

The inheritance of alternative nest architectural traditions in stingless bees

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# 1 **Inheritance of Behavioral Traditions underlying Nest Architecture in Stingless Bees**

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19

## 20 **Summary**

21 The transmission of complex behavior and culture in humans has long been attributed to  
22 advanced forms of social learning<sup>1,2</sup>, which play a crucial role in our technological  
23 advancement<sup>3</sup>. While similar phenomena of behavioral traditions and cultural inheritance have  
24 been observed in animals<sup>1,2,4-6</sup>, including in primates<sup>7</sup>, whales<sup>8</sup>, birds<sup>9</sup>, and even insects<sup>10</sup>, the  
25 underlying mechanisms enabling the persistence of such animal traditions, particularly in  
26 insects, are less well understood. This study introduces pioneering evidence of enduring  
27 architectural traditions in the stingless bee *Scaptotrigona depilis*, which are maintained without  
28 any evidence for social learning. We demonstrate that *S. depilis* exhibits two distinct nest  
29 architectures, comprising either helicoidal or flat, stacked horizontal combs, which are  
30 transmitted across generations through stigmergy<sup>11-17</sup> – an environmental feedback mechanism  
31 whereby the presence of the existing comb structures guides subsequent construction  
32 behaviors, thereby leading to a form of environmental inheritance<sup>18-20</sup>. Cross-fostering  
33 experiments further show that genetic factors or prior experience do not drive the observed  
34 variation in nest architecture. Moreover, the experimental introduction of corkscrew  
35 dislocations within the combs prompted helicoidal building, confirming the use of stigmergic

36 building rules. At a theoretical level, we establish that the long-term equilibrium of building in  
37 the helicoidal pattern fits with the expectations of a two-state Markov chain model. Overall,  
38 our findings provide compelling evidence for the persistence of behavioral traditions in an  
39 insect based on a simple mechanism of environmental inheritance and stigmergic interactions,  
40 without requiring any sophisticated learning mechanism, thereby expanding our understanding  
41 of how traditions can be maintained in non-human species.

42

43 **Keywords:** animal traditions; environmental inheritance; stigmergy; nest architecture;  
44 stingless bees

45

## 46 **Results and discussion**

47 The progress and prosperity of human civilizations have been significantly influenced by our  
48 ability to learn from others and accumulate knowledge, leading to technological progress and  
49 innovation that is stably transmitted through cultural mechanisms<sup>21</sup>. While long perceived to  
50 be exclusive to humans, behavioral traditions and social information transmission across  
51 generations have also been observed in a variety of non-human species<sup>1,2,4-6,22</sup>. In particular,  
52 primates<sup>7</sup>, cetaceans<sup>8</sup>, birds<sup>9</sup>, and even insects<sup>10</sup> have all demonstrated the capacity to maintain  
53 and transmit complex behaviors or structures across generations. High cognitive skills and  
54 advanced forms of social learning have long been thought to be required for the stable  
55 maintenance of behavioral traditions and culture<sup>7-9,23,24</sup>. However, the persistence of distinct  
56 traditions also in species with simpler cognitive capacities, like insects<sup>10,25</sup>, challenges the  
57 conventional understanding of cultural transmission, suggesting that alternative, less complex  
58 mechanisms might sometimes be at play<sup>10,25-28</sup>.

59 Recent insights into the architectural diversity of stingless bee colonies hint at the existence of  
60 behavioral traditions that might not rely on direct social learning or high cognitive abilities<sup>25</sup>.  
61 In this case, it is likely that variation in nest architecture could be propagated based on the  
62 comb structure itself, whereby the current building style guides the building by later  
63 generations of bees. Such a process could lead to environmental and behavioral inheritance<sup>18-</sup>  
64 <sup>20,27,28</sup>, even in the absence of any direct form of social learning. To test this theory, we here  
65 present the first study of behavioral innovation and social transmission of alternative nest  
66 architecture building patterns in a neotropical stingless bee, *Scaptotrigona depilis*. This species  
67 is one of 10 known stingless bee species that exhibit significant intraspecific variation in nest  
68 architecture<sup>29</sup>, building its brood combs in either a helicoidal shape built continuously without

69 the support of a central pillar, or as horizontally stacked parallel layers, supported by a central  
70 pillar<sup>12,14</sup> (Figure 1A,B). Given that stingless bees generate perennial colonies and reproduce  
71 through swarming or managed splitting, we hypothesized that the observed architectural  
72 variation might be maintained over periods of time extending beyond the lifespan of individual  
73 worker cohorts.

74 To investigate the inheritance and prevalence of the two alternative nest architectural building  
75 patterns, we surveyed 413 *S. depilis* colonies in Jaguariúna, São Paulo State, Brazil, and  
76 monitored the incidence and changes in nest architecture over one-month periods in 2022 and  
77 2023 (see STAR Methods). We hypothesized that the prevailing comb configuration would  
78 guide the construction of successive worker cohorts<sup>25</sup>, with the frequencies of helicoidal and  
79 parallel architectures reflecting the stable equilibrium of a two-state continuous time Markov  
80 chain model. Specifically, if  $a$  and  $b$  represent the monthly transition rates to helicoidal and  
81 parallel comb structures, each occurring at frequencies  $H$  and  $P$ , we predicted the dynamics to  
82 adhere to the following system of ordinary differential equations:

$$83 \quad \frac{dH}{dt} = aP - bH$$

$$84 \quad \frac{dP}{dt} = bH - aP$$

85 At equilibrium ( $dH/dt = 0$  and  $dP/dt = 0$ ), and given that  $H + P = 1$ , the expected equilibrium  
86 proportion building in the helicoidal configuration is  $H^* = a/(a + b)$ , while for the parallel  
87 configuration it is  $P^* = b/(a + b)$ . Our empirical data show that parallel-building colonies ( $n$   
88 = 398) transitioned to a helicoidal architecture at a rate of  $a = 4.5\%$  per month (binomial 95%  
89 CrI 2.8-6.9% per month), while helicoidal-building colonies ( $n = 15$ ) switched to parallel at a  
90 rate  $b = 87\%$  per month (binomial 95% CrI 64-97% per month). These rates did not differ  
91 significantly between the study years, supporting the Markov chain model's assumption of  
92 constant transition rates (binomial GLM, posthoc tests,  $z$  ratio = -1.53,  $p = 0.13$  and  $z$  ratio =  
93 0.32,  $p = 0.75$  for contrasts in switching rates  $a$  and  $b$  between years).

