



# Coevolutionary phage training leads to greater bacterial suppression and delays the evolution of phage resistance

Joshua M. Borin<sup>a</sup>, Sarit Avrani<sup>b</sup>, Jeffrey E. Barrick<sup>c</sup>, Katherine L. Petrie<sup>a,d</sup>, and Justin R. Meyer<sup>a,1</sup>

<sup>a</sup>Division of Biological Sciences, University of California San Diego, San Diego, CA 92093; <sup>b</sup>Department of Evolutionary and Environmental Biology and The Institute of Evolution, University of Haifa, 3498838 Haifa, Israel; <sup>c</sup>Department of Molecular Biosciences, The University of Texas at Austin, Austin, TX 78712; and <sup>d</sup>Earth-Life Science Institute, Tokyo Institute of Technology, 145-0061 Tokyo, Japan

Edited by Harmit S. Malik, Fred Hutchinson Cancer Research Center, Seattle, WA, and approved May 7, 2021 (received for review March 10, 2021)

**The evolution of antibiotic-resistant bacteria threatens to become the leading cause of worldwide mortality. This crisis has renewed interest in the practice of phage therapy. Yet, bacteria's capacity to evolve resistance may debilitate this therapy as well. To combat the evolution of phage resistance and improve treatment outcomes, many suggest leveraging phages' ability to counter resistance by evolving phages on target hosts before using them in therapy (phage training). We found that in vitro,  $\lambda$ trn, a phage trained for 28 d, suppressed bacteria ~1,000-fold for three to eight times longer than its untrained ancestor. Prolonged suppression was due to a delay in the evolution of resistance caused by several factors. Mutations that confer resistance to  $\lambda$ trn are ~100 $\times$  less common, and while the target bacterium can evolve complete resistance to the untrained phage in a single step, multiple mutations are required to evolve complete resistance to  $\lambda$ trn. Mutations that confer resistance to  $\lambda$ trn are more costly than mutations for untrained phage resistance. Furthermore, when resistance does evolve,  $\lambda$ trn is better able to suppress these forms of resistance. One way that  $\lambda$ trn improved was through recombination with a gene in a defunct prophage in the host genome, which doubled phage fitness. This transfer of information from the host genome is an unexpected but highly efficient mode of training phage. Lastly, we found that many other independently trained  $\lambda$  phages were able to suppress bacterial populations, supporting the important role training could play during phage therapeutic development.**

therapy studies (9–12, 14). A meta-analysis in 2018 reported that phage resistance evolved in 82% of animal gut decolonization studies, 50% of meningitis/sepsis models, and 75% of human clinical cases in which the evolution of resistance was monitored (14). These observations of rapid phage resistance evolution in therapy mirror decades of basic research in the laboratory; mutations that confer resistance to phages are often as common as those for antibiotic resistance (15–17). Furthermore, many of these resistance mutations confer cross-resistance to multiple phages (18).

Although resistance to phages is as or more common than to antibiotics, potential advantages of using phages as therapeutics have been proposed time and again (7, 8, 19–22). Notably, unlike antibiotics, phages are biological entities that evolve. By reciprocally adapting to changes in their hosts (coevolution), phages have maintained the ability to infect their hosts for millennia. Many have proposed harnessing this inherent evolutionary potential by preemptively coevolving phages with target bacterial prey (22–24). Proponents of this “phage training” approach suggest that, by experiencing the ways their host can evolve resistance, trained phages will evolve to counter host defenses. Then, trained phages “from the future” can be used to trap the ancestral, uncoevolved bacteria “from their past” that are infecting the patient, making their evolution futile.

evolution | coevolution | resistance | phage therapy | phage training

In 30 y, the World Health Organization predicts that antibiotic-resistant bacteria will kill over 10 million people each year—more deaths than are caused by cancer (1). This health crisis, in part caused by the heavy and often inappropriate way we use antibiotic drugs, has led to the spread of resistance genes through clinical, agricultural, and natural environments and to the emergence of multidrug-resistant (MDR) “superbugs” that are untreatable due to their resistance against all available classes of antibiotics (2–4). As bacteria continue to outpace our discovery and development of new drugs, the evolution of resistance threatens to return us to a pre-antibiotic era of infectious disease (5, 6).

