

1 **The central role of the interspecific interactions in the evolution of microbial communities**

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15 **Conflict of interest**

16 The authors declare that they have no conflict of interest.

## 17 **ABSTRACT**

18           The interspecific interactions play an important role in the establishment of a community  
19 phenotype. Furthermore, the evolution of a community can not only occur through an evolution of the  
20 species composing the community but also of the interactions among them. In this study, we investigated  
21 how widespread was the evolution of interspecific interactions in the evolutionary response of eight  
22 two-bacterial species communities regarding productivity. We found evidence for an evolution of the  
23 interactions in half of the studied communities which gave rise to a mean change of 15% in community  
24 productivity as compared to what was expected from the individual responses. Even when the  
25 interactions did not evolve themselves, they influenced the evolutionary responses of the bacterial  
26 strains within the communities which further affected community response. We found that the evolution  
27 within a community often promoted an adaptation of the bacterial strains to the abiotic environment,  
28 especially for the dominant strain in a community. Overall, this study suggested that the evolution of  
29 the interspecific interactions was frequent and that it could increase community response to evolution.  
30 We propose that the existence of an evolution of the interspecific interactions can justify the  
31 consideration of the community as a unit of selection.

32

33 **Key-words:** interspecific interactions, experimental evolution, synthetic bacterial communities,  
34 productivity, abiotic environment

35

## 36 **INTRODUCTION**

37           What makes a community is the existence of interactions between the species [1, 2]. The  
38 interactions give rise to emergent properties at the community-level i.e. properties that are not  
39 predictable from the sum of the properties of the component species [3, 4]. It is thus relevant to consider  
40 the phenotype of a community as a whole, especially since it is increasingly recognized that community  
41 phenotype can respond to the evolution [5]. The evolution of community phenotype can involve or not  
42 an evolution of the interspecific interactions. From a theoretical standpoint, it is accepted that microbial

43 community evolution can occur through genetic changes in the community members (e.g. through  
44 mutations, horizontal gene transfer, gene loss [6, 7]). Depending on the authors, changes in the relative  
45 abundances of the species within a community are also considered as part of the evolution of the  
46 community [8, 9] or not [6, 7]. In the latter case they are referred to as “ecological sorting” [10].  
47 Furthermore, as well as the interactions are involved in the establishment of community phenotype,  
48 there is also evidence that they can contribute to the evolution of this phenotype. This has been  
49 investigated in the field of artificial selection at the community level through modelling [11] and  
50 experimental approaches on communities made of two beetle species [12]. Both approaches highlighted  
51 that genetic changes in the species within a community are not always sufficient to explain the observed  
52 response of the community to selection and suggested that the interspecific interactions can be involved  
53 in community evolution. This is likely the strongest argument to support the idea that communities are  
54 units of selection.

55 In parallel, other studies aiming at understanding the evolutionary dynamics of microbial  
56 communities, especially in response to environmental changes, provided detailed assessments of the  
57 evolution of interspecific interactions in synthetic communities. It has been shown that, in a two-species  
58 bacterial community, a mutation in one of the two strains induced a shift from a commensal interaction  
59 to a more exploitative one [13]. This shift in the interaction occurred after five days of experimental  
60 evolution and gave rise to an enhanced community productivity. It indicates that the interactions can  
61 evolve through the evolution of one of the community members. Another way for the interactions to  
62 evolve is through the evolution of multiple species in a community. An experimental study showed that,  
63 in a four-species bacterial community, changes in resource use in the four species when experimentally  
64 evolved in polyculture reduced the occurrence of negative interspecific interactions [14]. It was  
65 associated with a higher productivity at the community level than this of a community which was built  
66 from the four species evolved in isolation. Changes in the interactions through the evolution of several  
67 species can also result from co-evolution, i.e. reciprocal adaptive changes in two populations or species  
68 [15]. Coevolution is different from evolution in response to the presence of a species as it involves  
69 adaptation and counter-adaptation in the interacting species. In experimental conditions, coevolution

70 can be evidenced either by tracking the evolutionary changes in each of the co-cultured species or by  
71 comparing the evolutionary responses in treatments where coevolution is allowed or not [16].

72 An additional level of complexity emerges from the fact that the evolution of the interspecific  
73 interactions can depend on the abiotic environment. For example, in bacterial communities, the  
74 evolution of the interspecific interactions can be promoted by a structured environment, allowing the  
75 formation of biofilm, as compared to a homogeneous environment [13]. It has also been shown that the  
76 involvement or not of the interactions in a bacterial community evolutionary response can depend on  
77 the resources or on the pH of the culture medium [10]. Interestingly, it has been shown that the  
78 productivity of a community increased as compared to the ancestral community only when the  
79 interactions were involved in the community response to evolution (and in the most diverse communities  
80 only) [10]. To go further, the abiotic environment can be modified by a species which can influence the  
81 evolution of other species in a community, this is referred to as niche construction [17]. It has been  
82 shown that the pairwise interaction between a bacteria and a yeast shifted from commensalism to  
83 amensalism and then to antagonism when the environment started to be changed by the yeast. Indeed,  
84 the excretion of a bacterial growth inhibitor promoted the evolution of resistance in the bacterial  
85 population which lowered the fitness of the yeast [18]. Thus, eco-evolutionary feedbacks are also  
86 involved in the evolution of the interactions and of the communities.