94 The calculated equilibrium frequency of the helicoidal architecture  $H^*$  of 5.0% (parametric  
95 bootstrapping 95% CI: 2.9-7.6%,  $n = 15$ ) aligns with the observed average frequency over both  
96 years (binomial GLM, 4.3% with 95% CI 2.7-6.7%,  $n = 413$ ,  $z$  ratio = -0.652,  $p = 0.51$ ) and  
97 was also not significantly impacted by season or year (Jan.-Febr. 2022 vs. Aug.-Sept. 2023),

98 hive entrance orientation, or position within the bee yard (Figure S1 & Table S1). It has been  
99 suggested that a helicoidal nest architecture could be a thermoregulatory adaptation helping to  
100 maintain the brood area at an optimum temperature<sup>30,31</sup>. Nevertheless, our results indirectly  
101 dismiss this hypothesis, since we would then have expected the helicoidal building type to be  
102 spatially clustered or to be more common in the warm season (Jan.-Feb.), which was not the  
103 case (Table S1). The inclination of the hives also did not impact the frequency of both types.  
104 When 10 colonies were tilted, none of them switched to building helicoidal combs within 2  
105 weeks, and on a per-month basis the rate of switching to the helicoidal type was not  
106 significantly elevated compared to 2022 parallel-building control colonies ( $n = 299$ ) (Firth's  
107 penalized logistic regression,  $z$  ratio = 0.66,  $p = 0.51$ ). The lack of any significant  
108 environmental effects argues against variation in nest architecture being driven by changes in  
109 the external environment<sup>30,31</sup>. Our results confirm the long-term persistence of both  
110 architectural phenotypes, but with the helicoidal form continuing for a shorter average duration  
111 ( $T_H = 1/b = 1.2$  months, 1.0-1.5 95% CI) than the parallel form ( $T_P = 1/a = 23.4$  months, 14.7-  
112 39.8 95% CI). Yet, the average duration of building in the helicoidal pattern still surpassed the  
113 typical comb-building period of a single worker cohort, which transitions to other tasks after  
114 approximately two to three weeks<sup>29</sup>. Consequently, our results imply that information on how  
115 combs are constructed is transmitted across different worker cohorts and hence that some form  
116 of environmental and behavioral inheritance is going on<sup>18-20,27,28</sup>.

117 To investigate the specific mechanism by which this transmission occurs, we carried out a full  
118 factorial cross-fostering experiment in which we provided experienced workers sourced from  
119 colonies building in either the helicoidal or parallel pattern with a comb lattice structure from  
120 a genetically unrelated colony that was matching or was opposite to their own (see STAR  
121 Methods, Figure 1,  $n = 6$  replicates per treatment combination). According to our stigmergy-  
122 based environmental inheritance hypothesis, the expectation was that presenting an altered  
123 comb structure in itself should cause the experienced workers to switch to a new building style,  
124 merely by being guided by the comb structure itself. In that case, social information on how  
125 combs are built would be socially transmitted across worker cohorts, but it would be based on  
126 environmental inheritance driven by stigmergy, whereby the change in the structure of the  
127 environment – the change in the comb lattice structure – would act as a stimulus for continued  
128 construction in a manner consistent with the existing architecture<sup>11-17</sup>. This form of social  
129 transmission emphasizes the role of the artifacts themselves – in this case, the comb structure  
130 – as repositories and conduits of social information, thereby bypassing the need for direct

131 observation of behavior or instruction. By contrast, if the experienced workers were  
132 predisposed towards building in a particular style, based on their genetic makeup or prior  
133 experience, the expectation was that they should continue to do so even when provided with a  
134 comb template of the alternative type.

135 Our cross-fostering experiment results confirm the environmental inheritance hypothesis.  
136 When exposed to alternative architectural styles, experienced workers did not adhere to their  
137 original construction patterns, thereby implying that nest architectural variation was not  
138 controlled by genes of large effect or by prior experience. Instead, they promptly adjusted their  
139 behavior to align with the provided comb structure, as evidenced by the rapid change in  
140 building patterns observed within the first week – a change that remained constant for several  
141 weeks (Figure 2). These results are consistent with the hypothesis that stigmergy underlies the  
142 observed environmental inheritance and the persistence of distinct nest architectural behavioral  
143 traditions. Nevertheless, over time, most colonies did eventually revert to building in the  
144 parallel configuration, consistent with the dominance of this type in the wild. Given that the  
145 observed changes in nest architecture were not affected by the original building style of the  
146 experienced workers, our results clearly argue against genetic factors of large effects (e.g.  
147 supergenes<sup>32,33</sup>) or direct social learning playing a significant role. Instead, our results support  
148 the concept that behavioral traditions can be maintained through environmental cues and  
149 stigmergic responses, aligning with the broader definition of traditions as patterns perpetuated  
150 over time by mechanisms that do not require direct social learning<sup>27,28</sup>.

151 To test if stigmergic building rules underpin the observed variation in nest architecture, we  
152 carried out one final experiment in which we incised the top comb of parallel-building colonies  
153 to mimic "corkscrew dislocations", which are known theoretical precursors to helicoidal comb  
154 building<sup>14</sup>. In line with theoretical predictions<sup>14</sup>, we found that this manipulation of the comb  
155 substrate caused a marked increase in the transition to a helicoidal architecture compared to  
156 control colonies (Figure 3). This result corroborates that the physical structure of the comb  
157 itself can direct subsequent construction, in line with the concept of stigmergy<sup>11,13,16</sup>.

