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# 1 **β-lactamase expression induces collateral sensitivity**

## 2 in *Escherichia coli*

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### 16 **Abstract**

17 Major antibiotic groups are losing effectiveness due to the uncontrollable spread of  
18 antimicrobial resistance (AMR) genes. Among these, β-lactam resistance genes –encoding  
19 β-lactamases– stand as the most common resistance mechanism in Enterobacterales due to  
20 their frequent association with mobile genetic elements. In this context, novel approaches  
21 that counter mobile AMR are urgently needed. Collateral sensitivity (CS) occurs when the  
22 acquisition of resistance to one antibiotic increases susceptibility to another antibiotic and  
23 can be exploited to selectively eliminate AMR. However, most CS networks described so far  
24 emerge as a consequence of chromosomal mutations and cannot be leveraged to tackle  
25 mobile AMR. Here, we dissected the CS response elicited by the acquisition of a prevalent  
26 antibiotic resistance plasmid to reveal that the expression of the β-lactamase *bla*<sub>OXA-48</sub>  
27 induces CS to colistin and azithromycin. We next showed that expression of other clinically  
28 relevant mobile β-lactamases produces similar CS responses in multiple, phylogenetically  
29 unrelated *E. coli* strains. Finally, by combining experiments with surveillance data comprising  
30 thousands of antibiotic susceptibility tests, we showed that β-lactamase-induced CS is  
31 pervasive within Enterobacterales. These results highlight that the physiological side-effects  
32 of β-lactamases can be leveraged therapeutically, paving the way for the rational design of  
33 specific therapies to block mobile AMR or at least counteract their effects.

34 **Keywords:** Collateral Sensitivity · β-lactamase · Colistin · Azithromycin · *E. coli*

35 **Running title:** β-lactamase expression induces collateral sensitivity

2

36 **Introduction**

37 The continuous evolution of antimicrobial resistance (AMR) is outpacing human efforts to  
38 control bacterial infections. Antibiotic-resistant bacteria are a severe threat to public health,  
39 leading to more than one million deaths yearly<sup>1</sup>. Due to the lack of new antibiotics in the  
40 development pipeline, new strategies are urgently needed to block or reduce the  
41 dissemination of AMR. One promising strategy is the exploitation of collateral sensitivity  
42 (CS), a phenomenon by which the acquisition of resistance to one antibiotic renders bacteria  
43 more sensitive to a second antibiotic<sup>2,3</sup>. Rationally designed treatments that combine  
44 antibiotics with reciprocal CS promise to eradicate bacterial infections and constrain the  
45 evolution of AMR<sup>3,4</sup>.

46 Multiple studies have uncovered CS networks associated with mutations in chromosomal  
47 genes across various bacterial species. For example, certain mutations conferring  
48 aminoglycoside resistance in *E. coli* collaterally increase susceptibility to  $\beta$ -lactams,  
49 fluoroquinolones, chloramphenicol, and tetracyclines<sup>5</sup>. Mecillinam-resistant and tigecycline-  
50 resistant *E. coli* strains often show CS to nitrofurantoin<sup>6</sup>. In addition, mutations in horizontally  
51 transferred AMR genes (such as *bla*<sub>CTX-M-15</sub> and *bla*<sub>OXA-48</sub>) that increase resistance towards  
52 modern  $\beta$ -lactams also produce CS to other, less modern  $\beta$ -lactams<sup>7,8</sup>. The emergence of  
53 CS is contingent on bacterial lifestyle<sup>9</sup>, and it can be transiently induced using chemical  
54 compounds, suggesting that the physiological responses leading to CS can be exploited to  
55 tackle antibiotic-resistant infections<sup>10</sup>.

56 We recently reported that the acquisition of plasmids isolated from clinical strains elicits  
57 CS<sup>11</sup>. Plasmids are arguably one of the most critical vehicles for AMR, as they readily spread  
58 through bacterial communities and typically carry multiple resistance determinants<sup>12–15</sup>. We  
59 found that plasmid-induced CS is robust and can be exploited to selectively eliminate  
60 plasmid-containing clinical strains. Interestingly, most plasmids tested in our previous study  
61 induced varying degrees of CS to azithromycin (AZI) and colistin (COL). This suggests that  
62 plasmid acquisition produces common physiological alterations that increase susceptibility to  
63 AZI and COL.

64 Here, we sought to identify the genetic determinants driving plasmid-associated CS. As a  
65 model, we first focus on the pOXA-48 plasmid. pOXA-48 is an enterobacterial, broad-host  
66 range, conjugative plasmid belonging to the plasmid taxonomic unit L/M that readily spreads  
67 in clinical settings<sup>13</sup>. Using a collection of clinically isolated pOXA-48 mutants, we first  
68 determine that the expression of *bla*OXA-48 is solely responsible for inducing CS to AZI and  
69 COL. We next show that expression of other clinically relevant plasmid-encoded  $\beta$ -

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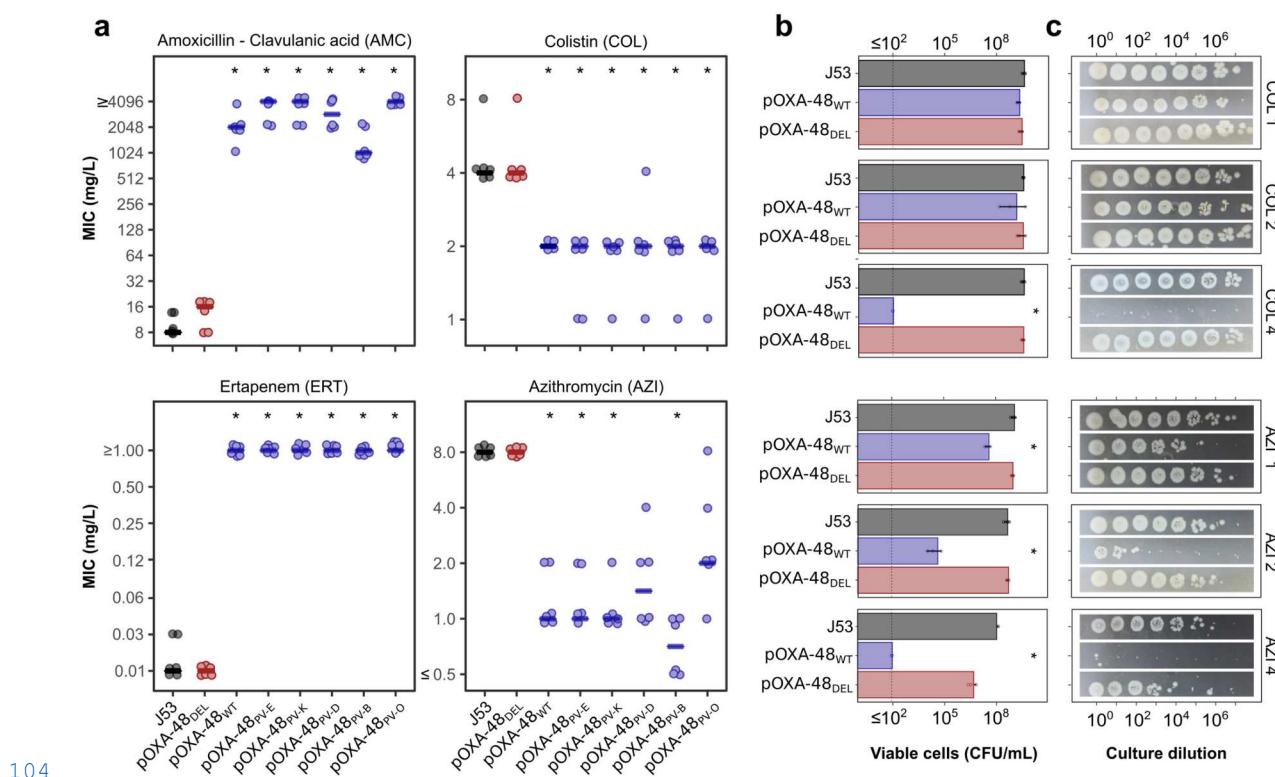
70 lactamases produces similar CS responses in multiple, phylogenetically unrelated *E. coli* strains. Finally, by analysing resistance data comprising thousands of bacteria-antibiotic 71 pairs, we demonstrate that  $\beta$ -lactamase-induced CS is a conserved phenomenon across 72 different Enterobacterales. Altogether, our results pave the way for treatments that exploit  $\beta$ - 73 lactam resistance as the Achilles' heel of multidrug-resistant enterobacteria. 74

