1 Essential Gene Knockdowns Reveal Genetic Vulnerabilities and Antibiotic Sensitivities in

- 2 Acinetobacter baumannii
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23 Abstract

24 The emergence of multidrug-resistant Gram-negative bacteria underscores the need to 25 define genetic vulnerabilities that can be therapeutically exploited. The Gram-negative 26 pathogen, Acinetobacter baumannii, is considered an urgent threat due to its propensity to 27 evade antibiotic treatments. Essential cellular processes are the target of existing antibiotics and 28 a likely source of new vulnerabilities. Although A. baumannii essential genes have been 29 identified by transposon sequencing (Tn-seq), they have not been prioritized by sensitivity to 30 knockdown or antibiotics. Here, we take a systems biology approach to comprehensively 31 characterize A. baumannii essential genes using CRISPR interference (CRISPRi). We show 32 that certain essential genes and pathways are acutely sensitive to knockdown, providing a set of 33 vulnerable targets for future therapeutic investigation. Screening our CRISPRi library against 34 last-resort antibiotics uncovered genes and pathways that modulate beta-lactam sensitivity, an

35 unexpected link between NADH dehydrogenase activity and growth inhibition by polymyxins,

36 and anticorrelated phenotypes that underpin synergy between polymyxins and rifamycins. Our

37 study demonstrates the power of systematic genetic approaches to identify vulnerabilities in

38 Gram-negative pathogens and uncovers antibiotic-essential gene interactions that better inform

- 39 combination therapies.
- 40

41 Importance

42 Acinetobacter baumannii is a hospital-acquired pathogen that is resistant to many 43 common antibiotic treatments. To combat resistant A. baumannii infections, we need to identify 44 promising therapeutic targets and effective antibiotic combinations. In this study, we 45 comprehensively characterize the genes and pathways that are critical for A. baumannii viability. 46 We show that genes involved in aerobic metabolism are central to A. baumannii physiology and 47 may represent appealing drug targets. We also find antibiotic-gene interactions that may impact 48 the efficacy of carbapenems, rifamycins, and polymyxins, providing a new window into how 49 these antibiotics function in mono- and combination therapies. Our studies offer a useful 50 approach for characterizing interactions between drugs and essential genes in pathogens to 51 inform future therapies.

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53 **Keywords:** CRISPR interference, functional genomics, systems biology, antibiotic resistance

54

55 Introduction

56 The rise of antibiotic resistance in Gram-negative pathogens, including Acinetobacter 57 baumannii, is a pressing healthcare concern, as many infections become untreatable amid a 58 stalled pipeline for novel therapies (1). A. baumannii causes serious infections in hospitalized 59 patients and is considered an urgent threat for its ability to evade killing by last-resort antibiotics 60 (2). It has numerous defenses against antibiotics including a propensity to acquire resistance 61 genes through horizontal transfer (3, 4), low membrane permeability coupled with robust efflux 62 to prevent antibiotics from reaching their cytoplasmic targets (5), and rapid accumulation of 63 resistance mutations (6). Although its unique strengths in resisting antibiotics are well 64 documented, less is known about whether A. baumannii carries any unique vulnerabilities that 65 could be therapeutically exploited.

66 The distinct physiology of A. baumannii sets it apart from well-studied, Gram-negative 67 bacteria. Among the Gram-negative ESKAPE pathogens (i.e., Klebsiella, Acinetobacter,

68 Pseudomonas, and Enterobacter), A. baumannii is the only obligate aerobe, requiring oxidative

69 phosphorylation to generate ATP (7). Further, the outer membrane of A. baumannii contains 70 lipooligosaccharide (LOS) rather than lipopolysaccharide (LPS) found in most Gram-negative 71 bacteria (8). LOS and LPS both contain a core lipid A moiety, but LOS lacks the repeating units 72 of O-polysaccharide found in LPS (8). Although LPS is essential for viability in other Gram-73 negative ESKAPE pathogens, a recent study showed that LOS was dispensable in ~60% of A. 74 baumannii strains tested, including contemporary clinical isolates (9). LOS⁻ strains cannot be 75 targeted by lipid A-binding antibiotics, such as polymyxins, increasing the antibiotic resistance 76 threat posed by A. baumannii (10). Finally, A. baumannii has numerous genes of unknown 77 function, including essential genes that are not present in model Gram-negatives or other 78 ESKAPE pathogens (11). These distinctions underscore the importance of examining essential 79 gene phenotypes and antibiotic interactions directly in A. baumannii.

Systematic genetic studies of *Acinetobacter* species have provided valuable
 physiological insights, although *A. baumannii* essential genes have not been comprehensively
 characterized. Tn-seg studies in *A. baumannii* identified putative essential genes (11, 12),

83 defined phenotypes for previously uncharacterized genes (13), and uncovered the mechanism

84 for strain-specific essentiality of LOS biosynthesis (9). An elegant Tn-seq study of non-

85 pathogenic *Acinetobacter baylyi* monitored depletion of strains with disrupted essential genes

86 following natural transformation (14), but it remains unclear whether those findings are directly

87 applicable to *A. baumannii*.

88 CRISPR interference (CRISPRi) is the premier genetic tool to define essential gene 89 function and antibiotic-gene interactions in bacteria. This gene knockdown technology uses a 90 programmable, single guide RNA (sgRNA) to direct a catalytically inactive Cas effector protein 91 (typically dCas9) to a target gene for silencing (15, 16). CRISPRi enables partial knockdown, 92 and, thus, phenotyping of essential genes either by titrating the levels of CRISPRi components 93 using inducible or weak promoters (15, 17, 18), or by modifying the sgRNA to weaken its 94 interaction with target DNA (19–21) or dCas9 (22). Due to its portability, CRISPRi has proven 95 valuable for phenotyping essential genes in diverse bacteria, including ESKAPE and other 96 pathogens (11, 23, 24). Antibiotic-gene interaction screens using CRISPRi often recover the 97 direct antibiotic target or related pathways among the largest outliers (17, 25). For instance, we 98 previously identified the direct targets of two uncharacterized antibiotics using a Bacillus subtilis 99 essential gene CRISPRi library, followed by genetic and biochemical validation of top hits (17). 100 Although CRISPRi has been previously developed in *A. baumannii* by us and others (11, 23), 101 only a handful of essential genes have been phenotyped to date.

To systematically probe for genetic vulnerabilities in *A. baumannii*, we generated and screened a pooled CRISPRi library targeting all putative essential genes [FIG 1A]. We identified essential genes and pathways that are most sensitive to knockdown, thereby prioritizing targets for future drug screens. We further used CRISPRi to define genetic interactions with last-resort antibiotics, finding antibiotic target pathways, obstacles to drug efficacy, and antibiotic-gene phenotypes that that may underlie synergistic drug combinations.