158 Despite our clear conclusions on the mode of inheritance of alternative nest architectures in  
159 this species, several important questions remain. It is unclear, for example, what factors cause  
160 the actual transitions between building styles, and why helicoidal building tends to persist for  
161 a much shorter time than parallel building. In all likelihood, transitions to parallel building are  
162 initiated by the building of a central wax support pillar<sup>12</sup> (Figure 1A), while transitions to

163 helicoidal building are caused by occasional mistakes in the vertical alignment of newly built  
164 cells<sup>14</sup>. If correct, this suggests that the parallel configuration is the default building pattern and  
165 that switching to the helicoidal pattern could be regarded as an error-correction mechanism to  
166 absorb occasional building mistakes and avoid costly interruptions in cell building. Similar  
167 error-correction mechanisms during comb construction have previously been described in other  
168 social insects<sup>34-37</sup>. Honeybees, for example, initiate comb building at multiple points within a  
169 frame, and to be able to fuse those comb sections they occasionally switch to building  
170 pentagonal or heptagonal cells instead of the standard hexagonal ones<sup>36,37</sup>. This adaptability  
171 reflects a sophisticated combination of stigmergy and behavioral flexibility, where bees  
172 respond dynamically to the challenges presented by their construction environment<sup>36,37</sup>. In any  
173 case, our findings indicate no clear superiority of either architectural style, given that neither  
174 significantly impacted cell construction rates (Figure S4). This absence of a distinct advantage  
175 may explain the coexistence of both architectural styles in *S. depilis*, despite the exclusive  
176 adoption of the helicoidal style in some other stingless bee species<sup>12,14,29</sup>.

177 Another important outstanding question is if the persistence of distinct nest architectures in our  
178 system could also involve more complex forms of social learning, which some authors take as  
179 a defining characteristic of behavioral or cultural transmission<sup>6,38,39</sup>. Indeed, Chittka & Rossi<sup>25</sup>  
180 suggested that stingless bees might to some extent be able to copy how to build their comb  
181 merely by observing and being exposed to the existing comb structure, which would be akin to  
182 an indirect form of social learning known as product learning<sup>40</sup>. At present, we cannot exclude  
183 that the stigmergy we describe also involves such a learning process and is not just based on  
184 innate responses, but conclusive evidence to support this theory is currently lacking.  
185 Personally, we believe it is more likely that the stigmergic building rules are largely innate, and  
186 that the same set of building rules produce different nest architectures depending on the initial  
187 comb substrate, or that particular innate building rules are conditionally expressed in function  
188 of the existing architecture.

189 Testing whether or not the inheritance of alternative nest architecture is purely innate remains  
190 a task for future work and would require extensive and complex experiments. Establishing the  
191 involvement of social learning would entail showing that prior exposure to a specific comb  
192 structure affects the construction approach in subsequent generations, following swarming  
193 events. Suggestive evidence for this has been collected in the honeybee, where colonies  
194 maintain their original comb building orientation after swarming<sup>41</sup>. Nevertheless, as this study

195 did not use a cross-fostering setup, it could not preclude that the building style persisted merely  
196 as a result of varying genetic predispositions<sup>41</sup>. In addition, definite conclusions for our system  
197 might be precluded by the fact that colonies presumably have a propensity to revert back to  
198 parallel building when placed in an empty hive without any comb substrate.

199 In conclusion, our findings provide a compelling case for the role of stigmergy and  
200 environmental feedback in the transmission of nest-building traditions in stingless bees. This  
201 mechanism facilitates the persistence of distinct architectural styles within colonies, thereby  
202 producing behavioral traditions that persist across the lifespan of individual bees, even in the  
203 absence of any evidence for learning or advanced cognitive processing. Hence, our study  
204 strengthens the case that animal traditions and the non-genetic transmission of behavior can be  
205 based on cognitively simple processes<sup>27,28</sup>, such as via stigmergy-mediated environmental  
206 feedback. Future research should aim to dissect the precise nature of these stigmergic  
207 interactions further and explore whether beyond innate responses, there might also be a layer  
208 of learning that influences these behaviours<sup>25</sup>. These investigations could shed light on the  
209 continuum between innate building rules and the potential for learning in shaping the cultural  
210 and behavioral landscapes of non-human societies. Our study not only advances our  
211 understanding of stingless bee behavior but also contributes to the broader discussion on the  
212 mechanisms of behavioral transmission and tradition maintenance in animal societies.

213

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## 221 **Author contributions**

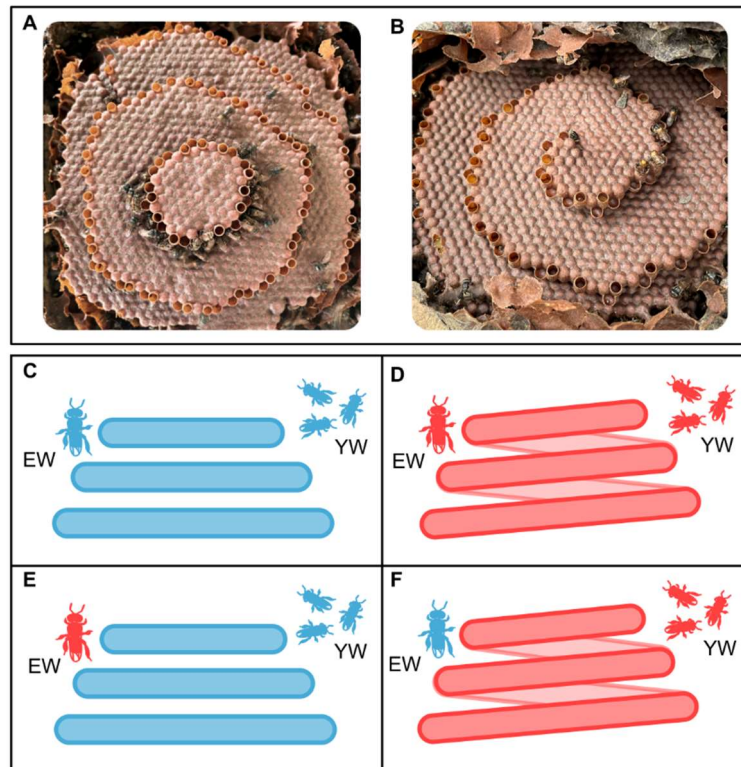
222 R.C.O. and T.W. conceived and supervised the study. V.D.P, C.M. and R.C.O.: experimental  
223 design. V.D.P, C.M., M.G.B.F. and D.J.P.: behavioral experiments. T.W.: theoretical  
224 modelling. V.D.P., M.F., R.C.O., T.W. and H.M.F.: data analysis. V.D.P and H.M.F wrote the



225 first draft of the manuscript. All authors contributed to revising and proofreading and approved  
226 of the final version before submission.