87 There are many studies that illustrate well the evolution of the interspecific interactions, the  
88 question is not anymore *whether the interactions can evolve* but *how important is the evolution of the*  
89 *interactions in the communities* [7]. In this study, we aimed at providing an insight into the prevalence  
90 of the evolution of interactions in the evolution of community phenotype. Following a five-month  
91 experimental evolution of synthetic bacterial communities [19], we re-isolated eight pairs of strains that  
92 evolved in different communities. We assessed community and community member phenotypes by  
93 measuring the optical density as a proxy of productivity. We compared them with the ancestral  
94 phenotypes and the phenotypes obtained by assembling the same strains evolved in isolation to discuss  
95 the evolution of interactions. We hypothesized that: *i*) the interspecific interactions played a role in the  
96 evolution of community phenotype (i.e. the phenotype of the evolved community would be different  
97 from this of a community reconstructed from strains that evolved in isolation); *ii*) this role occurred

98 through an evolution of the interactions themselves (i.e. the evolutionary response of the community is  
99 not predictable from the evolutionary responses of the community members); *iii*) the evolution of the  
100 community phenotype depended on the abiotic environment. To verify this third hypothesis, we assessed  
101 the phenotype of the evolved strains and communities in a second abiotic environment in order to discuss  
102 the adaptation to the abiotic conditions of the environment of the experimental evolution.

## 103 **MATERIALS AND METHODS**

### 104 *Origin of the studied communities*

105 The eight two-strain communities studied in this experiment stemmed from an experimental  
106 evolution procedure in which bacterial strains (= monocultures) and communities were grown for five  
107 months with a serial transfer each 3.5 days. This experiment involved 18 laboratory strains that were  
108 used to create communities differing for their initial richness levels (see [19]). During the experimental  
109 evolution, the strains and communities were grown in sterile 2 ml deep-well plates (Porvair Sciences,  
110 Wrexham, UK) filled with 1 ml of a mix of 1:5 lysogeny broth (LB) and 1:5 tryptic soy broth (TSB),  
111 hereafter called EE medium for Experimental Evolution, and placed at 28°C without shaking. An optical  
112 density (OD) measurement was performed at each serial transfer (as a proxy of productivity) and the  
113 transfer occurred following two treatments: artificial selection (where the transferred replicate was the  
114 one with the highest OD among ten) and no artificial selection (where the replicate was transferred  
115 whatever its OD). The monocultures and communities were stored at -80°C in 30% glycerol before the  
116 experimental evolution (ancestors) and after the experimental evolution (evolved strains and  
117 communities). In a first step of isolation, all of the communities of richness level 2 (six), both under  
118 artificial selection and no artificial selection (see [19]), were considered for being analysed in the present  
119 study. In a second step, all of the communities of richness level 4 (six) either under artificial selection  
120 or under no artificial selection were also considered to complete the experimental design. The pairs of  
121 strains that were finally included in the experiment are presented in Table 1 and responded to the  
122 following criteria: successful isolation of the strains from the evolved community and availability of the  
123 corresponding strains evolved in isolation.

124

### 125 *Isolation of the strains from the evolved communities*

126 To isolate the strains that evolved in communities, we revived the evolved communities from  
127 the glycerol stocks by growing them on agar plates (EE medium) by streaking. After 72h of growth at  
128 28°C, we picked the colonies of differing morphologies and placed them on new separated agar plates  
129 by streaking. After a new cycle of growth, one colony per plate was picked, placed in 200  $\mu$ l of 0.9%  
130 NaCl and 100  $\mu$ l of this suspension were plated on an agar plate with glass beads. At this step, 2  $\mu$ l of  
131 suspension were used to perform a PCR for the identification of the strains (see below). After a new  
132 cycle of growth, several colonies were picked on each plate and put in 20 ml of medium in a flask (48h,  
133 120 rpm). 800  $\mu$ l of suspension were then stored at -80°C in 800  $\mu$ l of 60% glycerol. As these isolation  
134 steps required four growth cycles during which evolution could act, we also performed these four growth  
135 cycles in the same conditions for the corresponding ancestral and evolved in isolation strains.

136

### 137 *Identification of the strains*

138 A PCR targeting 16S rRNA gene with the primers 27F/1492R [20] was performed for each  
139 strain isolated from the evolved communities. A digestion of the PCR products was then performed with  
140 the *AluI* restriction enzyme and followed by an electrophoresis for the identification of the strains at the  
141 genus level. For the genera that were represented by several strains in our experiment (i.e. *Pseudomonas*  
142 and *Escherichia*), we performed further analyses for an identification at the strain level. We used data  
143 from *gyrB* sequencing at the community level to determine which *Pseudomonas* strain was present in  
144 the community and coupled it with analyses at the strain level for formal identification. The different  
145 strains were identified based on the presence or not of *atzD* gene (assessed by PCR) and the resistance  
146 or not to nalidixic acid and amoxicillin (assessed by growing the strains on agar plates containing a mix  
147 of the two antibiotics at a final concentration of 100  $\mu$ g.ml<sup>-1</sup>). *Escherichia coli* K12 and *Escherichia coli*  
148 WA803 were identified based on their ability to do or not lactose fermentation (which was assessed by  
149 growing the strains on agar plates on Drigalski agar medium).

150

### 151 *Evolutionary history treatments*

152 Each of the two strains of a community (eight in total, hereafter identified as communities A to  
153 H; Table 1) was grown in its ancestral version (i.e. before experimental evolution), in its “evolved in  
154 isolation” version (i.e. after experimental evolution as an isolated strain) and in its “evolved in  
155 community” version. It resulted in six treatments (two strains and three evolutionary histories per strain;  
156 Figure 1a). Within each community, the most productive (highest OD at 3.5 days) of the two ancestral  
157 strains was referred to as “strain 1” and the least productive was referred to as “strain 2”. In addition,  
158 each community was grown in its ancestral version (i.e. co-culture of the two ancestral strains), in its  
159 “evolved in isolation” version (i.e. co-culture of the two strains that evolved in isolation) and in its  
160 “evolved in community” version (i.e. co-culture of the two strains that evolved together in a  
161 community). Two communities mixing ancestral strains and strains evolved in community were also  
162 included: mixed community 1 (i.e. co-culture of strain 1 evolved in community and ancestral strain 2)  
163 and mixed community 2 (i.e. co-culture of strain 2 evolved in community and ancestral strain 1). It  
164 resulted in five treatments at the community level plus the six treatments at the strain level (Figure 1b);  
165 each treatment was replicated eight times per each studied community.

