1	Evolutionary mechanisms shaping the maintenance of antibiotic resistance
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8	Keywords: Antibiotic, evolution, fitness costs, compensation, epistasis, multidrug resistance;
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10	Abstract
11	Antibiotics target essential cellular functions but bacteria can become resistant by acquiring
12	either exogenous resistance genes or chromosomal mutations. Resistance mutations
13	typically occur in genes encoding essential functions, which causes resistance mutations to
14	be generally detrimental in the absence of drugs. However, bacteria can reduce this
15	handicap by acquiring additional mutations, known as compensatory mutations. Genetic
16	interactions (epistasis) either with the background or between resistances (in multi-resistant
17	bacteria) dramatically affect the fitness cost of antibiotic resistance and its compensation,
18	therefore shaping dissemination of antibiotic resistance mutations. This review summarizes
19	current knowledge on the evolutionary mechanisms influencing maintenance of resistance
20	mediated by chromosomal mutations, focusing on their fitness cost, compensatory evolution
21	and epistasis and the effect of the environment on these processes.
22	

23 The threat of bacterial antibiotic resistance

24 The introduction of antibiotics represented one of the most important medical interventions in the history of global health resulting in a dramatic reduction in human morbidity and 25 mortality caused by bacterial infections. However, the intensive use of antibiotics has 26 accelerated the dissemination of bacteria that evolved to endure these drugs through the 27 acquisition of genes or chromosomal mutations that confer resistance [1,2]. Antibiotic 28 29 resistance (AR) is widespread in clinical [3,4] and environmental settings [5,6], providing a reservoir that can further spread by horizontal gene transfer. AR is a serious and growing 30 31 challenge in the treatment of infectious disease (http://www.who.int/medicines/publications/global-priority-list-antibiotic-resistant-32

33 bacteria/en/), with single and multidrug resistant clones of major pathogens circulating at frequencies above those expected by a balance between the stochastic emergence of 34 35 resistance by mutation and a purge of deleterious mutations (in the absence of antibiotic) by natural selection [7]. The dissemination of multidrug resistant bacteria is unfortunate 36 because these clones are harder to treat and those harbouring mobile resistance elements 37 38 (MREs) are able to spread resistance more quickly. Antibiotic resistant infections world-wide are estimated to potentially cause millions of deaths by 2050 (https://amr-review.org/) and 39 40 already inflict a major economic toll [8]. Beyond complex demographic processes, the 41 emergence and dissemination of AR in bacterial populations depends on key evolutionary 42 parameters, such as (i) the rate at which bacteria acquire resistance, (ii) the selective 43 pressures for and against resistant bacteria (see Glossary), and (iii) the rate and effects of 44 mutations compensating for potential costs of resistance (see Glossary) [9]. These factors 45 have been shown to be influenced by both the genetic background and the environment in which resistant bacteria grow [10], underlining the necessity of experimental studies and 46 47 quantitative analysis of these rates and processes in vivo, e.g. in ecological contexts related to infections, and in nature, e.g. in microcosms mimicking natural habitats. Such studies are 48 vital to preserve the effectiveness of antibiotics and reduce the frequency of resistance in 49 bacterial populations. Here we summarize up-to-date knowledge on the evolutionary 50 51 mechanisms influencing maintenance of resistance mediated by chromosomal mutations. In 52 particular, we will focus on fitness cost of AR, compensatory evolution, epistasis and environmental effects on these evolutionary mechanisms. 53

55 Emergence of bacterial antibiotic resistance

56 The rate of appearance of antibiotic-resistant bacteria is determined by the combined rates of de novo mutation (U) and horizontal gene transfer (HGT) of mobile genetic elements 57 carrying resistance (MRE, see Box 1). While acquisition of new DNA requires specific 58 ecological contexts (i.e.: the presence of donor bacteria), adaptive mutations (potentially 59 including resistance mutations) are continuously generated at rates that can be as high as 60 ~10⁻⁵ per cell per generation [11–13]. Furthermore, mutations leading to genomic 61 rearrangements (insertions, deletions, duplications, inversions) occur at an even higher rate 62 $(10^{-3}-10^{-5}$ per cell per generation) which can accelerate the rate of acquiring AR [14,15]. The 63 rate of the emergence of AR mutants is affected by physiology, genetics, antibiotic-64 bacterium interactions (e.g.: antibiotic itself can affect mutation rate [16] or different 65 resistance mutations can be selected at different antibiotic doses [17]), and the current and 66 67 past environment to which bacteria have been exposed (e.g.: bacteria grown at high temperature can acquire *rpoB* mutations conferring rifampicin resistance [18]), together 68 with the physical structure of the selective medium [12]. 69

70 It is important to note that antibiotic stress itself can impact the general value of U. Indeed, 71 a growing body of evidence suggests that sub lethal concentrations of several antibiotics can 72 boost resistance emergence via increasing the rate and frequency of HGT, recombination, 73 and mutagenesis [19]. Furthermore, bacteria can acquire mutations that increase their genome-wide U typically 10 to 1000-fold – known as "mutators". In fact, it has been long 74 75 known that recurrent pressure of antibiotics selects for mutator clones due to their 76 increased ability to produce the rare mutations that can rescue bacterial populations from 77 such high selective pressures [20]. Mutators are also known to exhibit increased ability for 78 recombination [21]. In samples of natural isolates of Escherichia coli, clones with 79 intermediate mutator phenotypes have been found to carry significantly more AR mutations 80 [22].