108

109 **Results**

110 Construction and validation of an *A. baumannii* essential gene CRISPRi library.

We constructed a CRISPRi library targeting all putative essential genes in *A. baumannii* 112 19606, a strain extensively used to characterize the fundamental biology of *A. baumannii* that is 113 also the type strain for antibiotic susceptibility testing (26). Notably, this strain is viable without 114 LOS (9), allowing us to examine the phenotypic consequences of LOS loss. Developing our 115 library in a susceptible strain also made it straightforward to use antibiotics as probes for gene 116 function.

117 To systematically investigate essential genes in A. baumannii, we first optimized 118 CRISPRi in A. baumannii, finding that reduced expression of dcas9 lowered toxicity and still 119 achieved ~20-fold knockdown (Supplementary Methods, [FIG S1A-E, and Tables S1-4]). We 120 next designed and constructed a CRISPRi library targeting all putative essential genes in A. 121 baumannii. As the goal of our study was to characterize rather than define essential genes, we 122 used existing Tn-seq data (12) to generate a list of CRISPRi targets we call the "Ab essentials" 123 (406 genes total, [Table S5, S8]). We designed a computationally optimized CRISPRi library 124 targeting the Ab essentials that consisted of three types of sqRNAs: 1) perfect match sqRNAs 125 (15) to maximize knockdown (~4/gene), 2) mismatch sgRNAs (19) to create a gradient of partial 126 gene knockdowns (~10/gene), and 3) control sgRNAs that are non-targeting (1000 total). This 127 library was cloned and site-specifically integrated into the 19606 genome using Mobile-CRISPRi 128 [FIG 1A] (23). Illumina sequencing of integrated sgRNA spacers confirmed that our CRISPRi 129 library successfully targeted all the Ab essentials (median = 14 guides/gene; [FIG S2A]). Our 130 approach, which includes using multiple sgRNAs per gene and robust statistics, mitigates 131 potential issues with toxic or inactive guides.

To validate our *A. baumannii* CRISPRi library, we measured the depletion of essentialgene-targeting sgRNAs during pooled growth. We grew the library to exponential phase in rich medium (LB) without induction (T0), diluted back into fresh medium with saturating IPTG to induce CRISPRi and grew cells for ~7 doublings (T1), then diluted back a second time in IPTG-

136 containing medium and grew cells for an additional ~7 doublings (T2). Quantifying strain

- depletion using log_2 fold change (log_2FC) and population diversity (N_b ; (27)) between T0, T1,
- and T2 ([FIG 1B-D, S2B], [Table S6]) revealed noticeable depletion of essential-gene-targeting
- 139 sgRNAs by T1 and substantial depletion by T2, while control sgRNAs were unaffected. The lack
- of an induction effect on control strain abundance suggests that toxic guide RNAs such as "bad
- seeds" (28) are largely absent from our library. Taken together, our CRISPRi library effectively
- 142 and comprehensively perturbs essential gene functions in *A. baumannii*.
- 143

144 Identification of *A. baumannii* essential genes and pathways that are sensitive to 145 knockdown.

146 Essential genes with a strong, negative impact on fitness when knocked down, *i.e.*, 147 "vulnerable" genes, are potential high-value targets for antibiotic development. CRISPRi 148 enables the identification of vulnerable genes by controlling the duration and extent of 149 knockdown (19, 20, 29). To define a set of vulnerable genes, we first quantified depletion of 150 strains containing perfect match guides from the CRISPRi library during growth in rich medium 151 (LB) [FIG S3A]. At T1, 88 genes showed significant depletion ($log_2FC<-1$ and Stouffer's p<0.05), 152 and by T2 an additional 192 genes were depleted (280/406 total or 69%; Table S6). Screening 153 our library in antibiotics at sub-MIC (minimal inhibitory concentration) levels recovered 154 phenotypes for 74 for the 126 genes that were non-responsive in rich medium (see below). 155 suggesting that these genes could be involved in antibiotic mode of action [FIG S3B]. The 156 remaining 52 genes that were non-responsive in all our conditions may require >20-fold 157 depletion (19), are false positives from the Tn-seg analysis used to define the Ab essentials 158 (12), or are not essential in 19606. Overall, most Ab essentials (354/406 or 87%) showed 159 significant phenotypes in our CRISPRi screens.

160 We sought to prioritize target genes and pathways by sensitivity to knockdown. 161 Because CRISPRi knockdown affects transcription units (TUs) that can encode multiple gene 162 products, we assigned essential genes to TUs and then organized the TUs into two groups: 163 those containing only one essential gene and those containing multiple essential genes [Table 164 S7]. We observed that most essential genes are in TUs containing either only one essential 165 gene or multiple genes that participate in the same cellular process, limiting the phenotypic 166 ambiguity of CRISPRi. Next, we ranked TU sensitivity to knockdown by the median log₂FC of 167 perfect match guides targeting essential genes present in the TU [Table S6]. Our 168 measurements of log₂FC are robust; however, we caution that small quantitative differences in 169 gene/TU ranks may not always indicate meaningful variations in vulnerability.

170 Knockdowns of *murA*, *rpmB*, *aroC* and the poorly characterized gene, GO593 00515 171 were among the most depleted strains in our CRISPRi library [FIG 2A-B]. These genes 172 represent established as well as underexplored therapeutic targets, and are in TUs containing 173 only one essential gene, allowing straightforward interpretation of phenotypes. The *murA* gene, 174 which encodes the target of fosfomycin (30), is vulnerable to knockdown despite fosfomycin's 175 inefficacy against A. baumannii due to efflux by the AbaF pump (31). L28, encoded by rpmB, is 176 a bacterium-specific ribosomal protein that is required for assembly of the 70S ribosome in 177 Escherichia coli (32, 33), but has no characterized inhibitors to our knowledge. Interestingly, E. 178 coli cells with reduced L28 levels accumulate ribosome fragments that can be assembled into 179 translation-competent ribosomes by expressing additional L28 (33), suggesting that L28 could 180 play a role in regulation of ribosome assembly. The *aroC* gene encodes chorismate synthase, a 181 metabolic enzyme genetically upstream of aromatic amino acid and folate biosynthesis. The 182 abundance of aromatic amino acids in LB medium used in our screen suggests that the 183 essential role of *aroC* is likely in folate biosynthesis. Chorismate synthase is essential in several 184 bacterial species including Gram-positives, such as B. subtilis (34), and is vulnerable to 185 knockdown in Mycobacterium tuberculosis (29), raising the possibility that aroC could be a 186 general, high-value target.