This crisis has renewed interest in the century-old practice of phage therapy: the use of phages, viruses that infect bacteria, to treat bacterial infections (7–11). Recently, phage therapy has shown promise in cases where drugs of last resort fail to treat life-threatening MDR bacterial infections (9–13). However, even in successful cases, the evolution of phage resistance poses a considerable threat to the efficacy of treatment (9, 12, 14). For example, in 2016, at the University of California San Diego, a patient with acute pancreatitis complicated by an MDR *Acinetobacter baumannii* infection was treated with two four-phage mixtures that suppressed the pathogen in vitro (9). Within 8 d, *A. baumannii* isolated from the patient was resistant to all eight phages used. Fortunately, the infection resolved following delivery of a ninth phage, and the patient survived. This case is representative of numerous phage

## Significance

**The evolution of antibiotic-resistant bacteria threatens to claim over 10 million lives annually by 2050. This crisis has renewed interest in phage therapy, the use of bacterial viruses to treat infections. A major barrier to successful phage therapy is that bacteria readily evolve phage resistance. One idea proposed to combat resistance is “training” phages by using their natural capacity to evolve to counter resistance. Here, we show that training phages by coevolving them with their hosts for 1 mo repeatedly enhances their capacity for suppressing bacterial growth and delays the emergence of resistance. Enhanced suppression was caused by several mechanisms, suggesting that the coevolutionary training protocol produces a robust therapeutic that employs complementary modes of action.**

Author contributions: J.M.B., S.A., and J.R.M. designed research; J.M.B., K.L.P., and J.R.M. performed research; J.M.B., J.E.B., and J.R.M. analyzed data; J.M.B. and J.R.M. wrote the paper; J.M.B., S.A., J.E.B., K.L.P., and J.R.M. edited the manuscript; and S.A., J.E.B., and J.R.M. provided financial support.

The authors declare no competing interest.

This article is a PNAS Direct Submission.

Published under the PNAS license.

See online for related content such as Commentaries.

<sup>1</sup>To whom correspondence may be addressed. Email: jrmeyer@ucsd.edu.

This article contains supporting information online at <https://www.pnas.org/lookup/suppl/doi:10.1073/pnas.2104592118/-/DCSupplemental>.

Published June 3, 2021.

While the idea of phage training is enticing, it has not yet been adopted for therapy. Contrasting theories of bacteria–phage coevolutionary dynamics make the success of phage training uncertain (12, 24, 25). According to some conceptual models of coevolution (e.g., matching alleles), as phages adapt to their evolving host, they lose the ability to infect past hosts (24). In such cases, phage training would not work because trained phages would lose the ability to infect the original target bacterium. Alternatively, other models of coevolution (e.g., gene for gene and arms race dynamics) argue that as phages adapt to their evolving host, they maintain the ability to infect their original host (24). In this scenario, training would expand phage host range to encompass both original and contemporary bacteria. Regardless of how coevolution affects host range, some opponents of phage training contend that the use of trained phages will apply stronger selection on target bacteria which will accelerate the evolution of resistance and loss of therapeutic efficacy (22).

In this study, we conducted a coevolution experiment using *Escherichia coli* and either untrained or trained phages to evaluate the potential of phage training for therapy. By comparing the population dynamics of coevolving bacteria and phages, we find that trained phages suppress the target bacteria more strongly and for longer than untrained phages. Through post hoc analyses on the bacteria and phages that evolved in our experiment, we identify the factors that allowed trained phages to suppress host populations and delay the evolution of resistance.