166

### 167 ***Community construction, growth conditions and phenotype assessment***

168 Before the start of the experiment, each strain was revived from the glycerol stock and grown  
169 in 20 ml of EE medium in a flask (48h, 28°C, 110 rpm). The OD of the suspensions was measured  
170 (Infinite M200 PRO, Tecan, Männedorf, Switzerland) and the suspensions were diluted to a final OD  
171 of 0.002 in EE. The eight two-strain communities were built by mixing an equivalent volume of each of  
172 the suspensions of the required strains. Then, two plates per community were inoculated with the  
173 suspensions at OD 0.002: a 2 ml deep-well plate (1 ml of suspension per well, eight replicates per  
174 treatment) and a honeycomb plate (Thermo Fisher Scientific, Waltham, Massachusetts, USA; 400  $\mu$ l of  
175 suspension per well, eight replicates per treatment). The growth conditions in deep-well plates were:  
176 28°C, no shaking; the OD was measured after 3.5 days of growth by homogenising the well content,  
177 pipetting 200  $\mu$ l of suspension and transferring it into a new plate for OD measurement at 600 nm  
178 (Infinite M200 PRO). These growth conditions were identical to the growth conditions of the  
179 experimental evolution, hereafter we refer to these conditions as “environment 1”. The growth

180 conditions in honeycomb plates were: 28°C, 15 s of shaking 5 s before each OD measurement (600 nm;  
181 Bioscreen, Oy Growth Curves Ab Ltd, Helsinki, Finland), one measurement every 30 min. These growth  
182 conditions were different from these of the experimental evolution, hereafter we refer to these conditions  
183 as “environment 2”.

184

### 185 **Statistical analyses**

186 The OD after 3.5 days of growth was analysed in two steps with two linear mixed models. The  
187 following model was used to analyse the effect of the evolution on strain and community phenotypes:

$$188 \quad Y_{ijkl} = \mu + \alpha_i + \beta_j + \gamma_k + (\alpha\beta)_{ij} + (\alpha\gamma)_{ik} + (\beta\gamma)_{jk} + (\alpha\beta\gamma)_{ijk} + I_l + E_{ijkl}$$

189  $Y_{ijkl}$  is the OD of the biological entity  $i$  (three levels: strain 1, strain 2, community), of identity  $l$  (24  
190 levels: strain or community identity), of evolutionary history  $j$  (three levels: ancestor, evolved in  
191 isolation, evolved in community), in environment  $k$  (two levels: environment 1, environment 2).  $\mu$  is the  
192 intercept,  $\alpha_i$  is the effect of the biological entity,  $\beta_j$  is the effect of the evolutionary history,  $\gamma_k$  is the  
193 effect of the environment. The interaction effects between  $i$ ) the biological entity and the evolutionary  
194 history  $(\alpha\beta)_{ij}$ ;  $ii$ ) the biological entity and the environment  $(\alpha\gamma)_{ik}$ ;  $iii$ ) the evolutionary history and the  
195 environment  $(\beta\gamma)_{jk}$ ;  $iv$ ) the biological entity, the evolutionary history and the environment  $(\alpha\beta\gamma)_{ijk}$   
196 were also included in the model.  $I_l$  is the random effect of the strain or community identity,  $E_{ijkl}$  is the  
197 residual error.

198 A second linear mixed model was built to analyse the effect of the evolutionary history of the  
199 community members on the community phenotype:

$$200 \quad Y_{jkl} = \mu + \beta_j + \gamma_k + (\beta\gamma)_{jk} + I_l + E_{jkl}$$

201  $Y_{jkl}$  is the OD of the community of identity  $l$  (8 levels: A to H), of evolutionary history  $j$  (five levels:  
202 ancestor, evolved in isolation, evolved in community, mixed 1, mixed 2), in environment  $k$  (two levels:  
203 environment 1, environment 2).  $\mu$  is the intercept,  $\beta_j$  is the effect of the evolutionary history,  $\gamma_k$  is the  
204 effect of the environment,  $(\beta\gamma)_{jk}$  is the effect of the interaction between the evolutionary history and  
205 the environment.  $I_l$  is the random effect of the community identity,  $E_{jkl}$  is the residual error.



206 To go into the details of the responses for each community, the OD after 3.5 days was then  
207 analysed with a linear model that included the identity of the individual as a fixed effect factor as well  
208 as the evolutionary history and the interaction between the identity and the evolutionary history. One  
209 model was built for the strains and one for the communities in both environments. Then, the  
210 predictability of the community evolutionary response was analysed by comparing the response of the  
211 community (i.e. change in OD during experimental evolution) to *i*) the response of strain 1 evolved in  
212 community, *ii*) the response of strain 2 evolved in community *iii*) the sum of the responses of strains 1  
213 and 2 (which corresponds to the expected response under the hypothesis of an additivity of the individual  
214 responses, i.e. the absence of evolution of interspecific interactions). The mean responses and the  
215 corresponding 95% confidence intervals were obtained by bootstrapping (1 000 iterations of the  
216 calculation of the response from randomly sampled values with replacement).

217 All the analyses were performed with R software version 3.6.3 with lmerTest package for linear  
218 mixed models [21], car package for type II analyses of variance [22] and emmeans package for pairwise  
219 comparisons [23].

