

1 Extended-spectrum beta-lactamase antibiotic resistance plasmids have diverse transfer rates  
2 and can be spread in the absence of selection

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35 **Abstract**

36 Horizontal gene transfer, mediated by conjugative plasmids, is one of the main drivers of the  
37 global spread of antibiotic resistance. However, the relative contributions of different factors  
38 that underlie this plasmid spread are unclear, particularly for clinically relevant plasmids  
39 harboring antibiotic resistance genes. Here, we analyze nosocomial outbreak-associated  
40 plasmids that reflect the most relevant Extended Spectrum Beta-Lactamase (ESBL) mediated  
41 drug resistance plasmids to i) quantify conjugative transfer dynamics, and ii) investigate why  
42 some plasmid-strain associations are more successful than others, in terms of bacterial fitness  
43 and plasmid spread. We show that, in the absence of antibiotics, clinical *Escherichia coli*  
44 strains natively associated with ESBL-plasmids conjugate efficiently with three distinct *E. coli*  
45 strains and one *Salmonella enterica* Serovar Typhimurium strain. In more than 40% of the *in*  
46 *vitro* mating populations, ESBL-plasmids were transferred to recipients, reaching final  
47 transconjugant frequencies of up to 1% within 23 hours. Variation of final transconjugant  
48 frequencies was better explained by variation in conjugative transfer efficiency than by  
49 variable clonal expansion of transconjugants. We also identified plasmid-specific genetic  
50 factors, such as the presence/absence of particular transfer genes, that influenced final  
51 transconjugant frequencies. Finally, we validated the plasmid spread in a mouse model for  
52 gut colonization, demonstrating qualitative correlation between plasmid spread *in vitro* and  
53 *in vivo*. This suggests a potential for predictive modelling of plasmid spread in the gut of  
54 animals and humans, based on *in vitro* testing. Altogether, this may allow straightforward  
55 identification of resistance plasmids with high spreading potential and to implement  
56 quarantine or decolonization procedures to restrict their spread.

57 **Author summary**

58 Antibiotic resistance is a major obstacle to the treatment of bacterial infections in clinics.

59 Plasmids encoding antibiotic resistance genes can spread between bacteria in a density-

60 dependent manner and accelerate the rise of resistant bacterial strains. This is particularly

61 important for densely inhabited ecological niches such as the guts of humans and animals,

62 where many bacteria interact. Understanding the exact contribution plasmids make to the

63 global spread of antibiotic resistance remains an obstacle, because we lack quantitative

64 studies implementing large-scale experimental testing of conjugation rates between clinically

65 relevant bacterial strains. To counteract this knowledge gap, we studied clinical *Escherichia*

66 *coli* isolates from human patients that carry extended-spectrum beta-lactamase producing

67 plasmids. We found that these plasmids spread extensively through different bacterial

68 populations and that both bacterial- and plasmid-specific factors determined the extent of

69 plasmid spread. Our study combines detailed bioinformatic analyses, high-throughput *in vitro*

70 testing and validation in an animal model. It suggests a potential for laboratory testing to

71 understand and predict the spread of clinically relevant plasmids, including in the human gut

72 microbiota, and thereby generates insights into novel treatment strategies to manage

73 antibiotic resistance spread mediated by plasmids.

## 74      **Introduction**

75      The prevalence of antibiotic resistant bacterial pathogens is rising and continues to challenge  
76      the clinical use of antibiotics [1]. Infections with bacteria resistant to antibiotics are  
77      increasingly common and can result in death [2,3]. Importantly, resistance determinants are  
78      often plasmid-encoded. Plasmids can be transferred horizontally between different bacterial  
79      cells by conjugation, allowing rapid spread through diverse bacterial communities. This  
80      includes transfer among and between clinically relevant bacterial pathogens and commensals  
81      found in the gut microbiota of humans, farm animals, or in the environment [4–6]. In some  
82      cases, the role of selection imposed by antibiotics may be overestimated, because certain  
83      resistance plasmids can increase in frequency even in the absence of antibiotics [7–9] .

84

85      Whether a plasmid persists within a population depends on the plasmid as well as its  
86      association with a bacterial host. Some of these associations, such as *Escherichia coli*  
87      sequence type ST131 and plasmids of the IncFII family, carrying the *bla CTX-M* gene (which  
88      encodes a cefotaximase, conferring resistance to extended-spectrum beta lactams; ESBLs),  
89      are very successful and have become global threats [10–12]. ESBLs provide their bacterial host  
90      with resistance to beta-lactam antibiotics, such as the widely used penicillins and  
91      cephalosporins, and are generally encoded on plasmids of the incompatibility groups IncF and  
92      IncI [13–15]. Other plasmids, such as those carrying the carbapenemase-producing gene  
93      *blaOXA-48*, remain a clinical problem despite no association with a specific strain. For  
94      instance, *blaOXA-48* plasmids have been reported in *E. coli*, *Klebsiella spp.*, *Citrobacter spp.*,  
95      and *Enterobacter spp.* [16]. The family of Enterobacteriaceae is a key public health concern,  
96      as it contains some of the most important nosocomial pathogens and is responsible for the  
97      pandemic spread of ESBLs [10,15,17,18].

98

99 To counteract resistant pathogens and their successful transmission in hospitals,  
100 communities, and the environment, we need to improve our understanding of the factors  
101 that determine successful plasmid-strain associations and to elucidate the drivers of  
102 resistance plasmid spread in the presence or absence of antibiotics. Recent *in vitro* studies  
103 revealed several key factors driving changes in resistance plasmid frequency over time. If a  
104 plasmid of the same incompatibility group is already established in a potential recipient,  
105 surface- or entry exclusion may prevent further plasmid acquisition [19]. Plasmids can also  
106 increase transfer rate of co-residing plasmids, or allow other (mobilizable) plasmids to co-  
107 transfer [20,21]. However, once a plasmid is taken up by a bacterium, the plasmid replication  
108 system and its interaction with host factors define whether it can be replicated and stably  
109 maintained in the lineage. For example, the efficiency of plasmid transfer decreases if a  
110 recipient strain encodes a restriction system, to which the incoming plasmid is susceptible  
111 [22–24]. In some cases, compensatory mutations have been shown to reduce plasmid cost in  
112 the presence and absence of selective pressure [25]. In others, it is the high rates of  
113 conjugation that allow a plasmid to persist despite a growth disadvantage [26]. With the  
114 recent discovery of several novel defense systems against foreign DNA in bacteria [24],  
115 interactions between bacteria, particularly during horizontal gene transfer, become  
116 increasingly interesting to study. This may allow us to find tools to prevent spread of plasmids  
117 carrying antibiotic resistance genes.

118

119 The relative contributions of the various factors that drive plasmid spread remain poorly  
120 understood, particularly for clinical plasmids [11]. Past studies have largely focused on types  
121 of plasmids not directly relevant for resistance in clinical settings, or on individual plasmids

122 after moving them into model strains [22,25–27] (notable exception [28]). Studies using  
123 mouse models have contributed to our understanding of the processes that drive conjugation  
124 within the gut, but these have mostly been limited to laboratory strains with conjugative  
125 plasmids that are not clinically relevant [8,9,29,30]. Human-based studies that demonstrate  
126 horizontal transfer of resistance plasmids in the human gut [5,31] are of strong clinical  
127 relevance, but often rely only on genomic evidence and thus do not allow to observe the  
128 factors driving plasmid spread. There is therefore a shortage of studies connecting  
129 mechanisms of plasmid spread found *in vitro* with corresponding patterns *in vivo* and with  
130 the effective spread of plasmids in the clinics [11,32,33]. To improve the predictability of  
131 clinically relevant plasmid spread, we need a quantitative understanding of resistance plasmid  
132 transfer from their clinical host strains to diverse recipient strains, the effect of plasmids on  
133 the growth phenotypes of these recipient strains, subsequent transfer of newly acquired  
134 plasmids to other recipients, and the impact of bacterial host factors on these properties.

135

136 Here, we use clinical *E. coli* strains with their natively associated plasmids carrying ESBL genes  
137 (ESBL-plasmids) to investigate the drivers of plasmid spread, and to study the correspondence  
138 between *in vitro* and *in vivo* spread. Based on *in vitro* liquid culture mating assays in the  
139 absence of antibiotic selection, we found that the final frequency of ESBL-plasmid carrying  
140 recipient strains (transconjugants) was determined by donor-, recipient-, and plasmid-specific  
141 factors. The plasmid itself had the largest contribution to final transconjugant frequency, as  
142 all plasmids that carry functional transfer (*tra*) genes were found to spread. Additionally, none  
143 of the tested plasmids show evidence of a growth cost in any recipient strain. Using a murine  
144 model for gut colonization, we validated that these plasmids can spread efficiently *in vivo* in  
145 the absence of antibiotic selection. As *in vitro*, plasmid carriage of the tested plasmids was

146 not associated with a major cost or benefit in the gut, confirming the critical role of  
147 conjugation in driving the spread of antibiotic resistance plasmids. We showed that the range  
148 of transfer efficiencies *in vivo* are qualitatively predictable based on our *in vitro* testing.

149 **Results**

150 **Diverse clinical ESBL-plasmids spread extensively through recipient populations in the**  
151 **absence of antibiotics.** We investigated the rate at which ESBL-plasmids from eight clinical  
152 donor *E. coli* strains spread through four non-resistant recipient populations. The donor  
153 strains stem from hospitalized patients and are representative of clinically relevant ESBL-  
154 producing *E. coli* [34]. Of the four recipients, two *E. coli* strains were isolated from healthy  
155 human subjects [35], one *E. coli* strain was previously isolated from mice housed in our facility  
156 [8], and one is a pathogenic wild type strain of *Salmonella enterica* Serovar Typhimurium. The  
157 chosen donor and recipient strains spanned the phylogenetic diversity of *E. coli* [36,37] (Fig  
158 1) and contained many plasmids of various incompatibility groups (S1 Fig, S1 Table). Each  
159 donor carried one plasmid containing resistance genes, either of the plasmid family Incl1 or  
160 IncF (Table 1, S2 Fig). We found various virulence genes, including type 6 secretion systems  
161 (T6SSs, involved in bacterial killing), in donors and recipients (S3 Fig). The only strain with a  
162 pathogenic virulence profile is D4 (S3 Fig). All strains carry numerous intact prophage  
163 sequences (S1 File).