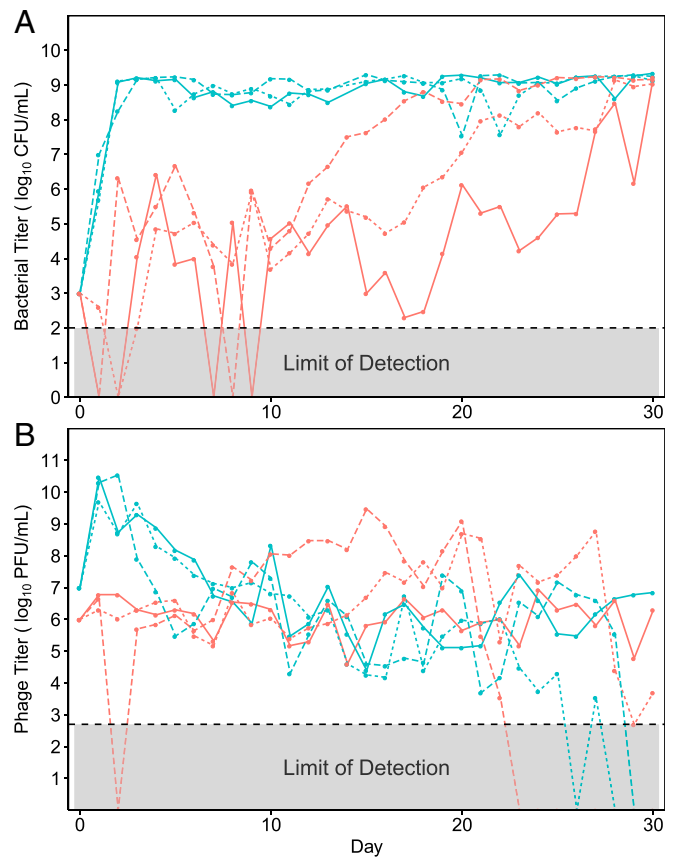
## Results

**Coevolution Experiment.** We propagated populations of *E. coli* B strain REL606 with either untrained or trained strains of phage  $\lambda$  in flasks for 30 d and compared the population dynamics of coevolving bacteria and phages. For untrained phages, we used  $\lambda_{\text{unt}}$ , a lytic strain of  $\lambda$  that uses LamB as a receptor. For trained phages, we used  $\lambda_{\text{trn}}$ , a descendant of  $\lambda_{\text{unt}}$  that was isolated on day 28 of a previous coevolution experiment with REL606. It can infect using either of two receptors, LamB and OmpF (26, 27). Because  $\lambda_{\text{trn}}$  uses two receptors, we hypothesized that it would be more difficult for hosts to evolve envelope-based resistance. Flasks containing 10 mL of modified M9 glucose media (M9-G) were inoculated with  $\sim 10^4$  cells of REL606 and either  $\sim 10^8$  or  $\sim 10^7$  phage particles of  $\lambda_{\text{unt}}$  (multiplicity of infection [MOI]  $\sim 10^4$ ) or  $\lambda_{\text{trn}}$  (MOI  $\sim 10^3$ ), respectively.

Daily measurements of population densities revealed large differences in bacterial abundance between treatments (Fig. 1A), whereas phage densities were similar (Fig. 1B). By day 3, bacteria coevolving with  $\lambda_{\text{unt}}$  were no longer suppressed by phages and were instead limited by the availability of glucose in the media. This rapid loss of suppression is consistent with past studies on  $\lambda_{\text{unt}}$  and REL606 (26–29), as well as studies on other bacteria–phage pairs (30, 31); when cultured with phages in flasks, bacteria rapidly evolve resistance, and their growth is limited by the availability of nutrients. However, in flasks with  $\lambda_{\text{trn}}$ , phages suppressed their hosts for 13 to 28 d, at which point bacterial densities slowly increased until they became limited by the availability of glucose, as in flasks with  $\lambda_{\text{unt}}$ . The prolonged suppression of bacteria by  $\lambda_{\text{trn}}$  suggested that resistance to  $\lambda_{\text{trn}}$  evolved much later than to  $\lambda_{\text{unt}}$ .

**Emergence of Resistance.** To determine when resistance evolved in each treatment, we sampled bacteria from various timepoints and challenged them with the initial phage they were cocultured with ( $\lambda_{\text{unt}}$  or  $\lambda_{\text{trn}}$ ). We assessed the resistance of 12 isolates every 5 d to quantify the diversity of resistance. Initially, we performed spot assays where 5  $\mu\text{L}$  of phage lysate was spotted on top of an isogenic lawn of bacteria growing on an agar plate. We found that this approach was inadequate because many bacterial isolates appeared sensitive to  $\lambda_{\text{trn}}$  when grown on agar (exhibited clearing due to phage killing) but were able to grow with phage in liquid culture.