- Hence, bacteria have an enormous potential for adaptation with access to a large supply of mutations and exogenous genetic material that could explain why AR evolves remarkably quickly both in laboratory and clinical environments [23,24].
- However, in the context of infection, bacterial population sizes within hosts are high enough
 (above 10¹⁰ in certain contexts) to already include pre-existing resistant mutants [9]. In such
 a large bacterial population, and considering a base-substitution mutation rate of around 10⁻

⁹-10⁻¹⁰ per nucleotide site per generation [25], it is possible that all viable mutations, 87 88 including resistance mutations, would already exist in the population. Thus, the current estimates of mutation rates and the large population sizes suggest that U may have a limited 89 influence on the emergence of resistances. On the other hand, population genetic theory 90 91 has shown that i) if a population is facing antibiotic pressure once a resistance mutation arises, its chances of not getting lost and spreading depend on its beneficial fitness effect (its 92 93 selection coefficient); ii) if a population does not experience antibiotic pressure, the resistance mutation is expected to attain a frequency reflecting the balance between the 94 95 rate of production of the mutants (proportional to U) and the rate of elimination by natural selection (the deleterious fitness effect resulting from a cost of resistance) or by genetic drift 96 (random changes in the frequency of resistant mutants in a population). In light of the 97 unavoidable escape of recurrent mutations associated with cell division, restriction of 98 99 resistance relies on the power of purifying selection acting on the costs that resistance 100 mutations might cause (Figure 1) [26,27].

101

102 Fitness costs associated with antibiotic resistance

From *in vitro* studies, the acquisition of resistance is often associated with fitness costs in the absence of antibiotics [1,4,28]. Deleterious effects are thought to originate either from the cost of maintaining resistance carrying plasmids (see **Box 1**) [29–36] or from the pleiotropic effect of chromosomal resistance mutations [1,4,37]. In the latter case, costs are often associated with the fact that resistance mutations map onto genes encoding essential cellular functions (targeted by antibiotics), such as transcription, translation or cell wall biogenesis.

The existence of a fitness cost caused by AR predicts that the fitter susceptible strain should 110 111 outcompete the resistant strains over time (Figure 1) [28]. This is in agreement with the observed decrease of antimicrobial resistance in clinical settings when the use of certain 112 antimicrobials is halted [38-41]. However, costs are not always found to occur [28]. For 113 example mutations causing streptomycin and/or rifampicin resistance could confer survival 114 115 benefits to bacteria engulfed by macrophages [42,43]; mutations conferring rifampicin 116 resistance could spread to high frequencies in bacterial populations growing under limited resources [18,44]; mutations conferring carbapenem resistance were found to confer a 117 118 competitive fitness advantage to *Pseudomonas aeruginosa* colonizing the mouse intestine and disseminating to the spleen [45]; carbapenem and fosfomycin resistance mutants can have increased virulence in a murine pneumonia model [46]; and mutations conferring vancomycin resistance can be selected for as a result of competition between diversified genotypes of *Staphylococcus aureus* spontaneously generated from a common ancestral strain [47].

The examples above also underline the strong influence of the environmental conditions on the fitness cost of resistances [37,48,49]. However, based on the studies that have been performed, fitness measurements made in the laboratory settings appear to have clinical relevance since they agree with epidemiological studies of the prevalence of resistance alleles in clinical isolates [50–52].

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130 Benefits and costs in the presence of antibiotics

While fitness effects of resistance mutations show a strong genotype-by-environment interaction [49] in the absence of antibiotics, their benefits are less dependent on the environment complexity if high antibiotic pressure is applied. This permits the use of experimental evolution in the lab to anticipate the spectrum of beneficial mutations causing resistance to high antibiotic doses. Indeed many of the resistance mutations in clinical isolates can be evolved in the lab, under the appropriate selective pressure [53].

137 The acquired level of resistance to the antibiotic is experimentally measured through the 138 minimal inhibitory concentration (MIC). The level of resistance can vary extensively 139 depending on the resistance mechanism and the conditions under which resistance is 140 measured. For instance, if the resistance mechanism affects monotonically the growth with 141 the drug concentration, then the relative fitness of an antibiotic-resistant bacterium might vary extensively depending on antibiotic concentration [9,54]. While it is clear that the high 142 143 concentrations of antibiotics used therapeutically can select for resistant mutants, it has been shown both in E. coli and Salmonella enterica that concentrations of tetracyclines, 144 quinolones, and aminoglycosides hundreds-fold below the MIC of susceptible bacteria can 145 select for resistant bacteria [3,55]. Importantly, it is not currently known if measurements of 146 147 resistance levels in the laboratory, typically performed in conditions far from natural, can be 148 extrapolated to resistance levels of bacteria in a host. In a host, inter-species ecological 149 interactions are likely to occur that are inexistent in most in vitro studies, some of which 150 could buffer the antibiotic pressure experienced by a particular bacteria [56,57].