164

165 **Table 1: Clinical ESBL-plasmids in their native host strains (donors).**

Strain ( <i>E. coli</i> sequence type)	ESBL-plasmid	Plasmid size	Replicon (incompatibility group)	Resistance genes on the ESBL-plasmid†	Antibiotic resistance of strain*
D1 (ST 117)	p1B_Incl	111 kB	Incl1	aadA5; <b>blaCTX-M-1</b> ; dfrA17; sul2	Amp, Ceftri, Cotri
D2 (ST 648)	p2A_IncF	165.7 kB	IncFIA; IncFIB; IncFII	mph(A); catB3; aadA5; aac(6')-lb-cr; dfrA17; sul1; sul2; <b>blaOXA-1</b> ; tet(A); <b>blaCTX-M-27</b> ; aph(3'')-lb; erm(B)	Amp, Amo/C; Ceftri; Tobra; Cotri; Cipro
D3 (ST 648)	p3B_Incl	59.8 kB	Incl1	<b>blaCMY-42</b>	Amp; Amo/C; Pip-T; Ceftaz; Ceftri;

					Tobra; Amika; Cotri; Cipro
D4 (ST 40)	p4A_Incl	88.9 kB	Incl1	<b>blaCTX-M-1</b>	Amp; Ceftri
D5 (ST 131)	p5A_IncF	160 kB	IncFIB; IncFIC(FII); IncFIA	mph(A); aadA5; aac(6')-Ib-cr; dfrA17; sul1; <b>blaCTX-M-15</b> ; aac(3)-Ila; tet(A); catB3; <b>blaOXA-1</b>	Amp; Amo/C; Ceftaz; Ceftri; Cefe; Tobra; Cotri; Cipro
D6 (ST 131)	p6A_Incl/F	157 kB	Incl1; IncFIA; IncFIB; IncFII	<b>blaTEM-1B</b> , aac(3)-Ild, <b>blaCTX-M-8</b>	Amp; Ceftri; Cefe; Tobra; Cipro
D7 (ST 131)	p7A_IncF/Col156	134.9 kB	IncFIA; IncFIB; IncFII; Col156	mph(A); aph(3')-Ib; aadA5; dfrA17; sul1; sul2; tet(A); <b>blaCTX-M-27</b>	Amp; Ceftri; Cotri; Cipro
D8 (ST 69)	p8A_IncF	131 kB	IncFIA; IncFIB	dfrA14, mph(A), <b>blaCTX-M-14</b> , tet(B)	Amp; Ceftri; Cotri

†Genes encoding the ESBL phenotype are highlighted in bold.

\*Antibiotic resistance is defined as being above the EUCAST defined minimum inhibitory concentration breakpoint (MIC; see S2 Table for all antibiotics tested and MIC information). Donor strains fulfilled criteria for ESBL production based on EUCAST recommendations. ESBL mechanism was phenotypically and genotypically confirmed. Abbreviations: Amp = Ampicillin; Amo/C = Amoxicillin/Clavulanic acid; Pip-T = Piperacillin-Tazobactam; Ceftaz = Ceftazidim; Ceftri = Ceftriaxone; Cefe = Cefepim; Tobra = Tobramycin; Amika = Amikacin; Cotri = Cotrimoxazol; Cipro = Ciprofloxacin.

166 First, we performed conjugation assays between all clinical donors and non-resistant  
 167 recipients (approximately 1:1 ratio, referred to below as the “1<sup>st</sup> gen *in vitro* experiment”) and  
 168 measured conjugation as the final fraction of the recipient population that carried the plasmid  
 169 after 23 hours of growth (hereafter termed “final transconjugant frequency”). Five of the  
 170 eight ESBL-plasmids were transferred to more than one *E. coli* recipient (Fig 2) and transfer  
 171 stemming from the donor-plasmid pair D4-p4A\_Incl led to the highest final transconjugant  
 172 frequencies of ~0.1%. Final transconjugant frequencies spanned 5 orders of magnitude (Fig  
 173 2A). For the donor-plasmid pairs where we observed plasmid spread to multiple recipients,  
 174 average final transconjugant frequency varied depending on the donor-plasmid pair (effect  
 175 of donor-plasmid pair in a two-way ANOVA, excluding D2, D3, D7:  $F_{4,66} = 87.665$ ,  $P < 0.01$ ) and  
 176 among recipient strains (effect of recipient in the same two-way ANOVA:  $F_{2,66} = 5.439$ ,  $P <$   
 177 0.01). Furthermore, variation among donor-plasmid pairs depended on the recipient (donor-  
 178 plasmid pair×recipient interaction:  $F_{8,66} = 3.164$ ,  $P < 0.01$ ). These plasmids, natively associated  
 179 with *E. coli*, reached comparable maximal transconjugant frequencies in *S. Typhimurium*

180 recipient populations (RS, Fig 2B). In *S. Typhimurium*, variation across donor-plasmid pairs  
181 was similar to *E. coli* recipients, with the exception of p6A\_Incl, which did not spread to  
182 recipient RS.

183

184 Qualitatively, phylogenetic relatedness (Fig 1) between donor strains did not explain  
185 similarities in their plasmid transfer dynamics in the 1<sup>st</sup> gen *in vitro* experiment. For example,  
186 D5, D6 and D7 have effectively the same host background (ST 131), yet transferred their  
187 plasmids with very different efficiencies (Fig 2). By contrast, D1 and D8 are relatively  
188 phylogenetically distant, yet showed very similar transfer dynamics across recipients (Fig 2).

189 Phylogenetic relatedness between donor strain and recipient was not strongly associated  
190 with transfer efficiency either: D5, D6 and D7 are all equally closely related to recipients RE1  
191 and RE2, yet we observed very different final transconjugants frequencies, spanning four  
192 orders of magnitude, among these 6 donor-recipient pairs (Fig 2). Finally, the *S. Typhimurium*  
193 (RS) recipient is roughly equally phylogenetically distant to all *E. coli* donors used, yet we  
194 observed widely varying transfer efficiencies, similar to those observed across *E. coli*  
195 recipients.

196

197 To investigate the effect of genomic factors on the observed plasmid spread, we related final  
198 transconjugant frequencies to the presence or absence of *tra* (transfer) genes and toxin-  
199 antitoxin systems (TA-systems) on plasmids and of restriction-modification systems and  
200 CRISPR-Cas in donor and recipient strains (S2 File). We found that the presence of relevant  
201 *tra* genes on a plasmid was the main genomic factor that affected whether plasmids were  
202 able to spread. *Tra* genes encode the sex pilus and the proteins required for the conjugative  
203 transfer, and thus, when missing, plasmids cannot conduct their own transfer [38–40]. All

204 three cases in which the plasmid showed no or almost no spread to any recipient (i.e.  
205 p2A\_IncF, p7A\_IncF/Col156, p3B\_Incl) could be explained by their lack of functional *tra* genes  
206 (S2 File). All plasmids encode for numerous TA-systems, likely leading to plasmid addiction,  
207 and thus we could not find a relation between these and final transconjugant frequencies.  
208 Despite the large number of unique donor-recipient combinations, the analysis of CRISPR-Cas  
209 and restriction-modification systems did not allow a clear association between their presence  
210 and the observed plasmid spread (S2 File). *Tra* genes, were the only genomic factor for which  
211 presence or absence could be consistently associated with the final transconjugant frequency.

212

213 **ESBL-plasmids from clinical donors carry no significant cost after transfer to new hosts.** The  
214 final frequency of the ESBL-plasmids in different recipient populations spanned five orders of  
215 magnitude after 23 hours. This variation in plasmid spread could be driven by differences in  
216 horizontal transmission, or in clonal expansion of transconjugants. Thus, we investigated the  
217 effects of plasmids on bacterial growth in the absence of antibiotics for ten strain-plasmid  
218 combinations. We estimated growth rates of recipients and transconjugants over 24 hours  
219 and expressed plasmid cost as the growth rate of transconjugants relative to their respective  
220 plasmid-free strains (Fig 3A for *E. coli* recipients and 3B for *S. Typhimurium*). None of the novel  
221 host-plasmid combinations had a significantly different growth rate compared to the original  
222 host strain (Student's t-Test for *E. coli* hosts and Wilcoxon Rank Sum Test for *S. Typhimurium*,  
223  $P > 0.05$  in all cases, before and after Holm's correction for multiple testing). Although non-  
224 significant, the *S. Typhimurium* transconjugants showed a consistent trend towards higher  
225 relative growth rates when carrying an ESBL-plasmid, and were not normally distributed.  
226 Whether this trend can explain the final frequency of *S. Typhimurium* transconjugants (Fig  
227 2B) depends on the magnitude of the growth advantage, and the duration of the conjugation

228 assay. We calculated whether, under the assumption of purely exponential growth, the mean  
229 difference in growth rate between recipients and transconjugants would be large enough to  
230 explain the observed final transconjugant frequencies (S3 File). This is the case for the  
231 combination of donors D1 and D8 with *S. Typhimurium* recipients, but for *E. coli* recipients,  
232 clonal expansion is unlikely to explain the observed variation in final transconjugant  
233 frequencies.

234

235 **Plasmid transfer rate drives the final transconjugant frequency.** Because for most cases  
236 clonal expansion alone did not explain the observed final transconjugant frequencies, we  
237 investigated whether variable rates of horizontal transfer (conjugation) could explain this. A  
238 widely used method to estimate plasmid transfer rates is the mass action model from  
239 Simonsen *et al.* [41]. When we applied it to the data obtained in the 1<sup>st</sup> gen *in vitro* experiment  
240 (S3 Table), we found that across all donor-recipient combinations, the estimated conjugative  
241 transfer rates correlate strongly with the observed final transconjugant frequencies (Fig 4,  
242 Pearson's test,  $r = 0.99$ ,  $P < 0.001$ ). This suggests that plasmid transfer rates dictate final  
243 transconjugant frequencies.

244

245 A drawback of the Simonsen method is that it assumes that (i) the growth rates for donor,  
246 recipient and transconjugants are all equal, (ii) the conjugation rate does not change over  
247 time (i.e. that the rate of conjugation from the donors and newly formed transconjugants to  
248 the recipients is the same), and (iii) mating takes place in well-mixed liquid cultures. However,  
249 the transfer rate estimates of the experiments described here are not likely to be affected  
250 significantly by violation of these assumptions. Firstly, the observed differences in growth rate  
251 for donors, recipients, and transconjugants (Fig 3 and S3 File), are too small to drive shifts in

252 relative frequencies over the course of our conjugation assays. Secondly, transconjugants  
253 reached maximally 0.1% of the donor population size, which is comparatively small (S4 Fig).  
254 Therefore, the vast majority of transfer events results from donor-to-recipient conjugation  
255 rather than transconjugant-to-recipient transfer. Thirdly, regarding assumption (iii), we  
256 conducted a control experiment to estimate the number of transconjugants observed solely  
257 due to surface mating during the plating step of our conjugation assay (S4 Table). For most  
258 donor-recipient pairs we found that the number of transconjugants due to on-plate mating  
259 was negligible. The pairs D1-RE1 and D1-RE3, however, reached high transconjugant CFU  
260 counts due to surface-mating only (35% and 85% of the numbers observed in the 1<sup>st</sup> gen *in*  
261 *vitro* experiment). Overall, we interpret estimates from the Simonsen method as an accurate  
262 reflection of the conjugation rate in our experiments, but for D1-RE1 and D1-RE3, it may  
263 reflect the combined effect of conjugation in liquid and on the agar surface after plating.