Given that the experiments were conducted in liquid medium, we developed a protocol to efficiently track bacterial population

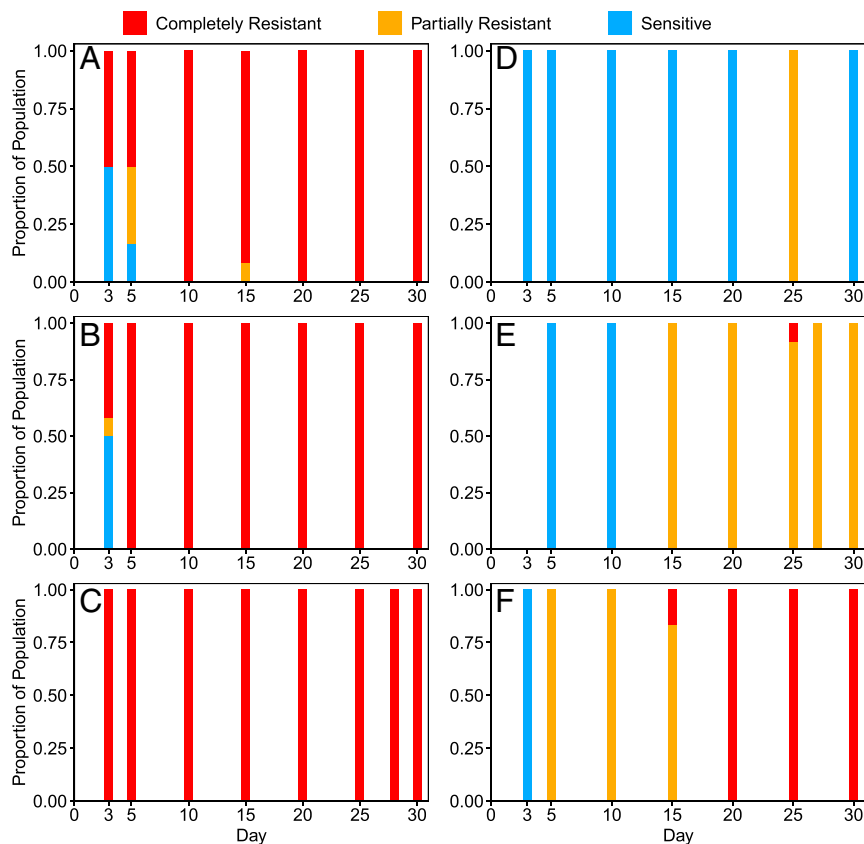


**Fig. 1.** Population dynamics of bacteria (A) and phage (B) during 30 d of coculturing, estimated from colony forming units (CFU) and plaque forming units (PFU), respectively. The flasks containing  $\lambda_{\text{unt}}$  are teal and  $\lambda_{\text{trn}}$  are red. The line types correspond with replicate populations (solid = 1, dotted = 2, and dashed = 3).

growth in liquid culture using a microtiter plate reader. Resistance was categorized visually by comparing the difference in cell density (via optical density; OD) dynamics between cultures growing with and without phage. Bacteria were deemed sensitive if no growth was observed in the presence of phage and completely resistant if cells grew uninhibited by phage. Partial resistance was recorded for bacteria that showed signs of growth but were clearly inhibited by the phage (representative isolates in *SI Appendix*, Fig. S1).

Using the liquid-based assay described above, we characterized the proportion of resistance in populations of the coevolution experiment at various timepoints (Fig. 2A–F). Resistance to  $\lambda_{\text{unt}}$  evolved much earlier than to  $\lambda_{\text{trn}}$ ; by day 3,  $\geq 50\%$  of isolates were partially or completely resistant to  $\lambda_{\text{unt}}$ , and by day 10, 100% of isolates were completely resistant. Despite high levels of resistance,  $\lambda_{\text{unt}}$  was able to persist. This was likely due to genetically “leaky resistance,” in which a resistant population of bacteria continuously generates a small number of sensitive mutant cells upon which a phage population can subsist (32). As in previous coevolution experiments,  $\lambda_{\text{unt}}$  in populations 1, 2, and 3 evolved to use OmpF as a receptor on days 17, 22, and 19, respectively (*SI Appendix*, Fig. S6).