An interesting environmental effect mediated by the presence of antibiotics on the fitness of resistant strains relates to the potential biological activities in degrading antibiotics. For instance, certain products of the physicochemical degradation of tetracycline are more harmful for resistant than for sensitive *E. coli*, causing the competitive advantage conferred by the resistance to eventually reverse and become disadvantageous [58].

Troublingly, certain mechanisms confer resistance to antibiotics at unknown fitness costs. 156 157 For instance, a set of mutations in genes encoding ribosomal components in Mycobacterium smegmatis confer resistance to diverse antibiotics not related structurally or mechanistically, 158 159 by causing extensive transcriptomic and proteomic changes, affecting proteins known to impact AR [59]. Furthermore, bacterial populations can collectively survive antibiotic 160 161 treatments lethal to individual cells via diverse mechanisms, such as production of resistance enzymes, bistable growth inhibition mediated by antibiotic titration, swarming or 162 163 interactions between different bacterial subpopulations. These strategies allow bacterial populations to survive upon antibiotic treatment and provide a time window for the 164 acquisition of genetic resistance [60]. 165

166

167 **Compensation of the fitness costs**

168 Despite the importance of the fitness costs in predicting the dissemination of AR mutations, 169 there are additional factors that significantly affect the evolutionary path of AR. The rapid 170 acquisition of compensatory mutations by resistant clones is key to prevent them from being 171 outcompeted by sensitive bacteria, as widely described for the cost of single resistance both 172 in clinical [61,62] and laboratory conditions [63–67]. Compensation can occur either by 173 losing the original resistance mutation which is causing the fitness decrease - a process known as reversion (Box 2, recently discussed in [68]) - or by acquiring additional mutations 174 175 which counteract the cost. Compensatory mutations generally affect genes encoding proteins involved in cellular machinery functionally related to those affected by the original 176 177 mutation [69].

The dynamics of compensatory adaptation depends on population size, bottlenecks [63], mutation rate [70], and the distribution of fitness effects of compensatory mutations, which depends on the genetic background due to genetic interactions [71,72]. For instance, in the simplest case of a single resistance mutation, it has been shown that compensation is typically faster when the fitness cost of the resistance mutation is higher, leading to the 183 prediction that clones carrying more costly resistance mutations have higher adaptive 184 potential. This faster adaptation is likely driven by the acquisition of compensatory mutations with larger effects on these backgrounds [73]. In the more complex case, where a 185 population carries genetic variation for resistance mutations, the different clones will have 186 187 different distributions of compensatory mutations and high competition between clones with different fitness - clonal interference - may result in the maintenance of costly 188 189 resistance alleles over long periods of time. For example, a study using experimental evolution with resistant E. coli clones observed coexistence between costly rifampicin and 190 191 less costly streptomycin resistance mutations during hundreds of generations [71]. This type of study exposes the complexity of the fitness landscape and the evolutionary dynamics, 192 193 which impacts predictions about extinction of high cost resistances.

194 Even though compensation of resistant bacteria is often studied in the absence of antibiotic 195 [65–67,70], it can also occur in the presence of antibiotics. For instance, mutations that decreased both the cost of resistance to fluoroquinolone and the susceptibility to the 196 antibiotic have been described [74,75]. The few studies that have compared bacterial 197 198 compensation in the absence versus presence of antimicrobial selection pressure [64,76] 199 indicate that both the targets of compensation in the presence of antibiotic and their fitness 200 effects can be different from the ones in the absence of the drug. For instance, mupirocin 201 resistant mutants, carrying compensatory mutations acquired in absence of the drug, have 202 increased fitness only in this environment and not when the antibiotic is present [76].

203 The effects of the presence or absence of antibiotics on compensatory evolution of resistant 204 bacteria become particularly relevant in light of the current discussion on the appropriate 205 duration of antibiotic treatments [77]. Although for certain infections there is strong 206 evidence on what is the optimal duration of an antibiotic course, this is unknown for many 207 other infections [78]. In case of long treatments (Fig. 1B top panel), resistant mutants are 208 able to reach large population sizes, which favours compensation during the antibiotic 209 treatment. Thus, compensation in presence of antibiotic becomes more significant, as the 210 effects of compensatory mutations acquired during the antibiotic treatment on bacterial 211 fitness in an antibiotic-free environment will likely determine whether compensated 212 resistant bacteria can be outcompeted or not. Conversely, in case of short treatments (Fig. 1B bottom panel), resistant mutants are unlikely to take over the entire population, making 213 214 compensation during treatment much more difficult. In these cases, compensatory evolution in absence of antibiotics constitutes a better framework for predicting the evolutionary fate of resistant bacteria. Efforts to elucidate the optimal duration of antibiotic treatments for each infection are therefore essential to determine the most relevant environment to study compensatory evolution and, subsequently, elaborate predictions on the evolutionary trajectories of resistant pathogens [9].

Another example of environmental effects on compensation with relevant clinical implications was the observed selection of different compensatory mutations depending on whether the resistant bacteria evolved in mice or in laboratory conditions, indicating that compensatory evolution can take different trajectories within and outside a host [67]. Indeed, the clinical and epidemiological importance of compensation remains poorly understood [4,79–81].

