Antimicrobial resistance level and conjugation permissiveness shape plasmid

distribution in clinical enterobacteria

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Abstract

Conjugative plasmids play a key role in the dissemination of antimicrobial resistance (AMR) genes across bacterial pathogens. AMR plasmids are widespread in clinical settings, but their distribution is not random, and certain associations between plasmids and bacterial clones are particularly successful. For example, the globally spread carbapenem resistance plasmid pOXA-48 can use a wide range of enterobacterial species as hosts, but it is usually associated with a small number of specific *Klebsiella pneumoniae* clones. These successful associations represent an important threat for hospitalized patients. However, knowledge remains limited about the factors determining AMR plasmid distribution in clinically relevant bacteria. Here, we combined *in vitro* and *in vivo* experimental approaches to analyze pOXA-48-associated AMR levels and conjugation dynamics in a collection of wild type enterobacterial strains isolated from hospitalized patients. Our results reveal significant variability in these traits across different bacterial hosts, with *Klebsiella* spp. strains showing higher pOXA-48-mediated AMR and conjugation frequencies than *Escherichia coli* strains. Using experimentally determined parameters, we developed a simple mathematical model to interrogate the contribution of AMR levels and conjugation permissiveness to plasmid distribution in bacterial communities. The simulations revealed that a small subset of clones, combining high AMR levels and conjugation permissiveness, play a critical role in stabilizing the plasmid in different polyclonal microbial communities. These results help to explain the preferential association of plasmid pOXA-48 with *K. pneumoniae* clones in clinical settings. More generally, our study reveals that species- and strain-specific variability in plasmid-associated phenotypes shape AMR evolution in clinically relevant bacterial communities.

Significance statement

Conjugative plasmids disseminate AMR genes across bacterial pathogens. Understanding the rules governing plasmid dynamics in bacterial communities is therefore crucial to controlling the global AMR crisis. In this study, we analyzed the dynamics of an AMR plasmid of great clinical relevance, pOXA-48, in a collection of wild type bacteria recovered from hospitalized patients. We reported a high degree of variability in two key plasmid-associated phenotypes, AMR level and conjugation ability, across the collection of clinical bacteria. Using simulations based on the experimental results, we studied how successful associations between AMR plasmids and clinical

strains can arise in bacterial communities. Our results revealed that accounting for variability in

plasmid-associated phenotypes help to understand the evolution of AMR in clinical settings.

Introduction

Plasmids shape bacterial ecology and evolution by spreading accessory genes across

populations. Plasmids can disseminate both vertically and horizontally. Vertical transmission is

coupled to the division of the bacterial host, whereas horizontal transmission is mediated mainly

by conjugation (the direct cell-to-cell transfer of plasmids through a bridge-like connection) (1).

Vertical plasmid transmission is favored in the presence of environmental stresses that select for

plasmid-encoded genes, but in the absence of plasmid-specific selection, vertical transmission is

usually hindered by the fitness costs that plasmids produce in their bacterial hosts (2, 3).

Therefore, plasmids' interests can align or conflict with those of their bacterial hosts depending

on the environmental conditions, leading to complex eco-evolutionary dynamics (4-6). Horizontal

plasmid transmission can in principle make up for a deficit in vertical transmission, although

conjugation rates vary considerably depending on the plasmid type (7, 8). The fate of plasmids in

bacterial populations is thus determined by the interplay between horizontal and vertical

transmission dynamics (and their evolution) (9-12). Multiple theoretical and experimental studies

have investigated plasmid dynamics in clonal bacterial populations (examples can be found in 7,

8, 13-17). Other studies have analyzed the variability of plasmid-associated phenotypes across

the diversity of wild type bacteria that plasmids encounter in natural communities (18-25).

However, information remains very limited about how this variability may affect plasmid

distribution in complex microbiota.

A dramatic example of the ability of plasmids to fuel bacterial evolution is the central role they

play in the spread of antimicrobial resistance (AMR) in clinical pathogens, which is one of the

most urgent public health threats facing humanity (26, 27). One particularly concerning group of

drug resistant pathogens is carbapenemase-producing enterobacteria (order *Enterobacterales*),

which appear on the WHO "priority pathogens" list (28, 29). Carbapenemases are β-lactamase

enzymes able to degrade carbapenem antibiotics and are mainly acquired through conjugative

plasmids (26). pOXA-48-like plasmids (from here on pOXA-48) constitute one of the most

clinically important groups of carbapenemase-producing plasmids (30). pOXA-48 is a broad-host-

range conjugative plasmid from the plasmid taxonomic unit L/M (31) that encodes the OXA-48

carbapenemase and is disseminated across enterobacteria worldwide (30). Crucially, like most

AMR plasmids, pOXA-48 is not randomly distributed across bacterial hosts. Although pOXA-48

has a broad potential host range, it is strongly associated with *Klebsiella pneumoniae* and is

especially prevalent in high-risk clones of specific sequence-types (ST), such as ST11, ST307 or

ST101 (32, 33). In a previous study, we proposed that this bias in host distribution could be

explained in part by pOXA-48-associated fitness costs in the absence of antibiotics (34). We

analyzed the distribution of pOXA-48 fitness effects across a collection of *Escherichia coli* and

Klebsiella spp. clinical strains. Our results revealed that pOXA-48 produced a wide distribution of

fitness effects across these hosts, but these effects could not explain overall plasmid distribution,

especially at the species level (34).

In the present study, we investigate how other key plasmid-associated phenotypes determine

pOXA-48 distribution across clinical enterobacteria. We determine pOXA-48-associated AMR

level and conjugation permissiveness in a collection of multidrug resistant *E. coli* and *Klebsiella*

spp. strains isolated from the gut microbiota of hospitalized patients. Through a combination of *in*

vitro and *in vivo* experimental approaches, we demonstrate that (i) pOXA-48 confers a higher

level of AMR in *Klebsiella* spp., and that (ii) *Klebsiella* spp. strains are, on average, more

permissive than *E. coli* strains to pOXA-48 acquisition through conjugation. Finally, we integrate

these new experimentally determined parameters with our previous fitness data in a simple

population dynamics model. We use this model to interrogate the distribution of plasmid pOXA-

48 in complex bacterial communities under different antibiotic concentrations.

Results

Experimental model system

In this study, we used a collection of multidrug-resistant clinical enterobacterial strains isolated

from the gut microbiota of patients at a large hospital in Madrid, Spain (Ramon y Cajal University

Hospital). We focused on the two most prevalent species associated with pOXA-48 in this

hospital, *K. pneumoniae* and *E. coli* (32). Since *K. quasipneumoniae* and *K. variicola* (two species

previously misidentified as *K. pneumoniae*) are also associated with pOXA-48 in the hospital (32),

we included strains from these species in the study. From now on we use *Klebsiella* spp. to refer

to the strains in our collection belonging to these three *Klebsiella* species.

To analyze pOXA-48 transmission dynamics it is necessary to work with pOXA-48-free strains,

which are able to receive the plasmid through conjugation. Therefore, we selected and sequenced

the genomes of 25 *Escherichia coli* and 25 *Klebsiella* spp. multidrug resistant strains that did not

carry this plasmid, and that were representative of the phylogenetic diversity of these species in

our hospital (Fig. S10 and Table S2, collection partially overlapping with the one in ref. (34), see

Methods). Although these strains were pOXA-48-naive, they were identified as ecologically

compatible with pOXA-48 because they were obtained from patients on hospital wards where

pOXA-48-carrying enterobacteria were commonly isolated during the same period (32, 34).