75 **Results**

76 *The  $\beta$ -lactamase *bla*<sub>OXA-48</sub> is responsible for pOXA-48-mediated CS.*

77 We first focused on the pOXA-48 plasmid, whose acquisition elicits CS to AZI and COL<sup>11</sup>. 78 The pOXA-48 plasmid (~65 kb) encodes the  $\beta$ -lactamase *bla*<sub>OXA-48</sub> together with nearly 90 79 genes of diverse functions, all potentially contributing to the CS phenotype. To uncover the 80 genetic determinant(s) responsible for plasmid-mediated CS, we took advantage of a well- 81 characterised collection of seven pOXA-48 natural variants<sup>16</sup>. These plasmid variants carry 82 diverse genetic mutations (deletions, insertions, and single nucleotide polymorphisms 83 (SNPs)). These mutations affect critical plasmid functions such as conjugation, antibiotic 84 resistance, or replication control and have been extensively characterised<sup>16</sup> (see 85 **Supplementary Fig. 1** and **Supplementary Table 1**). We introduced these plasmid variants 86 in *E. coli* K12 strain J53 and determined their effect on the minimal inhibitory concentration 87 (MIC) of four antibiotics: amoxicillin-clavulanic acid (AMC), ertapenem (ERT), azithromycin, 88 and colistin (**Fig. 1a**). As expected, most plasmid variants conferred resistance to AMC and 89 ERT (i.e. pOXA-48<sub>WT</sub>, pOXA-48<sub>PV-E</sub>, pOXA-48<sub>PV-K</sub>, pOXA-48<sub>PV-D</sub>, pOXA-48<sub>PV-B</sub>, and pOXA-48<sub>PV- 90 o</sub>). All these six variants showed a reduced MIC of AZI and COL compared to the plasmid- 91 free strain, confirming that the acquisition of pOXA-48 induces CS. Crucially, the pOXA-48<sub>DEL</sub> 92 variant, which carries a 199 bp deletion that abolishes *bla*<sub>OXA-48</sub> expression<sup>16</sup> 93 (**Supplementary Fig. 1** and **Supplementary Table 1**), neither conferred resistance to AMC 94 and ERT nor showed increased susceptibility to AZI and COL (**Fig. 1a**).

95 To confirm the abolition of the CS phenotype, we quantified the number of viable cells for the 96 pOXA-48<sub>WT</sub> and pOXA-48<sub>DEL</sub> carrying strains after exposure to different concentrations of 97 COL and AZI. While the viability of the pOXA-48<sub>WT</sub>-carrying strain significantly dropped at 98 low concentrations of AZI and COL (Mann-Whitney U test  $p < 0.04$ ), the pOXA-48<sub>DEL</sub>- 99 carrying strain showed almost the same viability as the plasmid-free strain (Mann-Whitney U 100 test  $p > 0.33$  for all concentrations and both antibiotics; **Fig.s 1b and c**). These results 101 cannot be explained by differences in plasmid stability or fitness cost across plasmid variants 102 (**Supplementary Fig. 2**) and confirm that the pOXA-48<sub>DEL</sub> variant, unlike pOXA-48<sub>WT</sub>, does 103 not produce CS to AZI or COL.



104  
105 **Figure 1 | A collection of pOXA-48 derivatives highlights that  $bla_{OXA-48}$  expression is the most**  
106 **likely cause behind CS. a) MIC values of four antibiotics for *E. coli* J53 carrying the pOXA-48**  
107 **variants. Horizontal lines indicate the median values of six biological replicates, represented as**  
108 **individual points. Asterisks denote statistical significance ( $p < 0.05$ ). Strains carrying non-functional**  
109 **variants of the  $bla_{OXA-48}$  gene are represented in red, strains with fully functional  $bla_{OXA-48}$  gene versions**  
110 **in blue, and the plasmid-free wild-type strain in dark grey. Data points have been slightly jittered to**  
111 **avoid overlapping. AMC: amoxicillin-clavulanic acid, ERT: ertapenem, COL: colistin, and AZI:**  
112 **azithromycin. b) Surviving viable cells after treatment with different concentrations of COL (upper**  
113 **panels) and AZI (lower panels). Error bars represent the standard deviation of three biological**  
114 **replicates. The antibiotic and its concentration, in mg/L, are indicated on the right-hand side of each**  
115 **panel. The dashed vertical line depicts the detection limit of the experiment. c) Spot test showing the**  
116 **survival at different antibiotic concentrations of *E. coli* J53 and its plasmid-carrying derivatives. After**  
117 **treatment with either AZI or COL at the indicated concentrations, appropriate dilutions of the surviving**  
118 **bacteria were plated on LB. Genotypes are shown in panel b.**