226

227 Epistatic effects on antibiotic resistance

Epistasis occurs when the effect of a mutation depends on the genetic background where it 228 229 arises. It is has been shown that the same AR mutation can have different effects if it occurs 230 in different genomes [82–84]. For example, strains harbouring identical rifampicin resistance mutations but belonging to different lineages of Mycobacterium tuberculosis showed 231 232 different levels of fitness cost [79]. Likewise, the available data suggests that the bacterial 233 genetic background can also influence the fitness of bacteria with MRE [36,85,86]. Epistasis 234 can have profound implications for the spread of bacterial AR [48,87–89]. In the simplest 235 case, epistasis can be quantified between two loci - pair-wise epistasis- and it can be positive or *negative* (see Figure 2A for details). 236

237 Positive (negative) epistasis occurs when the fitness of a clone carrying mutations at the two loci is higher (lower) than expected given the effects in fitness of each of the single mutants. 238 239 Furthermore, an important form of interaction – sign epistasis - can occur if the sign of the effect changes from deleterious to beneficial (or vice-versa) in the double mutant [90]. Non-240 reciprocal sign epistasis occurs when the double mutant fitness is higher (or lower) than one 241 242 of the single mutants, whereas reciprocal sign epistasis occurs when the double mutant 243 fitness is higher (or lower) than both single mutants (Figure 2A). The strength and type of 244 epistasis is also known to depend on the environmental context, as expected given that the fitness effects of resistance differ with the growth media [49]. 245

Epistasis strongly affects the dissemination of AR because it can greatly influence the dynamics and repeatability of evolution at numerous stages [88,91–95]. For instance, during a constant antibiotic treatment a phenomenon called *diminishing returns epistasis* can occur, where the beneficial effect of the resistance mutations decreases as they sequentially accumulate, limiting the subsequent evolution [84].

Epistasis has a decisive role during compensation of costly AR mutations in the absence of 251 252 drugs. Most compensatory mutations are deleterious or neutral in the sensitive background, but advantageous in the resistant background [72]. As a consequence, the persistence of 253 254 resistance mutations upon compensation is promoted because reversions will strongly be selected against. A bacterial population enriched with resistant mutants carrying 255 256 compensatory mutations can readily acquire a second resistance, either by accumulating 257 chromosomal mutations selected for in the presence of a new antibiotic, and/or by acquiring 258 plasmid-borne resistant elements (**Box 1**), leading to multidrug resistant strains [80,96].

Importantly in the context of multiple-resistance, different resistance mutations can also 259 interact epistatically. Studies in E. coli, P. aeruginosa, M. tuberculosis, Salmonella enterica 260 261 and Streptococcus pneumoniae found many instances of positive epistasis, with the 262 observed cumulative fitness cost of carrying multiple drug resistance-conferring mutations 263 below the expected sum of the fitness costs associated with each individual mutation 264 [48,87,97–99]. Positive epistasis between chromosomal resistance mutations and MRE or 265 between different MRE has also been observed (Box 1). Pervasive positive epistasis was 266 found not only between costly resistance mutations but also when combining costless 267 rifampicin resistance alleles with costly streptomycin resistance alleles [48]. Moreover, 268 double resistant clones were also shown to exhibit sign epistasis [87,90], with the implication that in the absence of antibiotics the acquisition of further resistance mutations 269 270 (or eventually plasmids) can increase the fitness of an initially single resistant strain, 271 resulting in reduced probability of reverting resistance by halting drug use.

Fortunately, although not as commonly as desired, examples of pairs of resistance mutations which interact negatively have also been found [87]. Knowledge of these negative epistatic interactions between resistance mutations is important and can be clinically explored to slow down the evolution of multi-resistance by using specific combinations of antibiotics. If, for a given pair of drugs, negative epistasis is expected to dominate the landscape of potential emerging resistance mutations, then the few double resistant genotypes that

would survive the treatment would have highly reduced fitness, and be outcompeted bysingle resistant and/or susceptible genotypes once the antibiotic treatment is completed.

Importantly, resistance to one drug might also increase susceptibility to another drug – a
 phenomenon called collateral sensitivity [100] – which constitutes another relevant
 interaction that can be used to combat resistant strains.

Notably, compensatory evolution of multi-resistant strains can also be affected by epistasis. 283 284 Although this topic remains poorly explored, the common observation of epistasis between resistance mutations implies that compensation of multiple-resistance bacteria can 285 286 significantly differ from that of single resistant strains (Figure 2B). In the case of positive epistasis one could expect that the process of compensation would entail less compensatory 287 288 targets than those involved in the compensation for costs of each single resistance. This 289 should be especially strong under sign epistasis, where multi-resistant clones have higher 290 fitness than some of the single resistant clones. On the contrary, negative epistasis should result in a higher number of compensatory targets, as mutations specifically compensating 291 292 for the negative epistasis could be expected. A recent study [72] showed that this can indeed 293 occur. By following the compensatory process of a streptomycin and rifampicin double-294 resistant E. coli and comparing it with that of single-resistant clones, the study unveiled 295 mutations in gene targets that only compensate for double resistance, e.g a specific amino 296 acid change in *rpoC* and a mutation causing increased expression of *nusG*. These mutations 297 were neutral or deleterious in sensitive or single resistant backgrounds, demonstrating their 298 compensatory nature solely under double-resistance. The study also showed that the 299 compensatory effect of the mutations disappeared in an environment where the epistatic 300 interaction between resistance alleles was absent, consistent with the hypothesis that these mutations were specifically compensating for the epistatic interaction between the ARs [72]. 301 302 The detection of compensatory targets for epistasis can lead to the identification of proteins involved in multiple essential processes. These proteins are potential targets for the 303 development of new antimicrobials, since their functional inhibition could strongly affect 304 305 bacterial fitness, furthermore limiting the rise of resistance mutations because these would 306 be particularly deleterious in these conditions.