187 Surprisingly, the most depleted knockdown strain in our library targeted an 188 uncharacterized gene: GO593 00515 [FIG 2A-B]. GO593 00515 is predicted to encode an Arc 189 family transcriptional repressor; Arc repressors have been extensively studied for their role in 190 the Phage P22 life cycle (35). Accordingly, GO593 00515 is located within a predicted 191 prophage in the 19606 genome: this locus is occupied by a similar but distinct prophage in the 192 model resistant strain AB5075 [FIG S4A]. Synteny between the 19606 prophage and P22 193 suggested a role for GO593 00515 in lysogeny maintenance. Consistent with this hypothesis, 194 we found that GO593 00515 knockdown cells showed little growth 10 hours after dilution into 195 IPTG-containing medium [FIG S4C], and addition of IPTG to growing GO593 00515 knockdown 196 cells caused complete lysis occurred within 7 hours [FIG S4B]. We reasoned that if the essential 197 function of GO593 00515 is to repress expression of toxic prophage genes, we could suppress 198 its essentiality by deleting the surrounding prophage genes entirely. Indeed, we recovered 199 prophage deletion strains lacking GO593 00515 after inducing GO593 00515 in the presence 200 of an integrated knockout plasmid [FIG S4C]. Thus, repression of toxic prophage genes is a 201 critical but conditionally essential function in A. baumannii. Given the ubiquity of prophages 202 harboring toxic lysis genes (36), we suggest that knockdown of phage repressors could aid in 203 identifying proteins that are exceptional at lysing A. baumannii.

204 Sensitivity to knockdown among groups of genes with related functions provided further 205 insight into A. baumannii vulnerabilities. Strong depletion of knockdowns targeting components 206 of the ribosome, peptidoglycan (PG) synthesis, and cell division validated our CRISPRi screen 207 by identifying pathways targeted by clinically relevant antibiotics [FIG 2A-B]. Genes encoding 208 aminoacyl-tRNA synthetases (aaRSs) were functionally enriched among strains with reduced 209 abundance at T2. Mupirocin, which targets IIeRS, is the only inhibitor of a bacterial aaRS used 210 clinically, although other aaRS inhibitors are used to treat infections caused by eukaryotic 211 microbes [PMID: 33799176]. aaRSs are currently prioritized as targets for tuberculosis 212 treatment as *M. tuberculosis* aaRS genes are vulnerable to knockdown (29) and a 213 LeuRS/MetRS dual inhibitor is currently undergoing clinical trials (37). Our data demonstrate the 214 vulnerability of aaRS genes in A. baumannii and suggest that aaRSs could serve as effective 215 targets. Oxidative phosphorylation (oxphos) genes also stood out by degree of functional 216 depletion in our library as early as T1 [FIG 2A]. Among the oxphos outliers, genes encoding the 217 NADH dehydrogenase complex I (NDH-1; nuo genes) were particularly sensitive to knockdown. 218 This finding highlights the distinct importance of aerobic metabolism in A. baumannii compared 219 to other Gram-negative pathogens, such as E. coli, where NDH-1 is not essential for viability in 220 aerobic conditions (38).

221 Ideal antibiotic targets have a tight relationship between target function and fitness such 222 that small perturbations result in a substantial loss of viability. Recent work in model bacteria 223 (19, 20) and *M. tuberculosis* (29) has found that the relationship between knockdown and 224 fitness for essential genes is non-linear and varies by gene or pathway. To examine this 225 phenomenon for A. baumannii vulnerable genes, we fit the relationship between gene 226 knockdown (predicted by machine learning (19)) and fitness (log₂FC of mismatch guides) to 227 generate "knockdown-response" curves [FIG 3A-B]. We found that vulnerable genes and 228 pathways were highly sensitive to even low levels of knockdown. Knockdown-response curves 229 allowed us to determine the amount of knockdown required to elicit a half-maximal reduction in 230 fitness (effective knockdown, or EK_{50}) at the gene level. Vulnerable essential genes, such as 231 *murA*, showed a substantial fitness defect at less than half of the maximal knockdown, whereas 232 non-essential genes, such as IpxA, showed little fitness defects even at higher levels of 233 knockdown. Other vulnerable genes (e.g., rpmB, aroC, and GO593 00515) also showed 234 heightened sensitivity to knockdown [Fig. FIG S5]. We extended our knockdown-response 235 analysis to the pathway level, finding that pathways with many vulnerable genes (PG/division) required less knockdown, on average, than pathways with few vulnerable genes (LOS) [FIG 3C-236 237 D]. Interestingly, although fitness at T2 was generally lower than T1 for vulnerable genes, EK_{50}

values at both time points were statistically indistinguishable. This demonstrates that even

239 guides with weak knockdown contribute to vulnerability phenotypes and suggests that gene

240 phenotypes require a certain threshold of knockdown that is pathway dependent in *A*.

241 baumannii.

242

Essential gene knockdowns that potentiate or mitigate carbapenem sensitivity in *A*.

244 baumannii.

245 Antibiotic-gene interaction screens have the potential to identify targets that synergize 246 with or antagonize existing therapies. Carbapenems, a class of beta-lactam antibiotics, are first-247 line treatments for A. baumannii that block PG synthesis by inhibiting penicillin binding proteins 248 (PBPs) (39). To uncover antibiotic-essential gene interactions that impact sensitivity to 249 carbapenems, we screened our CRISPRi library against sub-MIC concentrations of imipenem 250 (IMI) and meropenem (MER) [FIG 4A, S6A-B]. We found that knockdown of genes involved in 251 cell wall synthesis, including the direct target (ftsl, TU: ftsLI-murEF-mraY), increased carbapenem sensitivity. Knockdowns of genes required for PG precursor synthesis (murA, 252 253 dapA) and translocation (murJ) were strongly depleted in both IMI and MER. MurA catalyzes the 254 first committed step of PG synthesis, DapA is part of a pathway that converts L-aspartate to 255 meso-diaminopimelate which is incorporated into PG precursors by MurE, and MurJ, the lipid II 256 flippase, translocates PG precursors from the inside to the outside of the cytoplasmic 257 membrane (40). To validate screen hits, we developed a high-sensitivity assay that uses Next 258 Generation Sequencing to measure competitive fitness between a non-targeting and CRISPRi 259 knockdown strain we call "CoMBaT-seg" (Competition of Multiplexed Barcodes over Time). 260 CoMBaT-seg recapitulated murA vulnerability to knockdown and further sensitivity to IMI [FIG 261 4B]. Consistent with our murA-IMI interaction, we found that fosfomycin and IMI synergize in A. 262 baumannii [FIG S7A], as is the case in other Gram-negative pathogens (e.g., Pseudomonas 263 aeruginosa (41)). Although no clinically relevant inhibitors of DapA and MurJ exist, to our 264 knowledge, we speculate that such inhibitors would have the potential to synergize with 265 carbapenems. Intriguingly, knockdowns of advA-an Acinetobacter-specific division gene (13)-266 were also sensitized to carbapenems, raising the possibility of A. baumannii targeting 267 combination therapies should inhibitors of AdvA be identified.