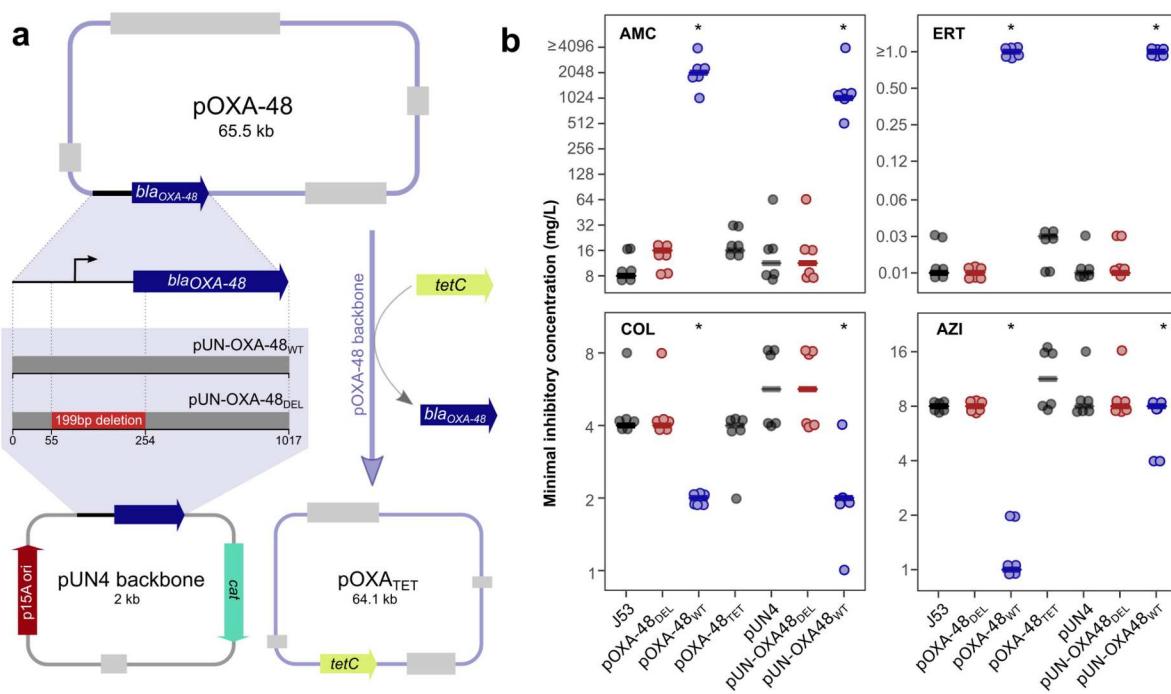
119 Expression of the  $bla_{OXA-48}$  gene is necessary and sufficient to induce CS to AZI and COL.

120 The above results suggested that a fully functional  $bla_{OXA-48}$  gene might be required to induce  
121 CS to AZI and COL. To test this hypothesis, we followed two complementary strategies.  
122 First, we used the pOXA-48<sub>TET</sub> plasmid, a pOXA-48 version in which the  $bla_{OXA-48}$  gene is  
123 replaced with a tetracycline resistance gene (*tetC*) (Fig. 2a and Supplementary Table 1).  
124 As expected, the pOXA-48<sub>TET</sub> plasmid did not confer resistance to  $\beta$ -lactam antibiotics (ERT  
125 and AMC; Fig. 2b) and conferred resistance to tetracycline (Supplementary Fig. 3). In  
126 addition, pOXA-48<sub>TET</sub> did not increase the susceptibility to AZI and COL, indicating that none

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127 of the genes in the plasmid backbone (nor the *tetC* gene) is responsible for the CS  
128 phenotype (Fig. 2b).



130 **Figure 2 | The expression of bla<sub>OXA-48</sub> induces collateral sensitivity.** a) Scheme depicting the  
131 design and construction of the pUN4 derivative vectors and the pOXA-48<sub>TET</sub>. Left branch: the region  
132 encoding the bla<sub>OXA-48</sub> gene was amplified from the pOXA-48<sub>WT</sub> plasmid and cloned into the pUN4  
133 backbone, obtaining the pUN-OXA-48<sub>WT</sub> vector. A parallel procedure was carried out for the pOXA-  
134 48<sub>DEL</sub> plasmid, leading to the pUN-OXA-48<sub>DEL</sub> vector. Right branch: the region encoding the tetC gene  
135 was amplified and cloned into the backbone of the pOXA-48<sub>WT</sub> plasmid, replacing bla<sub>OXA-48</sub> and  
136 resulting in the pOXA-48<sub>TET</sub> plasmid. b) MIC determination for *E. coli* J53 carrying the pOXA-48<sub>TET</sub>  
137 plasmid and the pUN4 derivatives in four antibiotics: AMC: amoxicillin-clavulanic acid, ERT:  
138 ertapenem, COL: colistin, and AZI: azithromycin. Horizontal lines indicate the median values of six  
139 biological replicates, represented as individual points. Asterisks denote statistical significance (p <  
140 0.02). Strains carrying non-functional variants of the bla<sub>OXA-48</sub> gene are represented in red, strains with  
141 fully functional bla<sub>OXA-48</sub> gene versions in blue, and  $\beta$ -lactamase-free strains in dark grey. Data points  
142 have been slightly jittered to avoid overlapping

143

144 Second, we cloned the wild-type bla<sub>OXA-48</sub> gene under the control of its own promoter into the  
145 pUN4 plasmid<sup>17</sup>, giving rise to the pUN-OXA-48<sub>WT</sub> plasmid (Fig. 2a). As a control, we also  
146 cloned the same plasmid region amplified from the pOXA-48<sub>DEL</sub> plasmid (pUN-OXA-48<sub>DEL</sub>;  
147 Fig. 2a). We independently transformed these plasmids and the empty vector (pUN4) into *E.*  
148 *coli* and assessed the antibiotic susceptibility of the derivative strains (Fig. 2b). The empty  
149 pUN4 or the pUN-OXA-48<sub>DEL</sub> plasmids did not significantly alter the susceptibility patterns  
150 compared to plasmid-free *E. coli* (Mann-Whitney U test p > 0.26). The expression of bla<sub>OXA-48</sub>

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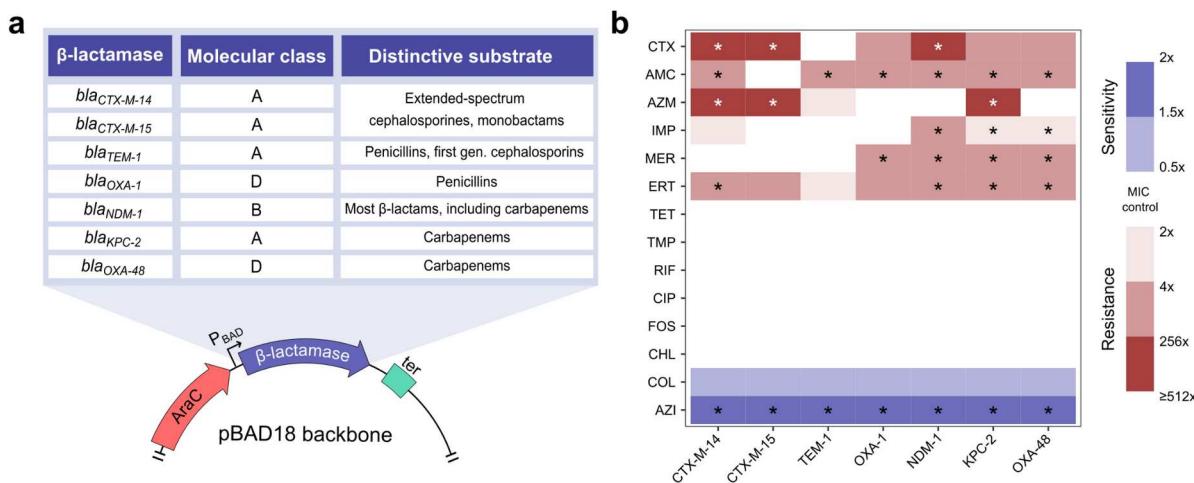
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151 from the pUN4 plasmid (pUN-OXA-48<sub>WT</sub>), however, conferred high resistance levels to AMC  
152 and ERT (Mann-Whitney U test  $p < 0.002$ ) and increased susceptibility to AZI and COL  
153 (Mann-Whitney U test  $p < 0.024$ , **Fig. 2b**), recapitulating the susceptibility patterns of pOXA-  
154 48<sub>WT</sub>. Together, these results indicate that the expression of a fully functional *bla*<sub>OXA-48</sub> gene is  
155 necessary and sufficient to induce CS to AZI and COL.