307 Epistasis can also occur at the intragenic level. There is plentiful evidence for sign epistasis 308 during the evolution in β -lactamases towards high levels of AR [88,91,101,102]. Remarkably, 309 sign epistasis was shown to limit the number of evolutionary paths available to evolve

310 increased resistance. For instance, during the evolution of classical β -lactamases into 311 extended-spectrum β -lactamases (ESBL), pervasive sign epistasis between mutations was 312 observed, where many mutations, individually leading to increased ability to degrade 313 cephalosporins, showed decreased MIC when combined [88]. In the system studied only 18 314 out of the 120 possible evolutionary pathways continuously increased the MIC.

A likely reason for such frequent epistasis is that mutations are often pleiotropic, simultaneously affecting multiple phenotypes [91]. Pleiotropy is a key assumption in classical models of adaptation to novel environments such as Fisher's geometric model (FGM, see **Box 3**), which describes the relationship between multiple phenotypic traits and fitness, and predicts complex patterns of epistasis [103–105].

320 A common form of pleiotropy within proteins is the simultaneous effects of mutations on enzyme activity and stability [101,106,107]. For instance, on the β -lactamase TEM-1, 321 322 mutations which increased activity against cephalosporin antibiotics lost thermodynamic stability. However, a second mutation which is neutral or deleterious by itself stabilizes the 323 proteins carrying an activity-increasing mutation, another example of sign epistasis [106]. 324 325 Interestingly, it has also been shown that the deleterious effect of a fraction of the 326 destabilizing mutations can be buffered by interacting with bacterial chaperones [108,109], 327 yet another source of epistasis with unexplored consequences for AR.

There are very few studies investigating if epistasis occurs frequently during the evolution of multidrug resistant strains in clinical settings. Nevertheless, in clinical isolates of multidrug resistant *M. tuberculosis*, resistant to both rifampicin and ofloxacin, many carried a particular mutation known to confer ofloxacin resistance in the *gyrA* gene. This mutation has been shown in laboratory settings to have positive epistasis with several *rpoB* mutations (which confer rifampicin resistance) [99]. Clearly, further epidemiological studies are required to understand to which extent epistasis is relevant in clinical contexts.

335

336 Concluding remarks

337 Due to the high evolutionary potential of bacteria, the initial golden age of antibiotics to 338 treat bacterial infections is quickly turning to a bronze age. *In vitro* and *in vivo* experimental 339 evolution studies are fundamental to anticipate the evolutionary paths likely to be taken by 340 potential pathogens upon exposure to drugs and to educate the society to the reality of 341 microbial rapid evolutionary change. Currently, most studies of epistasis on AR rely on 342 observations between two resistance alleles or in between an AR mutation and the genetic 343 background where it appears. The unfortunate reality of high frequency of multipleresistance (e.g. clones carrying three and more resistances are becoming common), 344 345 however, demands an understanding of higher order epistasis. This is a challenging task, but 346 one that is urgently necessary. Profiting from the rapid evolution of bacteria in the lab, both to acquire multiple resistance and to compensate for resistance costs on fitness, 347 348 experimental evolution studies focusing on key ecological and evolutionary factors (such as treatment duration, specific combinations of antibiotics and epistasis) may allow to more 349 350 effectively manipulate and reduce the danger of multiple resistance.

It is also important to remember that fitness costs, compensation and epistatic effects are 351 strongly environmental-dependent. Thus, further studies of competition, colonization, 352 353 compensation and transmission using animal models are required (see Outstanding 354 Questions). Such in vivo studies are likely essential to identify antibiotic targets that can hardly be compensated. Furthermore new surveys are required to quantify how pervasive 355 epistasis is in clinical populations of pathogens. This knowledge would provide a theoretical 356 357 framework for the development of novel antimicrobial strategies and therapeutic agents 358 aiming at minimizing the evolution of multidrug resistance.

359

360 Acknowledgments

PD and RB were supported by Fundação para a Ciência e Tecnologia (FCT), fellowships SFRH/BPD/118474/2016 and SFRH/BPD/109517/2015, respectively. Current research is supported by project JPIAMR/0001/2016-ERA NET and ONEIDA project (LISBOA-01-0145-FEDER-016417) co-funded by FEEI - "Fundos Europeus Estruturais e de Investimento" from "Programa Operacional Regional Lisboa 2020" and by national funds from FCT - "Fundação para a Ciência e a Tecnologia.

367

368 BOX 1 – Antibiotic resistance conferred by mobile genetic elements

Mobile genetic elements carrying resistances (MRE) play a key role in the spread of AR, since they can disseminate in bacterial populations by horizontal gene transfer (HGT) [27]. MRE typically carry genes encoding functions that counteract the action of antibiotics by either enzymatic inactivation [110], efflux [111], synthesis of alternative enzymes to native targets [112] or target protection [113,114]. Three principal evolutionary mechanisms of HGT are 374 conjugation [115], transduction [116], and natural transformation [117], although alternative
375 mechanisms have also been described [118].