In contrast to flasks with  $\lambda_{\text{unt}}$ , the evolution of partial and complete resistance to  $\lambda_{\text{trn}}$  occurred later and was more variable. In  $\lambda_{\text{trn}}$  population 3, partial resistance evolved by day 5, but complete resistance was not detected until day 15 (Fig. 2F). However, phages isolated 5 d later (i.e., day 20) were able to infect these completely resistant isolates (*SI Appendix*, Fig. S2). In  $\lambda_{\text{trn}}$  population 2, partial resistance was not detected until day 15. One completely resistant



**Fig. 2.** Proportion of sensitive (blue), partial (yellow), and complete (red) resistance of bacterial populations at various days of the coevolution experiment to ancestral phages from respective treatments ( $n = 12$  isolates per timepoint).  $\lambda_{\text{unt}}$  Populations 1 to 3 correspond to A–C and  $\lambda_{\text{trn}}$  Populations 1 to 3 correspond to D–F, respectively.

strain was isolated from day 25, but it was not detected at later timepoints. Phages isolated 2 d later (i.e., day 27) were able to infect this completely resistant isolate (*SI Appendix, Fig. S2*). These results suggest that  $\lambda_{\text{trn}}$ 's ability to evolve counter defenses may have contributed to the disappearance of the resistant genotype. Lastly, in  $\lambda_{\text{trn}}$  population 1, partial resistance was not detected until day 25, and complete resistance never evolved (Fig. 2D). Surprisingly, even at the end of the experiment, day-30 isolates from  $\lambda_{\text{trn}}$  population 1 lacked resistance, as determined by spot and liquid-based assays (Fig. 2D). We further describe this case in *SI Appendix,  $\lambda_{\text{trn}}$  Resistance*.

Delay in the evolution of resistance against our trained phage explains the difference in suppression between flasks containing  $\lambda_{\text{unt}}$  and  $\lambda_{\text{trn}}$ . To understand the reasons for this delay, we investigated four non-mutually exclusive hypotheses. First,  $\lambda_{\text{trn}}$  resistance would take longer to evolve if there were fewer mutations available conferring resistance to this phage. Second, resistance would be delayed if more mutations were required to confer resistance to  $\lambda_{\text{trn}}$  than  $\lambda_{\text{unt}}$ . Third, if mutations for  $\lambda_{\text{trn}}$  resistance are more costly, it will take them longer to rise in frequency. And fourth,  $\lambda_{\text{trn}}$  may be better able to evolve counter defenses, which would prolong its ability to suppress bacterial resistance.

**Mutation Rates of Resistance.** In order to determine whether there are fewer accessible mutations for  $\lambda_{\text{trn}}$  resistance than for  $\lambda_{\text{unt}}$  resistance, we conducted Luria–Delbrück fluctuation tests. This protocol is used to estimate the rate of mutations that generate a particular phenotype, like resistance, by applying a selective screen and enumerating cells with the desired phenotype (17, 33). Because traditional fluctuation tests on agar plates could not detect some forms of resistance that evolved in our experiments

(*Emergence of Resistance*), we used a fluctuation test design suitable for liquid culture. Using the  $P_0$  method (33), we estimated a mutation rate for  $\lambda_{\text{unt}}$  resistance of  $6.3 \times 10^{-6}$  per cell. With  $\lambda_{\text{trn}}$ , we found that the mutation rate for resistance was  $2.2 \times 10^{-8}$  per cell,  $\sim 100\times$  lower than resistance to  $\lambda_{\text{unt}}$ . Notably, resistance to  $\lambda_{\text{unt}}$  appeared to confer complete resistance, whereas  $\lambda_{\text{trn}}$  resistance was only partial. Thus, mutations that confer  $\lambda_{\text{trn}}$  resistance are  $\sim 100\times$  less common than mutations for  $\lambda_{\text{unt}}$  resistance, and they only confer partial resistance.