AMR level conferred by pOXA-48 in wild type enterobacteria

To characterize the fitness advantage associated with pOXA-48 in the presence of antibiotics, we

determined the impact of plasmid acquisition on the level of AMR. pOXA-48 was introduced by

conjugation into the pOXA-48-naive enterobacteria collection. Four *E. coli* strains and one *K.*

pneumoniae strain were unable to acquire the plasmid, and whole genome sequencing of the

remaining transconjugants revealed pOXA-48 mutations in six *E. coli* and six *Klebsiella* spp.

transconjugants. After excluding these strains, we used the remaining 15 *E. coli* and 18 *Klebsiella*

spp. isogenic strains pairs with or without pOXA-48 plasmid for this analysis (Fig. S10). For each

of the transconjugant (TC) and plasmid-free (PF) clones, we determined the minimal inhibitory

concentration (MIC) of 4 clinically important β-lactam antibiotics: amoxicillin in combination with

the β-lactamase inhibitor clavulanic acid (AMC) and the carbapenems ertapenem (ERT),

imipenem (IMP), and meropenem (MER) (Fig. 1A). Compared with *E. coli*, *Klebsiella* spp. strains

showed higher intrinsic resistance to all four antibiotics (Wilcoxon rank sum test: AMC, $W = 47.5$,

$P = 0.001$; ERT, $W = 14.5$, $P = 8.68 \times 10^{-6}$; IMP, $W = 15$, $P = 5.16 \times 10^{-6}$; MER, $W = 56$, $P = 0.002$),

as well as higher resistance level after plasmid acquisition (Wilcoxon rank sum test: AMC, $W =$

27, $P = 8.94 \times 10^{-5}$; ERT, $W = 82$, $P = 0.031$; IMP, $W = 29.5$, $P = 4.79 \times 10^{-5}$; MER, $W = 54$, $P =$

0.002).

The diverse genomic background and AMR gene content of the strains under study made it

difficult to elucidate a genetic origin for the higher AMR levels reached by pOXA-48-carrying

Klebsiella spp. (Fig. S11). However, a prominent influence on plasmid-mediated AMR level is

plasmid copy number (PCN). AMR level commonly escalates with PCN for AMR mechanisms

showing strong gene dosage effects, such as carbapenemases (35, 36). We used the genome

sequencing data to estimate pOXA-48 PCN in the strains under study (Fig. 1B). The results

showed that PCN was higher in *Klebsiella* spp. (mean = 2.21, SD = 1.53) than in *E. coli* strains

(mean = 1.41, SD = 0.55) (Wilcoxon rank-sum test, *W* = 76, *P* = 0.03). We then compared pOXA-

48 PCN and AMR levels for the antibiotic to which pOXA-48 confers the highest level of

resistance: AMC (average fold-change in MIC associated to pOXA-48 presence = 244.7, Fig.

S12). The final AMC resistance level correlated positively with PCN (Spearman's correlation: *R* =

0.5, *P* = 0.003; Fig. S13), supporting the idea that the higher PCN is at least partly responsible

for the elevated AMR level in *Klebsiella*. spp. Finally, to investigate if the differences in PCN were

also present in strains naturally carrying pOXA-48, we used the same genomic approach to

analyze PCN in a recently characterized large collection of 200 pOXA-48-carrying clinical isolates

from the same hospital. In line with the results from the transconjugant strains, PCN was higher

in *Klebsiella* spp. (mean = 2.35, SD = 0.88) than in *E. coli* (mean = 1.46, SD = 1.33) (Fig. 1C;

Wilcoxon rank-sum test, *W* = 1271, *P* = 1.32 x 10^{-14}).

Fig. 1. Resistance levels and copy number of pOXA-48 in wild type enterobacteria. pOXA-

48 confers higher resistance levels and has a higher PCN in *Klebsiella* spp. than in *E. coli.* (A)

MIC (mg/L) of amoxicillin/clavulanic acid, ertapenem, imipenem and meropenem for the plasmid-

free/plasmid-carrying strain pairs (median of three biological replicates). (B) pOXA-48 plasmid

copy number (PCN) of the *E. coli* (n = 15) and *Klebsiella* spp. (n = 18) transconjugant strains.

PCN was estimated from sequencing data as the ratio of plasmid/chromosome median coverage

(see Methods). Horizontal lines inside boxes mark median values, the upper and lower hinges

correspond to the 25th and 75th percentiles, and whiskers extend to 1.5 times the interquartile

range. Dots indicate individual PCN values. To aid visualization, the y axis is represented in $\log_{10}$

scale with no value transformation. (C) pOXA-48 PCN in *E. coli* (n = 59) and *Klebsiella* spp. (n =

140) pOXA-48-carrying wild-type clinical strains. Boxplots are structured as in B. *P < 0.05, **P

< 0.01, ***P < 0.001.

Conjugation frequency varies across clinical strains

To analyze pOXA-48 horizontal transmission dynamics, we determined the ability of clinical

strains to acquire the plasmid by conjugation ("conjugation permissiveness"). For recipients, we

used a subset of 10 *Klebsiella spp.* and 10 *E. coli* strains representative of the genetic diversity

of the collection (Fig. S10). For donors, we used three pOXA-48-carrying strains. These were a

laboratory-adapted *E. coli* strain [β3914, a diaminopimelic acid (DAP) auxotrophic laboratory

mutant of *E. coli* K-12], and two wild-type pOXA-48-carrying clinical strains recovered from

hospitalized patients and belonging to STs responsible for between-patient plasmid dissemination

in the same hospital (32): *K. pneumoniae* ST11, and *E. coli* ST10 (strains K93 and C165

described in references 32 and 36).

We first performed classical conjugation assays (one donor and one recipient strain in equal

proportions) for all donor–recipient combinations, and measured conjugation frequencies as the

ratio between transconjugants (TC) and total recipient cells (see Methods for details). Note that

the donor *K. pneumoniae* ST11 could not be distinguished from three recipients of the same

species, either by the phenotype in the differential medium or by antibiotic selection, and therefore

conjugations could not be performed for these donor–recipient pairings. This analysis revealed a

wide diversity of conjugation frequencies across recipient strains. Overall, *Klebsiella spp.* strains

showed a significantly higher conjugation permissiveness than *E. coli* for all three donors (Fig.

2A, Kruskal-Wallis rank sum test: *E. coli* β3914, X^2 = 45.8, *P* = 1.9 x 10^{-11}; *E. coli* ST10, X^2 = 23.8,

P = 1.07 x 10^{-6}; *K. pneumoniae* ST11, X^2 = 6.98, *P* = 8.24 x 10^{-3}). Moreover, two *E. coli* strains

produced no TCs with any of the donors, whereas all *Klebsiella spp.* strains produced TCs in at

least one of the conditions and were also the recipients with highest conjugation permissiveness

for every donor. Finally, we also calculated the conjugation rates from the mating assays with *E.*

coli ST10 as donor and the 20 recipient strains, using the end-point method (37) (Fig. S14).

Results ruled out the possibility that differences in growth dynamics of donors, recipients and TCs

could produce biases in the conjugation frequency results (37,38).

The gut microbiota is a dense bacterial community that engages in complex ecological

interactions. To analyze if community complexity could affect conjugation permissiveness in our

clinical strains, we repeated the conjugation assays, but this time instead of using a single clone

as the receptor, we used ten pairs of *E. coli*/*Klebsiella* spp. strains (Fig. 2B and Table S2). This

analysis once again revealed great variability in reception frequencies and a higher overall

conjugation permissiveness in *Klebsiella* spp. strains (Fig. 2B, paired Wilcoxon signed-rank exact

test: *E. coli* β3914, *V* = 235, *P* = 0.017; *E. coli* ST10, *V* = 205, *P* = 0.01; *K. pneumoniae* ST11, *V*

= 45, *P* = 1.2 x 10^{-4}). In general, the conjugation frequencies observed agreed with those from

the single conjugation assays, suggesting that ecological interactions did not markedly affect

conjugation dynamics. However, one of the *E. coli* strains that produced no TCs as single receptor

was able to acquire the plasmid (PF_EC07), which could be due to secondary conjugations from

the *Klebsiella* spp. TC (39). Finally, to increase the complexity of the recipient community even

further, we performed conjugation assays using a pool of all 20 strains as recipients (Fig. 2C). In

this case, we could only distinguish between TCs at the species level in the differential medium.