264

265 **Variation in plasmid spread stems from plasmid, donor and recipient factors.** In the 1<sup>st</sup> gen  
266 *in vitro* experiment each plasmid was present in a single donor strain (Fig 2), preventing us  
267 from disentangling the effects of donor strain and plasmid on plasmid spread. Thus, we next  
268 performed an experiment under conditions identical to above, using 8 different plasmid  
269 donors (2<sup>nd</sup> gen *in vitro*, Fig 5). Each donor is a unique combination of strain (one of three  
270 different recipient strains from above) and plasmid (one of three different plasmids from  
271 above), isolated from among the transconjugants of the 1<sup>st</sup> gen *in vitro* experiment. The final  
272 transconjugant frequency varied among donor strains (effect of donor strain in a three-way  
273 ANOVA with plasmid, donor strain and recipient as factors, excluding plasmid p1B\_Incl, see  
274 Materials and methods:  $F_{2,90} = 150.133, P < 0.001$ ) and among plasmids ( $F_{1,90} = 49.717, P <$   
275  $0.001$ ). This observed variation among plasmids depended on both the recipient and the

276 donor strain. For instance, in cases where *S. Typhimurium* RS acted as the donor and recipient  
277 simultaneously, both Incl1 ESBL-plasmids yielded remarkably high final transconjugant  
278 frequencies of 40 % for p1B\_Incl and 39 % for p4A\_Incl (donor strain $\times$ plasmid interaction:  
279  $F_{2,90} = 96.352, P < 0.001$ ; recipient $\times$ plasmid interaction:  $F_{2,90} = 29.610, P < 0.001$ ). A second  
280 analysis including plasmid p1B\_Incl, but excluding donor RE2 (see Materials and methods)  
281 supported variation among donor strains ( $F_{1,93} = 560.269, P < 0.001$ ) and plasmids ( $F_{2,93} =$   
282  $156.075, P < 0.001$ ), and that variation among plasmids depended on recipient and donor  
283 strain (recipient $\times$ plasmid interaction ( $F_{4,93} = 26.104, P < 0.001$ ); donor strain $\times$ plasmid  
284 interaction:  $F_{2,93} = 3.999, P = 0.022$ ). As in our 1<sup>st</sup> gen *in vitro* experiment, average final  
285 transconjugant frequencies also varied among recipients ( $P < 0.001$  for effect of recipient in  
286 both three-way ANOVAs). Thus, the final frequency of transconjugants depended on all three  
287 factors of donor strain, plasmid, and recipient.

288

289 The final transconjugant frequencies in this 2<sup>nd</sup> gen *in vitro* experiment, where we replaced  
290 the native donor strains with transconjugants stemming from the 1<sup>st</sup> gen *in vitro* assay,  
291 differed strongly from those of the 1<sup>st</sup> gen *in vitro* experiment. They increased  $>10$ -fold in 11  
292 and decreased  $>10$ -fold in 4 out of the 24 mating populations (Figs 2 and 5). Because the  
293 transferred plasmids and recipient strains were equal to, and the absolute frequencies of  
294 donor and recipient comparable to, those of the 1<sup>st</sup> gen *in vitro* experiment (S4-5 Figs), we  
295 tested whether these differing transconjugant frequencies stem from a difference in transfer  
296 from native host versus transfer from a secondary host (S7 Fig). As donors of plasmid  
297 p1B\_Incl, we used its native host D1 and its transconjugants stemming from conjugation with  
298 recipients RE1 and RS, both carrying the marker plasmid pACYC184, and an additional D1  
299 strain carrying pACYC184. First, we tested whether the presence of pACYC184 in donors could

300 affect the transfer of ESBL-plasmids. Indeed, pACYC184 in D1 had a significantly negative  
301 effect on transfer of p1B\_Incl to RE1 (Wilcoxon Rank Sum Test,  $P = 0.035$  after Holm's  
302 correction for multiple testing) and to RS (Student's t-Test,  $P = 0.042$  after Holm's correction  
303 for multiple testing). Although significant, the effect of pACYC184 was small compared to the  
304 difference in transconjugant frequency that resulted from transfer from native versus 2<sup>nd</sup> gen  
305 donor strain. For instance, conjugation of the donor strains RE1 and RS with recipient RE1  
306 resulted in a 45-fold and a 112-fold increase respectively, compared to conjugation of the  
307 native donor strain D1 with recipient RE1. When donor and recipient were RS, final  
308 transconjugant frequency even increased 2800-fold (S7 Fig). Overall, this experiment  
309 confirmed the significant difference in final transconjugant frequency resulting from transfer  
310 by native versus secondary donor strains and highlighted the great increase in final  
311 transconjugant frequency when donor and recipient are the same strain (self-self transfer).

312

313 A possible explanation for the altered transfer efficiency when transconjugants acted as  
314 plasmid donors, are mutational changes, in either the plasmid or the recipients, that might  
315 have accumulated during the 1<sup>st</sup> gen or the 2<sup>nd</sup> gen *in vitro* experiment. Thus, we analyzed  
316 transconjugants from the 1<sup>st</sup> and 2<sup>nd</sup> gen *in vitro* experiments by whole-genome sequencing  
317 (one clone for each transconjugant, except for RE3 carrying plasmid p4A\_Incl and p8A\_IncF,  
318 for which we sequenced three clones). We did not find any mutational changes in ESBL-  
319 plasmids but a range of chromosomal mutations in transconjugants (S5 Table). However,  
320 these mutations were not consistently present across transconjugants and could not be  
321 related to adaptation to plasmid carriage. Nevertheless, we expect that host factors play a  
322 major role in plasmid spread, and it is simply their interplay and our small sample size that  
323 prevent us from detecting one single crucial conjugation rate determinant.

324

325 **ESBL-plasmids can spread rapidly *in vivo*, with efficiencies correlating with the *in vitro***  
326 **trends.** Sequence-based studies have shown that ESBL-plasmids can spread between bacteria  
327 in the human gut [5,31], but their actual conjugation dynamics have not yet been studied *in*  
328 *vivo* (exception using laboratory *S. Typhimurium* strains [9]). Therefore, we extended our  
329 study to a more realistic murine model. We performed conjugation assays in mice with a  
330 limited microbiota [42] with three of the clinical donor strains carrying ESBL-plasmids (D4, D8,  
331 and D7) and RE3 as a recipient (Fig 6). These mice allow colonization of approximately  $10^8$  *E.*  
332 *coli* per gram feces, densities of *E. coli* that can be found in the guts of humans and animals  
333 [37]. Donors and recipients were introduced at equal densities but at different timepoints,  
334 the recipient one day prior to the donor, and were allowed to grow and conjugate over 7 days  
335 (Fig 6A). In line with our *in vitro* conjugation assay, we observed transconjugants for p4A\_Incl  
336 and p8A\_IncF, but not for p7A\_IncF/Col156 (Fig 6B). Similar to the *in vitro* results in Fig 2,  
337 transfer of p4A\_Incl resulted in higher transconjugants frequencies than transfer of p8A\_IncF  
338 (day 1-6, Fig 6B). Plasmid p4A\_Incl reached maximal proportions of plasmid carrying  
339 recipients of ~1% within only 4-8 hours of colonization (Fig 6C). Overall, we found that the  
340 rank order of final transconjugant frequencies is conserved between *in vitro* and *in vivo*  
341 conjugation. Moreover, the speed at which these clinical plasmids can establish themselves  
342 in the gut in the absence of antibiotic selection is striking.

343

344 As was the case *in vitro*, the transconjugant population *in vivo* was relatively minor compared  
345 to the size of the donor population (S4-6 Figs). This suggests that most transfer events derived  
346 from donor-to-recipient transfer, rather than transconjugant-to-recipient transfer. Given this,

347 it is likely that the conjugation dynamics *in vivo* can be predicted by the 1<sup>st</sup> gen *in vitro*  
348 experiments (Fig 2).

349

350 To determine whether the increase in transconjugant population size in the gut over the  
351 seven-day experiment was driven by clonal expansion or by conjugation, we investigated the  
352 competitive advantage of transconjugants versus recipients *in vivo*. For two transconjugants  
353 from the 1<sup>st</sup> gen *in vitro* experiment, we deleted the ESBL-plasmid origin of transfer (*oriT*) and  
354 created “locked”, non-conjugative plasmids. These were competed 1:1 with RE3, the recipient  
355 used in the *in vivo* conjugation assay. A change in fitness conferred by plasmid carriage would  
356 be reflected in the competitive index, which is calculated as the ratio between the population  
357 sizes of recipient and “locked” transconjugant. After seven days of competition, only  
358 transconjugants carrying p8A\_IncF outcompeted RE3, with a competitive index of ~0.1 (Fig  
359 6D). Over the course of the experiment, this plasmid-borne fitness advantage led the initial  
360 transconjugant frequency of 0.5 to increase to a final transconjugant frequency of 0.9.  
361 Because this two-fold increase in transconjugant frequency is small compared to the  
362 transconjugant frequencies observed in the conjugation experiment (increasing from the  
363 detection limit of 10<sup>-6</sup> to a frequency of 0.01; Fig 6B), we conclude that final transconjugant  
364 frequencies in the conjugation assay were mainly driven by conjugative transfer, rather than  
365 by clonal expansion of transconjugants. This is seen to a larger extent for p4A\_Incl, where the  
366 transconjugant frequency increased substantially faster than with p8A\_IncF (Fig 6B), despite  
367 a total lack of a growth advantage over recipient RE3 (Fig 6D). Altogether, we show that in  
368 the murine gut, ESBL-plasmids can be transferred rapidly between *E. coli* in the absence of  
369 antibiotic selection.

370

371 **Plasmid interactions: the effect of co-residence, co-transfer and plasmid exclusion on**  
372 **plasmid transfer.** It has been proposed that the transfer rate of plasmids can be modified by  
373 either the presence of other plasmids in the same bacterial host, by the co-transfer of other  
374 plasmids or by the presence of other plasmids in recipients [19,43]. All donor and recipient  
375 strains used in this study carry at least one plasmid (S1 Table). We investigated whether  
376 interactions with these plasmids might affect transfer of the ESBL-plasmids, using sequenced  
377 transconjugants from the 1<sup>st</sup> and 2<sup>nd</sup> gen *in vitro* experiments, and 8 clones per plasmid-donor  
378 pair from the *in vivo* conjugation assays on day seven.