220

## 221 **RESULTS**

### 222 *The strains' responses are driven by their initial productivity in monoculture*

223 The effect of the evolutionary history on optical density (OD) depended on the biological entity,  
224 i.e. whether the considered phenotype was this of the community or of the community members, and it  
225 also depended on the environment (biological entity\*history\*environment:  $\chi^2=48$ ;  $p_{df=4}=1.0 \times 10^{-9}$ ; Table  
226 S1). Strain 1 and strain 2, the initially most and least productive strain respectively, responded  
227 differently to the evolution in environment 1. The OD of strain 1 when evolved in community tended to  
228 be higher than this of strain 1 as an ancestor and was higher than strain 1 evolved in isolation  
229 (respectively  $0.68 \pm 0.18$ ,  $0.66 \pm 0.12$ ,  $0.55 \pm 0.22$ ; Figure 2). On the contrary, strain 2 showed a lower OD  
230 when evolved in community as compared to evolved in isolation ( $0.30 \pm 0.12$  and  $0.37 \pm 0.18$   
231 respectively).

232

233 ***Community response is driven by the most productive strain in monoculture***

234 In environment 1, the OD of the communities composed of strains that evolved together was  
235 not significantly different from the OD of the ancestral communities (respectively  $0.65\pm 0.18$  and  
236  $0.63\pm 0.13$ ; Figure 2). But, it was higher than the OD of the communities in which the members evolved  
237 in isolation ( $0.47\pm 0.15$ ) suggesting that the evolution in community (i.e. co-culture) did not produce the  
238 same outcome than an evolution in isolation. However, the communities composed of strains that  
239 evolved together produced the same phenotype as mixed communities (one ancestral and one evolved  
240 strain, Figure 3).

241 The OD of the community was not different from the OD of strain 1 whatever the evolutionary  
242 history (respectively  $0.61\pm 0.16$  and  $0.62\pm 0.18$  on average; Figure 2). Also, the response of the  
243 community to the evolutionary history was similar to this of strain 1 (i.e. trend to increase in OD with  
244 an evolution in community as compared to the ancestor and trend to decrease in OD with an evolution  
245 in isolation; Figure 2). Thus, community phenotype seemed to be driven by strain 1.

246

247 ***Community response involves an evolution of the interactions in half of the cases***

248 For all of the studied communities, there was a significant difference in OD between the evolved  
249 in community and evolved in isolation treatments (Figure 4) which highlighted the importance of the  
250 interactions in the evolution of community phenotype. This difference was in favour of the evolved in  
251 community treatment in seven of the eight communities (Figure 4). One evolved community showed no  
252 difference in OD as compared to the ancestral community (community G; Figure 4). Three communities  
253 showed differences in OD with the communities of all other evolutionary histories (communities A, C  
254 and F). It indicated that, in these cases, the only way to obtain the evolved community phenotype was  
255 through the presence of the two strains in their evolved in community version. The four remaining  
256 communities (B, D, E and H) showed no difference in OD as compared to at least the mixed community  
257 1 (Figure 4) highlighting the role of strain 1 in the expression of the evolved community phenotype in  
258 these cases.

259           The evolutionary response of four of the communities was predictable neither from the  
260 responses of the community members nor from the expected response under the hypothesis of an  
261 additivity of the individual responses, i.e. an absence of evolution of the interspecific interactions  
262 (communities A, C, F and H; Figure 5). It suggested that the evolutionary response involved an evolution  
263 of the interactions. In communities D and E, the community response was predictable from the response  
264 of strain 1 and in community B, it was predictable from the sum of the responses of the two strains  
265 (Figure 5). Thus, we did not evidence an evolution of the interspecific interactions in these communities.

266

### 267 *The abiotic environment influences the evolutionary responses*

268           In environment 2, where the conditions differed from these of the experimental evolution, strain  
269 2 showed a similar response to the evolutionary history than in environment 1 (Figure 2). On the  
270 contrary, the responses of strain 1 and of the community changed: the highest OD was observed for the  
271 ancestors followed by evolved in community and by evolved in isolation treatments. The expression of  
272 the “evolved phenotype” thus depended on the abiotic environment. As in environment 1, community  
273 phenotype and community response to the evolutionary history were similar to strain 1 (Figure 2). And,  
274 the OD of the mixed community 1 was similar to this of the community in which the strains evolved  
275 together (respectively  $0.97\pm 0.20$  and  $0.97\pm 0.13$ ) whereas mixed community 2 showed a higher OD that  
276 did not differ from this of the ancestral community (Figure 3), again highlighting the influence of strain  
277 1 on community phenotype.

278           Going into the details of the responses of the different communities, some of the changes in the  
279 strain and community phenotypes were consistently observed whatever the environment whereas others  
280 were not detectable or occurred in the opposite direction when the environment changed (Figure 6a).  
281 The phenotypic change in response to evolution in the evolved community (i.e. change in OD as  
282 compared to the ancestral community or to the community with evolved in isolation members) was  
283 maintained in environment 2 for three communities over eight (A, C and F; Figure 6b). When a strain  
284 that evolved in community showed a significant increase in OD as compared to the ancestor, this pattern  
285 was always lost when the environment changed (Figure 6c and d). On the contrary, when a strain that

286 evolved in community showed a significant decrease in OD as compared to the ancestor, this pattern  
287 was maintained in environment 2 in three cases over four. The changes in OD in the strain that evolved  
288 in community as compared to the corresponding strain evolved in isolation were maintained in  
289 environment 2 in nine cases over 13 (Figure 6c and d).

290

## 291 **DISCUSSION**

292 We showed that the evolution of the strains in a community was influenced by the interspecific  
293 interactions. Indeed, an evolution in isolation did not produce the same phenotype as an evolution in  
294 community (Figure 2). These results are in accordance with an increasing body of literature that  
295 highlights the effect of the biotic context, i.e. of the evolution within a community, on the evolutionary  
296 response and on the fitness of the community members [10, 13, 24, 25]. The characterization of the  
297 community members on the basis of their productivity before experimental evolution allowed a good  
298 explanation of their responses to evolution, despite the fact that we grouped species from different  
299 genera under the entities “strain 1” and “strain 2” (model  $R^2=0.85$ ; Table S1). To go further, we found  
300 that the most productive strain had a dominant role in explaining community phenotype and community  
301 response to evolution (Figure 2). It was probably highly linked to the fact that the studied community  
302 phenotype was productivity but, it also suggested that the most productive strain in monoculture was  
303 also the dominant strain in the community as previously observed on two-species communities [26].