Gene knockdowns that mitigate antibiotic function can reveal routes to resistance or target combinations that result in antagonism and should be avoided therapeutically. Given that increasing carbapenem resistance is an urgent clinical concern for *A. baumannii*, we sought to identify genes and pathways that mitigate the efficacy of IMI and MER. Although previous work 272 suggested that growth rate and beta-lactam resistance are linearly related (42, 43), we found 273 only a modest linear relationship growth and IMI/MER resistance across knockdown strains in 274 our library (R2 = 0.005, and 0.007, respectively [FIG S8A-B]). This indicates that slow growing 275 strains of A. baumannii are not necessarily more resistant to beta-lactam treatment. Instead, we 276 found that specific genetic pathways govern carbapenem resistance. Using gene set enrichment 277 analysis, we identified ribosomal protein genes as a pathway that increases resistance to 278 IMI/MER when perturbed [IMI: enrichment score = 4.65, FDR (afc) = 2.12e-06; MER: 279 enrichment score = 2.43, FDR (afc) = 0.002], consistent with antagonism between beta-lactams 280 and ribosome inhibitors described for other bacteria (44). 281 aaRS genes also emerged from our enrichment analysis [IMI: enrichment score = 4.93, 282 FDR (afc) = 1.04e-06; MER: enrichment score = 5.04, FDR (afc) = 1.16e-06], uncovering a 283 connection between tRNA charging and carbapenem resistance, as well as a surprising

284 relationship between knockdown and fitness unique to antagonistic interactions. In particular, a 285 subset of aaRS gene knockdowns including argS, lysS, valS, cysS and glnS showed increased 286 relative fitness our IMI pooled screen [FIG 4A, S8C]. Although glnS resistance to IMI in MIC test 287 strip and growth curve assays was modest [FIG S9], our more sensitive CoMBaT-seq assay 288 showed a clear growth advantage for the glnS knockdown when competed against a non-289 targeting control in contrast to sensitive knockdowns such as murA [FIG 4B-C]. Our 290 observations that the *glnS* knockdown is depleted during growth in rich medium and enriched 291 during growth in IMI implied that the relationship between knockdown and fitness changed 292 across the two conditions. Indeed, a 4-parameter knockdown-response curve fit well to 293 mismatch guides targeting *glnS* without treatment, but poorly to the same guides in IMI 294 treatment [FIG 5A-D, S10A]. Remarkably, IMI treated *aInS* knockdown strains showed 295 increased relative fitness as knockdown increased up until a point at the strains lost viability, 296 presumably due to a lack of glutamine tRNA charging. This pattern is reminiscent of a hormetic 297 response in dose-response curves (45) where a low amount of drug produces a positive 298 response that eventually becomes negative at higher doses [FIG 5A-B]. Accordingly, a 5-299 parameter logistic curve typically used in the context of hormetic responses improved the fit to 300 IMI treated glnS mismatch strains but did not improve the fit of untreated strains [FIG 5C-D, 301 S10B]. To test if the hormetic effect we observed between IMI and gInS in an antibiotic-gene 302 interaction was relevant to antibiotic-antibiotic interactions, we measured the growth of wild-type 303 A. baumannii treated with IMI and the aaRS inhibitor, mupirocin. Consistent with hormesis, IMI 304 antagonized the effect of mupirocin at low concentrations, but had no positive impact on growth 305 at higher concentrations [FIG 5E]. Although mupirocin treatment is not clinically relevant for A.

baumannii due to high-level resistance, our work provides a proof of principle that hormetic
effects can be predicted by genetic approaches and influence antibiotic susceptibility.

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309 Anticorrelated phenotypes underlie synergy between colistin and rifampicin

310 Antibiotic-gene interaction screens can identify genes and pathways that underpin 311 synergistic drug combinations, clarifying the genetic basis for synergy. Colistin (COL) and 312 rifampicin (RIF) synergistically inhibit A. baumannii growth by an unknown mechanism [FIG 313 S11](46). To define antibiotic-gene interactions that may inform COL-RIF synergy, we screened 314 our CRISPRi library against COL and RIF individually. We found strong, opposing phenotypes 315 in COL and RIF for genes encoding NDH-1 and LOS biosynthesis genes. COL, a polymyxin 316 class antibiotic, is a last-resort treatment for carbapenem-resistant A. baumannii (47). COL 317 binds to the lipid A moiety of LOS and is thought to kill cells by membrane disruption (48): 318 complete loss of LOS results in a >500-fold increase in COL resistance (9). As expected, 319 screening our library against a sub-MIC dose of COL identified LOS synthesis genes as 320 resistant outliers [FIG 6, S12]. Among the most resistant outliers were *lpxC* (TU: *lpxC*) and *lpxA* 321 (TU: *lpxD-fabZ-lpxA*), which encode enzymes that catalyze the first two committed steps in LOS 322 synthesis and are commonly found in selections for COL resistant mutants (9). Genes involved 323 in fatty acid biosynthesis biosynthesis (TU: fabDG, TU: aroQ-accBC) also showed increased 324 resistance to COL, possibly by limiting the pool of fatty acids available for LOS synthesis [FIG 325 S12]. Surprisingly, knockdown of genes encoding NDH-1 (TU: nuoABDEFGHIJKLMN) caused 326 heightened sensitivity to COL in the context of our pooled screen [FIG 6, S9]. We robustly 327 confirmed the COL sensitivity of a nuoB knockdown using our CoMBaT-seg assay [FIG 7A]. 328 although MIC test strips showed a more muted effect [FIG S13]. NDH-1 couples conversion of 329 NADH to NAD+ to proton translocation across the inner membrane, but whether the key role for 330 NDH-1 in *A. baumannii* physiology is NAD+ recycling or contributing to membrane potential ($\Delta \psi$) 331 is unknown. To address this issue, we measured the NAD+/NADH ratio and $\Delta \psi$ using an 332 enzyme-coupled luminescence assay (NAD/NADH-Glo) and the membrane potential-sensitive 333 dye Thioflavin T (ThT), respectively [FIG 7B, S14A]. Knockdown of nuoB lowered the 334 NAD+/NADH ratio, consistent with reduced conversion of NADH to NAD+ by NDH-1 [FIG 7B]. 335 Unexpectedly, *nuoB* knockdown did not impact $\Delta \psi$, although reduced $\Delta \psi$ in cells treated with 336 the ionophore CCCP was readily apparent in our ThT assay [FIG S14B]. Thus, recycling of 337 NADH to NAD+ for use in the TCA cycle, rather than maintenance of membrane potential, may 338 be the critical cellular role of NDH-1. A. baumannii also encodes a non-essential, non-proton 339 pumping NDH-2 enzyme that can be inhibited by COL in vitro. We speculate that NDH-2

inhibition by COL combined with knockdown of NDH-1 critically reduces cellular NAD+ levels,

341 leading to enhanced sensitivity.