156 *CS to AZI and COL is a general side-effect of  $\beta$ -lactamase expression.*

157 The above results, together with our previous data showing that several  $\beta$ -lactamase-  
158 producing plasmids elicit varying degrees of CS to AZI and COL<sup>11</sup>, prompted us to  
159 investigate whether the expression of other  $\beta$ -lactamases induces CS. To this end, we  
160 selected seven clinically relevant  $\beta$ -lactamases frequently encoded on mobile genetic  
161 elements. Specifically, we chose penicillinases (i.e. TEM-1), oxacillinases (OXA-1),  
162 extended-spectrum  $\beta$ -lactamases (CTX-M-15, CTX-M-14), metallo- $\beta$ -lactamases (NDM-1),  
163 and other different carbapenemases (OXA-48, KPC-2) (**Fig. 3a**)<sup>18-21</sup>. We cloned these  $\beta$ -  
164 lactamases into the pBAD18 plasmid under the control of the arabinose-inducible P<sub>BAD</sub>  
165 promoter (**Fig. 3a**)<sup>22</sup>. We introduced these plasmids into *E. coli* K12 BW25113, a strain  
166 unable to metabolise arabinose that shows comparable resistance levels to J53  
167 (**Supplementary Fig. 4**). We then fine-tuned expression levels to match those found in  
168 natural plasmids using *bla*<sub>OXA-48</sub> as a reference (**Supplementary Fig. 5**) and then measured  
169 the susceptibility patterns to 14 antibiotics from nine drug families.

170 Under arabinose induction, all plasmids produced the expected  $\beta$ -lactam resistance profile  
171 according to their respective  $\beta$ -lactamases (**Fig. 3b**). Notably, expression of all  $\beta$ -lactamases  
172 increased susceptibility to COL (albeit non-significantly; two-way ANOVA adjusted using  
173 Dunnett's test,  $p > 0.12$  in all cases) and produced a substantial reduction in AZI resistance  
174 (two-way ANOVA adjusted using Dunnett's test,  $p < 0.003$  in all cases). Importantly,  
175 heterologous expression of other genes (i.e. *gfp*, *cat*, and *tetA*) did not produce any  
176 significant increase in susceptibility to AZI or COL (**Supplementary Fig. 6**), indicating that  
177 the expression of different  $\beta$ -lactamases (and not other genes) induce CS to AZI and, to  
178 some extent, to COL.



180 **Figure 3 |  $\beta$ -lactamase expression induces CS to AZI and, to some extent, COL.** **a)** The  
 181 molecular class and distinctive substrate of each  $\beta$ -lactamase are listed in the table.  $\beta$ -lactamases  
 182 were cloned under the control of the  $P_{BAD}$  promoter in the pBAD18 plasmid. **b)** Heat map representing  
 183 collateral responses to antibiotics associated with  $\beta$ -lactamase acquisition (median of six biological  
 184 replicates). The colour code represents the fold change in MIC of each antibiotic for the  $\beta$ -lactamase-  
 185 carrying derivatives relative to *E. coli* BW25113 strain carrying pBAD18 without  $\beta$ -lactamase.  
 186 Asterisks denote statistically significant differences ( $p < 0.047$  in all cases). CTX, cefotaxime; AMC,  
 187 amoxicillin-clavulanic acid; AZM, aztreonam; IMP, imipenem; MER, meropenem; ERT, ertapenem;  
 188 TET, tetracycline; TMP, trimethoprim; RIF, rifampicin; CIP, ciprofloxacin; FOS, fosfomycin; CHL,  
 189 chloramphenicol; COL, colistin; and AZI, azithromycin.

190  **$\beta$ -lactamase acquisition induces CS in diverse *E. coli* strains.**

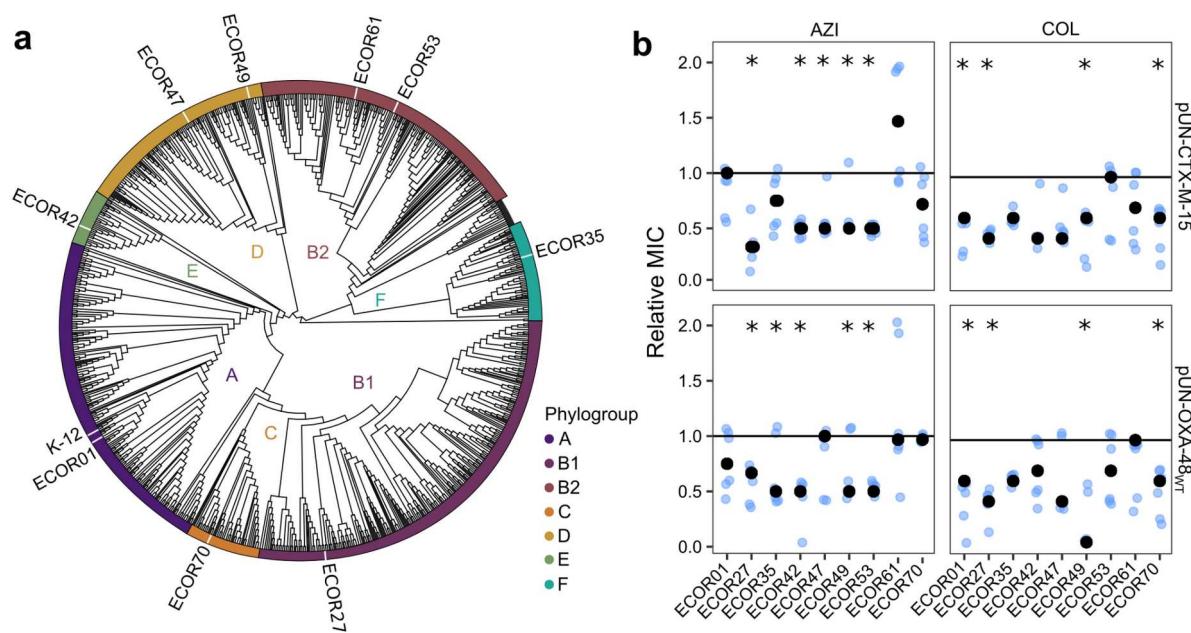
191 We then decided to test whether the CS response elicited by  $\beta$ -lactamase expression is a  
 192 general phenomenon that can be extrapolated to other *E. coli* strains. To assess the degree  
 193 of conservation of  $\beta$ -lactamase-induced CS, we selected nine genetically diverse *E. coli*  
 194 strains isolated from various hosts and geographical locations from the ECOR collection<sup>23,24</sup>.  
 195 We chose these strains because they lack known mobile  $\beta$ -lactamases, colistin and  
 196 macrolide resistance genes and span all major *E. coli* phylogroups (Fig. 4a and  
 197 **Supplementary Table 2**)<sup>24,25</sup>. *E. coli* wild-type strains are typically able to metabolise  
 198 arabinose and are unsuitable for  $P_{BAD}$ -driven expression. We thus transformed these strains  
 199 with the pUN4 empty vector and the pUN-OXA-48<sub>WT</sub> or pUN-CTX-M-15 plasmids. Analogous  
 200 to the pUN-OXA-48<sub>WT</sub>, the pUN-CTX-M-15 expresses the  $\beta$ -lactamase  $bla_{CTX-M-15}$  under the  
 201 control of its native promoter (**Supplementary Table 1**).