304 Beyond an effect at the individual level, our results indicated that the evolution of community  
305 phenotype, i.e. productivity, was influenced by evolutionary changes in interspecific interactions.  
306 Indeed, as in a previous study [14], the phenotype of the evolved community could not be obtained by  
307 reconstructing a community from strains that evolved in isolation (Figures 2 and 4). We observed an  
308 effect of the interactions on community evolutionary response in all of the communities that showed an  
309 evolution in their phenotypes, i.e. seven among the eight (Figure 4, except G). However, this effect of  
310 the interactions depended on the studied community and occurred through three different ways.  
311 Community phenotype evolved through *i*) an evolutionary response of one strain conditionally to the

312 presence of the second strain without evolution of the interaction (communities D and E), *ii*) an  
313 evolutionary response of the two strains conditionally to their respective presence without evolution of  
314 the interaction (B), *iii*) an evolution of the interaction itself under the influence of one (H) or of the two  
315 strains (A, C and F; Figures 4 and 5). Thus, the evolution of the community phenotype involved an  
316 evolution of the interactions in more than half of the cases. It suggested that the implication of the  
317 evolution of the interactions in the evolution of community phenotype is not rare in experimental  
318 evolution of microbial communities. In another study [11], a modelling approach allowed to estimate  
319 that the responses of ecosystems to evolution under artificial selection would involve an evolution of  
320 the interspecific interactions in 4% of cases when targeting an increase in a property and in 38% of the  
321 cases when targeting a decrease in a property (this could be modulated by specific experimental  
322 choices). More recently, it has been estimated that the evolution of the productivity of beech tree  
323 bacterial communities was explained by ecological sorting at 0.35%, by additive evolution at 17.7% and  
324 by the evolution of the interspecific interactions at 14.3% [10]. It is not straightforward to estimate the  
325 importance of the interspecific interactions in community evolutionary dynamics as their role seems to  
326 be highly dependent on the studied community but, together, these results suggest that it is relevant to  
327 consider the evolution of the interactions when studying community dynamics, at least in laboratory  
328 experiments. Since interspecific interactions, which are not definable below the level of the community,  
329 are potential determinants of the evolution of a community, it can be necessary to consider the  
330 community as a selection unit.

331 In the communities in which an evolution of the interspecific interactions was detected, the  
332 change in community productivity was higher than expected but the direction of this change was  
333 community-dependent. The response to evolution when the interactions evolved (i.e. in communities A,  
334 C, F and H) gave rise to a mean change in productivity of  $35 \pm 13\%$ , i.e.  $+15 \pm 7\%$  as compared to what  
335 was expected from the individual responses. However, in two communities over four (C and F) this  
336 change was negative (i.e. the productivity of the evolved community was lower than this of the ancestral  
337 community) and in one case it occurred whereas the sum of the individual responses was positive (C;  
338 Figure 5). In the other studies that reported an evolution of the interactions, the effect was to enhance

339 community productivity [10, 13, 14]. Furthermore, some authors registered a reduction of the negative  
340 interactions and the evolution towards positive ones [14]. In our study, we did not characterize the  
341 interactions, but we can hypothesize that different types of interactions (i.e. positive or negative) led to  
342 different responses of the community phenotype to the evolution of the interactions.

343         The influence of the abiotic environment on the evolutionary responses of the communities and  
344 community members was community-dependent. For three of the four communities in which an  
345 evolution of the interactions was detected, the response to evolution was consistently observed in the  
346 two environments (communities A, C and F; Figure 6b) contrary to what was observed for the strains  
347 composing these communities (Figure 6c and d). A possible explanation would be that the evolutionary  
348 responses of the strains involved an adaptation to the abiotic component (so that the response is not  
349 consistently observed when changing the environment) but that the expression of the “evolved”  
350 interaction did not rely on an adaptation to the abiotic component or relied on an adaptation to a  
351 condition that is found in the two environments [27]. Previous studies have shown the importance of the  
352 resources on the outcome of the evolution of interactions [14, 28]. As the same culture medium was  
353 used in the two environments in our experiment, it could suggest that the evolution of the interactions  
354 implied modifications in resource sharing.

355         Our results also suggested that the evolution in community often promoted an adaptation of the  
356 strains to the abiotic component, especially in strain 1 (Figure 6c and 6d). This is not expected since the  
357 theory predicts that there are trade-offs between the adaptation to the abiotic and to the biotic  
358 components [6, 14] and, that biotic forces are dominant over abiotic forces in driving species evolution  
359 (Red Queen hypothesis; [29]). Thus, it is expected that strains that evolved in isolation would show a  
360 better adaptation to the abiotic environment than strains that evolved in community. It has been observed  
361 experimentally [14, 30] but seemed to be strain-dependent. Our results suggested that the interspecific  
362 interactions could have promoted evolutionary responses to the abiotic conditions, which can occur  
363 through competition for example [6]. These results may be linked to the structure of the environment.  
364 Indeed, it has been suggested that in homogeneous environments, the evolution would act through the  
365 selection of traits that are directly beneficial for the carrier species [7]. Thus, the evolutionary response

366 of a strain to the presence of another strain could be an adaptation to the abiotic conditions, which could  
367 have a direct and positive effect on the strain fitness.