227 **Declaration of interests**

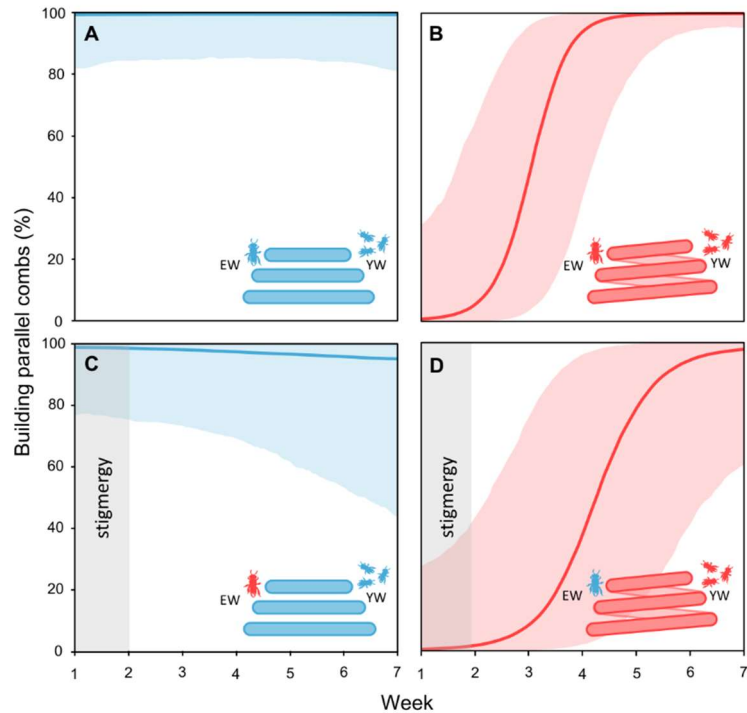
228 The authors declare no competing interests.



229

230 **Figure 1. Cross-fostering experiment to study how intraspecific variation in nest**  
231 **architecture in the stingless bee *Scaptotrigona depilis* is transmitted.** Strikingly, workers in  
232 this species construct their brood combs either in a parallel arrangement (A) with a central  
233 support pillar from which the first cell of the comb is built (\*) or in a helicoidal pattern (B),  
234 without any central pillar (+). To study the mechanism by which this variation in nest  
235 architecture is transmitted, we carried out a full factorial cross-fostering experiment (panels C-  
236 F), where we provided experienced workers (EW), deriving from colonies with either parallel  
237 (blue) or helicoidal building patterns (red), with a comb lattice structure that was either of the  
238 same type or the alternative type. The combs used as a template in the experiment contained  
239 late-stage genetically unrelated brood that was ready to emerge, to allow for interactions and  
240 potential social information exchange between experienced workers and naïve young workers  
241 (EW and YW).

242

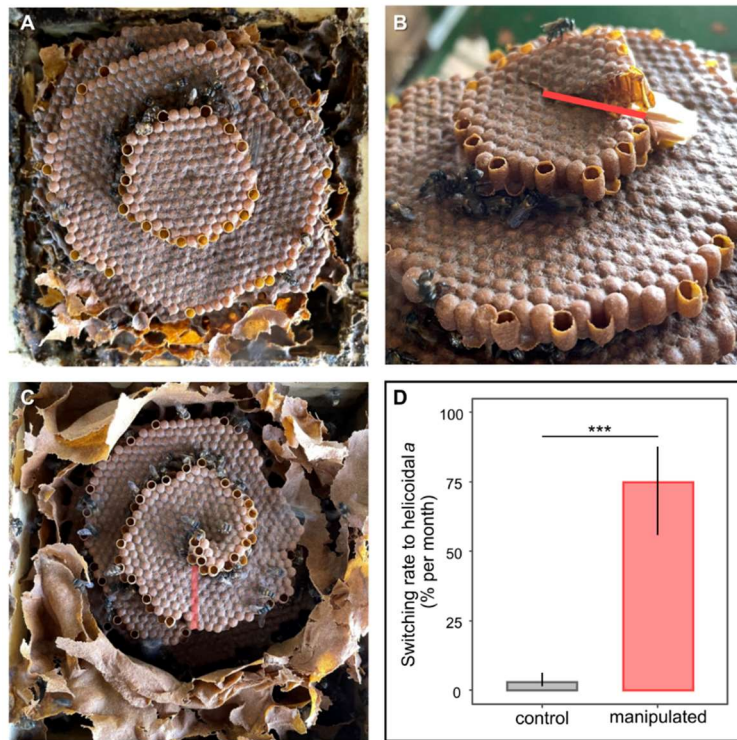


243

244 **Figure 2. Stigmergy, rather than genetics or prior experience, drives the inheritance of**  
 245 **alternative nest architectures.** Estimated changes in nest architecture over 7 weeks in our  
 246 cross-fostering experiment ( $n = 6$  replicates/treatment). When experienced workers (EW), with  
 247 a history of building in either parallel or helicoidal styles, encountered the opposing comb  
 248 structure, they immediately switched to building in the presented style (panels C and D). This  
 249 swift change was likely driven by stigmergy, where the existing comb structure guided  
 250 subsequent building. These results also clearly show that nest architecture was not determined  
 251 by prior experience or genetic makeup. As the weeks progressed, most colonies eventually  
 252 switched towards the parallel style (panels A-D), mirroring its dominance in the wild and the  
 253 observed preferential switching to this building style. The presence of EWs from parallel-  
 254 building colonies did not accelerate this shift (panels B and D), thereby implying that direct  
 255 social learning did not significantly influence building patterns. The shaded areas denote 95%  
 256 credible intervals from a Bayesian Gaussian process logistic regression model (see STAR  
 257 Methods). For detailed results see Figures S2 & S3.

258

259



260

261 **Figure 3. Stigmergy underlies the transition to helicoidal comb building.** To investigate  
 262 the role of stigmergy in the social transmission of helicoidal comb construction, we modified  
 263 the top comb of colonies that were previously building in a parallel pattern by incising and  
 264 tilting one side to simulate "screw dislocations", a theoretically identified initiator of helicoidal  
 265 comb building<sup>14</sup> (A,B). With only the comb's lattice structure changed and all workers  
 266 inexperienced in helicoidal building, a subsequent shift to this construction style would  
 267 implicate stigmergy. Results confirmed this hypothesis: 43% of the manipulated colonies  
 268 (9/21) transitioned to helicoidal building within one week (c, red line indicates initial incision,  
 269 obscured by newly built helicoidal comb), which amounted to a monthly transition rate to  
 270 helicoidal building of 75.0% [55.8-87.7] 95% CI ( $n = 21$ ) compared to a mere 3.1% [1.5-6.3]  
 271 95% CI in the parallel-building 2022 controls ( $n = 299$ ) (binomial GLM analysis, odds ratio to  
 272 switch over one month: 95.1 [30.3-299.2] 95% CI,  $z$  ratio = 7.79,  $p < 1E-14$ ).