202 As expected, the expression of  $bla_{OXA-48}$  or  $bla_{CTX-M-15}$  provided resistance to ERT or  
 203 cefotaxime (CTX), regardless of the initial resistance profile of the strain (**Supplementary**  
 204 **Fig. 7**). Moreover, the expression of both  $\beta$ -lactamases produced a generalised increase in  
 205 susceptibility to AZI and COL. Specifically,  $bla_{CTX-M-15}$  expression led to significant CS to AZI  
 206 and COL in five and four strains, respectively. Expression of  $bla_{OXA-48}$  significantly reduced

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207 the MIC of AZI and COL in five and four strains, respectively (Fig. 4b; Mann-Whitney U test  
208 p < 0.038). Although only two strains showed significant CS to both AZI and COL (ECOR27  
209 and ECOR49), virtually all strains (8 out of 9) showed CS to at least one of the antibiotics,  
210 indicating that  $\beta$ -lactamase-induced CS is a common phenomenon in *E. coli*.



211

212 **Figure 4 | Collateral sensitivity induced by  $\beta$ -lactamases is conserved across phylogenetically**  
213 **distant *E. coli* strains. a)** Phylogenetic tree depicting the relationships of 1,573 representative *E. coli*  
214 **genomes and highlighting the strains used in this study. Colours at the tip of tree branches represent**  
215 **different phylogroups, as indicated in the legend. b)** Collateral sensitivity response to azithromycin  
216 **(AZI) and colistin (COL) associated with  $\beta$ -lactamase expression in *E. coli*. Relative MIC is determined**  
217 **as the MIC of the  $\beta$ -lactamase-carrying *E. coli* relative to the  $\beta$ -lactamase-free strain carrying the**  
218 **empty vector. Black points represent the median values of six biological replicates, shown as**  
219 **individual blue points. The horizontal line represents no change in MIC relative to the control strain.**  
220 **Asterisks denote a significant decrease in MIC (Mann-Whitney U test; p < 0.03). The data points have**  
221 **been slightly jittered to avoid overlapping.**

222 *Detection of CS patterns in clinical MIC surveillance data.*

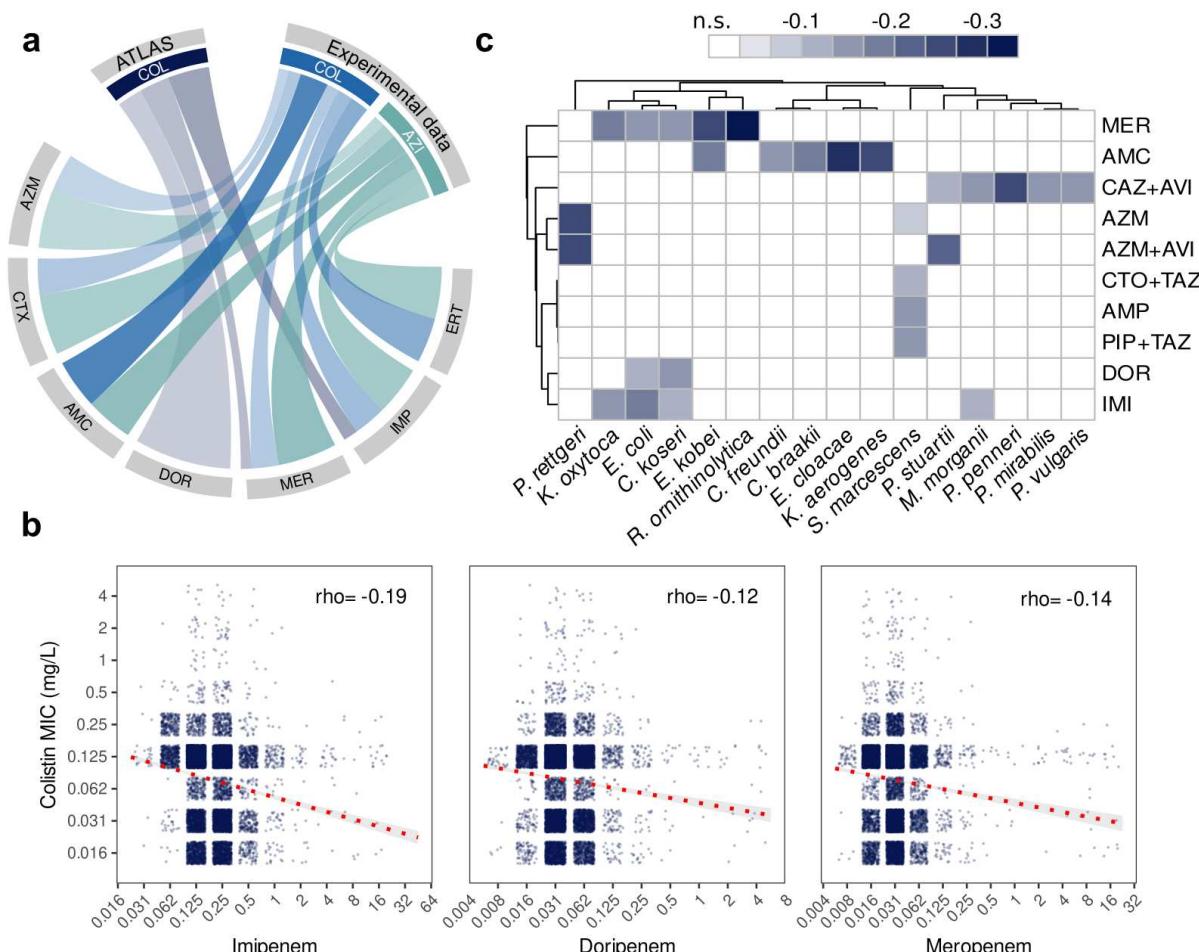
223 Given that the expression of horizontally acquired  $\beta$ -lactamases is the primary mechanism of  
224  $\beta$ -lactam resistance in *E. coli*<sup>26</sup>, we then hypothesised that a negative correlation between  $\beta$ -  
225 lactam resistance and resistance to COL or AZI would be consistent with  $\beta$ -lactamase-  
226 induced CS. To test the validity of this assumption, we searched for significant  
227 anticorrelations in our experimental dataset. We combined all experimental data from Fig.s  
228 1, 2, 3, and 4 and found that resistance to  $\beta$ -lactam antibiotics (AMC, AZM, CTX, ERT, IMP,  
229 and MER) is indeed significantly anti-correlated with COL and AZI resistance  
230 (**Supplementary Fig. 8 and Supplementary Table 3**; Spearman rho < -0.27; p < 0.04),

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231 indicating that correlation analysis can detect CS signatures across different strains and  
232 mechanisms of resistance.