Our inability to detect mutants with complete  $\lambda_{\text{trn}}$  resistance in fluctuation tests led us to focus on the second hypothesis, that complete resistance might require multiple mutations. To test this, we repeated fluctuation tests on four genetically distinct, partially resistant mutants isolated from the initial fluctuation test. We found that, across 10 replicate cultures for each isolate (40 total), only 1 replicate evolved complete resistance (with an additional mutation). Thus, under the artificial selection in fluctuation tests, multiple mutations were required to achieve complete  $\lambda_{\text{trn}}$  resistance. This led us to wonder whether complete resistance to  $\lambda_{\text{trn}}$  required multiple mutations in the coevolution experiment as well.

**Genetics of Resistance.** To identify the resistance mutations that evolved in the coevolution experiment, we sequenced whole genomes of representative isolates at the earliest timepoint at which resistance was detected, as well as of isolates at later timepoints with distinct changes in resistance status (i.e., greater resistance or sensitivity; *SI Appendix, Fig. S1*). We identified mutations using the computational pipeline *breseq* (34) and then classified putative resistance mutations as those that occurred in genes 1) known to be involved in  $\lambda$  infection (26, 35) or 2) that evolved in parallel in multiple populations, fluctuation tests, or previous coevolution

experiments (26, 27). In total, we found two unique putative resistance mutations across four bacterial isolates from flasks with  $\lambda$ unt and eight unique putative resistance mutations across eight isolates from flasks with  $\lambda$ trn (SI Appendix, Fig. S3).

From flasks with  $\lambda$ unt, all completely resistant day-3 isolates had 25-basepair (bp) frameshift duplications in *malT*, a positive regulator of the receptor LamB, and no other putative resistance mutations (SI Appendix, Fig. S3). Notably, isolates with partial  $\lambda$ unt resistance only had point mutations in *malT* (e.g., isolate P1-T5-5-P, SI Appendix, Figs. S1C and S3). Thus, whereas frameshift mutations in *malT* conferred complete resistance to  $\lambda$ unt, point mutations in *malT* were less protective. *malT* appeared to be the only locus to evolve resistance mutations in the  $\lambda$ unt treatment.

In contrast, putative resistance mutations identified in the  $\lambda$ trn treatment occurred at numerous loci. Many of the genes were not previously known to affect  $\lambda$  infection; however, they were flagged because they evolved in parallel. For example, we found a 21,535-bp 27-gene deletion in all isolates from population 2, as well as in a fluctuation test isolate (JB43). Moreover, JB42, an independently evolved partially resistant fluctuation test isolate, had a single mutation in *lpcA*, which occurs within this 21,535-bp range. Thus, we believe the large deletion observed in population-2 isolates confers partial resistance by removing *lpcA*. The function of the gene suggests a mechanism for partial resistance; *lpcA* codes for a phosphoheptose isomerase and is involved in assembly of the lipopolysaccharide (LPS) core and outer-membrane biogenesis. It is possible that the disruption of *lpcA* alters the organization of outer-membrane proteins like LamB and OmpF, which may interfere with phage adsorption. This hypothesis is also supported by the detection of parallel evolution in *waa* genes, which are also associated with LPS core biogenesis. In both isolates from population 3, we found a 4,894-bp IS1-mediated deletion of genes *waaC* through *waaT*, and a nearby locus, *waaO*, evolved mutations in a previous experiment (36, 37). Previously, mutations in *waa* have only been associated with resistance to completely different phages (e.g., T7 and Mu) that use LPS as a receptor (36, 37). However, here they also appear to interfere with phage  $\lambda$  recognition of its outer-membrane protein receptors, LamB and OmpF. The mechanisms by which other putative resistance mutations confer partial  $\lambda$ trn resistance are less clear and are discussed in SI Appendix,  *$\lambda$ trn Resistance*.