Conjugation and transduction frequencies can be much higher in vivo than in vitro [29,119-376 122]. For example, in the context of the gut microbiota it was found that inflammation could 377 378 greatly increase the rates of plasmid and bacteriophage transfer between Salmonella strains. 379 Regarding natural transformation its prevalence is still not well quantified. Since the gut microbiota is a reservoir of AR genes [123,124], the HGT of MRE is likely frequent in the gut 380 [125]. Among MRE, plasmids are probably the most clinically relevant [27]. The mechanisms 381 382 underlying the effects of plasmid carriage on bacterial fitness in the absence of antibiotics remain poorly understood [52,126–128]. Interestingly, different plasmids cause diverse 383 384 effects on bacterial fitness, ranging from large deleterious effects to no cost or even fitness 385 advantage [52,126,127]. This heterogeneity can originate from plasmid features (size, resistance range, number of resistances, etc.), interference with the host physiology or 386 387 interactions with the environment [129–131]. The fitness cost associated with plasmid 388 carriage can be counterbalanced by acquiring compensatory mutations, either in the 389 plasmid, in the bacterial chromosome, or in both [32,132–134]. These mutations often influence replication and transmission rates, impacting plasmid dissemination in bacterial 390 391 populations [34,135]. Importantly, epistatic interactions between plasmids and chromosomal loci or other MRE [89,133,136-138] have been observed. Remarkably, these 392 393 interactions include epistasis between plasmids and chromosomal resistance mutations 394 [139], indicating that the acquisition of one resistance can favour or prevent the emergence 395 of further resistance. Understanding the mechanisms underlying maintenance and 396 dissemination of MRE in bacterial populations is thus essential to face the challenge of 397 spreading ARs.

398

BOX 2 – Compensation through reversions

A particular case of compensation is reversion, when the adaptive mutation completely reverts the fitness costs by returning to the original genetic sequence. When reversion occurs in the presence of antibiotic, revertants are likely lost due to strong selection against them (alternatively, revertants can also be lost by genetic drift). Thus, reversion is considered to occur only in the absence of antibiotics and is clinically relevant since the bacteria re-gain sensitivity. However, compensation by acquiring additional mutations is far

406 more likely to occur than genetic reversion, since the range of targets for compensation is 407 much broader [1].

Interestingly, phenotypic reversion (phenotypic sensitivity caused by the acquisition of an additional mutation, but maintaining the original resistance mutation) can also occur. For instance, mutations in the *rpsL* gene – encoding a ribosomal protein - confer resistance to streptomycin but several compensatory mutations occurring in other ribosomal proteins [140] or in translation elongation factors [141] can phenotypically revert resistance.

More recently, three studies have developed promising strategies to convert resistant 413 414 bacteria into phenotypically sensitive to the original antibiotics [142–144]. The first study has re-sensitized resistant bacteria by treating it with a specifically designed oligonucleotide 415 416 which acts as an antisense mRNA translation inhibitor and can be designed to target the 417 mRNAs encoding resistance genes such as a constituent of the major drug efflux pump [142]. 418 In the second study, a spiroisoxazoline family of Small Molecules Aborting Resistance (SMARt) was developed to phenotypically revert acquired resistance of *M. tuberculosis* to 419 420 the prodrug ethionamide by inducing the expression of an alternative bioactivation pathway 421 [143]. The SMARt molecule fully reversed ethionamide-acquired resistance and efficiently cleared an ethionamide-resistant infection in mice. In the third study, the assembly of 422 423 functional membrane microdomains (structurally and functionally similar to lipid rafts of eukaryotic cells) of methicillin-resistant S. aureus (MRSA) was targeted and as a result 424 425 resistance to penicillin was reverted both *in vitro* and *in vivo* [144].

426

427 Box 3 - Antibiotic resistance in light of Fisher's model of adaptation

428 Taking into account that the fitness effects of AR mutations are strongly dependent on the environment, it is of paramount importance to be able to anticipate the effect of resistance 429 430 mutations across environments. Fisher's geometric model (FGM), which assumes a fitness 431 landscape with a single peak, is a theoretical framework that allows predictions on the distribution of fitness effects (DFE) of mutations [145]. Under FGM an environmental change 432 433 can be theoretically thought of as a change in the distance to the optimum of a given 434 population or a change in the position of the optimum itself. FGM assumes that mutations 435 affect pleiotropically a number of quantitative traits under stabilizing selection and many antibiotic targets are known to have pleiotropic effects. Maybe that is why this model has 436

437 been effective in describing the fitness effects of antibiotic resistance in the absence [49]438 and presence of antibiotic [17].