273

274

275 **STAR Methods**

276 **RESOURCE AVAILABILITY**

277 *Lead contact*

278 Further information and requests for resources should be directed to and will be fulfilled by the  
 279 lead contact, Viviana Di Pietro (viviana.dipietro@kuleuven.be).

280 ***Materials availability***

281 This study did not generate new unique reagents.

282 ***Data and code availability***

283 All datasets used for analysis in this study have been deposited at Mendeley Data  
284 (10.17632/bhjp3m2sbp.1) and will be publicly available as of the date of publication.  
285 Accession numbers are listed in the key resources table. For review the data can be downloaded  
286 through this link provided by Mendeley Data:  
287 <https://data.mendeley.com/preview/bhjp3m2sbp?a=cd4b4d79-ba16-4248-8754-1af2f5eda915>

288 All original code has been deposited at Mendeley Data and is publicly available as of the date  
289 of publication. DOI is listed in the key resources table.

290 Any additional information required to reanalyze the data reported in this paper is available  
291 from the lead contact upon request.

292 **EXPERIMENTAL MODEL AND STUDY PARTICIPANT DETAILS**

293 Stingless bees, a group of more than 500 highly eusocial bees in the tribe of the Meliponini,  
294 display an astounding diversity in terms of diet, behaviour and nest architecture, not only  
295 between but also within species<sup>29,42,43</sup>. Unlike honeybees, which construct vertical parallel wax  
296 combs and use them both for food storage and brood rearing<sup>44</sup>, the nest building of stingless  
297 bees is more complex and diverse<sup>42</sup>. They use a range of building materials, including soil  
298 particles, resin, plant fibres, and even excrement<sup>29,42,45,46</sup> with food pots and brood combs being  
299 spatially separated<sup>42</sup>. Nest architecture can vary both across and within species, with brood  
300 cells being arranged either in horizontal combs, vertical combs, clustered cells or some  
301 intermediates between these forms<sup>29</sup>. Our focus in this study is on *Scaptotrigona depilis*, a  
302 Neotropical stingless bees and one of 10 species that are known to show large bimodal  
303 intraspecific variation in nest architecture<sup>29</sup>. The species constructs nests with combs consisting  
304 either of flat, stacked parallel combs, supported by a central pillar, or builds combs arranged in  
305 a helicoidal configuration, in which case there is no central support pillar. Both forms of comb  
306 can coexist within the same colony simultaneously<sup>47</sup>, suggesting that minor changes in building  
307 behaviour can cause a switch between both configurations<sup>14,48</sup> and the switch from one  
308 configuration to the other can occur at any stage during building. The precise trigger for such  
309 transitions remains unknown. The colonies used for this study were kept at Embrapa Meio

310 Ambiente in Jaguariúna, São Paulo, Brazil. These colonies were housed in identical wooden  
311 boxes (19 x 19 x 16 cm) and the bees were allowed to forage freely in their natural environment.

312

## 313 **METHOD DETAILS**

### 314 *Observational data collection*

315 To determine the frequency of helicoidal and parallel comb building in the stingless bee  
316 *Scaptotrigona depilis* and determine the rate of switching between both types within the same  
317 colony, we recorded the nest architecture of 413 colonies at one month intervals, in January-  
318 February 2022 ( $n = 241$ ), and August-September 2023 ( $n = 172$ ). Hive entrance orientation and  
319 position in the bee yard (placed individually on a stand or placed on the upper or lower shelf  
320 under a shelter) were noted to evaluate environmental influences on nest architecture.

### 321 *Cross-fostering experiment*

322 Our factorial cross-fostering experiment involved four groups with six colonies each: two  
323 control groups with congruent comb structures and worker backgrounds, and two treatment  
324 groups with mismatched comb structures and worker backgrounds (Figure 1). Standardized  
325 hives (19 x 19 x 16 cm) were populated with three to four layers of brood combs from which  
326 bees were ready to emerge, the original mother queen and approximately 600 genetically  
327 unrelated bees of varying ages, from the youngest to foragers, of a given nest architectural  
328 background. After a one-week acclimation period during which colonies were kept closed and  
329 where they were provided with wax, pollen and honey, we tracked nest architecture weekly for  
330 seven weeks, in a blinded manner, between February and March 2022.

### 331 *Stigmergy experiment and hive inclination effect*

332 To investigate the role of stigmergy in the social transmission of helicoidal comb building, we  
333 experimentally manipulated small newly built brood comb layers (diameter ca. 5 cm) of 21  
334 parallel-building colonies by making an incision and tilting up one side to mimic "screw  
335 dislocations", which theoretically have been posited to initiate helicoidal comb building<sup>14</sup>  
336 (Figure 3). After seven days, we recorded the nest architecture to check if helicoidal comb  
337 building had stably persisted.

338 In a similar fashion, we examined whether inclination had any impact on nest configuration by  
339 selecting 10 colonies that were building in parallel and tilting them at an angle of 20 degrees.  
340 Following a two-week interval, we examined these colonies to determine if any of them had  
341 transitioned to helicoidal architecture.

### 342 *Colony performance analysis*

343 To test if nest architecture affected colony performance, six free-foraging observation hives  
344 (three per nest architecture) of similar colony size were set up and videotaped to allow us to  
345 measure and compare cell building rates. The brood combs were exposed by removing the  
346 involucre, and colony temperature was maintained with halogen lights. The number of newly  
347 built cells over 5 subsequent days were measured from the video footage using ImageJ's "Cell  
348 Counter" plugin<sup>49</sup>. Colony size was controlled for by using that same plugin to count the  
349 average number of workers visible in 20 video frames collected at 30-second intervals for a  
350 period of 10 minutes.