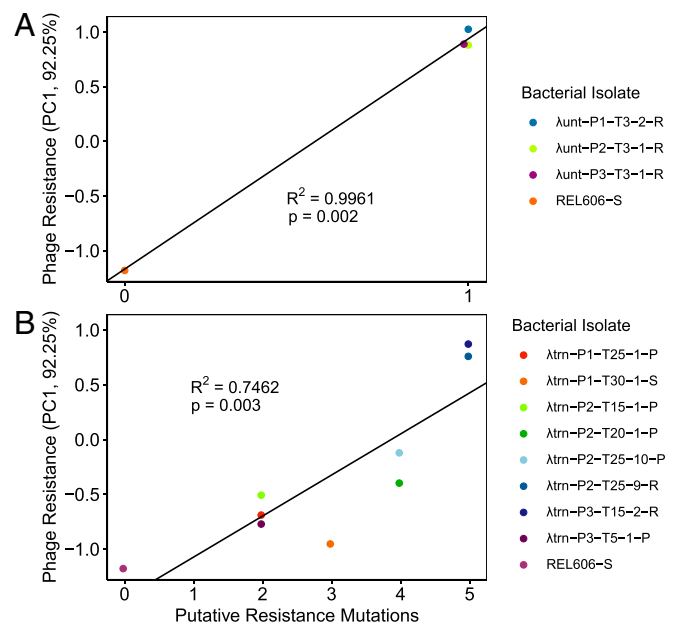
After identifying putative resistance mutations that occurred in each bacterial isolate, we sought to quantify how these mutations affected phage resistance. Because strains possessed various compositions of mutations, we were unable to analyze their effects in isolation. Therefore, we conducted linear regressions to determine whether there was a relationship between the number of putative resistance mutations and the level of resistance to  $\lambda$ unt or  $\lambda$ trn. To discriminate between the resistance of different isolates (especially partially resistant isolates) we needed a way to quantitatively score resistance. We tried simple approaches to score resistance by analyzing the OD trajectories of cultures (e.g., computing the difference in the area under growth curves for bacteria without and with phage); however, these methods were unable to characterize differences that were easily identifiable with the naked eye. When these approaches did not work, we used principal component analysis (PCA) on the growth trajectory data, which was able to transform and score growth trajectories along a continuous scale for resistance. As a result, principal component 1 (PC1, 92.25% of variance) was able to discriminate sensitive, partial, and complete resistance, as well as between different levels of partial resistance (SI Appendix, Fig. S4).

Using PC1 as an indicator of resistance, we conducted linear regressions to test the relationship between the number of putative resistance mutations and phenotypic resistance to ancestral phages (Fig. 3). We find that the relationship is significant for both  $\lambda$ unt ( $P = 0.002$ ) and  $\lambda$ trn ( $P = 0.003$ ). The significant relationship for  $\lambda$ trn suggests that the putative resistance mutations we identified

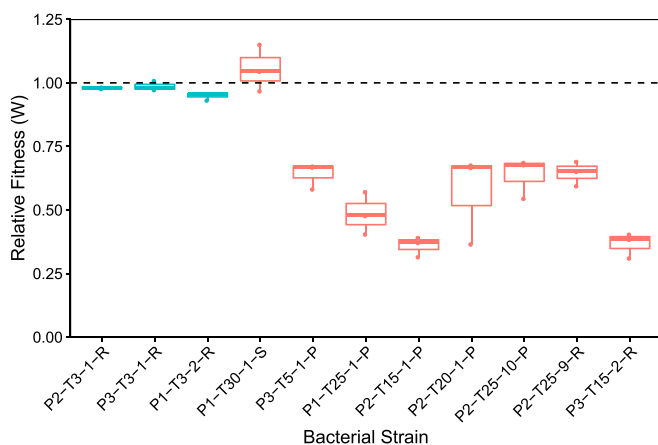
played a role in building bacterial defenses. This observation combined with the fluctuation test analysis provides evidence in support of the second hypothesis that multiple mutations are required to confer complete resistance to  $\lambda$ trn. All strains with complete resistance to  $\lambda$ unt had only one mutation (Fig. 3A), whereas isolates with complete resistance to  $\lambda$ trn possessed five putative resistance mutations (Fig. 3B).