Once again, the results revealed *Klebsiella spp.* to be more conjugation-permissive than *E. coli*,

regardless of the donor (Fig. 2C, Kruskal-Wallis rank sum test: *E. coli* β3914, X^2 = 9.28, *P* = 2.32

x 10^{-3}; *E. coli* ST10, X^2 = 9.31, *P* = 2.35 x 10^{-3}; *K. pneumoniae* ST11, X^2 = 12.8, *P* = 3.49 x 10^{-4}).

Fig. 2. *In vitro* **pOXA-48 conjugation dynamics in wild type enterobacteria**. Conjugation frequencies (transconjugants/recipient) of a subset of 20 isolates from our clinical enterobacteria collection (10 *E. coli* and 10 *Klebsiella* spp., x-axis), obtained from three pOXA-48 donors (*E. coli* β3914, left; *K. pneumoniae* ST11, center; and *E. coli* ST10, right). (A) Conjugation frequencies obtained in conjugation assays with one donor and one recipient in equal proportions. Color represents the recipient species (red, *E. coli*; blue, *Klebsiella* spp.), symbols represent biological replicates (n = 4), and asterisks symbolize conjugation frequencies below the detection limit (dotted line). *Klebsiella spp.* exhibits higher conjugation frequencies than *E. coli* for the three donors. (Kruskal-Wallis rank sum test: *P* < 0.01). (B) Conjugation frequencies using one donor and pairs of *E. coli* and *Klebsiella* spp. as recipients. *Klebsiella spp.* is more conjugation-permissive than *E. coli*, regardless of the donor used (Wilcoxon signed-rank exact test: *P* < 0.01). (C) Conjugation frequencies obtained with a pool of recipients (one donor, 20 recipients). The results give a conjugation frequency value per species, and symbols represent biological replicates (n=9) whose values would correspond to the most successful strains of each species in plasmid uptake. *Klebsiella spp.* has higher conjugation frequencies than *E. coli*, regardless of the donor (Kruskal-Wallis rank sum test: *P* < 0.01).

Conjugation dynamics in a mouse model of gut colonization

To contrast our *in vitro* results in a more biologically relevant environment, we studied pOXA-48

conjugation dynamics in a mouse model of gut colonization (C57BL/6J). As donor, we used *K.*

pneumoniae ST11 strain K93, since this clonal group is frequently responsible for gut microbiota

colonization of patients in our hospital (32). As recipients, we used 6 strains representative of the

variability in conjugation frequency observed *in vitro* (*E. coli* PF_EC10, PF_EC12, and PF_EC21;

and *Klebsiella spp*. FP_KQ01, PF_KPN11, and PF_KPN12). Mice (n = 21) were treated orally

with ampicillin (0.5 g/L), vancomycin (0.5 g/L), and neomycin (1 g/L) for one week to reduce

colonization resistance, as we previously described (40), and the antibiotic treatment was stopped

one day before inoculation. A total of 18 mice were inoculated orally with the donor and co-

inoculated 2 hours later with the recipients (3 mice per recipient), and 3 mice were not inoculated

with any bacteria, as controls. Fresh fecal samples were collected every 24 hours during 2 days.

At the end of the second day, mice were sacrificed, and cecum samples were collected. Samples

were processed and plated with antibiotic selection to determine colonization levels and the

frequency of transconjugants, as described in Methods. Two independent assays were

performed, two months apart, and the results of both assays are compiled below (Fig. 3 and

source data).

Colonization levels were high in all inoculated mice at both 24 and 48 hours for donor and recipient

strains (Fig. 3A), while no colonization was observed in the control mice. At 24 hours post-

inoculation, the numbers of transconjugants were generally low, and no differences in

transconjugant frequencies were detected between *E. coli* and *Klebsiella* spp. (Fig. 3B Kruskal-

Wallis rank sum test H = 1.4, P = 0.265). At 48 hours post-inoculation, the levels of donors were

similar in mice co-inoculated with *E. coli* or *Klebsiella* spp. recipient strains (Wilcoxon rank sum

test: in feces, W = 2.71, P = 0.1; in cecum, W = 0.1, P = 0.752). However, despite the fact that

the levels of *Klebsiella spp.* recipients were slightly lower than those of *E. coli* recipients (Wilcoxon

rank sum test: in feces, W = 245, P = 0.008; in cecum, W = 4.9, P = 0.026), *Klebsiella spp.* showed

significantly higher frequencies of transconjugants (Fig. 3B, Kruskal-Wallis rank sum test: in feces,

$H = 24.6$, $P = 6.89 \times 10^{-7}$; in cecum, $H = 10.2$, $P = 1.4 \times 10^{-3}$). In summary, the *in vivo* results

correlated qualitatively with those from the *in vitro* conjugation assays (Fig. 2A and 3B), and

Klebsiella spp. strains showed higher levels of transconjugants than *E. coli* strains on average.

Fig. 3. pOXA-48 conjugation dynamics in a mouse model of gut colonization. pOXA-48

transconjugant frequencies in mouse feces and cecum at 24 and 48 hours post colonization. (A)

Colonization levels of the donor (*K. pneumoniae* ST11), recipients (3 *E. coli* and 3 *Klebsiella spp.*

strains), and transconjugants, in feces at 24 and 48 hours post-inoculation (top and center) and

in cecum content at 48 h (bottom). Species are indicated by colors (red, *E. coli*; blue, *Klebsiella*

spp.) and biological replicates (n=6) by symbols. Black lines indicate the median values for the

biological replicates. Donor and recipient colonization levels were high in both feces and cecum.

(B) Transconjugant frequencies (transconjugants/recipients) in feces at 24 and 48 hours (top and

center) and in cecum (bottom). Transconjugant frequencies were significantly higher in *Klebsiella*

spp. than in *E. coli* in both feces and cecum at 48 hours (Kruskal-Wallis rank sum test in feces H

= 24.6, *P* = 6.89 x 10^{-7}; in cecum H = 10.2, *P* = 1.4 x 10^{-3}).

Simulating plasmid-host associations in complex populations

We previously developed a mathematical model to study how pOXA-48 fitness effects impact

plasmid maintenance in complex bacterial communities (34). That model allowed us to predict

the competitive fitness of each strain, with and without pOXA-48, based on growth-kinetic

parameters that were calibrated from experimental growth curves obtained from single clones. In

the present study, we extended this model to include the new variables informed by the

experimental results: conjugation permissiveness and resistance levels (Fig. 4A,B). Specifically,

we used the conjugation rates values obtained using *E. coli* ST10 as donor, and resistance levels

to AMC (see Supporting Information for a complete description of the model and its

parametrization). This computational model allowed us to track the distribution of plasmids in

response to selection at species and strain resolution.

We first simulated simple pairwise competition experiments between the 10 *Klebsiella* spp. and

10 *E. coli* strains in our collection with experimentally determined conjugation rates and AMR

levels (Table S1). Each competition experiment started with a 1:1 ratio, and a 50% plasmid

frequency in each strain (see Supporting Information). To assess the role of antibiotics in the

distribution of plasmids in the population, we performed all pairwise competition experiments for

a range of selective pressures (Fig. S5-S7). At low and intermediate antibiotic concentrations, the

plasmid was preferentially associated with *E. coli*. In contrast, as the selective pressure increased,

the proportion of plasmid-carrying *Klebsiella* spp. strains within the pairs correspondingly

increased, reflecting the relatively lower resistance levels exhibited by *E. coli* strains (Fig. S5-S7).