379

380 We found multiple indications of plasmid interference in our conjugation experiments (Figs 2  
381 and 5). Firstly, RE1, the only recipient without an IncFII-plasmid, received IncFII ESBL-plasmids  
382 (e.g. when mating with D5 and D6) at a higher rate than all other recipients. P6A\_Incl/F of D6  
383 did not transfer, and p5A\_IncF of D5 only poorly, to recipient RS that carries a plasmid with  
384 IncFII/FIB replicons (Fig 2). On the other hand, plasmid p8A\_IncF, carrying IncFIA/FIB-  
385 replicons, spread through RS recipient populations, despite RS having an IncFIB replicon (Figs  
386 2 and 5). Because all but one of our conjugative plasmids carry multiple replicons [44], which  
387 is suggested to be a strategy to circumvent limitations to spread due to plasmid  
388 incompatibility, we argue that the plasmid incompatibility in our conjugation assays to might  
389 be permeable. Secondly, both *in vitro* and *in vivo*, transfer of ESBL-plasmid p8A\_IncF to  
390 recipient RE3 resulted in the loss of the resident F-plasmid pRE3A\_IncF (S8 Fig): in 6/11 re-  
391 sequenced transconjugants it was lost, retained in 2/11 and in 3 /11 it showed very low  
392 frequency in the sequencing reads. Similarly, pRE1A\_Incl was lost by recipient RE1,  
393 irrespective of the donor strain and whether it acquired an Incl1 or IncF ESBL-plasmid (S8 Fig).  
394 The cause and effect we can not trace back: loss of resident plasmids could have allowed

395 subsequent acquisition of ESBL-plasmids, or the acquisition of ESBL-plasmids could have been  
396 followed by the loss of resident plasmids. Either way, despite this incompatibility of resident  
397 and newly-acquired ESBL-plasmids comparably high transconjugant frequencies could be  
398 reached (Figs 2 and 5).

399

400 In all the investigated conjugations, we only observed a few isolated cases of co-travelling  
401 plasmids, which we could not link to the observed variation in final transconjugant  
402 frequencies. We found plasmids co-transferred from donors D1 and D8 but not from D4 (S8  
403 Fig). Although all three donors D1, D4 and D8 carry ColRNAI plasmids, we observed its transfer  
404 only from D1, alongside ESBL-plasmid p1A\_IncF. *In vitro*, multiple plasmids were transferred  
405 from D8 alongside the ESBL-plasmid p8A\_IncF, depending on the recipient: plasmid  
406 p8C\_IncBOKZ was passed together with plasmid p8G\_Col8282 to RE2, from which both  
407 plasmids were passed across the species boundary to *S. Typhimurium* RS in the 2<sup>nd</sup> generation  
408 *in vitro* experiment. Plasmid p8C\_IncBOKZ also co-travelled to recipient RE1, but from there  
409 it was not passed to any 2<sup>nd</sup> generation recipient. No mutations were found on any of the co-  
410 transferred plasmids. The prophage p8B\_p0111 (S8 Fig and S1 File) was passed to recipient  
411 RE3 *in vitro* but not *in vivo* and showed a deletion in the side tail fiber proteins stfE\_2, and  
412 stfR in all three sequenced transconjugants. Despite the presence of their essential transfer  
413 genes (S2 File), we did not detect transfer of resident plasmids pRE2B\_IncF of recipient RE2  
414 or pRSA\_IncF of recipient RS, to any recipient of the 2<sup>nd</sup> gen *in vitro* experiment.

415

416 **Discussion**

417 In this study, we demonstrated that transfer rates of ESBL-plasmids derived from clinical  
418 donors varied over five orders of magnitude and spread in the absence of antibiotics through  
419 various recipient populations. We confirm that, in the absence of external factors such as  
420 selection by antibiotics or competition against other bacterial species, conjugative transfer is  
421 the main determinant of the spread of ESBL-plasmids *in vitro* and *in vivo*. Like others, we  
422 found that ESBL-plasmids are not costly in our experiments [45,46]. When correcting for  
423 growth, we found that the increase in plasmid frequency was strongly correlated with plasmid  
424 transfer rate (Fig 4). This might hold true even for costly plasmids, as others have shown that  
425 transfer rates can surpass a fitness cost and allow plasmids to spread [26,47]. Foremost, we  
426 found that all plasmids carrying the required *tra* genes spread from various donors through a  
427 multitude of recipient populations. This suggests that conjugative plasmids have a strong  
428 drive to spread and that donor and recipient determinants play a lesser role. Since half of all  
429 plasmids can transfer via conjugation [20], it is tempting to speculate that the majority of  
430 these plasmids may spread in the absence of selection by antibiotics.

431

432 Although the estimates of our transfer rates are in line with results obtained with common  
433 laboratory strains [7,27], we have shown that it is crucial to use multiple and clinical strains  
434 to better understand the factors driving plasmid transfer. For instance, the pathogenic *S.*  
435 *Typhimurium* RS was able to receive 4 out of 5 conjugative plasmids. When acting as donor  
436 too, it could yield transconjugants at the highest efficiency compared to other recipients,  
437 particularly for Incl1 plasmids (Figs 2 and 5). This has important implications in the spread of  
438 antibiotic resistance plasmids, because the tissues of infected animals can serve as a reservoir  
439 for *S. Typhimurium*, which can lead to long-term potential for plasmid transfer into co-

440 colonizing Enterobacteriaceae [9]. An additionally important characteristic of clinical strains  
441 is the multitude of plasmids they harbor. It has been shown that their presence in donors and  
442 recipients may affect the transfer of the plasmid of interest. This has previously not been  
443 taken into account [27]. Here, we observed variation in plasmid transfer rate depending also  
444 on the recipient strain, and could recapitulate that some recipients are inherently more  
445 permissive to plasmids. The frequently used lab strain *E. coli* K12 seems to be an exceptionally  
446 good recipient, which may have led to a historical overestimation of transfer potential of  
447 plasmids [7,27] .

448

449 We found that *in vitro* transfer dynamics are a good qualitative predictor of *in vivo* plasmid  
450 transfer in a murine model, and discovered similar variation across donor and recipient  
451 combinations in both methods. Furthermore, we highlight the previously underappreciated  
452 speed with which ESBL-plasmids can spread through recipient populations *in vivo*. Plasmid  
453 donors colonized the gut within 4 hours and transferred ESBL-plasmids within the first 24  
454 hours in the absence of antibiotic selection. This is particularly important, because our *in vivo*  
455 model recapitulates a natural situation in which *E. coli* is an abundant member of the  
456 microbiota of the gut lumen [37], and interacts with an invading ESBL-bearing *E. coli* [48,49].  
457 However, contrary to our mouse experiments, not all natural Enterobacteriaceae populations  
458 reach densities of  $10^8$  CFU/g feces in farm animal or human guts [37]. This may lead to an  
459 overestimation of actual plasmid spread in our study. For such cases, the role of inflammation  
460 inducing pathogens such as *S. Typhimurium* may be especially important, because they can  
461 induce blooms of Enterobacteriaceae, leading to increased population densities and thus  
462 plasmid transfer [8]. The strains carrying clinical ESBL-plasmid rapidly colonized the mouse  
463 gut and thereby outperformed the resident strain (S6 Fig). All but one of our strains associated

464 with ESBL-plasmids encode a T6SS in their genome (S3 Fig), which may explain their  
465 competitive success. Thus, especially *in vivo*, the strain background of the plasmid-host  
466 association is crucial to long-term plasmid persistence.

467

468 To obtain exact quantitative predictions of *in vivo* plasmid spread based on *in vitro* data,  
469 detailed mathematical modelling will be needed. Fischer *et al.* [50] showed that a very simple  
470 model that does not take into account varying plasmid transfer rates to host microbiota,  
471 underestimates observed *in vivo* transfer rates. Given the high transfer proficiency of RS  
472 observed in this study, a realistic mathematical model will likely require detailed  
473 understanding of inter-species aspects of plasmid transfer. Furthermore, one will need to  
474 consider the recently discovered role of long-term reservoirs formed by plasmid-carrying  
475 invasive enteropathogens, such as *S. Typhimurium*, in plasmid spread [9].

476

477 Although our broad study includes many of the factors known to determine plasmid transfer,  
478 the biological basis of the variation in plasmid transfer we found remains unknown. For  
479 instance, we found large differences in plasmid spread between transfer from native and from  
480 secondary bacterial hosts and a consistent 1000-fold increase in final transconjugant  
481 frequency when donor and recipient were the same strain (self-self transfer). Dimitriu *et al.*  
482 suggested compatibility of restriction-modification systems as a likely mechanism for  
483 increased transfer rates in such cases [27]. Here, neither the presence of restriction-  
484 modification systems nor of CRISPR-Cas showed a consistent connection to the observed  
485 plasmid spread. Because donors of the 1<sup>st</sup> gen and 2<sup>nd</sup> gen *in vitro* experiment had the same  
486 handling before the conjugation assay, i.e. thawing and growing overnight, it is unlikely that  
487 there is a role of plasmid de-repression. Moreover, other factors such as surface exclusion or

488 adaptive mutations seem, based on our genomic analysis, at most minor. Although evolution  
489 experiments demonstrated extensive plasmid host co-adaptation upon plasmid acquisition  
490 [51,52], neither for the 24 hours *in vitro* nor for the 7 days *in vivo* conjugation assay, could we  
491 find any mutational changes that would suggest recipient-plasmid co-adaptation. Because  
492 these ESBL-plasmids are non-costly in all tested recipients, we think further co-adaptation  
493 might not be necessary for plasmid spread on a species level. An alternative explanation for  
494 the lack of genomic modification related to plasmid-host adaptation could be transcriptional  
495 changes in response to plasmid carriage [53]. To statistically test the relative significance of  
496 donor, plasmid, and recipient factors, as those investigated here, in determining plasmid  
497 transfer rates, even larger scale studies are needed. The feasibility of this has been  
498 demonstrated by Alamam et al. [54], who studied horizontal resistance transfer for more  
499 than 60.000 pairs of cell populations in parallel. We advocate for high-throughput screening  
500 of clinically relevant donor and recipient strains *in vitro*.