368 In this study, we aimed at investigating the importance of the evolution of the interactions in  
369 community evolution. There was evidence for an evolution of the interactions in half of the studied  
370 communities. Moreover, we highlighted that, even when they did not evolve themselves, the interactions  
371 influenced the evolution of both community phenotype and community members' phenotype. It is thus  
372 relevant to consider that a community is not just an addition of evolving species, but that the community  
373 by itself, with evolving species interactions, can be the unit of selection. The present study included  
374 eight communities, eight bacterial strains belonging to five genera and focused on pairwise interactions  
375 only. Further studies involving higher levels of community complexity are needed to investigate how  
376 widespread is the importance of interspecific interactions in community evolutionary dynamics. To go  
377 further, our results suggested that the communities in which the interspecific interactions evolved were  
378 more likely to be independent on the abiotic environment to express the evolved community phenotype.  
379 This is of particular interest in the field of the artificial selection at the community level and its possible  
380 applications.

381

### 382 **Acknowledgements**

383 We thank Alain Hartmann and Baptiste Serbource, MERS team, INRAE Dijon, for their advice and the  
384 provision of the equipment allowing the assessment of the antibiotic resistance of the strains.

385

### 386 **Competing interests**

387 The authors declare that they have no conflict of interest.

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- 453

454 **Table 1 Two-strain communities studied in the experiment.** Some of the pairs of strains evolved in  
 455 the absence of other strains (i.e. in two-strain native communities), whereas other pairs evolved in the  
 456 presence of other strains (i.e. in four-strain native communities), this is specified into the column “Initial  
 457 richness level of the native community”. Some of the native communities evolved under artificial  
 458 selection whereas others evolved under “no artificial selection” (i.e. natural selection only), this is  
 459 specified in the column “Selection regime applied to the native community”. In each community, strain  
 460 1 is the most productive of the two strains (highest OD) and strain 2 is the least productive one (lowest  
 461 OD).

Community identifier	Strains	Initial richness level of the native community	Selection regime applied to the native community
Community A	1 <i>Variovorax</i> sp.38R 2 <i>Pseudopedobacter saltens</i> DSM12145	2 strains	No artificial selection
Community B	1 <i>Variovorax</i> sp.38R 2 <i>Pseudopedobacter saltens</i> DSM12145	4 strains	No artificial selection
Community C	1 <i>Pseudomonas knackmussii</i> DSM6978 2 <i>Variovorax</i> sp.38R	4 strains	No artificial selection
Community D	1 <i>Pseudomonas</i> sp. ADPe 2 <i>Escherichia coli</i> WA803	2 strains	No artificial selection
Community E	1 <i>Pseudomonas knackmussii</i> DSM6978 2 <i>Pseudopedobacter saltens</i> DSM12145	4 strains	No artificial selection
Community F	1 <i>Pseudomonas</i> sp. ADP3 2 <i>Escherichia coli</i> K12	4 strains	No artificial selection
Community G	1 <i>Escherichia coli</i> WA803 2 <i>Agrobacterium</i> sp.9023	4 strains	Artificial selection
Community H	1 <i>Pseudomonas</i> sp. ADPe 2 <i>Escherichia coli</i> WA803	2 strains	Artificial selection

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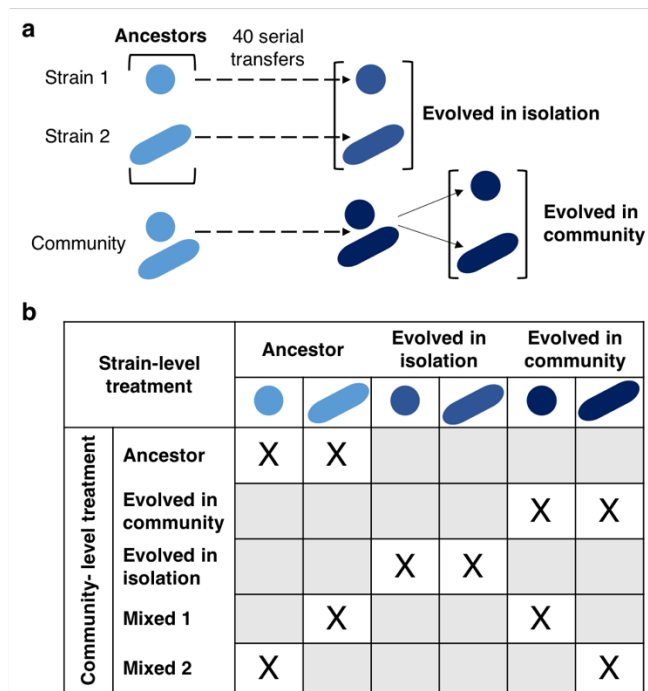
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475 **Figure 1 Experimental design. a)** Each bacterial strain was previously experimentally evolved in

476 isolation and as a member of a community [19]. At the end of this experimental evolution, the strains

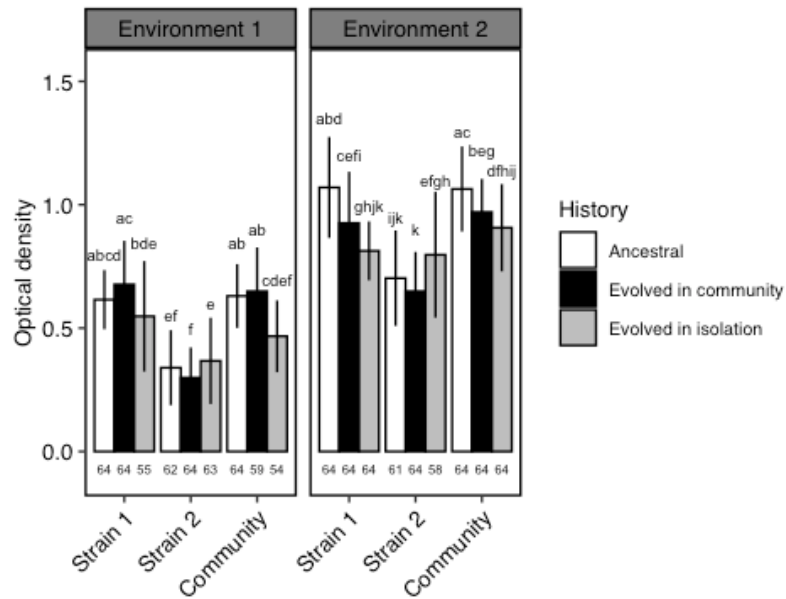
477 were isolated from the community in which they evolved. **b)** From the strains, different communities