We next used the model to analyze the impact of AMR levels and conjugation permissiveness in

pOXA-48 distribution in complex communities, such as those in the gut microbiota of hospitalized

patients (Fig. 4 and S8). Our previous epidemiological studies revealed that patients are

commonly colonized by pOXA-48-carrying nosocomial enterobacterial clones (32). During

colonization, the plasmid spreads horizontally to resident enterobacteria in the gut, and different

clones can subsequently maintain the plasmid in the community, producing long term pOXA-48

gut carriage (32). To simulate the invasion and dissemination within the gut microbiota

community, we used our mathematical model to initialize multistrain simulations with only one

member of the community carrying pOXA-48 (starting at a frequency of 0.01% of the total density,

Fig. 4A,B). We conducted 10-day simulated serial dilution experiments with a starting community

including the 20 strains (the 10 *E. coli* and 10 *Klebsiella spp.*). We then explored the effects of

various antibiotic concentrations on community compositions (Fig S8), aiming to evaluate the

plasmid dynamics and to identify the successful associations between plasmid and hosts. At low

drug concentrations, we found that, as the selective pressure increases, the population shifts from

being dominated by plasmid-free *E. coli* to contain mostly plasmid-free *Klebsiella* spp. (Fig. 4C).

At intermediate and high drug concentrations, plasmid-carrying strains dominate, with only

Klebsiella spp. strains being able to persist at very high concentrations. At the strain-level, the

simulations revealed that the species-level dynamics were driven by a small subset of successful

strains, which played a key role in stabilizing the plasmid in the communities (Figs 4D). At

intermediate and high drug concentrations, plasmid-carrying PF_KPN12 (ST307), PF_EC02

(ST453), and PF_KPN11 (ST307) were the most prevalent strains. At very high antibiotic

concentrations pOXA-48-carrying PF_KPN11 (ST307) clearly dominated the population.

Finally, we followed a different approach to further evaluate if specific bacterial strains played an

important role in maintaining plasmid stability within the community. We used an iterative knock-

out simulation approach where strains were sequentially and randomly removed from the 20-

strain community, with an evaluation of plasmid stability after each removal. This approach

revealed the important role of strains PF_EC03 (ST131), PF_EC16 (ST38), PF_KPN11 (ST307)

in antibiotic-free environments (Fig. S9). In high-antibiotic-concentration environments,

PF_KPN02 (ST485), PF_KQ01, and again, PF_KPN11 (ST307) played key roles in maintaining

plasmid stability (Fig S9).

Taken together, our results underscore the critical role of successful plasmid-host associations in

securing plasmid stability in mixed microbial populations. Specifically, we observed that certain

strains in our pool, such as PF_KPN11 (ST307), are crucial for the dissemination and

maintenance of plasmid pOXA-48 in the communities.

Fig. 4. Computational model of plasmid population dynamics. (A) Diagram illustrating the computational approach employed to assess the distribution of plasmids within mixed bacterial populations under a range of selective pressures (see Supporting Information). (B) The model simulates various ecological processes that influence plasmid dynamics, enabling the exploration of their behavior under different conditions, including bacterial growth, modeled as a Monod term G (S; ψ), conjugative transfer occurring at a rate γ, segregational loss occurring at a rate λ, and antibiotic bactericidal killing κ (Table S1). (C) Population dynamics simulated across a range of drug concentrations, starting with an initial population of 10 *E. coli* and 10 *Klebsiella* spp. strains. Predominantly, plasmid-free bacteria emerge at low drug levels, while plasmid-bearing *Klebsiella* spp. prevail under high drug concentrations. (D) Strain-level resolution in the simulations of the multistrain dose-response. In conditions of low drug concentrations, the plasmid-free strains PF_EC22 (ST131) and PF_KPN12 (ST307) are predominant. In high drug concentration environments, the strain PF_KPN11 (ST307) appears to contribute to the preservation of plasmid stability in these communities.

Klebsiella-derived capsules are associated with plasmid carriage in *E. coli*

The conjugation experiments showed a higher permissiveness for pOXA-48 acquisition in *Klebsiella* spp. than in *E. coli*, as well as high variability between strains of the same species. We sought to investigate the genetic traits that could explain these differences. We analyzed the

genomes of the 20 recipient strains for an array of traits known to affect conjugation efficiency:

CRISPR arrays, restriction-modification (RM) systems and other phage defense systems that

could target pOXA-48, plasmid incompatibilities, and type VI secretion systems (T6SS, known to

mediate bacterial competition, which may affect conjugation frequencies). However, none of

these traits accounted for the observed differences in pOXA-48 acquisition (Fig. S15, Table S3).

Capsules have been reported to hinder DNA transfer and possibly constitute a barrier to plasmid

acquisition (41, 42). We used two software tools to search for capsular systems: Kaptive, to detect

and type *Klebsiella* capsular loci, and CapsuleFinder, to identify other capsular systems. With the

single exception of the non-capsulated PF_KPN14 strain, each recipient strain encoded a specific

set or type of complete capsular loci (Table S3). To assess whether similar sets of capsular loci

were associated with higher or lower conjugation permissiveness, we calculated a weighted gene

repertoire relatedness (wGRR) score. Although we found no clear pattern for the *Klebsiella* spp.

recipients, the *E. coli* strain with the highest overall pOXA-48 reception permissiveness across

the three different donors, PF_EC25, encoded a *Klebsiella* capsular locus (KL35, Fig. 5A, Table

S3).

To determine if *Klebsiella*-derived capsules better facilitate pOXA-48 acquisition than other

capsular systems, we analyzed their association in the complete genomes of 1,585 *E. coli* and

715 *K. pneumoniae* strains (RefSeq), of which 6 *E. coli* strains and 46 *K. pneumoniae* strains

carry pOXA-48 (Fig. 5B, Table S4). We used phylogenetic logistic regression (*phyloglm*) to

account for phylogenetic dependency of the significant associations ($P < 0.05$, Fisher's exact test;

Table S6). The presence of *Klebsiella*-derived capsules was associated with pOXA-48 carriage

only when *E. coli* and *K. pneumoniae* were analyzed together (Table S6, *phyloglm* $P = 0.0016$).

We next investigated the relationship between the presence of *Klebsiella*-derived capsules and

plasmid carriage more generally, finding significant associations when analyzing *E. coli* and *K.*

pneumoniae together (Table S6, *phyloglm* $P < 2 \times 10^{-16}$) and when analyzing *E. coli* separately

(Table S6, *phyloglm* $P = 2.2 \times 10^{-5}$). Moreover, *E. coli* strains encoding other capsular systems

(not derived from *Klebsiella*) were more likely to be plasmid-free or to carry only one plasmid,

whereas *E. coli* encoding *Klebsiella*-derived capsules had an increased likelihood of carrying

multiple plasmids (Fig. 5C). These results suggest that although capsules generally obstruct

conjugation (41, 42), certain types of *Klebsiella*-derived capsules could be more permissive than

other capsule types to plasmid acquisition by *E. coli*.