501  
502 Efforts must be made to minimize the transmission of strains containing antibiotic resistance  
503 plasmids. Understanding the factors that make plasmid-host associations successful, can give  
504 insight into novel measures to limit their spread. For instance, previous studies have  
505 suggested to exploit systems like CRISPR-CAS, restriction modification or surface exclusion  
506 [19,22,55,56]. We found multiple cases of plasmid interference due to plasmid  
507 incompatibility, which may provide an important further avenue for future studies to block  
508 the transfer and persistence of plasmids within a population of bacteria [57]. The results  
509 presented here contribute to a growing scientific field aimed at determining fitness and  
510 plasmid persistence factors that could ultimately inspire the development of anti-plasmid  
511 spread strategies.

512 **Materials and methods**

513 **Strains and growth conditions.** As plasmid donor strains, we use 8 ESBL-plasmid positive  
514 clinical *E. coli* isolates, sampled from hospitalized patients at the University Hospital Basel,  
515 Switzerland [58]. Additionally, we worked with 4 ESBL-plasmid negative recipient strains: two  
516 clinical *E. coli* isolates from healthy patients, and mouse-derived *E.coli* and *Salmonella*  
517 *enterica* Typhimurium isolates. A comprehensive list of strains and associated plasmids can  
518 be found in S1 Table. Marker plasmids were introduced by electroporation, to mark recipients  
519 with either pACYC184 (New England Biolabs) encoding Chloramphenicol (Cm) resistance or  
520 pBGS18 [59] encoding Kanamycin (Kan) resistance. An exception was recipient RS, having  
521 chromosomal Cm resistance (*marT::cat*) [29]. Unless stated otherwise, we grew bacterial  
522 cultures at 37°C and under agitation (180 rpm) in lysogenic broth (LB) medium, supplemented  
523 with appropriate amounts of antibiotics (none, 100µg/mL Ampicillin (Amp) , 50µg/mL Cm  
524 and 50µg/mL Kan). We stored isolates in 25% glycerol at -80°C.

525

526 **Antibiotic resistance profiling.** We used microdilution assays with a VITEK2 system  
527 (bioMérieux, France) to determine the minimum inhibitory concentrations (MIC). MIC  
528 breakpoints for ESBL were interpreted according to EUCAST guidelines (v8.1). In addition, we  
529 confirmed the resistance mechanism of suspected isolates phenotypically using ROSCO disk  
530 assays (ROSCO diagnostica, Denmark) and/or genotypically with detection of CTX-M1 and -9  
531 groups using the eazyplex Superbug assay (plex, Germany).

532

533 **Construction of non-transferrable plasmids.** We generated non transferrable plasmids, by  
534 deleting their origin of transfer (*oriT*) region, using the lambda red recombinase system with  
535 pKD4 as template for the Kan resistance marker[60]. The following primers were used (5' to

536 3'): For Incl1 plasmids (p4A\_Incl) DIncl1\_oriTnikA\_f ( GCA TAA GAC TAT GAT GCA CAA AAA  
537 TAA CAG GCT ATA ATG GGT GTA GGC TGG AGC TGC TTC) and DIncl1\_oriTnikA\_r ( CCT TCT CTT  
538 TTT CGG AAT GAC TGC ATT CAC CGG AGA ATC CAT GGG AAT TAG CCA TGG TCC)[8] and for F  
539 plasmids (p8A\_IncF) D25\_2\_oriT-nikA-ko\_vw ( CCA TGA TAT CGC TCT CAG TAA ATC CGG GTC  
540 TAT TTT GTA AGT GTA GGC TGG AGC TGC TTC ) and D25\_2\_oriT-nikA-ko-rev ( GTG CGG ACA  
541 CAG ACT GGA TAT TTT GCG GAT AAA ATA ATT TAT GGG AAT TAG CCA TGG TCC ). All mutants  
542 were verified by PCR (Incl1\_oriT\_val\_f: AGT TCC TCA TCG GTC ATG TC, Incl1\_oriT\_val\_r: GAA  
543 GCC ATT GGC ACT TTC TC, D25\_oriT\_val\_fw: CAT ACA GGG ATC TGT TGT C and  
544 D25\_2\_oriT\_ver\_rev: CAG AAT CAC TAT TCT GAC AC) and loss of transfer function.

545

546 **Sequencing, assembly, annotation.** We sequenced all donor and recipient strains on an  
547 Illumina MiSeq machine (paired end, 2x250 bp), Oxford Nanopore MinION, and PacBio  
548 Sequel. Unicycler [61] (v0.4.7) was used to produce hybrid assemblies (for D1,2,4,6,7,8 the  
549 Oxford Nanopore – Illumina hybrid assembly proved most contiguous; D3,D5, RE1, RE2, RE3  
550 were assembled using Pacbio Sequel – Illumina hybrid assembly). Manual curation involved  
551 removing any contig smaller than 1kB, and sequences up to 5 kB that mapped to the own  
552 chromosome. Quality control was performed by mapping the paired end Illumina reads to the  
553 finished assemblies using samtools (v1.2) and bcftools (v1.7) [62,63]. The reference sequence  
554 of RS was downloaded from NCBI Genbank under the accession numbers NZ\_CP034230.1 and  
555 NZ\_CP034231.1.

556

557 We extracted an alignment of the concatenated core genome genes of all *E. coli* donor and  
558 recipient strains, using chewBBACA for core genome Multi-Locus Sequence Typing (cgMLST)  
559 against the Enterobase cgMLST scheme [64,65]. The phylogenetic tree was inferred using

560 BEAST2 [66], with an HKY substitution model and a strong prior on the mutation rate of *E. coli*  
561 ( $10^{-4}$  mutations per genome per generation, as estimated by Wielgoss et al. [67]).

562

563 We performed bacterial annotation using Prokka [68], and ST calling using mlst (Torsten  
564 Seemann, <https://github.com/tseemann/mlst>), which makes use of the PubMLST website  
565 (<https://pubmlst.org/>) developed by Keith Jolley [69]. Phylogroups were assigned using  
566 ClermonTyper [70].

567

568 We determined genomic features using a range of bioinformatic tools, and by BLAST  
569 comparison against various curated databases. Plasmid replicons and resistance genes were  
570 determined using abricate (Torsten Seemann, <https://github.com/tseemann/abricate>) with  
571 the PlasmidFinder [71] and ResFinder [72] databases respectively. Phages were located using  
572 PHASTER [73] (listing only those marked as “complete”), type 6 secretion systems using  
573 SecReT6 [74], virulence genes using the Virulence finder database [75], toxin-antitoxin  
574 systems using the database TADB 2.0 [76], and CRISPR-Cas loci using CRISPRCasFinder [77].  
575 Restriction-modification systems were determined by using grep on the term ‘restriction’ in  
576 the prokka general feature format (GFF) files.

577

578 To determine the presence/absence of IncF and IncI1 transfer genes, we constructed our own  
579 database to compare against. IncF transfer genes were taken from the supplementary  
580 material of Fernandez-Lopez et al. [78], IncI1 transfer genes were copied from R64 using the  
581 annotations by Komano et al. [38], and R621a annotated by Takahashi et al. [39].

582

583 ***In vitro* conjugation assays.** We determined the final frequency of the recipient population  
584 that obtained an ESBL-plasmid (T/(R+T)) in a high throughput, 96-well plate-based assay, with  
585 two replica blocks per experiment. The experiments with *E. coli* recipients and the *S.*  
586 *Typhimurium* recipient RS were performed independently. Donor and recipient grew over  
587 night with or without ampicillin (100 $\mu$ g/mL), respectively. We washed the independent  
588 overnight cultures (n=5-6 per strain) by spinning down and resuspending and added ~1 $\mu$ L of  
589 6.5-fold diluted donor and recipient cultures into 150 $\mu$ L fresh LB with a pin replicator (total  
590 ~1000-fold dilution, aiming to reach approximately a 1:1 ratio of donor and recipient). These  
591 mating populations grew for 23 hours in the absence of antibiotics and were only shaken prior  
592 to hourly optical density (OD) measurements (Tecan NanoQuant Infinite M200 Pro). To  
593 determine the final cell densities, we plated the mating cultures at the end of the conjugation  
594 assay on selective plates. In the 1<sup>st</sup> gen *in vitro* experiment, where the clinical strains  
595 transferred their native plasmids to recipients, we selected for donors+transconjugants with  
596 Amp, for recipients+transconjugants with Cm (*E. coli* recipients carried pACYC184-Cm and RS  
597 chromosomal *marT::cat*) and for transconjugants with their combination. Four replicates had  
598 to be excluded because the satellite colonies, a common phenomenon when plating on Amp,  
599 could not be distinguished from true transconjugant colonies. For the 2<sup>nd</sup> gen *in vitro*  
600 experiment, we chose a subset of transconjugants generated in the 1<sup>st</sup> gen *in vitro* experiment  
601 that we used as plasmid donors. Transconjugants and recipients of the clone type EC3 were  
602 omitted because of the size of the experiment, as well as transconjugant D1-EC2, carrying  
603 p1B\_Incl, because it could not be regrown from glycerol stock. We selected for donor with  
604 Cm, for recipient with Kan (recipients carried pBGS18-Kan) and for transconjugants with  
605 Kan+Amp. With this approach, we were able to detect transconjugant populations if they  
606 were greater than 10<sup>-8</sup> cells per mL.

607

608 Alongside the second replica block of the 1<sup>st</sup> gen *in vitro* experiment, we performed a plate-  
609 mating control experiment, to assess the extent of surface mating in our conjugation assay.  
610 After washing and diluting the independent overnight cultures of the second replica block,  
611 we grew clinical donors and *E. coli* recipients in isolation for the duration of the conjugation  
612 experiment. Donors and recipients were mixed only before plating 20 $\mu$ L of the undiluted  
613 mixed population ( $n_{total} = 1-3$ , S4 Table). In conjugations involving donors D4-D6 and D8, the  
614 transconjugant CFU from plate-mating, was maximally ~15 % of the CFU observed in the 1<sup>st</sup>  
615 gen *in vitro* experiment. For D1 in combination with RE1 and RE3, we found substantial  
616 amounts of plate-mating, as high as fractions of 35 and 85 % of the transconjugants resulting  
617 from the 1<sup>st</sup> gen *in vitro* experiment, respectively.

618

619 ***In vitro* plasmid cost and growth rate assays.** To investigate the effect of plasmid carriage on  
620 bacterial growth, we measured the growth rate of transconjugants and corresponding  
621 recipients. Per D and R combination, we used three clonal transconjugants (4 replicates each),  
622 which were obtained from independent mating populations of the 1<sup>st</sup> gen *in vitro* experiment.  
623 We grew bacterial cultures in absence of antibiotics overnight and diluted them 150-fold by  
624 transfer with a pin replicator to a 96-well plate, containing 150 $\mu$ L fresh LB per well. The  
625 cultures grew without shaking and we estimated growth rates of recipients and  
626 transconjugants based on 10 OD measurements over 24 hours and expressed plasmid cost as  
627 their relative growth rates. Because transconjugants have passed the 1<sup>st</sup> gen *in vitro*  
628 experiment, we had to exclude that an effect of plasmid carriage could be obscured by  
629 transconjugants having adapted to the LB growth conditions. Thus, we exposed recipients ( $n$   
630 = 4) to the same culture handling as a conjugation assay would and found their growth rates

631 not to be different from the naïve recipient strains used in the plasmid cost assay (S9 Fig). We  
632 had to exclude RE2 carrying p1B\_Incl because it could not be regrown from glycerol stock and  
633 further excluded RE3 carrying p1B\_Incl because we had not stored 3 independently arisen  
634 transconjugants.