478 were built: ancestor (co-culture of two ancestral strains), evolved in community (co-culture of two

479 strains that evolved together), evolved in isolation (co-culture of two strains that evolved in isolation),

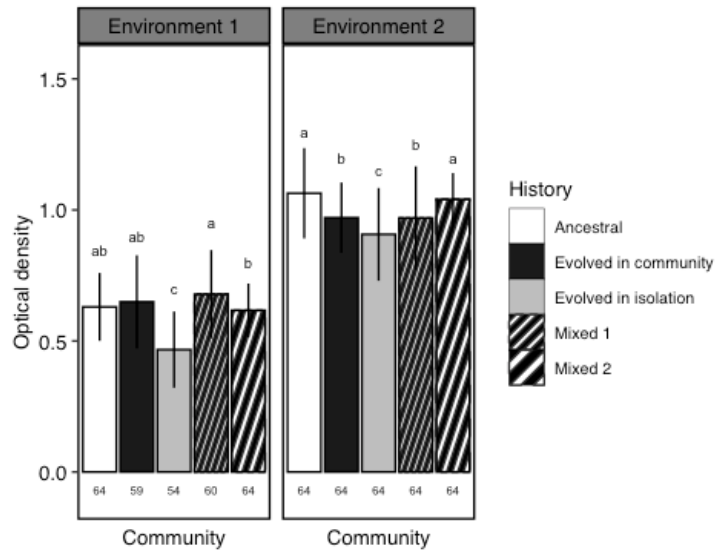
480 mixed 1 (co-culture of one ancestral strain and one strain evolved in community) and mixed 2 (co-

481 culture of one ancestral strain and one strain evolved in community conversely to mixed 1).



482

483 **Figure 2 Optical density of the community and the community members depending on the**  
484 **evolutionary history and the environment.** Environment 1: identical growth conditions to the  
485 experimental evolution; Environment 2: different growth conditions from the experimental evolution.  
486 Strain 1 is the most productive of the two strains in a given community (highest OD) and strain 2 is the  
487 least productive of the two strains (lowest OD). Community refers to the co-culture of strain 1 and strain  
488 2. Different letters represent significant differences in OD within a given environment. Mean values are  
489 given  $\pm$  SD. Sample sizes are given on the bottom of the graphs.



490

491 **Figure 3 Optical density of the communities depending on the evolutionary history of their**  
492 **members and the environment.** Environment 1: identical growth conditions to the experimental  
493 evolution; Environment 2: different growth conditions from the experimental evolution. Community  
494 refers to the co-culture of strain 1 and strain 2. In mixed community 1, the strain 1 evolved in community  
495 was grown with the ancestral strain 2. In mixed community 2, the ancestral strain 1 was grown with the  
496 strain 2 evolved in community. Different letters represent significant differences in OD within a given  
497 environment. Mean values are given  $\pm$  SD. Sample sizes are given on the bottom of the graphs.

Community identifier	History	Evolved in community						History	Community identifier
		Community	Strain 1	Strain 2	Community	Strain 1	Strain 2		
A	Ancestral	■	■	■	■	■	■	Ancestral	E
	Evolved in isolation	■	■	■	■	■	■	Evolved in isolation	
	Mixed 1	■	■	■	■	■	■	Mixed 1	
	Mixed 2	■	■	■	■	■	■	Mixed 2	
B	Ancestral	■	■	■	■	■	■	Ancestral	F
	Evolved in isolation	■	■	■	■	■	■	Evolved in isolation	
	Mixed 1	■	■	■	■	■	■	Mixed 1	
	Mixed 2	■	■	■	■	■	■	Mixed 2	
C	Ancestral	■	■	■	■	■	■	Ancestral	G
	Evolved in isolation	■	■	■	■	■	■	Evolved in isolation	
	Mixed 1	■	■	■	■	■	■	Mixed 1	
	Mixed 2	■	■	■	■	■	■	Mixed 2	
D	Ancestral	■	■	■	■	■	■	Ancestral	H
	Evolved in isolation	■	■	■	■	■	■	Evolved in isolation	
	Mixed 1	■	■	■	■	■	■	Mixed 1	
	Mixed 2	■	■	■	■	■	■	Mixed 2	

■ > ■ < ■ n.s. ■ n.a.

498

499 **Figure 4 Effect of an evolution in community on optical density in environment 1 depending on**  
500 **the community.** The OD of a community composed of strains that evolved together (in columns) is  
501 compared to the OD of a community including ancestral strains, strains evolved in isolation or one  
502 ancestral strain and one strain evolved in community (mixed 1 and mixed 2) (in rows). The OD of strains  
503 1 and 2 evolved in community (in columns) is compared to the OD of the corresponding strain as an  
504 ancestor or evolved in isolation (in rows). Blue: significantly higher. Red: significantly lower. Light  
505 grey: no significant difference ( $\alpha=0.05$ ). Black: not applicable.