233



234

235 **Figure 5 | Antibiotic resistance surveillance data show patterns consistent with  $\beta$ -lactamase-  
236 induced CS. a) The plot displays negative correlations between AZI or COL and  $\beta$ -lactam antibiotics  
237 using experimental data or data from ATLAS. The strength of the colours is proportional to the  
238 strength of the correlation (Spearman's rho). Only statistically significant correlations are plotted  
239 (Spearman correlation  $p < 0.05$ ). b) MICs for COL and the three antibiotics (imipenem, doripenem,  
240 meropenem, in mg/L) showing significant anticorrelations in ATLAS data. Each dot within the plots  
241 represents an isolate, and the red dotted line represents the best linear fit with 95% confidence  
242 intervals in light grey. Spearman's rho is also indicated within each plot. c) Hierarchical heatmap  
243 revealing negative correlations between  $\beta$ -lactam resistance and COL in different species belonging  
244 to the Enterobacterales order. Only statistically significant negative correlations were included. The  
245 strength of the colours is proportional to the strength of the correlation (Spearman's rho). Antibiotic  
246 pairs with no significant correlation are denoted by white, and negative correlation between antibiotics  
247 by blue colour as shown in the legend. MER: meropenem, AMC: amoxicillin-clavulanic acid, CAZ +  
248 AVI: ceftazidime + avibactam, AZM: aztreonam, AZM + AVI: aztreonam + avibactam, CTO + TAZ:  
249 ceftolozane + tazobactam, AMP: ampicillin, PIP + TAZ: piperacillin + tazobactam, DOR: doripenem,  
250 IMI: imipenem.**

251

252 To further investigate the signature of β-lactamase-associated CS in clinical enterobacteria,  
253 we analysed the Antimicrobial Testing Leadership and Surveillance (ATLAS) database.  
254 ATLAS comprises antibiotic susceptibility data for 44 antimicrobials and more than 600,000  
255 pathogens belonging to more than 200 bacterial species isolated from over 70 countries<sup>27,28</sup>.  
256 For each bacterial isolate, ATLAS stores MIC data of multiple antibiotics (mode: 11, range:  
257 11-34), which allows the detection of associations of resistance patterns between antibiotic  
258 pairs<sup>29,30</sup>.

259 We computed all possible pairwise correlations between the MIC data of 23 antibiotics for  
260 the ~80,000 *E. coli* isolates stored in ATLAS. Analysis of ~500 antibiotic pairs revealed three  
261 weak yet significant negative associations. All of them occurred between β-lactam antibiotics  
262 and COL. Specifically, strains showing higher resistance levels to carbapenem antibiotics  
263 doripenem (DOR), meropenem (MER), and imipenem (IMP) tend to show higher  
264 susceptibility to COL (i.e. are negatively correlated; Spearman's rho -0.12, -0.14, -0.19,  
265 respectively, and  $p < 0.027$  in all cases; **Fig. 5a, 5b** and **Supplementary Table 3**). Our  
266 experimental dataset further supports this result, as both analyses identified significant  
267 anticorrelations between IMP and MER resistance and COL (we did not measure DOR  
268 resistance experimentally), highlighting that carbapenem resistance elicits CS to COL.

269 To gain a deeper insight into this result, we analysed the MIC distributions of COL, grouping  
270 the bacteria based on their respective carbapenem resistance levels. As expected, strains  
271 with higher levels of carbapenem resistance tend to show significantly higher COL  
272 susceptibility (**Supplementary Fig. 9**), supporting the idea that the observed anticorrelations  
273 are a signature of β-lactamase-induced CS rather than a result of other potential  
274 confounding factors. It is important to note that despite being increasingly used to treat  
275 Gram-negative infections<sup>31</sup>, AZI susceptibility is rarely tested in *E. coli*, and thus, the low  
276 number of AZI susceptibility determinations in ATLAS restricted our analysis to COL.

277 We then decided to test if the signature of β-lactamase-induced CS was detectable in other  
278 enterobacteria. To this end, we analysed MIC data for the most abundant species within the  
279 order Enterobacterales in the ATLAS database. We found negative correlations between  
280 COL and β-lactam antibiotics for 13 out of 16 pathogens in a species- and antibiotic-specific  
281 pattern (**Fig. 5c** and **Supplementary Fig. 10**). The specificity of the CS signature agrees  
282 with previous reports showing that the effect of antibiotic combinations is species-specific  
283 and that β-lactamase expression produces host-specific physiological effects<sup>32,33</sup>. Altogether,  
284 these results suggest that β-lactamase-induced CS might be pervasive across

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284 enterobacteria despite the vast diversity of intrinsic susceptibility patterns and resistance  
285 mechanisms.

286

287 **Discussion**

288 In this study, we uncovered that the expression of different, clinically relevant β-lactamases  
289 increases bacterial susceptibility to AZI and COL. By taking a classical genetics approach,  
290 we first demonstrated that the *bla*<sub>OXA-48</sub> carbapenemase is solely responsible for the CS  
291 response to COL and AZI induced by the acquisition of the broadly disseminated pOXA-48  
292 plasmid (**Fig.s 1 and 2**). Given that all β-lactamases share a common mechanism of action  
293 (i.e. hydrolysis of the β-lactam ring in the periplasm), we tested whether this result could be  
294 generalised to other β-lactamases and strains. Using heterologous expression systems, we  
295 discovered that most β-lactamases induce CS to AZI and COL and that this phenomenon is  
296 conserved in phylogenetically diverse *E. coli* strains (**Fig.s 3 and 4**). We then searched for  
297 signatures of β-lactamase-induced CS in a clinical surveillance database containing millions  
298 of MIC data for different pathogens. We found significant negative correlations between  
299 MICs to different β-lactam antibiotics and COL resistance in *E. coli* and other  
300 Enterobacterales, a result that strongly supports the notion of β-lactamase-induced CS (**Fig.**  
301 **5**).

302 Our results indicate that acquiring β-lactamases of different families and classes induces a  
303 common pleiotropic response that increases susceptibility to AZI and COL in *E. coli*. But  
304 what is the molecular mechanism underlying this phenotype? A compelling hypothesis might  
305 come from the observation that β-lactamase expression affects bacterial physiology,  
306 reducing fitness in different species<sup>16,22,34–37</sup>. In some cases, this effect has been traced to the  
307 β-lactamase signal peptide, suggesting that protein translocation or accumulation in the  
308 periplasm perturbs cellular homeostasis<sup>22,33,35,38,39</sup>. Supporting this idea, the expression of  
309 some β-lactamases has been shown to induce the cellular envelope stress response<sup>33,38</sup>. In  
310 other cases, the biological cost occurs as a byproduct of residual dd-peptidase activity of  
311 certain β-lactamases. This ancestral activity may decrease cross-linked muropeptides,  
312 affecting peptidoglycan composition and producing structural changes in the cell wall<sup>36,40</sup>.  
313 Altogether, this evidence suggests that β-lactamase expression may destabilise the bacterial  
314 envelope, facilitating AZI and COL activity. Accordingly, AZI permeability and COL activity  
315 have been shown to increase when the envelope integrity is compromised<sup>41–44</sup>. Future work  
316 addressing this hypothesis will shed light on the molecular mechanisms driving β-lactamase-

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317 induced CS, with the potential reward of uncovering the ultimate mechanisms responsible for  
318  $\beta$ -lactamase fitness costs, which have remained elusive for over 20 years.