Fig. 5. Associations between capsular systems and plasmid carriage. Analysis of capsular systems and plasmid prevalence in our recipient strains and in *E. coli* and *K. pneumoniae* genomes obtained from RefSeq. (A) Heatmap of weighted gene repertoire relatedness (wGRR) scores between capsular sets (*Klebsiella*-derived capsules and/or other capsular systems) encoded by the recipient strains used in conjugation experiments. A wGRR score of 1 means that all proteins from the capsular set encoding the fewest number of proteins have a homolog in the capsular set it is compared with. A score of 0 indicates there are no homologs between the capsular sets of the two compared strains. Recipients are ordered by median pOXA-48 conjugation frequency across replicates and donors. The PF_EC25 strain, highlighted in bold, has the highest median conjugation frequency of any *E. coli* strain and is the only *E. coli* strain encoding a *Klebsiella*-derived capsule. Strains from the same sequence type (ST) are marked with a symbol. The black square indicates strains with a *Klebsiella*-derived capsule. (B) Number of *E. coli* (Ec) and *K. pneumoniae* (Kpn) strains from the RefSeq database analyzed for the association between the presence of *Klebsiella*-derived capsules (Kcaps) and carriage of pOXA-48 (left) or plasmids in general (including pOXA-48; right). In total, the RefSeq database includes 1,585 Ec and 715 Kpn strains. (C) Association between the presence of a genome-encoded *Klebsiella*-derived capsule and the number of plasmids carried in the *E. coli* (Ec) and *K. pneumoniae* (Kpn) RefSeq strains. The chart shows odds ratio (Fisher's exact test) of plasmid

carriage for strains encoding a *Klebsiella*-derived capsule *vs* strains encoding other capsular

systems (not from *Klebsiella*). Values above 1 (horizontal dashed line) indicate a positive

association, and values below 1 a negative association, between encoding *Klebsiella*-derived

capsules and carrying the indicated number of plasmids. In all cases, the number of strains

carrying each number of plasmids is >100. A significant Fisher's test ($P < 0.05$) is indicated by a

black outline.

Discussion

In this work, we performed a comprehensive analysis of pOXA-48 effects in clinical

enterobacteria. One of the main strengths of this study is the relevance of the experimental

system. We used an epidemic carbapenem resistance plasmid, pOXA-48, and a collection of

wild-type, multidrug resistant, enterobacterial isolates recovered from hospitalized patients. Using

this system, we analyzed pOXA-48-associated AMR levels and conjugation permissiveness both

in vitro and *in vivo* (Figs. 1-3). The key advantage of experimentally determining plasmid-

associated phenotypes in a collection of wild type clinical enterobacteria is that we can confidently

feed these variables into mathematical models. We developed a model including three key

variables informed by our experimental results: bacterial growth dynamics with and without pOXA-

48 (34), conjugation permissiveness (Fig. 2 and S14), and AMR levels (Fig. 1). We used this

model to investigate pOXA-48 dynamics in complex bacterial communities under different levels

of selection, aiming to simulate pOXA-48 invasion of a gut microbiota (Fig. 4).

The critical result of our study is that pOXA-48-associated phenotypes vary significantly across

different wild type bacterial hosts. We had previously shown that pOXA-48 produces variable

fitness effects in the absence of antibiotics (34, 43), and in this new study we reveal similar

variability in pOXA-48-associated AMR levels and conjugation permissiveness. This variability is

especially evident for horizontal transmission, with conjugation frequencies differing by orders of

magnitude across different recipients. Our simulations revealed that the variability of plasmid-

associated phenotypes dramatically impact plasmid distribution in polyclonal bacterial

communities. Specifically, a single successful pOXA-48-bacterium association is sufficient to

allow for plasmid invasion and stable maintenance in a complex population for a wide range of

antibiotic concentrations (Fig. S8). These jackpot associations, combining high growth rates, high

AMR levels, and high conjugation permissiveness, can act as pOXA-48 super-sinks in the gut

microbiota of patients, maintaining and further disseminating the plasmid. Interestingly, these

successful pOXA-48-carrying clones are likely to produce long-term colonization of the gut

microbiota of patients, as we have recently reported (32). Long-term colonization may in turn lead

to the dissemination of carbapenemases from clinical settings towards the community, which

represents a critical step in AMR epidemiology.

One of the main goals of this study was to understand the bias in pOXA-48 distribution across

enterobacteria. Despite having a broad host range and producing similar fitness effects in *E. coli*

and *Klebsiella* spp. (34, 43), pOXA-48 is usually associated with specific *K. pneumoniae* clones

in hospitals (32, 33). Our results help to explain this bias. We experimentally showed that,

compared with *E. coli*, *Klebsiella* spp. clones generally have a higher AMR level associated with

pOXA-48 carriage and a greater ability to take up pOXA-48 by conjugation. Crucially, our

simulations of both pairwise competitions and complex bacterial communities revealed that

pOXA-48 is mostly associated with *Klebsiella* spp. under high antibiotic pressure. Taken together,

these results help to explain why pOXA-48 is usually associated with *K. pneumoniae* in the gut

microbiota of hospitalized patients, which is a complex community frequently exposed to high

antibiotic pressure. At the strain level, our model also provides interesting information. The most

relevant result emerging from our simulations is that *K. pneumoniae* strains belonging to ST307

(PF_KPN12 and specially PF_KPN11) are responsible for pOXA-48 maintenance in the bacterial

communities. Importantly, ST307 is a clonal group that is emerging as major cause of nosocomial

outbreaks in many different regions around the world, and is usually associated with plasmid-

mediated extended-spectrum ß-lactamases (ESBLs) and carbapenemases (33, 44, 45). In Spain,

ST307 is actually becoming the most concerning pOXA-48-carrying clonal group in hospitals,

replacing other high-risk *K. pneumoniae* STs, such as ST11 (32, 46). Therefore, our simulations

based on data obtained from clinical strains which were originally pOXA-48-free were able to

mirror the real dynamics observed in our hospital. These results suggest that the experimentally

determined phenotypes: fitness with and without plasmid, AMR levels and conjugation

permissiveness, could help to predict the evolution of plasmid-mediated AMR in clinical settings.

Given the importance of the variability of plasmid-associated phenotypes in the evolution of

plasmid-mediated AMR, a critical research direction in the field will be to characterize the

molecular basis underlying these differences. In this study, we showed that the presence of

Klebsiella-derived capsules, compared to other capsular systems, is associated with a higher

plasmid frequency in an *E. coli* clone (Fig. 5). We also showed that pOXA-48 PCN is higher in

Klebsiella spp. than in *E. coli* clones, probably contributing to the higher AMR level observed in

pOXA-48-carrying *Klebsiella* spp. strains (Fig. 1). Further work will be needed to characterize the

molecular basis and significance of these and other specific interactions. Understanding the

plasmid and host factors that determine this variability will help us not only to predict, but also

hopefully to counteract successful associations between AMR plasmids and high-risk bacterial

clones.

Methods

pOXA-48_K8 plasmid, strains, and growth conditions. We used 50 wild type pOXA-48-free

enterobacterial strains recovered from the gut microbiota of hospitalized patients (Table S2,

partially overlapping the collection in (34)). These strains belonged to the R-GNOSIS collection,

which was constructed in our hospital during an active surveillance-screening programme for

ESBL/carbapenemase-producing enterobacteria (from March 4th, 2014 to March 31st, 2016, R-

GNOSIS-FP7-HEALTH-F3-2011-282512,

https://cordis.europa.eu/project/id/282512/reporting/es, approved by the Ramón y Cajal

University Hospital Ethics Committee, Reference 251/13). These strains are representative of *E.*

coli and *Klebsiella* spp. diversity in the R-GNOSIS collection, and we define them as ecologically

compatible with plasmid pOXA-48, because they were obtained from patients on hospital wards

where pOXA-48-carrying enterobacteria were commonly isolated during the same period. To

analyze the pOXA-48-associated AMR level, we selected 33 isogenic strains pairs (15 *E. coli* and

18 *Klebsiella* spp.) with (TC) or without pOXA-48 plasmid (PF) from the collection. Plasmid-

bearing strains carry the most common pOXA-48-like plasmid variant from our hospital, pOXA-

48_K8 (32). For the conjugation frequencies determination, we selected, as recipients, 10 *E. coli*

and 10 *Klebsiella spp.* pOXA-48-free isolates that cover the phylogenetic diversity of the collection

(Fig. S10) (32) and showed similar β-lactam resistance levels. As plasmid donors we selected

three pOXA-48_K8-carrying strains: *E. coli* β3914 (47), *K. pneumoniae* K93, and *E. coli* C165 (32,

36). Bacterial strains were cultured in LB at 37 °C with continuous shaking (250 r.p.m), and on LB

or HiCrome™ UTI (Himedia Laboratories, India) agar plates at 37 °C.