635

636 For other growth measurements, we followed a similar approach of 150-fold dilution of  
637 overnight cultures by transfer with a pin replicator to a 96-well plate, containing 150µL fresh  
638 LB per well. Growth assays were performed in the plate reader with hourly OD  
639 measurements. We estimated growth rates using the R package Growthcurver [79].

640

641 **Infection experiments.** We have previously established a murine model for enterobacterial  
642 pathogen infection (Barthel et al, 2003) that has been used to measure conjugative plasmid  
643 transfer [8,9,29,30]. For conjugation experiments, 8-16 week old C57BL/6 mice containing an  
644 oligo microbiota [42], which allows colonization of approximately  $10^8$  *E. coli* per gram feces,  
645 densities of *E. coli* that can be found in the guts of humans and animals [37], were infected  
646 orogastrically with  $\sim 5 \times 10^7$  CFU of RE3, carrying marker plasmid pACYC184. 24 hours later,  
647  $\sim 5 \times 10^7$  CFU of either D4, D7, or D8 were introduced orogastrically (Fig 6A). Feces were  
648 collected daily, homogenized in 1 ml of PBS with a steel ball by a Tissue Lyser (Qiagen) at 25  
649 Hz for 1 min. Samples were enumerated for bacterial populations on MacConkey media  
650 containing the appropriate antibiotics (selection for donors+transconjugants with Amp, for  
651 recipients+transconjugants with Cm and for transconjugants with their combination) and final  
652 transconjugant frequencies  $T/(R+T)$  calculated.

653

654 For competition experiments, 8-16 week old C57BL/6 oligo microbiota mice were infected  
655 orogastrically with a 1:1 mixture of both competitor strains ( $\sim 5 \times 10^7$  CFU total). Feces were  
656 collected and bacterial populations were enumerated daily as above. Bacteria were  
657 enumerated on MacConkey agar containing chloramphenicol and replica-plated on media  
658 containing chloramphenicol, kanamycin, and ampicillin to enumerate the locked  
659 transconjugants. Competitive index is calculated by dividing the recipient population by the  
660 locked transconjugant population.

661

662 Prior to all infections, overnight cultures in LB containing the appropriate antibiotics were  
663 subcultured for 4 hours at 37°C without antibiotics (1:20 dilution) to ensure equal densities  
664 of bacteria. Cells were washed in PBS and introduced into mice.

665

666 All infection experiments were approved by the responsible authority  
667 (Tierversuchskommission, Kantonales Veterinäramt Zürich, license 193/2016).

668

669 **Resequencing.** We re-sequenced isolates from the 2<sup>nd</sup> generation *in vitro* experiment as well  
670 as the *in vivo* transfer experiment, to study the genetic contribution to the observed transfer  
671 rates. Resequencing was performed on an Illumina MiSeq (paired end, 2x150 bp). Reads were  
672 mapped to the closed assemblies of respective donor and recipient strains using the breseq  
673 pipeline (v 0.32.0). Mutations or indels shared by all re-sequenced strains were treated as  
674 ancestral (S5 Table).

675

676 **Statistical analyses.** We performed statistical analyses using the software R (version 3.4.2).  
677 The effect of donor, recipient and plasmids on the final transconjugant frequency was

678 analyzed with either a two-way ANOVA (1<sup>st</sup> gen *in vitro* experiment, factors donor-plasmid  
679 pair and recipient) or a three-way ANOVA (2<sup>nd</sup> gen *in vitro* experiment, factors donor, plasmid,  
680 recipient). For the 1<sup>st</sup> gen *in vitro* experiment, we excluded from this analysis strain-plasmid  
681 pairs which did not result in transconjugants in the 1<sup>st</sup> gen *in vitro* experiment (D2, D3, D7)  
682 and *S. Typhimurium* recipient RS. When single replicates for a given donor-recipient  
683 combination lacked transconjugants (D5 and D6), we assigned these replicates a final  
684 transconjugant frequency at the detection limit of 10<sup>-8</sup>. The same data was used to perform  
685 the correlation of transconjugant frequency and transfer rate. Data of the 2<sup>nd</sup> gen *in vitro*  
686 experiment was not fully factorial. To enable testing of higher-order interactions here, we  
687 therefore performed two 3-way ANOVAs: one excluding plasmid p1B\_Incl and one excluding  
688 donor RE2, for which we had to take the two replica blocks into account:  $P < 0.001$ ). For two  
689 replica populations of donor RE2 transferring p4A\_Incl to RE1, we were not able to detect  
690 donors on plates and assigned them a donor population size at the detection limit of 1 colony  
691 per plate (10<sup>8</sup> cells/mL). For two replica populations (RS self-self transfer with p1B\_Incl), we  
692 had higher counts on plates selecting for transconjugants than on plates selecting for  
693 recipients+transconjugants and replaced the resulting negative CFU/mL for recipients with 1  
694 CFU/mL.

695  
696 To express the final fraction of transconjugants as a plasmid transfer rate, we used the cell  
697 densities of donor, recipient, transconjugant and their sum (CFU/mL), and growth rates of  
698 mating populations, both estimated in the 1<sup>st</sup> gen *in vitro* experiment. Introducing these  
699 values to the mass action model as previously described by Simonsen *et al.* [41] yields the  
700 transfer rate constant  $\gamma$  (mL(CFU \* t)<sup>-1</sup>). For statistical comparisons derived from *in vivo*

701 experiments, Kruskal-Wallis tests were performed with Dunn's multiple test correction using  
702 GraphPad Prism Version 8 for Windows.

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945

946 **Fig 1. Phylogenetic tree of the *E. coli* donor and recipient strains, inferred using Bayesian**  
947 **inference on a core genome alignment.** The names at the tips are colored by *E. coli*  
948 phylogroup. The *S. Typhimurium* recipient RS was not included in the phylogeny, but listed  
949 here to allow comparison of the plasmid content. Blue rectangles indicate that a plasmid  
950 carrying the given IncF or IncI incompatibility marker (replicon) was present in the strain. The  
951 intensity of the shade of blue reflects the percent identity and coverage of the BLAST match  
952 to the listed genes. A red dot indicates the ESBL-plasmid. If multiple replicons were found on  
953 the same ESBL-plasmid this is indicated with open red circles.

954

955 **Fig 2. ESBL-plasmids spread at variable rates in the absence of antibiotics (1<sup>st</sup> gen *in vitro***  
956 **experiment).** Plasmid spread was measured as the final frequency of the recipient population  
957 carrying the ESBL-plasmid (transconjugants), for three different *E. coli* (A) and one *S.*  
958 *Typhimurium* (B) recipient populations. Circles represent independent replicates (n=4-6) and  
959 the beams are mean values  $\pm$  standard error of the mean (SEM). The detection limit was at  $\sim 10^8$   
960.

961

962 **Fig 3. No evidence for cost of plasmid carriage for transconjugants.** Plasmid cost was measured  
963 for ten strain-plasmid combinations, with three independently isolated transconjugants each (n  
964 = 4; beams are mean values  $\pm$  SEM). The growth rate of transconjugants and their plasmid free  
965 complements was determined from independent cultures. Relative growth rate was calculated  
966 by dividing the transconjugant growth rates by the mean growth-rate of plasmid-free strains.

967

968 **Fig 4. Correlation of plasmid transfer rate and final transconjugant frequency estimated**  
969 **using the Simonsen formula** [41]. Each data point results from the same liquid mating culture  
970 shown in Fig 2. Transconjugant frequencies and transfer rates can be found in the S3 Table.