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519 **Figure 5 Predictability of the evolutionary response of the community.** The observed evolutionary

520 responses of the community, strain 1 and strain 2 in environment 1 were expressed as the difference in

521 optical density as compared to the corresponding ancestor (i.e. ancestral community or ancestral strain

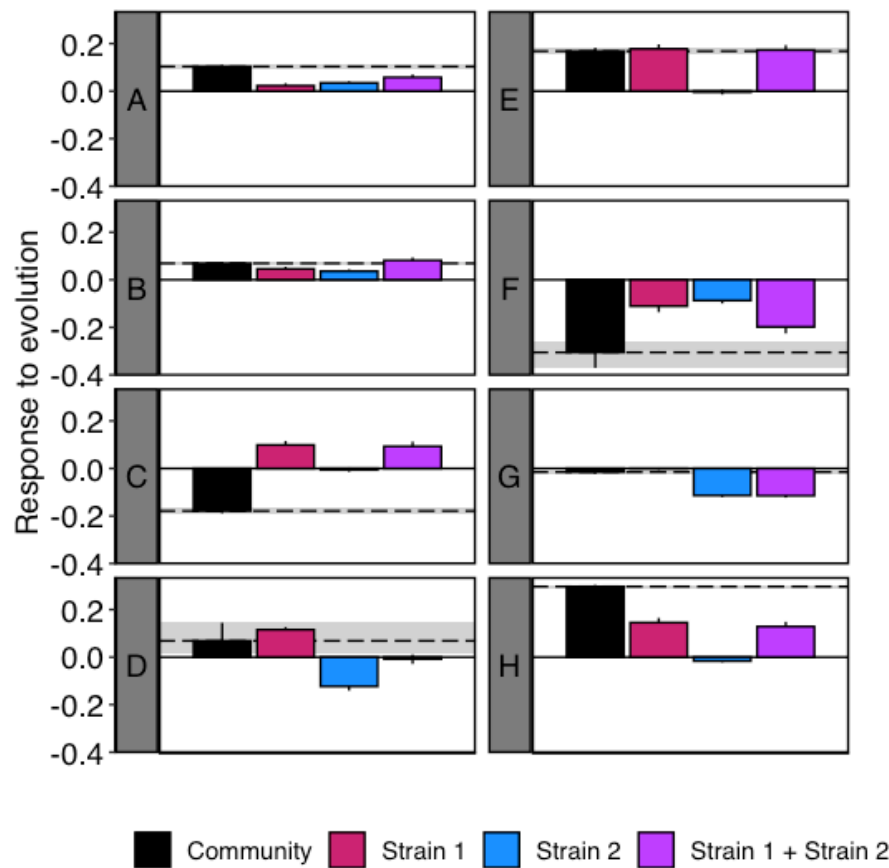
522 1 or ancestral strain 2 in environment 1). “Strain 1 + Strain 2” refers to the expected response to evolution

523 under the hypothesis of an additivity of the individual responses, it was obtained by summing the

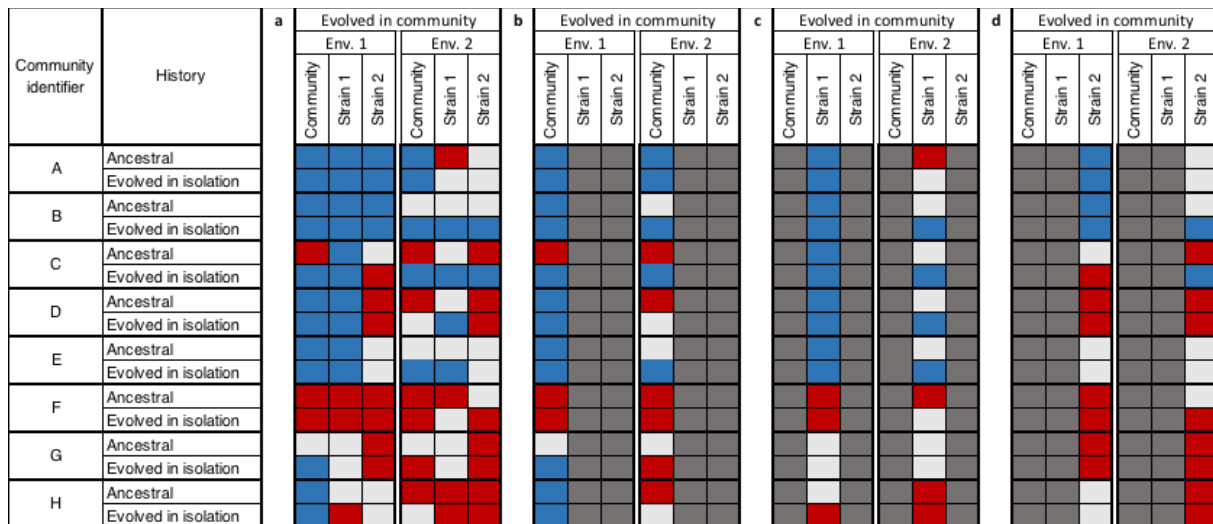
524 observed responses of strain 1 and strain 2. Bars represent 95% CI. On each graph, the black dashed line

525 represents the mean value of the response of the community and the grey area represents the associated

526 95% CI. Means and 95% CI were obtained by bootstrapping.







527

Blue > Red < Light grey n.s.

528 **Figure 6 Effect of the environment on the expression of the evolved phenotype.** The OD of a

529 community composed of strains that evolved together (in columns) was compared to the OD of a

530 community including ancestral strains or strains evolved in isolation (in rows). The OD of strains 1 and

531 2 evolved in community (in columns) is compared to the OD of the corresponding strains as ancestors

532 or evolved in isolation (in rows). The results are presented for both environments. Environment 1:

533 identical growth conditions to the experimental evolution; Environment 2: different growth conditions

534 from the experimental evolution. Blue: significantly higher. Red: significantly lower. Light grey: no

535 significant difference ( $\alpha=0.05$ ). The overall results are shown on panel a, and panels b, c, and d show

536 the results of the community, strain 1 and strain 2 respectively. On those panels, only the comparisons

537 of interest are shown, and the others are shaded in dark grey for readability.