342 Rifampicin is a relatively large antibiotic (822.9 Da) that targets RNA polymerase 343 (RNAP) in the cytoplasm but is typically avoided for treating Gram-negative infections due to low 344 permeability (49). Consistent with a permeability barrier to rifampicin function (50), we found that 345 knockdown of LOS synthesis and transport genes strongly sensitized cells to rifampicin 346 [enrichment score = 8.26, FDR (afc) = 3.97e-05]. Again, knockdown of genes encoding NDH-1 347 produced an unexpected phenotype, this time increasing RIF resistance by an unknown 348 mechanism [FIG 6, S15]. To further characterize the NDH-1 RIF resistance phenotype, we 349 examined the knockdown-response curve of *nuoB* with and without RIF treatment. As seen 350 previously with glnS, nuoB knockdown showed a hormetic response: increasing knockdown of 351 nuoB increased relative fitness in RIF until the highest levels of nuoB knockdown where growth 352 decreased [FIG 7C-D, S10C-D]. Although MIC changes were modest [FIG S16], our CoMBaT-353 seq assay showed a clear fitness benefit for *nuoB* knockdown in RIF relative to a non-targeting 354 control [FIG 7E]. We considered that NDH-1 knockdown cells may have reduced permeability, 355 limiting RIF entry into the cytoplasm. To test permeability, we measured uptake of ethidium 356 bromide (EtBr) which fluoresces when bound to DNA in the cytoplasm [FIG 7F]. We found that 357 nuoB knockdown cells had a reduced rate of EtBr uptake, demonstrating that cells with reduced 358 NDH-1 activity are less permeable and suggesting a possible mechanism for increased RIF 359 resistance.

360 COL and RIF showed strong, anticorrelated phenotypes in our CRISPRi screen 361 [FIG 8], with LOS related knockdowns causing resistance to COL and sensitivity to RIF and 362 NDH-1 knockdowns resulting in sensitivity to COL and resistance to RIF. These results support 363 a collateral sensitivity model for COL-RIF synergy (51) (see Discussion). Taken together, COL 364 and RIF synergistically kill *A. baumannii* by exerting opposite effects on LOS and NDH-1 that 365 cannot be compensated for by reducing the function of either pathway.

366

367 Discussion

Bacterial susceptibility to antibiotics is underpinned by species- and condition-specific gene essentiality. The recent lack of innovative treatments for *A. baumannii* and other Gramnegative pathogens can be attributed to our limited knowledge of genetic weaknesses in these bacteria. This work advances our understanding of genetic vulnerabilities in *A. baumannii* by systematically perturbing and phenotyping essential genes. Using CRISPRi to knock down essential gene products, we identified genes that are sensitive to knockdown as well as genes

that potentiate or mitigate antibiotic action. Together, these studies define potential targets for
antibiotic discovery and provide a genetic approach for understanding synergistic therapies that
is broadly applicable.

377 Our study of essential gene knockdown phenotypes in A. baumannii points to both 378 unique and shared genetic vulnerabilities with other bacterial species. Our finding that A. 379 baumannii is highly sensitive to depletion of genes encoding NDH-1 highlights a unique 380 weakness in pathogens that are obligate aerobes and a possible therapeutic target. Among the 381 Gram-negative ESKAPE pathogens, only A. baumannii is known to require nuo genes for 382 aerobic growth in rich medium (52). Recent work from Manoil and colleagues in the non-383 pathogenic model strain, Acinetobacter baylyi, found that genes involved in oxidative 384 phosphorylation were among the first to be depleted from a pool of transposon mutants (14); 385 combining these observations with our CRISPRi results suggests that oxygen-dependent 386 energy production is a physiological linchpin across the Acinetobacter genus. Our finding that A. 387 baumannii genes involved in PG synthesis and translation are vulnerable to depletion 388 underscores the conserved importance of these pathways across bacterial species (19, 29) and 389 their foundational role as antibiotic targets.

390 Our finding that knockdown gradients of essential genes treated with antibiotics can 391 mimic hormetic effects seen in dose-response curves (45) has implications for modeling 392 conditional phenotypes of essential genes and dosing of combination therapies. For most 393 essential genes, complete loss of gene function results in lethality under the majority of 394 conditions. However, our mismatch guide strategy allowed us to examine intermediate levels of 395 essential gene function that may be analogous to partial loss of function alleles found in 396 resistant clinical isolates or adaptive evolution experiments. Partial loss of function mutants can 397 exhibit striking differences in phenotype over a narrow range of function, as we observed with 398 glnS and nuoB resistance during IMI and RIF treatment, respectively. These hormetic 399 resistance phenotypes fit poorly to established 4-parameter logistic models, emphasizing the 400 importance of considering alternative model parameters and comprehensive statistical 401 approaches when quantifying intricate biological processes. Given our limited set of screening 402 conditions, it is currently unclear how widespread the phenomenon of hormesis is for antibiotic-403 gene interactions, although we note that clear instances of hormesis were rare in our data. 404 Hormesis in antibiotic interactions may have clinical relevance as well, as doses of combination 405 therapies falling within the concentration window of a hormetic/antagonistic response would be 406 ineffective. Our ability to predict antagonism between an aaRS inhibitor and carbapenems

407 based on genetic data suggests that screening for antibiotic-gene interactions will have as much
408 value in avoiding antagonisms as it does in identifying potential synergies.

409 Our data show an unexpected link between NADH dehydrogenase activity and growth 410 inhibition by COL. NDH-1 knockdown strains were highly sensitized to COL in competitive 411 growth assays, but the precise mechanism behind this sensitivity is unclear. Based on our 412 measurements, NDH-1 knockdown primarily affects the ratio of NADH to NAD+ in cells, rather 413 than membrane potential. COL inhibits conversion of NADH to NAD+ by the type II NADH 414 dehydrogenase (NDH-2) in a purified system (53), although at much higher concentrations than 415 used in our experiments. We speculate that the sensitivity of NDH-1 knockdowns to COL is due 416 insufficient recycling of NAD+, which would be expected to reduce flux through the TCA cycle. 417 In this scenario, CRISPRi knockdown reduces NDH-1 activity while COL inhibits NDH-2 activity, 418 resulting in further skewing of the NADH/NAD+ ratio toward NADH and away from NAD+. Flux 419 through the TCA cycle would be expected to decrease as multiple steps in the cycle require 420 available NAD+ (54, 55). In general, identifying targets that potentiate COL activity may be 421 clinically relevant in the context of combination therapy because toxicity is a major dose-limiting 422 concern of polymyxin antibiotics (56). Employing effective combination treatments using colistin 423 concentrations below toxicity thresholds would greatly improve its clinical utility and safety 424 against A. baumannii. Our CRISPRi approach could inform not only combinations with 425 polymyxins, but also other antibiotics which have dose-limiting toxicity concerns that prevent 426 more widespread use.