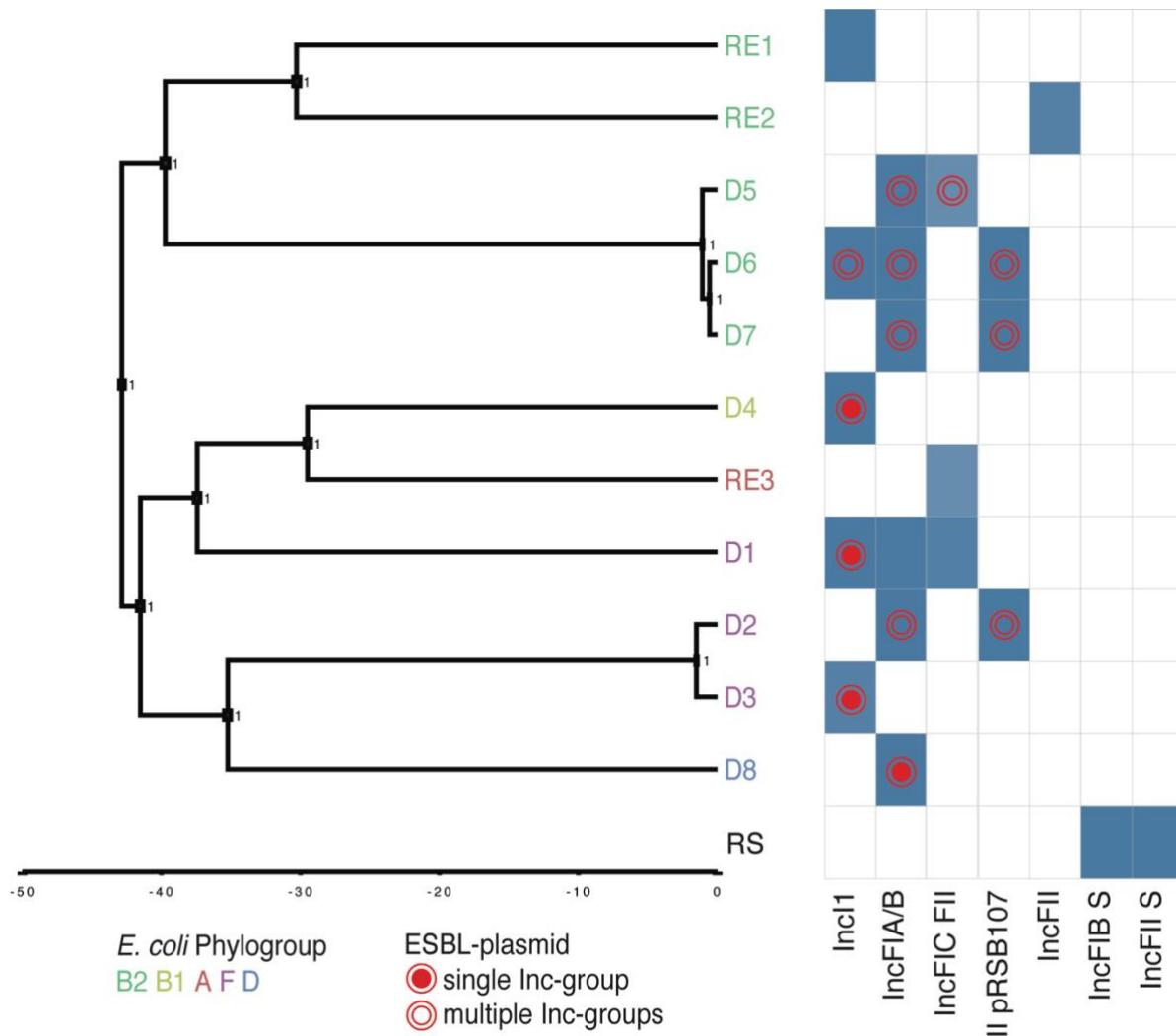
971

972 **Fig 5. Final transconjugant frequency depends on donor, recipient, and plasmid (2<sup>nd</sup> gen *in***  
973 ***vitro* experiment).** Eight transconjugants isolated from mating assays in the 1<sup>st</sup> gen *in vitro*  
974 experiment (Fig 2), used here as plasmid donor strains, transferred their plasmid to three  
975 different recipients. Circles represent independent replicates (n= 6), the beams are mean values  
976  $\pm$  SEM and different plasmids are indicated in color. The detection limit was at  $\sim 10^{-8}$ .

977

978 **Fig 6. ESBL-plasmids can spread in the gut in the absence of selection.** (A) Mouse model used  
979 for *in vivo* conjugation assays. These mice have a minimal microbiota that offers intermediate  
980 colonization resistance. Recipient RE3 was added one day before the plasmid donor.  
981 Populations were enumerated in faeces by selective plating. (B) Conjugation assay for three  
982 clinical donors and recipient RE3. (C) A subset of mice used in panel B were monitored for  
983 conjugation within the first 24 hours of infection. (B-C) Plasmid spread is reported as final  
984 transconjugant frequency. Dotted lines indicate the detection limit for selective plating. (D)  
985 Competition assay performed by infecting mice with a 1:1 mix of a “locked” transconjugant  
986 (*oriT* knockout) and recipient RE3. The competitive index was calculated by dividing the  
987 recipient population by the locked transconjugant population. (B, D) Kruskal-Wallis test  
988 p<0.05 (\*), p<0.01 (\*\*), p<0.001 (\*\*\*), p<0.0001 (\*\*\*\*).

Fig 1.



989

Fig 2.

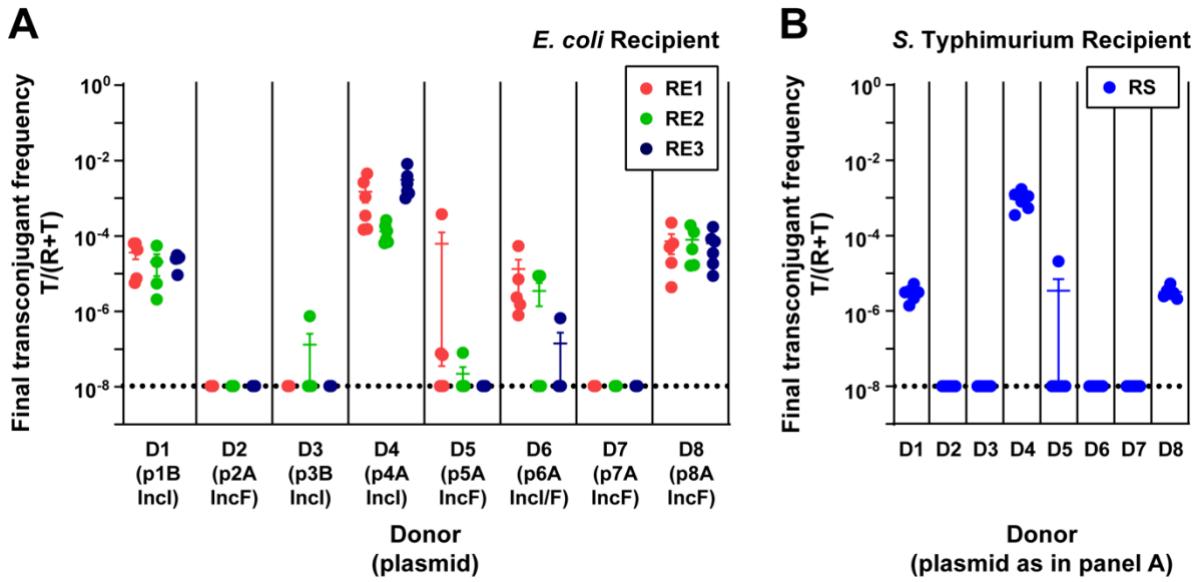
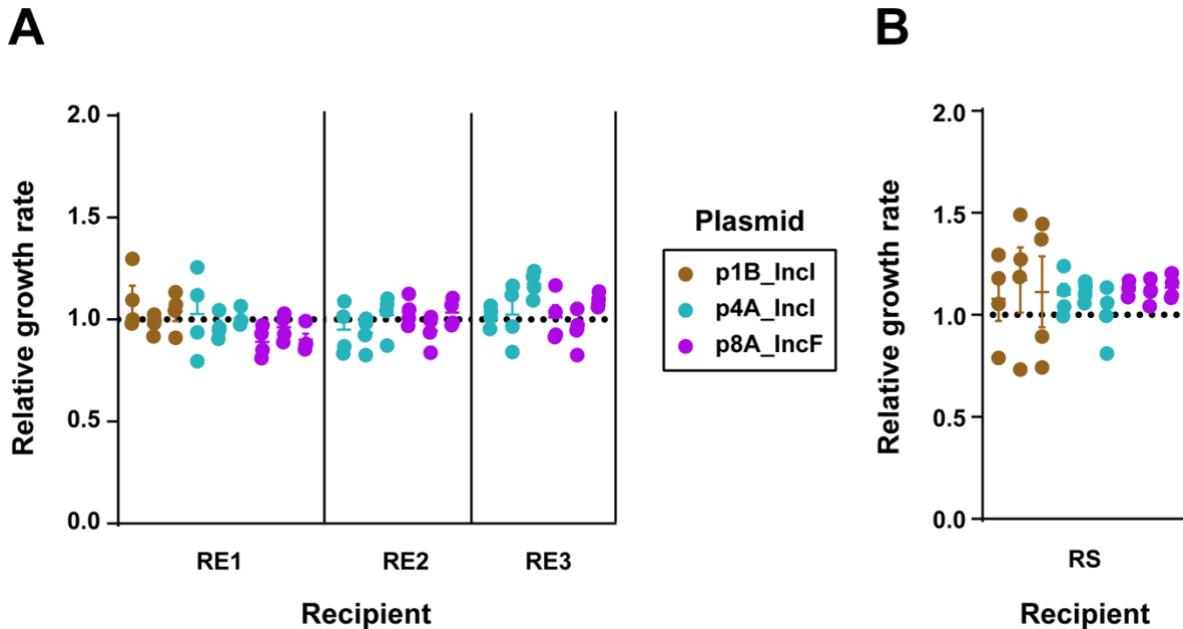
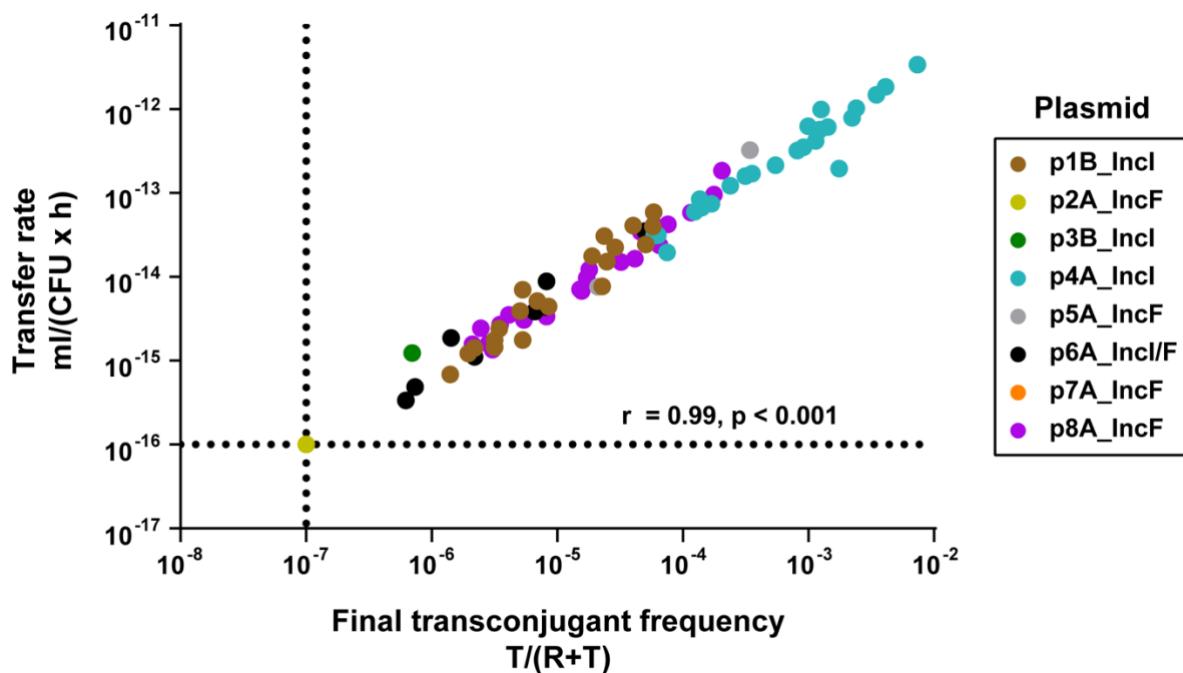


Fig 3.