For instance, a study [49] using mutations in *E. coli* conferring resistance to streptomycin, 439 rifampicin or D-cycloserine found that antibiotic mutation effects in the absence of antibiotic 440 were well described by a shifted gamma distribution as predicted by FGM, with a shift 441 parameter (reflecting the distance to the fitness peak) varying across environments. A 442 443 somewhat extended FGM was also robust enough to accurately describe the mutational pattern of AR in *E. coli* across a gradient of nalidixic acid, a quinolone [17]. The implemented 444 445 extensions took into account that: i) only a minor subset of mutations from specific regions of the genome will affect the ability to resist antibiotics (modularity). This proportion of 446 447 resistance mutations seems to sharply decrease with the increase of the antibiotic concentration, a result with clinical relevance; ii) the effect of a mutation is dependent of the 448 environmental selective constraints and thus, the same mutation may confer a fitness 449 increase in one environment and not in others; and iii) different antibiotic concentrations 450 may either constrain the optimal fitness that populations can reach (changing the height of 451 452 the fitness peak) or change the rate of fitness increase with each mutation (changing the 453 width of the peak). In the future, it will be important to distinguish in between these two 454 latter processes.

Lastly, FGM also provides a reasonable theoretical framework to predict the dynamics of compensatory evolution of AR [146]. For instance, FGM predicts that compensatory mutations should occur at higher rates and cause higher fitness increases in strains where the costs of AR are larger.

459

460 Glossary

antibiotic resistance - an inheritable ability of microorganisms to grow at high
 concentrations of antibiotic (independently of whether it is bacteriostatic or
 bactericidal) and irrespective of the duration of treatment.

464 natural selection - evolutionary process by which the genotypes best phenotypically
 465 adapted to a particular environment in a population, increase in relative frequency
 466 with respect to less adapted organisms over generations.

467 fitness - a term that refers to the survival and reproductive success of an organism in
 468 an environment. In bacteria relative fitness is measured by competing two genotypes

469 (i.e.: resistant versus sensitive) and accounting for the change in frequency over time
470 (competitive fitness). Fitness of bacteria can also be estimated by measuring
471 reproductive related traits such as growth rate, carrying capacity or length of lag
472 phase.

473 selective pressure – an evolutionary effect exerted by any cause or agent (i.e.: an
474 antibiotic) that increases or reduces the reproductive success (fitness) of a genotype,
475 changing its frequency in a population.

- 476 cost of resistance deleterious effect to an organism fitness caused by the presence
 477 of either a chromosomal mutations conferring resistance or mobile genetic elements
 478 carrying resistance.
- 479 reversion genetic reversion occurs when a mutation returns to the original genetic
 480 sequence. Phenotypic reversion of an AR mutation occurs when the resistance
 481 mutation is maintained but the sensitive phenotype is restored.
- 482 compensatory mutations adaptive mutations which reduce the fitness costs
 483 caused by a pre-existing condition, such as the presence of antibiotic resistance
 484 mutations or MRE.
- 485 epistasis phenomenon where the effect of one mutation is dependent on the
 486 presence of other pre-existing mutations, e.g. the genetic background.
- 487

489 **FIGURE LEGENDS**

490

491 Figure 1 – Emergence and maintenance of bacterial antibiotic resistance.

(A) Multidrug resistance under natural selection. E. coli can acquire rifampicin (Rif) and 492 493 streptomycin (Str) resistance through mutations in the *rpoB* or *rpsL* genes, respectively (blue and purple circles), which allow the bacteria to survive during an antibiotic treatment 494 495 (represented by the capsules). After antibiotic treatment, acquisition of resistance is often associated with fitness costs (red arrows) which can be alleviated (brown arrows) by 496 497 compensatory mutations in known gene targets (orange circles). Bacterial population after rifampicin treatment will be enriched in resistance with compensated costs and, if submitted 498 499 to subsequent treatments with other antibiotics (i.e.: streptomycin), may lead to the 500 development of multiple resistances by the acquisition of mutations. (B) Compensation 501 under short-term and long-term antibiotic treatments. Use of antibiotics can strongly select for resistant mutants (a), favouring multiplication of the resistant strain (b). On a long-term 502 503 antibiotic treatment (upper panel), competition between resistant strains will increase over 504 time and compensation to the fitness costs is likely to occur during the treatment (c). In a 505 short-term antibiotic treatment (bottom panel), compensation during treatment is unlikely 506 because the advantage of resistance over the susceptible bacteria outweighs the fitness 507 costs. In both scenarios, once the antibiotic treatment finishes, resistant strains will often 508 have a fitness costs when competing against the susceptible strain and compensation will 509 occur (c). Time course of antibiotic treatment results in bacteria with different genetic 510 backgrounds since they compensate differently for the costs of resistance. Whether this 511 compensation occurred in presence or absence of antibiotics may strongly affect the fate of these mutants in competition with the sensitive strain. 512

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514 Figure 2 – Genotype-by-genotype-by-environment (GxGxE) interactions.

(A) Epistasis between costly resistances. Epistasis can be *negative*, whereby the fitness of the double resistance is lower than expected, or *positive*, whereby the fitness of the double resistance is higher than expected. Sign epistasis represents a particular interaction, whereby the sign of the fitness of a double mutant changes depending on genetic background – a single mutation may be deleterious on the susceptible background, but may be beneficial or have no effect on a single resistance background. (B) Epistasis between

521 resistances changes compensation. When double resistance is not epistatic, the prediction is that the same compensation targets as the sum of the ones found in the single resistances 522 will be found. When double resistance interacts negatively, increasing the fitness cost, a new 523 set of compensatory mutations targeting the negative epistasis can occur [72]. When double 524 resistance interacts positively, reducing the fitness cost, less compensatory mutations are 525 526 expected to be available than the sum of targets found in the single resistances. Thickness of 527 orange arrows represents compensatory mutations of higher effect and the numbers 528 represent an example of expected compensatory genes for each resistance. (C) Epistasis depends on the environment. Fitness of double resistance $(Ant_1^{R} + Ant_2^{R})$ depends on the 529 environment. Not only the same single resistances to either antibiotic (Ant₁^R, in green or 530 Ant^R, in red) may have a different fitness depending on the environment but also the 531 interactions in between Ant₁^R and Ant₂^R mutations might change depending on the 532 environment, leading to negative epistasis in the environment I (left panel) and positive 533 534 *epistasis* in environment II (*right panel*).