Determination of minimum inhibitory concentration (MIC). We determined the MIC of AMC

(Normon, Spain), ERT (Merck Sharp & Dohme B.V., Netherlands), IMP (Fresenius Kabi,

Germany) and MER (SunPharma, India) in all plasmid-carrying and plasmid-free clones selected

for this study following a modified version of the agar dilution protocol (48, 49). This method allows

us to test a large number of isolates simultaneously under identical conditions and to test a wide

range of AMC concentrations, since this β-lactam antibiotic degrades fast in liquid medium (50).

We prepared pre-cultures of plasmid-free and plasmid-carrying strains by inoculating single

independent colonies into LB broth in 96-well plates and overnight incubation at 37 ºC with

continuous shaking (250 r.p.m.). We spotted 10 µl of each overnight culture onto LB agar plates

with increasing concentrations of AMC (from 4 mg/L to 32,768 mg/L), ERT (from 0,25 mg/L to 512

mg/L), IMP (from 0.25 mg/L to 1,024 mg/L) or MER (from 0.25 mg/L to 32 mg/L), and incubated

them overnight at 37 ºC. We determined the MIC of each strain as the lower antimicrobial

concentration able to inhibit the growth of each strain. We performed three biological replicates

per MIC determination in three independent days, and we used the median value of the three

replicates as the MIC.

***In vitro* determination of conjugation frequencies and rates.** To determine the *in vitro*

conjugation frequencies, we selected, as recipient strains, 10 *E. coli* and 10 *Klebsiella spp.* pOXA-

48-free isolates, from our collection of ecologically compatible enterobacterial isolates (Fig. S10).

As plasmid donors we used three pOXA-48_K8-carrying strains: *E. coli* β3914, a counter-

selectable diaminopimelic acid auxotrophic laboratory strain (47); *K. pneumoniae* K93, a pOXA-

48-carrying ST11 strain; and *E. coli* C165, a pOXA-48-carrying ST10 strain (32, 36). To counter-

select the two natural donors, we transformed the recipients with pBGC plasmid, a non-

mobilizable *gfp*-carrying small plasmid that encodes a chloramphenicol resistance gene (34). It

was not possible to introduce pBGC into three *Klebsiella spp.* isolates (PF_KPN09, PF_KPN14 y

PF_KPN16), due to their level of constitutive resistance to chloramphenicol. We streaked donor

and recipient strains from freezer stocks onto LB agar plates with or without ertapenem 0.5 mg/L

–and 0.3 mM DAP for *E. coli* β3914/pOXA-48_K8–, respectively, and incubated at 37 °C

overnight. We prepared pre-cultures of donors and recipients by inoculating single independent

colonies in 15-ml culture tubes containing 2 ml of LB broth and overnight incubation at 37 ºC with

continuous shaking (250 r.p.m.). To perform classic conjugation assays, we mixed one donor and

one recipient at equal proportions (each donor with each recipient, independently, with a total of

4 recipient biological replicates by donor), plated the mixture as a drop onto LB agar plates –

supplemented with DAP 0.3mM for *E. coli* β3914/pOXA-48_K8 donor– and incubated them at 37

ºC during only 4h. A short mating experiment (4 hours) reduces the chances of secondary

conjugation events from transconjugants to recipients, but we cannot rule out this possibility. Also,

4 hours mating reduces the impact of potential differences in donor, recipient, and transconjugant

growth rates on conjugation frequency determination. After incubation, we collected the biomass,

resuspended it in 1 ml of NaCl 0.9 % and performed 1/10 serial dilutions up to 10^{-6}. We estimated

the final densities of transconjugants and recipients by plating 10 µl of each dilution on HiCrome^{TM}

UTI agar plates (HIMEDIA laboratories, India) with or without AMC 256 mg/L, respectively, and

with chloramphenicol 50 mg/L. We plated the dilutions as drops, and each drop was subsequently

allowed to drain down the plate, this way we can separate the colonies so they are easily

distinguishable and quantifiable. We performed the donor counter-selection by the absence of

DAP in the medium for *E. coli* β3914/pOXA-48_K8, or by selection with chloramphenicol for

clinical *K. pneumoniae* ST11 and *E. coli* ST10. Finally, we calculated the conjugation frequencies

per recipient following the formula below:

538
$$Conjugation\ frequency_R = \frac{CFU_{transconjugants}}{CFU_{recipient}}$$

where *CFU$_{transconjugants}$* are the transconjugant colony-forming units obtained from the number of

colonies in the plate (corrected by the dilution factor); and *CFU$_{recipient}$* are the number of recipient

colony-forming units minus transconjugants. Note that in the cases where no TC colonies were

detected in the plate, we calculated a threshold conjugation frequency assuming the presence of

a single colony in the total cell suspension, thus establishing a detection limit of 10^{-6}. Conjugation

rates were calculated for the experiments performed using *E. coli* ST10 as a donor and the 20

recipient strains. For these mating experiments, the number of donors, recipients and

transconjugants were determined both before and after the mating assays as described above,

and the conjugation rates were determined using the end-point method for solid surfaces (37).

To perform conjugation assays with recipient pairs we randomly grouped the recipients in pairs

so that each pair comprised one *E. coli* and one *Klebsiella spp.* recipient. We used a modified

version of the above protocol, in which we mixed recipient pre-cultures of each pair at equal

proportions and we subsequently mixed these recipient mixtures with the pre-culture of the donor

at the same proportion, forming the final conjugation reaction (each recipient pair with one donor

per time, with 4 biological replicates of recipient pairs). We determined the recipients and

transconjugants densities by antibiotic selection with AMC 256 mg/L, (to select transconjugants

vs. recipients) and chloramphenicol 50 mg/L (to counter-select donors), and distinguished

between recipients using the differential chromogenic medium HiCrome™ UTI agar. We

calculated the conjugation frequency per each receptor using the formula above.

For conjugation assays with a pool of all the recipients, we mixed the same pre-culture volume of

all recipient strains with one donor per experiment, following the same protocol previously

described. Nine biological replicates were performed.

***In vivo* conjugation.** For the determination of conjugation frequencies of clinical isolates *in vivo*,

we performed conjugation assays using a mouse model of gut colonization. We selected a subset

of 6 pBGC-carrying recipient strains from the *in vitro* conjugation assays: 3 *E. coli* (PF_EC10,

PF_EC12 and PF_EC21) and 3 *Klebsiella spp.* (PF_KQ01, PF_KPN11 and PF_KPN12) strains.

As plasmid donor we selected the natural pOXA-48_K8-carrying isolate, *K. pneumoniae* ST11,

K93 (32). We carried out the experiment described below twice, 2 months apart and under

identical conditions.

Mouse model and housing conditions. We used 6-week-old C57BL/6J female mice (n =

21) purchased from Charles River Laboratories and housed them with autoclave-sterilized food

(a 1:1 mixture of 2014S Teklad Global diet and 2019S Teklad Global Extrused 19% Protein

Rodent Diet from Envigo) and autoclave-sterilized water. Temperature was kept at 21 ± 2 °C and

humidity was maintained at 60–70%, in 12 h light/dark cycles. To allow intestinal colonization of

the donor and recipient strains, we disrupted the intestinal microbiota by administering ampicillin

(500 mg/L), vancomycin (500 mg/L) and neomycin (1 g/L) in the drinking water for one week, as

previously described (40). Water with antibiotics was changed every 3-4 days to avoid reduction

of antibiotic activity. During antibiotic treatment, mice were co-housed (3-6 mice per cage). After

1 week of treatment, antibiotics were removed from the drinking water and mice were individually

housed to avoid bacterial transfer between mice due to coprophagia during the experiment.