351

## 352 **QUANTIFICATION AND STATISTICAL ANALYSIS**

### 353 *Observational data collection*

354 Bayesian binomial credible intervals for the frequency of each nest architecture and the  
355 monthly transition rates were estimated under a Jeffrey's prior using the *propCI* function from  
356 the *prevalence* package<sup>50</sup> in R. We employed binomial generalized linear models (GLM) with  
357 a logit link function to test for annual and environmental variations in architecture switching  
358 rates, using the *glm* function in R and carried out two-sided Sidak posthoc comparisons with  
359 the *emmeans* package<sup>51</sup> (Figure S1). To derive confidence intervals for the equilibrium  
360 frequency of helicoidal types and the expected duration of architectural forms, we applied  
361 parametric bootstrapping with one million replicates. All statistical analyses were performed  
362 in R v. 4.2.2<sup>52</sup>.

### 363 *Cross-fostering experiment*

364 We employed a Bayesian Gaussian process logistic regression model<sup>53</sup>, fit using the *brms*  
365 package<sup>54</sup>, to analyse the change in nest architecture over time. This approach allowed us to  
366 model time series data flexibly, accounting for potential autocorrelations and inter-colony  
367 variability by including a random intercept for each colony. We assumed an exponentiated  
368 quadratic covariance function to describe the covariance between two time points as a function  
369 of the number of weeks that separates them. We selected weakly informative zero-centered  
370 normal priors for intercepts and scales (with a *SD* of 3), and a moderately informative inverse  
371 gamma prior (with a shape and scale of 5) for length scales. We ran four MCMC chains of  
372 2,000 iterations each, of which the first 1,000 iterations were discarded as warmup.  
373 Convergence diagnostics included inspection of traceplots and calculation of the Potential  
374 Scale Reduction Factor (R-hat), which for all parameters was smaller than 1.01<sup>55</sup>. To visualize

375 the effects of time and treatment on the outcome type, we plotted the conditional temporal  
376 trajectory of each treatment along with 95% equal-tailed credible intervals (Figure 2). We also  
377 performed a prior sensitivity analysis to ascertain that our findings were robust against  
378 alternative prior specifications (Figure S2). In addition, we visualized the posterior  
379 distributions of the estimated fraction of parallel comb architecture for each treatment group at  
380 each week using the *ggdist* package<sup>56</sup> (Figure S3). Posterior estimates were compared pairwise  
381 among treatments and weeks.

#### 382 *Stigmergy experiment and hive inclination effect*

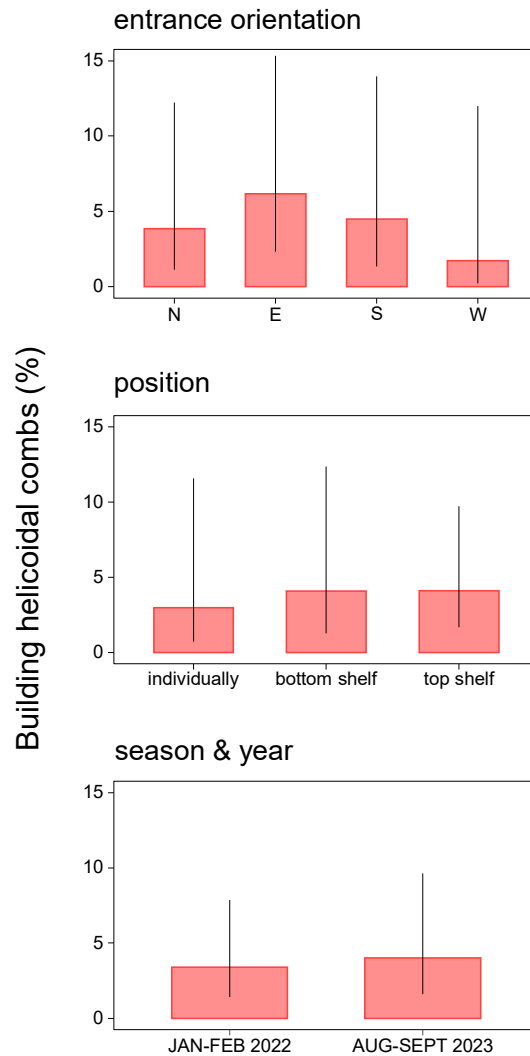
383 A logit link binomial GLM was used to compare the rate of switching to helicoidal comb  
384 building in manipulated colonies ( $n = 21$ ) vs. in unmanipulated parallel-building control  
385 colonies observed over the same time period (February 2022,  $n = 299$ ). Differences in the  
386 period over which switching was observed, i.e. one week versus one month, were adjusted by  
387 including  $\log(\text{period})$  as a model offset. To facilitate comparison, switching rates were  
388 expressed on a fixed per month basis.

389 A binomial GLM with logit link function was employed to compare the rate of transitioning to  
390 helicoidal comb construction in tilted colonies ( $n = 10$ ) with that in unmanipulated control  
391 colonies that naturally built parallel combs during the same observation period (February 2022,  
392  $n = 299$ ). Given that there was separation, this model was fitted using the *brglm2* package<sup>57</sup>  
393 using a Jeffrey's prior. To account for differences in the observation period in the manipulated  
394 vs. in the control colonies (two weeks versus one month), we made adjustments by including  
395  $\log(\text{period})$  as a model offset.

#### 396 *Colony performance analysis*

397 The data were then analyzed using a Poisson GLMM with a log link function fitted using the  
398 *lme4* package<sup>58</sup>. The model included time, nest architecture, and their interaction as fixed  
399 effects,  $\log(\text{colony size})$  as a model offset and colony ID as a random intercept. Overdispersion  
400 was addressed by incorporating an observational-level random effect. Two-sided Sidak post-  
401 hoc pairwise comparisons and estimation of marginal means were performed with the *emmeans*  
402 package<sup>51</sup>.