319  $\beta$ -lactams are the most prescribed antibiotics, and resistance rates are skyrocketing among  
320 clinical pathogens<sup>45</sup>. The Centers for Disease Control and Prevention (CDC) and the World  
321 Health Organization (WHO) consider  $\beta$ -lactamase-producing Gram-negative bacteria among  
322 the world's most serious threats<sup>46,47</sup>. This has led to a worldwide effort to potentiate the  
323 activity of existing  $\beta$ -lactam antibiotics by developing new  $\beta$ -lactamase inhibitors, among  
324 other strategies<sup>48-51</sup>. In this regard, our results pave the way for novel therapies that exploit  
325 CS using COL and AZI in combination with  $\beta$ -lactam antibiotics to eliminate  $\beta$ -lactamase-  
326 producing bacteria. We note, however, that the magnitude of the CS response in our  
327 experiments is moderate (2-8-fold reductions in MIC). While this result is similar to the CS  
328 responses found elsewhere<sup>4,52,53</sup>, more research is needed before  $\beta$ -lactamase-induced CS  
329 can be exploited therapeutically. The rational design of novel derivatives of macrolides and  
330 polymyxins<sup>54-56</sup> or novel antibiotic combinations<sup>32,57</sup> hold promise for increasing the efficacy of  
331 treatments against  $\beta$ -lactamase-producing bacteria. In summary, future work will be needed  
332 to understand the molecular mechanism(s) behind  $\beta$ -lactamase-induced CS and to find or  
333 design compounds that exploit it efficiently.

334

## 335 Materials and methods

### 336 Bacterial strains and culture conditions

337 *E. coli* strains were routinely grown in Lennox lysogeny broth (LB) at 37 °C with shaking (225  
338 rpm) or in agar plates (15 g/L). When needed, kanamycin (50 mg/L, Nzytech), carbenicillin  
339 (100 mg/L, Nzytech), cefotaxime (50mg/L, Normon), tetracycline (15 mg/L, Nzytech), or  
340 chloramphenicol (30 mg/L, Nzytech) were added for plasmid selection. **Supplementary**  
341 **Table 4** lists all antibiotics used in this study. *E. coli* J53 (F<sup>-</sup> met pro Azi<sup>r</sup>; ref.<sup>58</sup>) was used as  
342 the recipient of the pOXA-48 plasmid variants in conjugation experiments<sup>16</sup>. For consistency,  
343 we used this strain in all experiments except those involving the induction of the P<sub>BAD</sub>  
344 system. J53 readily metabolises L-arabinose, and therefore, for those experiments, we used  
345 *E. coli* strain BW25113 (F<sup>-</sup> DE(araD-araB)567 lacZ4787(del)::rrnB-3 LAM<sup>r</sup> rph-1 DE(rhaD-  
346 rhaB)568 hsdR514; ref.<sup>59</sup>). Both strains (J53 and BW25113) are *E. coli* K12 derivative strains  
347 and present similar levels of resistance and susceptibility to antibiotics (**Supplementary Fig.**  
348 **4**). *E. coli* strains belonging to each major phylogroup were chosen from the ECOR  
349 collection<sup>23</sup> to represent the genetic diversity of *E. coli*. The presence of known  $\beta$ -lactamases  
350 other than the chromosomally-encoded ampC gene present in all *E. coli* strains was

24

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351 discarded using deposited genomic sequences (Bioproject PRJNA230969 and ref.<sup>24</sup>) and  
352 Resfinder<sup>60</sup> (**Supplementary Table 2**).

353 *Construction of β-lactamase-carrying plasmids*

354 A list of all plasmids and oligonucleotides used in the study are listed in **Supplementary**  
355 **Table 1** and **Supplementary Table 5**, respectively. To construct the β-lactamase-carrying  
356 pUN4 plasmids, standard molecular biology techniques in combination with the Gibson  
357 assembly method were used as previously described<sup>61,62</sup>. PCR primer pairs were designed to  
358 amplify the pUN4 plasmid backbone (CS23-CS24, CS7-CS8 or CS41-CS42). PCR primer  
359 pairs were also designed to amplify the *bla*<sub>OXA-48</sub> gene containing the upstream region from  
360 pOXA-48<sub>WT</sub> or pOXA-48<sub>DEL</sub> plasmids (CS25-CS25 and CS9-CS10) and the *bla*<sub>CTX-M-15</sub> gene  
361 from pBAD-CTX-M-15 (CS43 and CS44). The resulting DNA fragments were cloned using  
362 the Gibson Assembly Cloning Kit (NEB) into plasmid backbone pUN4 to obtain pUN-  
363 OXA48<sub>WT</sub>, pUN-OXA48<sub>DEL</sub>, and pUN-CTX-M-15, respectively. The final plasmid constructs  
364 were introduced into *E. coli* DH5α and were confirmed by PCR and whole plasmid  
365 sequencing.

366 Prof. Linus Sandegren provided arabinose-inducible pBAD18 plasmids carrying the β-  
367 lactamase genes used in this work. Non-β-lactamase genes used as controls were cloned  
368 into the pBAD18 using the Gibson Assembly Cloning Kit (NEB). pBAD (RBS)\_fwd/rev primer  
369 pairs were used to amplify the plasmid backbone. Primer pairs (**Supplementary Table 5**)  
370 were designed to amplify *cat* and *gfp* genes from pBGC vector<sup>63</sup> and the *tetA* gene from the  
371 pCT plasmid<sup>64</sup>. The final plasmid constructs were introduced into *E. coli* DH5α and the  
372 transconjugant strains were confirmed by PCR and whole plasmid sequencing.

373 *Bacterial growth analysis*

374 Single colonies of each bacterial population were inoculated in LB starter cultures and  
375 incubated at 37 °C for 16 h at 225 rpm (six biological replicates). Each culture was diluted  
376 1:2000 in LB, and 200 µl were added to a 96-well microtiter plate containing appropriate  
377 antibiotic concentrations. When appropriate, L-arabinose (0, 0.005, 0.1, 0.2 or 0.5 % (w/v))  
378 was added into the culture broth to induce gene expression in the pBAD18-carrying strains.  
379 For checkerboard analysis, a matrix in 96-well plates was created with 2-fold serial dilutions  
380 of arabinose and amoxicillin-clavulanic acid. Plates were incubated for 22 h at 37 °C with  
381 strong orbital shaking before reading the optical density at 600 nm (OD600) every 15 min in  
382 a Synergy HTX (BioTek) plate reader. The area under the growth curve (AUC) was obtained  
383 using the ‘auc’ function from the ‘flux’ R package. AUC is used as it integrates all relevant  
384 growth parameters (maximum growth rate, lag duration and carrying capacity). For GFP

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385 expression monitoring, after 22 h of incubation, the fluorescent emission was measured at  
386 528 nm with excitation at 485 nm using a fluorescence spectrophotometer Synergy HTX  
387 (BioTek). The result is shown as relative fluorescence to the optical density at 600 nm. Data  
388 was represented using an R custom script and the 'ggplot2' package.