Mice inoculation with donor and recipient strains. 1 day after antibiotic treatment removal,

18 out of 21 mice were inoculated by oral gavage with 10^7 CFU of the donor strain, *K. pneumoniae*

ST11. Two hours later, each donor-inoculated mouse was co-inoculated by oral gavage with 10^7

CFU of a recipient strain (3 mice per recipient). This way, from the initial 21 mice, 18 of them were

inoculated with donor and recipient bacteria (6 different recipients, 3 mice per recipient) and 3

mice remained uninoculated as control.

Sample collection and bacterial levels determination. After antibiotic treatment and prior

to inoculation, we collected fresh fecal samples from each mouse as to control for the absence of

bacteria able to grow on the selective medium used for our bacteria of interest. We weighted the

feces and resuspended them in 1 ml PBS until a homogeneous mixture was obtained. Then, we

diluted mixtures 1:100,000 and plated 100 μl on HiCrome$_{TM}$ UTI agar plates with ampicillin (400

mg/L) and vancomycin (1 mg/L). We incubated the plates overnight at 37 ºC. After incubation,

bacterial growth was found to be absent. During the assay, we collected fresh fecal samples from

each mouse 24 and 48 h post inoculation and processed samples as described before. To

determine the donor, recipients and transconjugants densities, we plated 100 μl of different

dilutions onto HiCrome$_{TM}$ UTI agar plates with: i) vancomycin (1 mg/L) and AMC (256 mg/L) to

detect the donor; ii) vancomycin (1 mg/L) and chloramphenicol (50 mg/L) to detect recipients; and

iii) vancomycin (1 mg/L), AMC (256 mg/L) and chloramphenicol (50 mg/L) to determine the

presence of transconjugants. We calculated the colonization levels of the members of each

conjugation assay with the following formula:

599
$$CFU/mg_{donor,recipient} = \frac{CFU_{donor,recipient} - CFU_{transconjugants}}{mg_{feces}}$$

600 From the levels of recipients and transconjugants we calculated the conjugation frequencies per

601 recipient as described before in the *in vitro* protocol. At 48 h post inoculation, after fresh fecal

602 samples collection, we sacrificed mice and obtained samples of cecum content by manual

603 extrusion. We performed sample processing, bacterial levels determination and conjugation

604 frequencies determination as described above.

DNA extraction and genome sequencing. We isolated the genomic DNA of the strains used in this work using the Wizard genomic DNA purification kit (Promega, WI, USA) and quantified using the Qubit 4 fluorometer (ThermoFisher Scientific, MA, USA). Whole genome sequencing was performed at the Wellcome Trust Centre for Human Genetics (Oxford, UK) using the Illumina HiSeq4000 or NovaSeq6000 platforms with 125 or 150 base pair (bp) paired-end reads, respectively. Read data is available under the BioProject PRJNA803387.

Processing of sequencing data. All Illumina reads were trimmed with a quality threshold of 20 and reads shorter than 50 bp and adapters were removed using Trim Galore v0.6.6 (https://github.com/FelixKrueger/TrimGalore). PF and TC genomes were *de novo* assembled with SPAdes v3.15.2 (51) in --isolate mode and with the --cov-cutoff flag set to auto. Assembly quality was assessed with QUAST v5.0.2 (52). TC were confirmed to correspond to their PF strain by checking mutations and plasmid content with Snippy v4.6.0 (https://github.com/tseemann/snippy) and ABRicate v1.0.1 (PlasmidFinder database, https://github.com/tseemann/abricate), respectively. Snippy was also used to confirm isogenicity of the acquired pOXA-48 plasmids. Multilocus sequence typing was performed with MLST v2.21.0 (https://github.com/tseemann/mlst).

Construction of phylogenetic trees. Mash distance phylogenies were constructed for the 25 *E. coli* and 25 *Klebsiella* spp. PF strains from their whole-genome assemblies using mashtree v1.2.0 (53) with a bootstrap of 100 (Fig. S10).

Plasmid copy number (PCN) estimation. PCN of pOXA-48 was determined for the 33 TC strains and the 200 wild-type *E. coli* and *Klebsiella* spp. R-GNOSIS strains (BioProject PRJNA626430) carrying pOXA-48 variants sharing 72% of the pOXA-48_K8 core genome (32, 36). PCN was estimated from read coverage data as the ratio of plasmid median coverage by chromosome median coverage (54, 55). Since the genome assemblies are fragmented, the median coverage of the chromosome was calculated from the first three, largest contigs (total size sum of first three contigs 0.3-4.0 Mb), which were confirmed to correspond to chromosomal sequences by using BLASTn against the NCBI nr nucleotide database. The median coverage of pOXA-48 was calculated from the contig containing the IncL replicon, as identified with ABRicate v1.0.1 with the PlasmidFinder database, which generally corresponds to the largest pOXA-48 contig (size 11.0-59.8 Kb). For computing the PCN, the Illumina trimmed reads were first mapped

to their respective genome assembly using BWA MEM v0.7.17 (56). Strain K25 from the wild-type

pOXA-48-carrying collection was removed from the analysis due to truncated reads. Samtools

depth v1.12 (57) with the -a flag was used to obtain read depths at each genomic position and

the median read coverage for pOXA-48 and chromosome was computed with GNU datamash

v1.4 (gnu.org/software/datamash).

Comparative genomic analysis of recipient strains. We analyzed the genomes of the recipient

strains to find traits that could explain the observed differences in pOXA-48 acquisition. First, the

draft genomes of the 20 recipients and three donors (*E. coli* ST10 C165 and *K. pneumoniae* ST11

K93 from Bioproject PRJNA626430; for *E. coli* β3914, the sequence of the ancestral K-12 strain,

NC_000913.3) were annotated with Prokka v1.14.6 (58) with default settings. A summary of the

results can be found in Table S3.

Restriction-modification (RM) systems were searched using two approaches. First, the protein

sequences of the recipient and donor strains were blasted against the protein "gold standard"

REBASE database (downloaded February 2022, (59)) using BLASTp v2.9.0 (60). The results

were filtered with a criteria based on (61). Briefly, hits with type I and IIG RM systems were kept

if the percentage of identity and alignment was 100%, since it was observed that recognition sites

varied between enzymes with only a few mismatches. For type II systems, a threshold of 70%

identity and 90% alignment was used, as it was previously reported that these systems with

identity over 55% generally share the same target motifs. For type III and type IV this threshold

was higher, as reported in the same study, and was set at 90% identity and 90% alignment. After

filtering, some proteins had hits with more than one enzyme. For these cases, the best hit or the

hit with the enzyme of the corresponding organism (*E. coli* or *Klebsiella* spp.) was kept. The

DefenseFinder webserver (accessed February 2022, (62, 63)) was also used to search for RM

systems in the proteomes of recipients and donors. Then, the REBASE hits and the RM systems

detected by DefenseFinder were unified by protein ID. Enzymes or RM systems present in all

strains were discarded, since they would not explain differences in conjugation frequencies

between isolates. Finally, only complete RM systems that were not present in the donor strains

were retained for each recipient-donor combination, since the donor would be conferring

protection to pOXA-48 against equivalent systems of the recipient. Complete type I systems

comprise a restriction enzyme (REase), a methylase (MTase) and a specificity (S) subunit. Type

II systems include at least a REase and a MTase. No type III systems were detected, and type IV

systems are normally composed of one or two proteins. Donor and recipient systems were

regarded as similar if they shared the same recognition sequence or if a BLASTp alignment of

the enzymes followed the previous criteria of identity and alignment percentage per type of

system. The same method was applied for comparing the final systems between recipient strains,

and similar systems within each type were given the same letter code identifying the RM system

subtype (Fig. S15, Table S3).