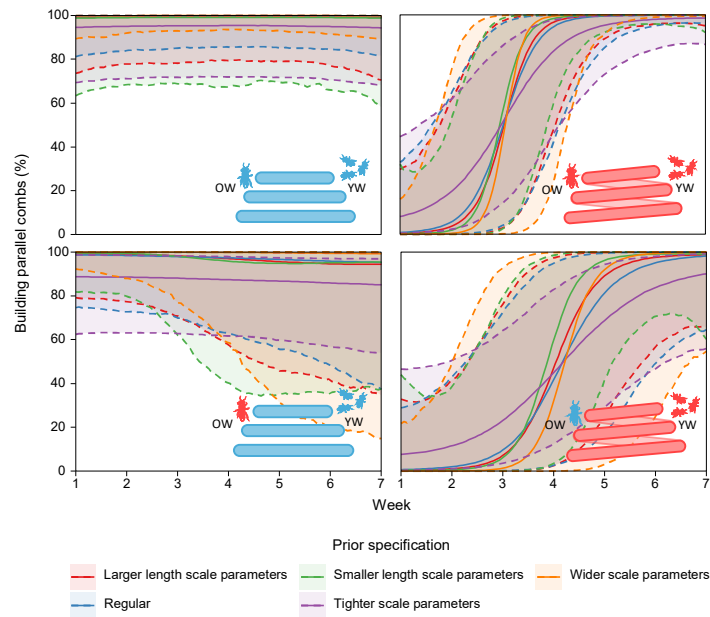
#### 403 **Supplemental Information figures and tables**



404

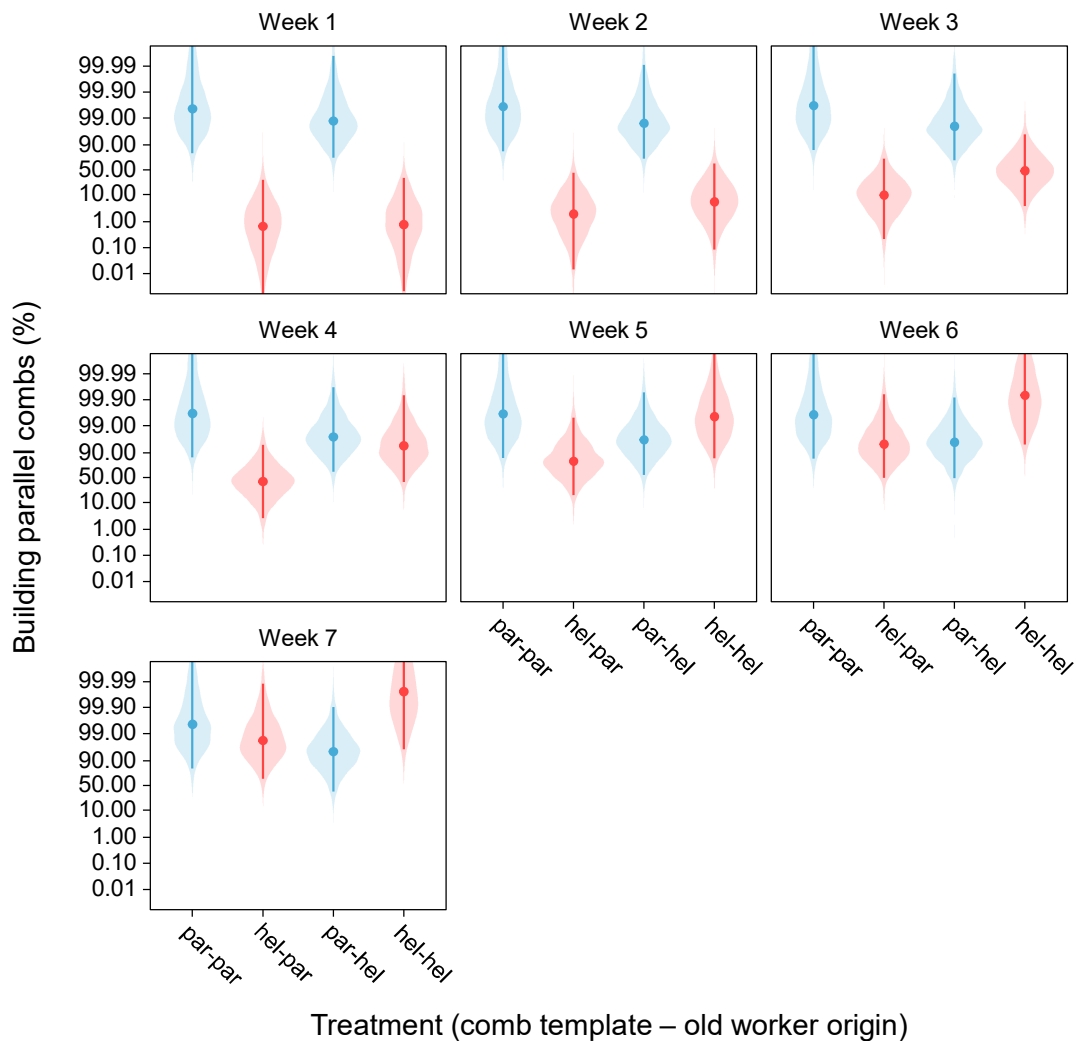
405 **Figure S1. The frequency of the helicoidal nest architecture was consistent across time**  
 406 **and space and not significantly affected by environmental factors.** The frequency of the  
 407 helicoidal nest architecture in *Scaptotrigona depilis* was not significantly affected by season &  
 408 year (January-February 2022,  $n = 241$  colonies, vs. August-September 2023,  $n = 172$  colonies),  
 409 hive entrance orientation (facing north, east, south or west) or position in the apiary (placed  
 410 individually on a stand, or on the bottom or top shelf in the apiary) (main effects logistic  
 411 regression, anova Type III likelihood-ratio tests, effect for year/season:  $\chi_1^2 = 0.095$ ,  $p = 0.76$ ,  
 412 effect for hive entrance orientation:  $\chi_3^2 = 2.65$ ,  $p = 0.45$ , effect for position in the apiary:  $\chi_2^2 =$   
 413  $0.23$ ,  $p = 0.89$ ). Plots show the expected marginal means and Sidak adjusted 95% confidence  
 414 intervals, calculated using the *emmeans* package. As each colony was observed twice per year  
 415 with a one month interval, we used prior observation weights of 0.5 in our logistic regression  
 416 to avoid pseudoreplication.