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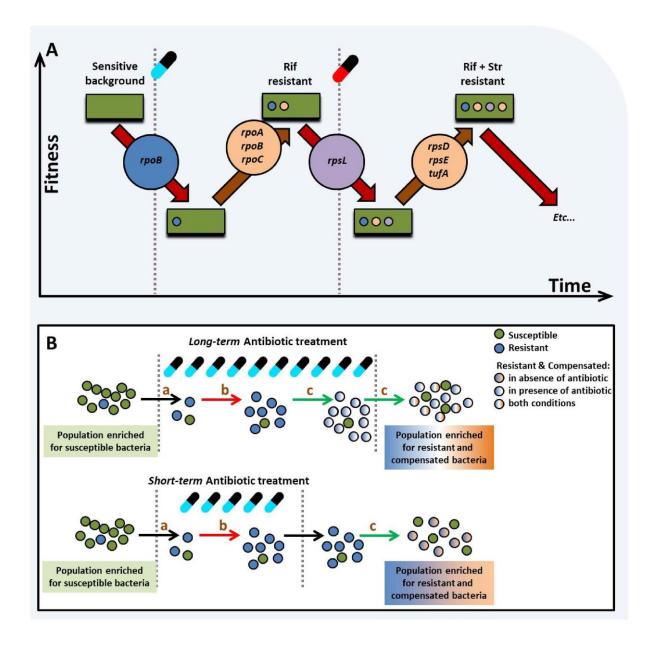
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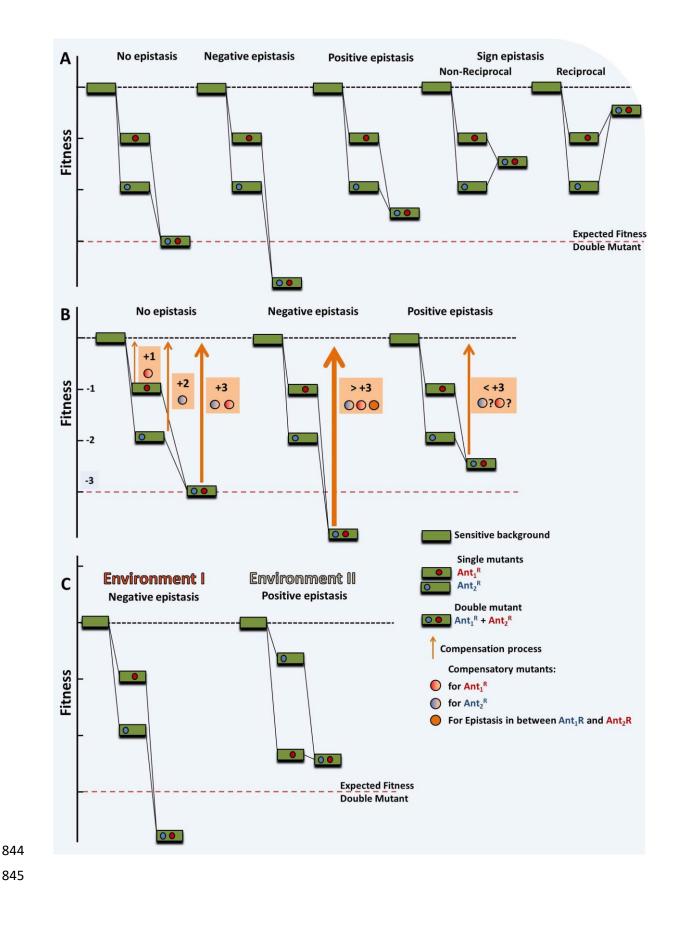
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846 Highlights

- Most antibiotic resistance mutations reduce bacterial fitness in the absence of the
 antibiotic, but some are not costly, or can even be advantageous in certain
 environments, including infection-related conditions.
- Acquiring a new resistance can alleviate the cost of a pre-existing one, thus favouring
 the emergence of multidrug resistant bacteria.
- The compensatory evolution of multidrug resistant bacteria is distinct from that of
 single-resistant bacteria, since the proteins mediating functional interactions
 between those affected by resistance mutations become new targets for their
 compensation.
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858 **Outstanding Questions**

- Fitness effects of AR are environmental dependent. How to identify the key
 characteristics of the environment to be able to predict resistance effects *in vivo*?
- Compensation of costs of multiple resistances can occur in a few days in the lab.
 What is the rate at which compensation occurs in the human host?
- How many mutations are adaptive to pathogens depending on the presence or
 absence of antibiotics in the environment?
- To what extent is epistasis relevant *in vivo* and how to measure epistasis between many resistances?

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