Clustered regularly interspaced short palindromic repeats (CRISPRs) were identified in the

nucleotide sequences of the recipient strains with the DefenseFinder webserver. The spacer

sequences were aligned to pOXA-48_K8 (MT441554) using the blastn-short function of BLASTn

v2.9.0 (60) and hits were then filtered by percentage of alignment. Other defense systems were

also detected with the DefenseFinder webserver and PADLOC v1.1.0 (database v1.3.0, (64)).

Plasmid incompatibility was investigated by identifying plasmid replicons using ABRicate v1.0.1

with the PlasmidFinder database.

Secretion systems were searched using the TXSScan models of MacSyFinder v1.0.5 (62, 65),

selecting the option "ordered_replicon" and linear topology. Only complete systems were

considered.

Capsular systems were identified using two software. First, *Klebsiella* capsules, which belong to

the Wzx/Wzy-dependent group I capsular systems, were identified with Kaptive v2.0.0 (66), using

the K locus primary reference and default parameters. The presence of *Klebsiella* capsules was

assigned when the confidence level of the matches was above "good", as recommended by the

authors. Other capsular systems from groups I (Wzx/Wzy-dependent), II and III (ABC-dependent),

IV, synthase-dependent (cps3-like and hyaluronic acid) and PGA (Poly-γ-d-glutamate) were

searched using MacSyFinder v1.0.5 with the CapsuleFinder for diderms models, indicating

"ordered_replicon" as database type and linear topology (62, 67). Only systems reported as

complete were considered. In the cases where *Klebsiella* capsular loci were also identified by

CapsuleFinder as group I capsules, analyses were performed with the Kaptive output. To assess

the similarity of the different sets of capsular loci between strains, a weighted gene repertoire

relatedness (wGRR) score was calculated as in (68). For this, significant sequence similarities (e-

694 value <10^{-4}, identity ≥35%, coverage ≥50%) among all pairs of proteins in the capsular loci were

695 searched using MMSeqs2 (Nature Biotechnology release, August 2017, (69)) with the sensitivity

696 parameter set to 7.5. The best bi-directional hits between pairs of capsule loci sets were then

697 used to compute the wGRR as:

698
$$wGRR_{A,B} = \Sigma_i \frac{id(A_i, B_i)}{min(A, B)}$$

699 where $id(A_i, B_i)$ is the sequence identity between each pair i of homologous proteins in A and B,

700 and $min(A, B)$ is the number of proteins of the capsule loci set encoding the fewest proteins (A or

701 B). The wGRR takes values between 0 (no homologous proteins between capsule loci sets) and

702 1 (all genes of the smallest capsule loci set have an identical homologous in the loci set of the

703 other strain), representing the fraction of homologs in the smallest of the two capsule loci set

704 weighted by their sequence similarity. Protein sequences of the *Klebsiella* capsular loci were

705 obtained from Prokka annotations of the operon nucleotide sequences output by Kaptive. All

706 proteins between the borders of CapsuleFinder complete systems were included.

707 **Analysis of capsular systems in a database.** The database comprised the genomes of 730 *K.*

708 *pneumoniae* and 1,585 *E. coli* downloaded from the NCBI RefSeq database of high quality

709 complete non-redundant genomes (retrieved from ftp://ftp.ncbi.nlm.nih.gov/genomes/refseq/ on

710 March 2021; Table S4) (70). pOXA-48-carrying strains were identified in the RefSeq database

711 when the best, largest BLASTn hit between the sequence of pOXA-48_K8 (MT441554) and the

712 target plasmid had >95% identity and >10 Kb alignment, and when the plasmid sequence

713 contained the pOXA-48 IncL replicon and the bla_{OXA-48} gene as detected by ABRicate with the

714 PlasmidFinder and ResFinder databases. The plasmids of 6 *E. coli* and 46 *K. pneumoniae* strains

715 met this criteria, which had lengths between 50.6-74.2 Kb (average 64.0 Kb; Table S4). Kaptive

716 and CapsuleFinder were used as previously described to search for *Klebsiella*-derived capsules

717 and capsular systems, respectively, and to discard non-capsulated strains (15 *K. pneumoniae*

718 strains).

719 Associations between the presence of *Klebsiella*-derived capsules and pOXA-48- or plasmid-

720 carriage were analyzed building 2x2 contingency tables. Significant interactions ($P < 0.05$, Fisher

721 exact test) were then corrected for phylogenetic dependency, i.e. the tendency of closely related

strains to share the same traits. For this, a set of 128 HMM profiles (Pfam release 35, Table S5)

of conserved bacterial single copy genes, described in (71) and curated in (72), were identified in

the RefSeq strains and an *Enterobacter cloacae* outgroup (accession number

GCF_003204095.1) using HMMER v3.3 (option --cut_ga) (73). Hits were filtered by score using

the cutoffs reported in (65), resulting in 127 gene markers present in >90% of strains. Protein

sequences of each family were aligned with MAFFT v7.453 (option --auto) (74) and alignments

were trimmed with trimAl v1.4.rev15 (75). IQ-TREE v1.6.12 (76) was used to infer two

phylogenetic trees from the concatenated alignments (the first including all capsulated strains,

and the second including only *E. coli* strains, both with the *E. cloacae* outgroup) with best

evolutionary model selection and 1000 ultrafast bootstrap. Trees were rooted and rescaled to a

total height of 1. Phylogenetic logistic regression for each significant association was performed

with the function *phyloglm* from the *phylolm* v2.6.4 R package (77), fitting a logistic MPLE model

with 100 independent bootstrap replicates.

Mathematical model and simulations of polymicrobial communities. A detailed description

of the population dynamics model and the computational simulations can be found in the

Supporting Information (SI Text). All code and data used is available at https://github.com/ccg-

esb/EvK.

Statistical analyses. All statistical analyses were performed with R v4.2.2 (www.R-project.org).

Packages *ggplot2* v3.3.6, *ggpubr* v0.4.0 *pheatmap* v1.0.12, *RColorBrewer* v1.1-3, *ggsignif* v0.6.3

and *tidyverse* v1.3.1 were used for data manipulation and representation. R base packages were

used for statistical tests. Normality of the data was assessed with the Shapiro-Wilk test. To

analyze the differences in initial (PF) and final (TC) MIC of antibiotics and PCN between *E. coli*

and *Klebsiella* spp. a Wilcoxon sum-rank test was used. To analyze the differences between the

members of each recipient couple in the pairwise conjugation experiments (Shapiro-Wilk

normality test, $P < 0.01$ in all cases), the non-parametric Wilcoxon paired signed-rank test was

used. To determine differences between receptor species in the classical and pooled recipient

conjugation experiments, as well as in *in vivo* conjugation assays (Shapiro-Wilk normality test, P

< 0.01 in all cases), the non-parametric Kruskal-Wallis test was performed. Correlations were

performed with the Spearman's rank test. Phylogenetic analyses were performed with *ape* v5.6-

2, *phytools* v1.0-3 and *phylolm* v2.6.4 packages.

Data and code availability. Sequencing data generated in this study is available in the Sequence

Read Archive (SRA) under the BioProject PRJNA803387. The R-GNOSIS sequences were

generated in (32) and a subset of strains were selected as in (36) (see Methods). All source data

is provided as Supporting Information. The code generated during the study along with detailed

bioinformatic methods is available at https://github.com/LaboraTORIbio/super-sinks and

https://github.com/ccg-esb/EvK.

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