417

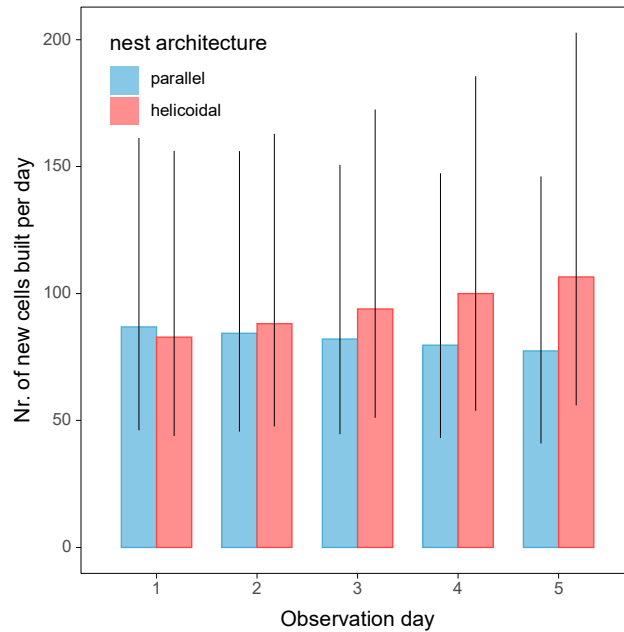
418 **Figure S2. Prior sensitivity analysis of nest architecture change over time in the cross-**  
 419 **fostering experiment.** Plots show the estimated percentage of colonies building parallel combs  
 420 through time for the four treatment groups ( $n = 6$  replicates per treatment combination, Figures  
 421 1 & 2) under five different prior specifications for a Gaussian process logistic regression fitted  
 422 using *brms*, in which colony was included as a random intercept ( $n = 6$  colony replicates per  
 423 treatment combination, data were collected weekly). Full lines indicate posterior mean  
 424 trajectories, while dashed lines and the shaded zones show 95% credible intervals. The regular  
 425 prior specification (a Normal (0, 3) prior on the model intercept, an Inv-Gamma (5, 5) prior on  
 426 the Gaussian process' length scale, a Normal (0, 3) prior on the Gaussian process' marginal  
 427 scale and a Normal (0, 3) prior on the random intercepts' scale), used for the main analysis  
 428 (Figure 2), is shown in blue. Results of an alternative model in which the Gaussian process'  
 429 length scale is replaced by an Inv-Gamma (18.5, 10) prior, favoring slower temporal changes,  
 430 is shown in red. Results of a model in which the Gaussian process' length scale is replaced by  
 431 an Inv-Gamma (18.5, 5) prior, favoring faster temporal changes, is shown in green. A model  
 432 in which wider Normal (0, 9) priors on the model intercept, the Gaussian process' marginal  
 433 scale and the random intercepts' scale are used, is shown in orange. Finally, a model in which  
 434 tighter Normal (0, 1) priors on the model intercept, the Gaussian process' marginal scale and  
 435 the random intercepts' scale are used, is shown in purple. The prior sensitivity analysis reveals  
 436 that alternative prior specifications do not affect the general patterns and qualitative  
 437 conclusions presented in the main analysis, and only lead to minor changes in the width of the  
 438 credible intervals.



439

440 **Figure S3. Weekly estimates of nest architecture variation in transplant experiment.** The  
 441 figure presents the model's predicted probabilities of colonies building in the parallel pattern  
 442 across different treatments plus their uncertainty at 1 to 7 weeks after the start of the experiment  
 443 (points and line ranges show median posteriors plus 95% credible intervals,  $n = 6$  replicates  
 444 per treatment combination). Treatments show the combinations of the provided comb lattice  
 445 template (parallel or helicoidal) and the origin of the experienced old workers (from colonies  
 446 that previously built in the parallel or helicoidal arrangement), i.e. "par-par", "hel-par", "par-  
 447 hel" or "hel-hel" (cf. Figures 1 & 2). The estimates are derived from a Bayesian Gaussian  
 448 process logistic regression model, which incorporated random intercepts for individual bee  
 449 colonies. The colors distinguish between treatments, with blue and red indicating the  
 450 architecture of the provided comb lattice structure (parallel or helicoidal).

451



452

453 **Figure S4. Mean cell building rates in colonies with parallel and helicoidal nest**  
 454 **architectures.** This figure illustrates the average number of new cells constructed per day over  
 455 a period of 5 days in colonies kept in observation hives that were constructing their combs in  
 456 either a parallel or a helicoidal arrangement ( $n = 6$  colony replicates for each). The plotted  
 457 estimates show marginal means and 95% confidence intervals derived from a Poisson  
 458 generalized linear mixed model (GLMM), calculated using the *emmeans* package (for details  
 459 see Table S1). No significant differences were found at any observation day, which shows that  
 460 nest architecture did not significantly affect colony performance.

461

462

463 **Table S1. Analysis of cell building rates in colonies with parallel and helicoidal nest**  
464 **architectures.** (A) Model coefficients of a Poisson generalized linear mixed model (GLMM)  
465 in which we compared the number of new cells built per day, measured at 24-hour intervals for  
466 a period of five days in function of nest architecture ( $n = 6$  colony replicates per type). The  
467 model accounts for fixed effects time (day of observation) and nest architecture plus their  
468 interaction, and included the natural logarithm of colony size as a model offset (average count  
469 of workers visible in 20 video frames collected at 30-second intervals for a period of 10  
470 minutes). Colony ID was included as a random intercept and an observation-level random  
471 effect was included to take into account overdispersion. (B) Pairwise contrasts in daily cell  
472 building rates between the two nest architectures show no significant differences in building  
473 efficiency (ratio in the number of new cells built per day for colonies of average size) at any of  
474 the observation days. The table shows coefficients, standard errors (*SE*), lower and upper 95%  
475 confidence intervals (*LCL* and *UCL*), *z* values and *p* values (*NS* = not significant, i.e.  $p > 0.05$ ).  
476

(A) Model coefficients	term	coefficient	SE	z value	p value	
fixed effect	(Intercept)	-0.15	0.19	-0.80	0.42	
fixed effect	scale(time)	0.03	0.05	0.57	0.57	NS
fixed effect	nest_architecture1	-0.04	0.19	-0.23	0.82	NS
fixed effect	scale(time):nest_architecture1	-0.08	0.05	-1.54	0.12	NS
random intercept: observation	SD(Intercept)	0.19				
random intercept: colony ID	SD(Intercept)	0.46				
(B) Contrast (day)	ratio	LCL	UCL	z ratio	p value	
helicoidal / parallel (1)	0.95	0.43	2.09	-0.12	0.90	NS
helicoidal / parallel (2)	1.04	0.49	2.24	0.11	0.91	NS
helicoidal / parallel (3)	1.14	0.54	2.43	0.35	0.73	NS
helicoidal / parallel (4)	1.26	0.58	2.69	0.58	0.56	NS
helicoidal / parallel (5)	1.38	0.62	3.04	0.79	0.43	NS

477

478

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