427 COL and RIF have been shown to synergistically kill A. baumannii and other Gram-428 negatives (56) by an unknown mechanism. We suggest that the synergy can be explained by a 429 collateral sensitivity mechanism (51), in which genetic perturbations that promote COL 430 resistance increase sensitivity to RIF and vice versa. Treatment with COL selects for mutations 431 in LOS biosynthesis genes (10), while the loss of LOS promotes permeability to RIF (and other 432 antibiotics (56)). Accordingly, the presence of RIF has been shown to reduce recover of 433 inactivated lpx genes in selections for COL resistance (57). Mutations in nuo genes are 434 commonly obtained in screens for tobramycin resistance in *P. aeruginosa* (58, 59), supporting a 435 model in which reduced NDH-1 function decreases permeability of the inner membrane to 436 antibiotics. Consistent with this model, we found that EtBr fluorescence, which is often used as 437 a proxy for measuring permeability of small molecules, was decreased in NDH-1 knockdown 438 strains. Collateral sensitivity comes into play when mutations that reduce NDH-1 activity to block 439 rifampicin entry increase sensitivity to colistin which further reduces NDH-1 function. This 440 mechanism of synergy can impact other Gram-negative ESKAPE pathogens but is particularly

relevant in *A. baumannii* because LOS is not essential and NDH-1 is uniquely required for
viability. In the case of colistin and rifampicin, collateral sensitivity manifests as anticorrelated
phenotypes in chemical genomics data. We speculate that anticorrelated phenotypic signatures
are predictive of antibiotic synergy, particularly in the context of bacteria with low permeability
such as *A. baumannii* and *P. aeruginosa*. Interrogating a larger chemical genomics dataset with
a greater diversity of antibiotics for these organisms will shed light on general rules for antibioticgene interactions and their implications for discovering synergy.

448

449 Materials and Methods

450 **Strains and growth conditions.** Strains are listed in Table S1. Details of strain growth

451 conditions are described in the Supporting Information.

452

453 General molecular biology techniques and plasmid construction. Plasmids and

454 construction details are listed in Table S2. Oligonucleotides are listed in Table S3. Details of
 455 molecular biology techniques are described in the Supporting Information.

456

457 A. baumannii Mobile-CRISPRi system construction. An A. baumannii strain with the Mobile-458 CRISPRi (MCi) system from pJMP1183 (23) inserted into the att_{Tn7} site (Fig. S1A), which 459 constitutively expresses mRFP and has an mRFP-targeting sqRNA, has a growth defect when 460 induced with 1mM IPTG (Fig. S1B; "parent"). Strains with suppressors of the growth defect that 461 still maintained a functional CRISPRi system were identified by plating on LB supplemented with 462 1mM IPTG and selecting white colonies (red colonies would indicate a no longer functional MCi 463 system; Fig. S1B and S1C). gDNA was extracted and mutations in the dCas9 promoter were 464 identified by Sanger sequencing (Fig. S1D). The Mobile-CRISPRi plasmid pJMP2748 is a 465 variant of pJMP2754 (Addgene 160666) with the sgRNA promoter derived from pJMP2367 466 (Addgene 160076) and the dCas9 promoter region amplified from the A. baumannii suppressor 467 strain gDNA with oJMP635 and oJMP636. Plasmid pJMP2776, which was used to construct the 468 A. baumannii essential gene library and individual sgRNA constructs, was created by removal of 469 the GFP expression cassette from pJMP2748 by digestion with Pmel and re-ligation. This 470 system shows ~20-fold knockdown when targeting the GFP gene (Fig. S1E). Plasmids will be 471 submitted to Addgene.

472

473 *A. baumannii* Mobile-CRISPRi individual gene and gene library construction. sgRNAs
474 were designed to knockdown essential genes in *A. baumannii* 19606 using a custom python

script and Genbank accession #s CP046654.1 and CP046655.1 as detailed in reference (60).
Mismatch guides were designed and predicted knockdown was assigned as previously
described (19). sgRNA-encoding sequences were cloned between the Bsal sites of MobileCRISPRi (MCi) plasmid pJMP2776. Methodology for cloning individual guides was described
previously in detail (60). Briefly, two 24-nucleotide (nt) oligonucleotides encoding an sgRNA
were designed to overlap such that when annealed, their ends would be complementary to the
Bsal-cut ends on the vector.

482 The pooled essential gene CRISPRi library was constructed by amplification of sgRNA-483 encoding spacer sequences from a pooled oligonucleotide library followed by ligation into the 484 Bsal-digested MCi plasmid. Specifically, a pool of sgRNA-encoding inserts was generated by 485 PCR amplification with primers oJMP697 and oJMP698 from a 78-nt custom oligonucleotide 486 library (2020-OL-J, Agilent) with the following conditions per 500 µl reaction: 100 µl Q5 buffer. 487 15 µl GC enhancer, 10 µl 10mM each dNTPs, 25 µl each 10 µM primers oJMP897 and 488 oJMP898, 10 µl 10 nM oligonucleotide library, 5 µl Q5 DNA polymerase, and 310 µl H2O with 489 the following thermocycling parameters: 98°C, 30s; 15 cycles of: 98°C, 15s; 56°C, 15s; 72°C, 490 15s; 72°C, 10 min; 10°C, hold. Spin-purified PCR products were digested with Bsal-HF-v2 491 (R3733; NEB) and the size and integrity of full length and digested PCR products were 492 confirmed on a 4% agarose e-gel (Thermo). The Bsal-digested PCR product (without further 493 purification) was ligated into a Bsal-digested MCi plasmid as detailed in (60). The ligation was 494 purified by spot dialysis on a nitrocellulose filter (Millipore VSWP02500) against 0.1 mM Tris, pH 495 8 buffer for 20 min prior to transformation by electroporation into E. coli strain BW25141 496 (sJMP3053). Cells were plated at a density of ~50,000 cells/plate on 150mm LB-2% agar plates 497 supplemented with carbenicillin. After incubation for 14 h at 37°C, colonies (~900,000 total) 498 were scraped from the agar plates into LB, pooled, and the plasmid DNA was extracted from 499 \sim 1x10¹¹ cells using a midiprep kit. This pooled Mobile-CRISPRi library was transformed by 500 electroporation into E. coli mating strain sJMP3049, plated at a density of ~50,000 cells/plate on 501 150mm LB-2% agar plates supplemented with carbenicillin and DAP. After incubation for 14 h at 502 37° C, colonies (~1.000,000 total) were scraped from the agar plates and pooled, the OD₆₀₀ was 503 normalized to 27 in LB with DAP and 15% glycerol and aliquots of the pooled CRISPRi library 504 were stored as strain sJMP2942 at -80°C.