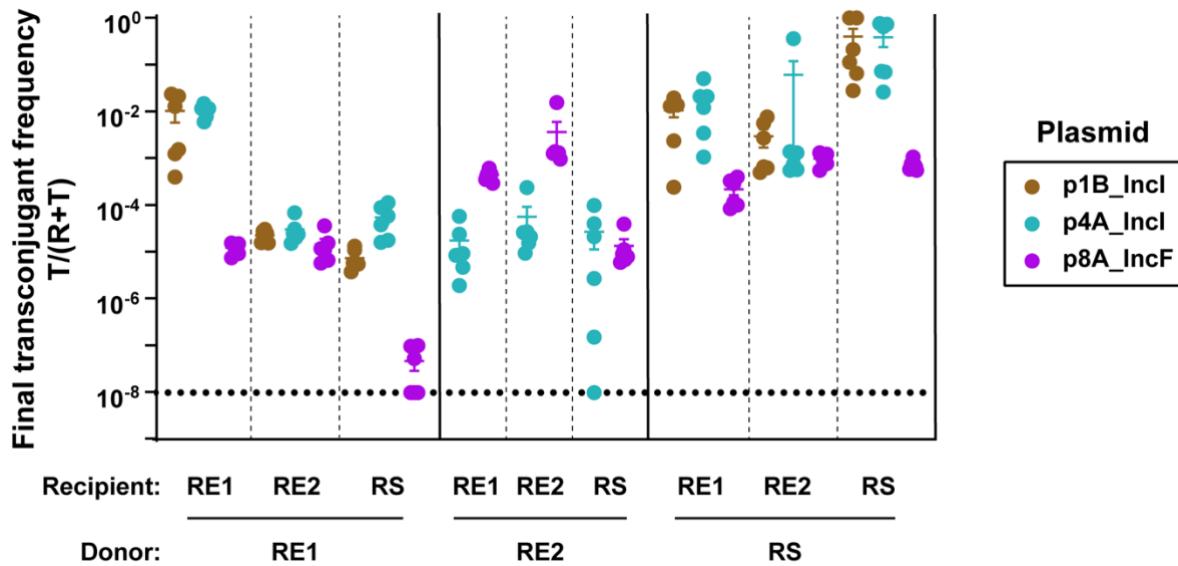
991

Fig 4.



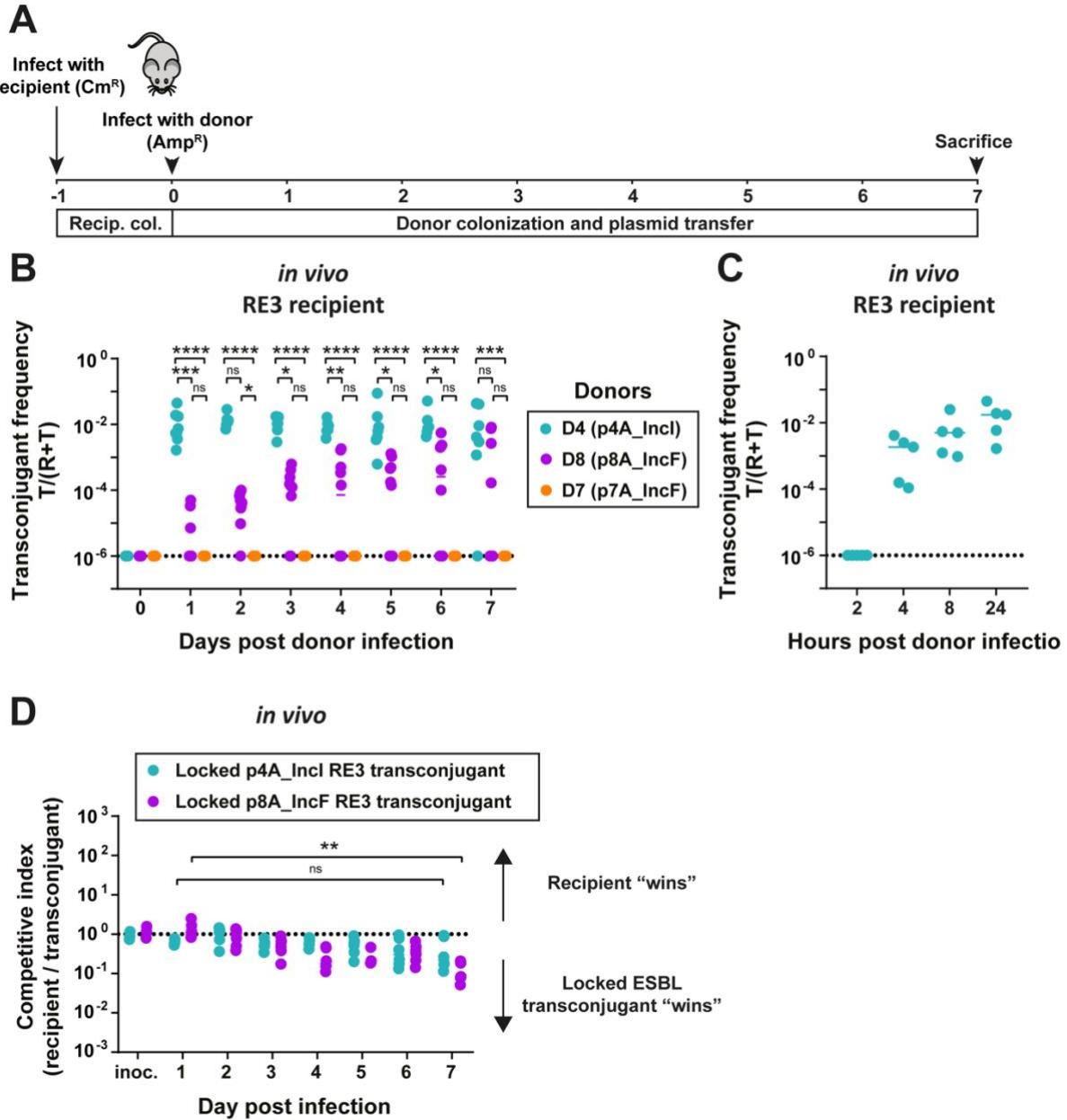
992

Fig 5.



993

Fig 6.



995 **Supporting information**

996 **S1 Fig. Plasmid replicons.** Presence (blue) / absence (white) of plasmid replicons. The  
997 intensity of the shade of blue reflects the percent identity and coverage of the BLAST match  
998 to the listed genes.

999 **S2 Fig. Resistance genes.** Presence (blue) / absence (white) of resistance genes. The intensity  
1000 of the shade of blue reflects the percent identity and coverage of the BLAST match to the  
1001 listed genes.

1002 **S3 Fig. Type 6 secretion systems and virulence genes.** Presence (blue) / absence (white) of  
1003 T6SS (defined by the presence of more than one prodigal T6SS-encoding gene in an operon)  
1004 and virulence genes (defined by BLAST match to the listed genes; the shades of blue indicate  
1005 the percent identity and coverage). The only strain with a pathogenic virulence profile (Fig  
1006 1.3) is D4, which carries chromosomally encoded intimin genes (*eae*, *tir*) commonly  
1007 associated with Enteropathogenic *E. coli*. All strains, except RE3 and D1, encode for a type 6  
1008 secretion system (T6SS).

1009 **S4 Fig. Absolute population sizes of donors, recipients, and transconjugants for 1<sup>st</sup> gen in**  
1010 **vitro experiment.** Conjugation experiments were performed with natural donor strains  
1011 bearing the indicated plasmid, and recipients (A) RE1 (B) RE2 (C) RE3 and (D) RS. Dotted lines  
1012 indicate the detection limit by selective plating. Beams are mean values  $\pm$  SEM.

1013 **S5 Fig. Absolute population sizes of donors, recipients, and transconjugants for 2<sup>nd</sup> gen in**  
1014 **vitro experiment.** Conjugation experiments were performed with 2<sup>nd</sup> gen donor strains  
1015 bearing the indicated plasmid, and recipients (A) RE1 (B) RE2 and (C) RS. Dotted line indicates  
1016 detection limit by selective plating. Beams are mean values  $\pm$  SEM.

1017 **S6 Fig. Absolute population sizes of donors, recipients, and transconjugants for *in vivo***  
1018 **experiments in Fig 6.** Each population is indicated by a unique colored symbol (see figure

1019 legend). (A, B, C) Fecal loads of donor, recipients, and transconjugants in Figure 6B  
1020 determined by selective plating. Dotted line indicates the detection limit.

1021 **S7 Fig. Plasmid transfer from native versus secondary host.** We marked D1 with the same  
1022 Cm-resistance plasmid (pACYC184) as the *E. coli* recipients in the 1<sup>st</sup> gen conjugation  
1023 experiment, to exclude pACYC184 having a major effect on transconjugants' ability to donate  
1024 plasmids. Circles represent independent replicates (n= 5-6) and the beams are mean values ±  
1025 SEM. The detection limit was at ~10<sup>-8</sup>.

1026 **S8 Fig. Overview of co-transferring plasmids, showing the changing plasmid composition**  
1027 **across both *in vitro* conjugation assays (1<sup>st</sup> gen is denoted as F<sub>1</sub>, 2<sup>nd</sup> gen as F<sub>2</sub>).** Plasmids are  
1028 indicated in italics. Because all the resident plasmids of recipients are listed in F<sub>1</sub>, for simplicity  
1029 in F<sub>2</sub> only changing resident plasmids are shown. Plasmids that transfer or get lost are  
1030 highlighted (blue = ESBL-plasmids, green = changes originating from F<sub>0</sub>, red = changes  
1031 originating from F<sub>1</sub>). Plasmids transferred across generations are only indicated with lines and  
1032 not listed as resident plasmids. Skulls mark the loss of resident plasmids.

1033 **S9 Fig. Control for transconjugant growth rates.** Recipient strains (n = 4) that were used in  
1034 the 1<sup>st</sup> gen conjugation assay did not increase their growth rate compared to ancestral  
1035 recipient strains. Thus, we can exclude that transconjugants have a growth advantage over  
1036 ancestral recipients based on adaptation to laboratory conditions.

1037 **S1 Table. Strain overview.** Overview of all strains used in this study, including their natural  
1038 plasmid content and detected resistance genes. Replicon and resistance gene hits were  
1039 recorded in this table if they had a coverage and percent identity of at least 70%.

1040 **S2 Table. Phenotypic resistance profile of donor strains.** Minimum inhibitory concentration  
1041 (μg/mL) measurements of ESBL donors used in this study.

1042 **S3 Table. Average transconjugant frequencies and average transfer rates in 1<sup>st</sup> gen *in vitro***

1043 **experiment.**

1044 **S4 Table. Conjugation on plate.**

1045 **S5 Table. Mutational changes that occurred during conjugation assays.**

1046 **S1 File. Prophages and plasmid cointegration.**

1047 **S2 File. Analyses to elucidate genomic effects on plasmid spread.**

1048 **S3 File. Growth rates of all strains in the 1<sup>st</sup> generation *in vitro* experiments.**