain our data. Generalisation and overshadowing phenomena - both consequences of Rescorla-Wagner models of learning (Rescola et al. 1972) – are sufficient to explain our data. Our visual stimuli were complex in the computer vision sense of being composed of multiple elements and differing in multiple ways, but we do not need to

invoke complex cognitive processes to explain effective and efficient learning of thesestimuli.

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353 Author contributions

MGG and HM conceived the study. MGG designed the protocol. MGG and EQK acquired the data. MGG curated the data. MGG performed video analysis. VG created the software for video analysis. MGG and HM statistically analysed the data. MGG drafted the manuscript. MGG and HM revised the manuscript.

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363 Data availability

364 Data will be provided upon request.

365 **Declarations of interest**

366 None.

367 Ethical approval

Our research involved bumblebees from commercially available colonies dedicated to research for which an approval of an ethical committee is not mandatory. The protocols comply with standard welfare practice in our field and a minimum number of individuals were used to study our scientific question. The animals were not harmed during the experimental procedures and went on to live a happy retired life after experiments.

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550 Supplementary material



552 Supplementary Figure 1. Training and testing protocol. Example of the conditioning and testing procedure. Left panel: bees were exposed to 2-3 pre-training 553 bouts where eight blue circular stimuli were rewarded (50% sugar solution - w/w). 554 555 Training consisted of trials with four rewarding stimuli (CS+) and four penalized stimuli (providing quinine solution, CS-). Training continued until the bees reached 80% 556 correct choices over 20 consecutive choices. Right panel: Unrewarded tests were 557 558 subsequently performed with a learning test, conflict pattern test, half-pattern test and generalisation test (see methods for details). The learning test consisted of training 559 560 patterns the bee wasn't exposed to. Conflicting test stimuli had the first part (unique 561 bar) of the CS+ stimuli presented with the second part of the CS- (gratings) and vice versa. Half-pattern tests: only one part of the stimuli was present (either the unique 562 563 bar or the gratings from the trained CS+ and CS- configurations). The generalisation 564 test consisted of similar patterns to training ones; the half with the unique bar presented two parallel bars now. Bees' performance was evaluated based on the 565 566 number of landings on each presented pattern during 120 sec of the unrewarded tests.

567

Supplementary table 1. Statistical evaluation of the bees' performance in training
and learning test. A. Training. B. Learning test

Α	Aim of the test	Group of bees	Statistical test	Statistical
				values
	Comparing the proportion of	Bees rewarded	One sided	z= 2.51,
	bees' correct choices when	on	Wilcoxon signed	p=0.0060
		LH+45	rank test	

reaching criterion with the			
chance level (50%)			
Comparing the proportion of	Bees rewarded	One sided	z= 1.8418,
bees' correct choices when	on	Wilcoxon signed	p=0.0328
reaching criterion with the	RH-45	rank test	
chance level (50%)			
Comparing the proportion of	Bees rewarded	One sided	z= 2.4870,
bees' correct choices when	on	Wilcoxon signed	p=0.0064
reaching criterion with the	LV+45	rank test	
chance level (50%)			
Comparing the proportion of	Bees rewarded	One sided	z= 2.4534,
bees' correct choices when	on	Wilcoxon signed	p=0.0071
reaching criterion with the	RV-45	rank test	
chance level (50%)			
Comparing the length of	All four groups	Kruskal-Willis test	df=39, Chi-
training			sq=2.47,
Comparing the proportion of			p=0.4806
bees' correct choices with the			
chance level (50%)			

В.	Difference between groups	Bees rewarded	Wilcoxon signed	z=2.80,
		on	rank test	p= 0.0020
		LH+45		
		Bees rewarded	Wilcoxon signed	z= 2.81,
		on	rank test	p=0.0049
		RH-45		

Bees rewarded	Wilcoxon signed	z= 2.80,
on	rank test	p=0.0050
LV+45		
Bees rewarded	Wilcoxon signed	z= 2.93,
on	rank test	p=0.0033
RV-45		

574 Supplementary table 2. Statistical evaluation of the bees' performance in half-

575 pattern tests.

Aim of the test	Group of bees	Statistical test	Statistical
			values
Comparing the	Bees rewarded on	Wilcoxon signed	z= 2.8031, p=
responses of bees to	LH+45	rank test	0.0051
the CS+ Single bar	Bees rewarded on	Wilcoxon signed	z= 2.7082,
SB+ vs CS- Single	RH-45	rank test	p=0.0068
bar SB-	Bees rewarded on	Wilcoxon signed	z= 2.6656, p=
	LV+45	rank test	0.0077
	Bees rewarded on	Wilcoxon signed	z= 2.8031, p=
	RV-45	rank test	0.0051
Comparing the	Bees rewarded on	Wilcoxon signed	z= 2.4973, p=
responses of bees to	LH+45	rank test	0.0125
CS+ gratings G+ vs	Bees rewarded on	Wilcoxon signed	z= 2.3664p=
CS- gratings G-	RH-45	rank test	0.0180

	Bees rewarded on	Wilcoxon signed	z= 0.3557, p=
	LV+45	rank test	0.7220
	Bees rewarded on	Wilcoxon signed	z=1.8204, p=
	RV-45	rank test	0.0687
Comparing the	Bees rewarded on	Wilcoxon signed	z= 1.1220, p=
responses of bees to	LH+45	rank test	0.2619
SB+ vs G+	Bees rewarded on	Wilcoxon signed	z= 1.6362, p=
	RH-45	rank test	0.1018
	Bees rewarded on	Wilcoxon signed	z= 2.5236, p=
	LV+45	rank test	0.0116
	Bees rewarded on	Wilcoxon signed	z= 2.2439, p
	RV-45	rank test	0.0248

578 **Supplementary table 3**. Statistical evaluation of the bees' performance in conflict

579 test.

Aim of the test	Group of bees	Statistical test	Statistical
			values
Comparing the	Bees rewarded on	Wilcoxon signed	-0.7645,
proportion of bees'	LH+45	rank test	0.4446
responses to SB+G-	Bees rewarded on	Wilcoxon signed	Z=1.1752,
from chance level	RH-45	rank test	p=0.2399
(50%)	Bees rewarded on	Wilcoxon signed	Z=2.4973,
	LV+45	rank test	p=0.0125

	Bees rewarded on	Wilcoxon signed	Z=2.8076,
	RV-45	rank test	p=0.0050
Difference between	H group bees	Wilcoxon rank sum	z= -1.2875, p=
the H group bees		test	0.1979
Difference between	V group bees	Wilcoxon rank sum	z= -0.8464, p=
the V group bees		test	0.3973
Difference between	All four groups	Wilcoxon rank sum	Z= -1.5674 , p
the H and V groups		test	=0.1170
of bees			

Supplementary table 4. Statistical evaluation of the bees' performance in

- 582 generalisation test.

Aim of the test	Group of bees	Statistical test	Statistical
			values
Comparing the	Bees rewarded on	Wilcoxon signed	z=0.4743,
proportion of bees'	RH-45	rank test	p=0.6353
responses to the	Bees rewarded on	Wilcoxon signed	z= 1.3684, p=
double generalisation	LV+45	rank test	0.1712
of the SB+G+ from	Bees rewarded on	Wilcoxon signed	z= -1.0070, p=
chance level (50%)	RV-45	rank test	0.3139
	Bees rewarded on	Wilcoxon signed	z= -0.7707, p=
	LH+45	rank test	0.4409

Difference between	All four groups	Kruskal-Willis test	df=39, Chi-
groups			sq=6.28,
			p=0.098