505

506 **Transfer of the Mobile-CRISPRi system to the** *A. baumannii* **chromosome**. The MCi system 507 was transferred to the att_{Tn7} site on the chromosome of *A. baumannii* by quad-parental 508 conjugation of three donor strains—one with a mobilizable plasmid (pTn7C1) encoding Tn7

509 transposase, another with a conjugal helper plasmid (pEVS74), and a third with a mobilizable 510 plasmid containing a Tn7 transposon encoding the CRISPRi system—and the recipient strain A. 511 baumannii 19606. A detailed mating protocol for strains with individual sqRNAs was described 512 previously (60). Briefly, 100 µl of culture of donor and recipient strains were added to 600 µl LB, 513 pelleted at ~8000 x g, washed twice with LB prior to depositing cells on a nitrocellulose filter 514 (Millipore HAWP02500) on an LB plate, and incubated at 37°C, ~5 hr. Cells were removed from 515 the filter by vortexing in 200 µl LB, serially diluted, and grown with selection on LB-gent plates at 516 37°C.

517 For pooled library construction, Tn7 transposase donor (sJMP2644), conjugation helper 518 strain (sJMP2935), and recipient strain (sJMP490) were scraped from LB plates with 519 appropriate selective additives into LB and the OD_{600} was normalized to ~9. An aliguot of 520 sJMP2942 pooled library strain was thawed and diluted to OD₆₀₀ of ~9. Eight ml of each strain 521 was mixed and centrifuged at 8000xg, 10 min. Pelleted cells were resuspended in 4 ml LB, 522 spread on two LB agar plates, and incubated for 5hr at 37°C prior to resuspension in LB + 15% 523 glycerol and storage at -80°C. Aliguots were thawed and serial dilutions were plated on LB 524 supplemented with gent (150) and LB. Efficiency of trans-conjugation (colony forming units on 525 LB-gent vs. LB) was ~ 1 in 10⁷. The remaining frozen stocks were plated on 150 mm LB plates 526 solidified with 2% agar and supplemented with gent (150) and incubated for 16 h at 37°C. Cells 527 were scraped from plates and resuspended in EZRDM (Teknova) + 25mM succinate + 15% 528 glycerol at OD₆₀₀ = 15 and aliquots were stored at -80°C as strain sJMP2949.

529

530 Library growth experiment. The A. baumannii essential gene CRISPRi library (sJMP2949) 531 was revived by dilution of 50 µl frozen stock ($OD_{600} = 15$) in 50 ml LB (starting $OD_{600} = 0.015$) 532 and incubation in 250 ml flasks shaking at 37°C until $OD_{600} = 0.2$ (~2.5 h) (timepoint = T0). This 533 culture was diluted to OD₆₀₀ = 0.02 in 4 ml LB with 1mM IPTG and antibiotics (colistin, 534 imipenem, meropenem, rifampicin, and no antibiotic control) in 14 ml snap cap culture tubes 535 (Corning 352059) in duplicate and incubated with shaking for 18 h at 37°C (T1). These cultures 536 were serially diluted back to $OD_{600} = 0.01$ into fresh tubes containing the same media and 537 incubated with shaking for 18 h at 37°C again (T2) for a total of ~10-15 doublings. Cells were 538 pelleted from 1 ml of culture in duplicate at each time point (T0, T1, T2) and stored at -20°C. 539 Final antibiotic concentrations were (in µg/ml): colistin (Sigma C4461): 0.44 and 0.67, imipenem 540 (Sigma I0160): 0.06 and 0.09, meropenem (Sigma 1392454): 0.11 and 0.17, and rifampicin 541 (Sigma R3501): 0.34.

542

543 Sequencing library samples. DNA was extracted from cell pellets with the DNeasy gDNA 544 extraction kit (Qiagen) according to the manufacturer's protocol, resuspending in a final volume 545 of 100 µl with an average yield of ~50 ng/µl. The sgRNA-encoding region was amplified using 546 Q5 DNA polymerase (NEB) in a 100 µl reaction with 2 µl gDNA (~100 ng) and primers oJMP697 547 and oJMP698 (nested primers with adapters for index PCR with Illumina TruSeg adapter) 548 according to the manufacturer's protocol using a BioRad C1000 thermocycler with the following 549 program: 98°C, 30s then 16 cycles of: 98°C, 15s; 65°C, 15s; 72°C, 15s. PCR products were 550 purified using the Monarch PCR and DNA Cleanup and eluted in a final volume of 20 µl for a 551 final concentration of ~20 ng/ μ l). 552 Samples were sequenced by the UW-Madison Biotech Center Next Generation

553 Sequencing Core facility. Briefly, PCR products were amplified with nested primers containing i5 554 and i7 indexes and Illumina TruSeq adapters followed by bead cleanup, quantification, pooling 555 and running on a Novaseq 6000 (150bp paired end reads).

556

557 Library data analysis. For more information on digital resources and links to custom scripts,558 see Table S4.

559

Counting sgRNA Sequences. Guides were counted using *seal.sh* script from the *bbtools*package (Release: March 28, 2018). Briefly, paired FASTQ files from amplicon sequencing
were aligned in parallel to a reference file corresponding to the guides cloned into the library.
Alignment was performed using *k*-mers of 20 nucleotide length—equal to the length of the guide
sequence.

565

Condition Comparisons – Quantification and Confidence. Log₂-fold change and confidence
intervals were computed using *edgeR*. Briefly, trended dispersion of guides was estimated and
imputed into a quasi-likelihood negative binomial log-linear model. Changes in abundance and
the corresponding false discovery rates were identified for each guide in each condition
individually. Finally, log2-fold abundance changes were calculated by taking the median guidelevel log2-fold change; confidence was calculated by computing the Stouffer's *p*-value (*poolr R*package) using FDR for individual guides across genes.