389 *Plasmid stability*

390 To test the stability of pOXA-48-like plasmids after each antibiotic treatment, the surviving  
391 bacterial populations were collected from the well corresponding to 0.5x MIC of either COL  
392 or AZI. Serial dilutions ranging from  $10^{-1}$  to  $10^{-7}$  were plated on both LB agar and LB agar  
393 with carbenicillin to identify and count the pOXA-48<sub>WT</sub>-carrying colonies (including negative  
394 controls of plasmid-free wild-type clones). For pOXA-48<sub>DEL</sub>, PCR amplification with the  
395 oligonucleotides OXA-F and OXA-R or  $\Delta$ blaOXA-48F and  $\Delta$ blaOXA-48R (**Supplementary**  
396 **Table 5**) was used to assess plasmid stability of 100 independent colonies.

397 *Antimicrobial susceptibility testing*

398 The antibiotic minimal inhibitory concentration (MIC) was determined using broth  
399 microdilution tests in LB medium<sup>11</sup>. Starter cultures were prepared and incubated as  
400 described above. Each culture was diluted 1:2000 in LB, resulting in approximately  $\sim 5 \cdot 10^4$   
401 colony forming units, and 200  $\mu$ l were added to a 96-well microtiter plate containing the  
402 appropriate antibiotic concentration. Optical density at 600 nm (OD600) was measured after  
403 22 h of incubation at 37 °C with strong orbital shaking every 10 min in a Synergy HTX  
404 (BioTek) plate reader to determine MIC values. As previously reported, the MIC value is  
405 reported as the lowest antibiotic concentration resulting in no visible growth (measured here  
406 as OD600 < 0.2)<sup>11</sup>. To ensure reproducibility, we performed parallel MIC determinations of  
407 plasmid-free J53 control strain in every assay.

408 To perform disk-diffusion assays, sterile disks containing the antibiotic were placed on plates  
409 of LB previously swabbed with a 0.5 McFarland matched bacterial suspension and then  
410 incubated at 37 °C for 22 h. Inhibition halos were measured using ImageJ software.  
411 Antibiotic disk content used in the assays were cefotaxime 30  $\mu$ g and amoxicillin + clavulanic  
412 acid 30  $\mu$ g (20  $\mu$ g + 10  $\mu$ g; all from Bio-Rad).

413 *Plasmid sequencing*

414 The pOXA-48<sub>TET</sub> plasmid was extracted using the Wizard genomic DNA purification kit  
415 (Promega). The pUN4 and pBAD18 derivatives were isolated using the Plasmid Easypure  
416 isolation kit (Macherey-Nagel) following the manufacturer's protocol. DNA was quantified  
417 using the Qubit dsDNA Assay (ThermoFisher) following the manufacturer's instructions.

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418 Genomic and plasmid DNA were sequenced with Oxford Nanopore technology at  
419 Plasmidsaurus (<https://www.plasmidsaurus.com/>, Eugene, EEUU) using the V10 chemistry  
420 library prep kit with the R10.4.1 flow cells. Sequences were annotated using the pLannotate  
421 software<sup>65</sup> and analysed using the BLAST Ring Image Generator<sup>65</sup>.

422 *Phylogenetic analysis of E. coli strains*

423 To determine the distribution of the *E. coli* isolates across the phylogeny of the species, we  
424 obtained a total of 1,573 *E. coli* genomes from the RefSeq database  
425 (<https://www.ncbi.nlm.nih.gov/assembly>), including all isolates from the ECOR Collection<sup>23</sup> in  
426 .fna format. Genomes were assigned to an *E. coli* phylogroup using the EzClermont tool  
427 (<https://github.com/nickp60/EzClermont>)<sup>67</sup>. Genomic distances were estimated using Mash<sup>68</sup>,  
428 and a phylogenetic tree was constructed using the R package PATO  
429 (<https://github.com/irycisBioinfo/PATO>)<sup>69</sup>.

430 *ATLAS data processing*

431 To conduct our analysis, we gathered MIC data for all species belonging to the order  
432 Enterobacterales in the ATLAS database ([www.atlas-surveillance.com](http://www.atlas-surveillance.com)). To avoid possible  
433 bias due to susceptibility testing heterogeneity, we discarded pathogen-antibiotic pairs with  
434 less than 50 instances. We also updated the classification of *Enterobacter aerogenes* to  
435 *Klebsiella aerogenes* to align with recent taxonomic changes<sup>70</sup>. In ATLAS, the actual MIC  
436 is sometimes reported as below or equal ( $\leq$ ) the detection limit of the  
437 susceptibility test or exceeds ( $>$ ) the highest antibiotic concentration tested. In  
438 these cases, we made conservative approximations. If the MIC was lower or  
439 equal to the lowest concentration tested, we recorded it as equal to that  
440 concentration. Conversely, if the MIC exceeded the highest concentration tested,  
441 we recorded it as double the detection limit. For instance, if ATLAS raw data  
442 indicated " $>64$  mg/L", we used "128 mg/L" as the numerical value. We computed  
443 pairwise correlations among the log2-transformed numerical MIC data for all  
444 possible antibiotic pairs for each species. This analysis was performed using the  
445 "corr.test" function from the "psych" package in R, with the Spearman method  
446 applied. We specifically focused on identifying significant negative correlations in  
447 our analysis. To visualise these correlations, we utilised the "circlize" package for  
448 chord diagrams and the "pheatmap" package for heatmaps in R.

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449 **Statistics**

450 Data sets were analysed using R software. Normality was assessed by visual inspection and  
451 the Shapiro-Wilk test. ANOVA tests were performed to ascertain the effect of the ‘ $\beta$ -  
452 lactamase x antibiotic concentration’ interaction term in the analysis of minimal inhibitory  
453 concentration. Plasmid stability was explored using the chi-square test. Associations  
454 between antibiotic resistance were performed using a simple linear model. Mann-Whitney U  
455 test was used to assess the significance of MIC determinations (n = 6) for the CS instances  
456 in natural *E. coli* strains.

457

458 **Data availability.**

459 Datasets generated and/or analysed during the current study are available in the  
460 Supplementary Data file. ATLAS data can be visualised through the ATLAS website  
461 (<https://atlas-surveillance.com>) and was downloaded from the following dataset published in  
462 ref.<sup>73</sup>  
463 ([https://s3-eu-west-1.amazonaws.com/amr-prototype-data/Open+Atlas\\_Reuse\\_Data.xls](https://s3-eu-west-1.amazonaws.com/amr-prototype-data/Open+Atlas_Reuse_Data.xls))

464

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