- 574 Knockdown-Response Curves. Code was adapted from the *drc* (*DoseResponse*) *R* package
- 575 to generate 4-parameter logistic curves describing the relationship between predicted
- 576 knockdown (independent) and the log₂-fold change in strain representation (dependent) for all
- 577 (~10) mismatch guides per gene.
- 578

579 Data Sharing Plan

Raw data will be deposited in the Sequence Read Archive (SRA), code used to analyze
the data will be available on GitHub, and plasmids will be available from Addgene. Other
reagents and protocols are available upon request.

583

584 Acknowledgements

- 585 This work was supported by a Career Transition Award from the NIH National Institute of
- 586 Allergy and Infectious Diseases (K22AI137122). R.D.W. was supported by the Predoctoral
- 587 Training Program in Genetics (NIH 5T32GM007133). J.S.T. was supported by the
- 588 Biotechnology Training Program (NIH 5T32GM135066) and a GRFP from the NSF. We thank
- 589 ChatGPT for assistance in developing the CoMBaT-seq acronym. We thank Agilent
- 590 Technologies for providing SurePrint Oligonucleotide libraries and Laura Whitman for oligo
- 591 synthesis support and the University of Wisconsin Biotechnology Center for technical support
- 592 with Illumina sequencing.
- 593

594 Competing Interest

- 595 Jason M. Peters and Amy B. Banta have filed for patents related to Mobile-CRISPRi 596 technology and bacterial promoters.
- 597

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Fig 1 CRISPRi screening overview. **(A)** Design and construction of a Mobile-CRISPRi library targeting all putative essential genes in *A. baumannii* 19606. The library was screened with CRISPRi inducer (1 mM IPTG) to identify genes that are vulnerable to knockdown or with inducer and a sub-MIC concentration of antibiotic to identify antibiotic-gene interactions. **(B-C)** Density plot showing depletion of essential gene targeting sgRNA spacers (perfect match or mismatch) from the library but not depletion of non-targeting control sgRNAs during growth over two time points (T₁ and T₂) **(D)** The population diversity (N_b) of essential gene targeting sgRNAs is reduced relative to controls, indicating that those sgRNAs are depleted during growth. The white horizontal line through the bars indicates a break in the data.



Fig 2 *A. baumannii* genes and pathways that are vulnerable to knockdown. **(A-B)** Depletion of sgRNAs targeting transcription units (TUs) from the CRISPRi library during growth in inducer over two time points (T_1 and T_2). Vertical dashed lines indicate a two-fold loss in fitness relative to non-targeting sgRNAs and horizontal dashed lines indicate a Stouffer's *p* value of ≤ 0.05 . Stouffer's p values were calculated at the TU level by combining the false discovery rates (FDRs) of all individual sgRNAs targeting the TU. TUs related to pathways discussed in the text are colored according to the figure legend and the number of essential genes in a TU is indicated by point size.



Fig 3 Knockdown-response curves describe gene and pathway vulnerability. **(A-B)** Knockdown-response curves of the LOS gene *lpxA* and the PG/division gene *murA*. Points are individual mismatch sgRNAs; mismatch sgRNA knockdown was predicted as previously described (19). Colored lines are a 4-parameter logistic fit describing the relationship between relative fitness and knockdown. The effective knockdown 50 (EK_{50}) is the amount of predicted knockdown needed to achieve a half-maximal effect on relative fitness. EK_{50} s are depicted as crosshairs. **(C-D)** Knockdown response curves for genes in LOS synthesis or PG/division pathways. Points indicate the EK_{50} for individual pathway genes. Boxplots on the y-axis show the distribution of relative fitness at EK_{50} for genes in the pathway and boxplots on the x-axis show the distribution of EK_{50} values for genes in the pathway. Statistical significance was assessed using Wilcoxon Rank Sum Test; asterisks indicate $p \le 0.05$ and ns for not significant.



Fig 4 Essential gene interactions with carbapenem antibiotics in *A. baumannii*. **(A)** Boxplots showing the relative fitness of selected TUs that interact with imipenem (IMI) across the genome at T₁. Points are individual genes in the TU. Boxplots are colored by relevant pathways; light-blue boxplots indicate TUs where tRNA synthetase genes are present with genes in other pathways. **(B-C)** CoMBaT-seq data from a growth competition between either a *murA* or *glnS* knockdown strain and a non-targeting control strain in the presence or absence of IMI. Only data from the gene targeting strain is depicted as the non-targeting control is the remaining proportion of the population. Points are data from individual experiments (N = 2).





Fig 5 Knockdown extent affects the sign of antibiotic-gene interactions. **(A-B)** Schematics of idealized dose-response curves showing monotonic or hormetic relationships between dose and response; hormetic responses change the sign of the response depending on dose. **(C-D)** Knockdown-response curves of *glnS* show a nearly monotonic response in the absence of IMI, but a hormetic response in the presence of IMI. **(E)** The interaction between the IIeRS tRNA synthetase inhibitor mupirocin (MUP) and IMI shows a hormetic response at intermediate concentrations of IMI.



Fig 6 Essential gene knockdown phenotypes in rifampicin (RIF) versus colistin (COL). Depletion of sgRNAs targeting transcription units (TUs) from the CRISPRi library during growth in inducer and RIF or COL at T₂. Vertical dashed lines indicate a two-fold loss in fitness relative to non-targeting sgRNAs and horizontal dashed lines indicate a Stouffer's *p* value of \leq 0.05. Stouffer's *p* values were calculated at the TU level by combining the false discovery rates (FDRs) of all individual sgRNAs targeting the TU. TUs related to pathways discussed in the text are colored according to the figure legend and the number of essential genes in a TU is indicated by point size.



Fig 7 COL/RIF interaction with and physiological characterization of NDH-1 knockdown. **(A)** CoMBaT-seq data from a growth competition between a *nuoB* knockdown strain and a non-targeting control strain in the presence or absence of COL. Only data from the gene targeting strain is depicted as the non-targeting control is the remaining proportion of the population. Points are data from individual experiments (N = 2). **(B)** Measurement of the NAD+/NADH ratio in *nuoB* knockdown and non-targeting cells using the NAD/NADH-Glo assay. An unequal variance t-test was performed and the asterisk indicates that the p value ≤ 0.05 . **(C-D)** Knockdown-response curves of *nuoB* show a nearly monotonic response in the absence of RIF, but a hormetic response in the presence of RIF. **(E)** CoMBaT-seq data from a growth competition between a *nuoB* knockdown strain and a non-targeting control strain in the presence of RIF. **(F)** EtBr permeability assay of non-targeting and *nuoB* knockdown strains; *nuoB* knockdowns show decreased access of EtBr to DNA in the cytoplasm.



Fig 8 Anticorrelated gene-antibiotic interactions for colistin (COL) and rifampicin (RIF). Relative fitness changes for genes encoding NDH-1 or involved in LOS biosynthesis in COL or RIF treated conditions relative to untreated.