**Costs of Resistance.** In order to determine whether resistance to  $\lambda$ trn was costlier than to  $\lambda$ unt, we conducted competition experiments in which resistant bacteria with different genotypes were paired with a genetically marked sensitive strain (Fig. 4).  $\lambda$ unt resistance carried only a small cost compared to the marked competitor ( $\bar{w} = 0.972$ ,  $t = -3.8617$ ,  $P = 0.005$ , one-sample Student's  $t$  test). This was expected because *malT* mutants cultured in similar laboratory conditions were not found to bear a cost in previous studies (38, 39). In contrast, resistance to  $\lambda$ trn was more costly than  $\lambda$ unt resistance ( $\bar{w} = 0.596$ ,  $t = -8.19$ ,  $P < 0.001$ , two-sample Student's  $t$  test). The fitness burden was similar regardless of whether the mutations conferred partial or complete resistance ( $P = 0.67$ , two-sample Student's  $t$  test). Thus, any level of resistance to  $\lambda$ trn has a cost, which helps explain the lag in the development of resistance to this phage (Fig. 1A).

**Phage Adaptation and Suppression of Resistance.** Thus far, we have focused on the bacterial response to  $\lambda$ unt and  $\lambda$ trn treatments. However, the ability of phages to evolve counter resistance to their hosts could have also contributed to differences in bacterial suppression and slowed the progression of resistance. To investigate whether phages evolved counter defenses, we isolated a single phage from each population on the day we first detected that co-occurring bacteria had evolved resistance. We refer to co-occurring phage isolates as  $\lambda$ unt+ and  $\lambda$ trn+ to differentiate them from their



**Fig. 3.** Relationship between the number of putative resistance mutations and the level of phage resistance (PC1 is indicative of resistance; SI Appendix, Fig. S4) from coevolutionary treatments with  $\lambda$ unt (A) and  $\lambda$ otr (B). Linear regressions (PC1 ~ Putative Resistance Mutations, black lines) are significant for both Panels A and B; however, the number of mutations required for high levels of resistance is greater in B. The bacterial strains are labeled as [Treatment] – [Population] – [Day Isolated] – [Isolate #] – [Resistance Status], in which S = Sensitive, R = Complete Resistance, and P = Partial Resistance to phages from respective treatments.



**Fig. 4.** Fitness of coevolved bacterial isolates relative to their common ancestor, REL606. Isolates that coevolved with  $\lambda_{unt}$  are in teal and  $\lambda_{trn}$  in red. The bacteria are labeled as in Fig. 3 except with treatment omitted. The mean relative fitness is significantly different between treatments with  $\lambda_{unt}$  ( $\bar{w} = 0.972$ ) and  $\lambda_{trn}$  ( $\bar{w} = 0.596$ , independent two-sample Student's  $t$  test,  $t = -8.19$ ,  $P < <0.001$ ). However, the relative fitness of isolates with partial and complete resistance to  $\lambda_{trn}$  does not differ ( $P = 0.67$ ). Strains are ordered by treatment ( $\lambda_{unt}$  and  $\lambda_{trn}$ ) and then by increasing resistance according to PC1 (Fig. 3).

ancestors. We then conducted plate reader experiments to determine whether co-occurring phages ( $\lambda_{unt+}$  or  $\lambda_{trn+}$ ) had evolved enhanced ability to suppress the earliest resistant bacteria to emerge from each population compared to ancestral phages ( $\lambda_{unt}$  or  $\lambda_{trn}$ ). We found that  $\lambda_{unt+}$  phages were no better than  $\lambda_{unt}$  at suppressing resistant hosts, despite accumulating multiple adaptive mutations in the host's region of host recognition gene  $J$  (26, *SI Appendix, Fig. S5*).

Contrastingly, all  $\lambda_{trn+}$  phages were better able to suppress co-occurring, resistant hosts than their ancestor,  $\lambda_{trn}$  (Fig. 5). For population 1, we compared the suppression of host P1-T25-1-P by  $\lambda_{trn}$  and  $\lambda_{trn}$ -P1-T25. We found greater suppression by  $\lambda_{trn}$ -P1-T25, apparent visually (Fig. 5A), as well as quantitatively by comparing PC1 between replicate cultures (Fig. 5B,  $P = 0.004$ , two-sample Student's  $t$  test). The same was true for  $\lambda_{trn+}$  phages from population 2 ( $P = 0.017$ , two-sample Student's  $t$  test, Fig. 5D and E) and population 3 ( $P = 0.034$ , two-sample Student's  $t$  test, Fig. 5G and H). For each population, comparisons were drawn from cultures where phage inoculum densities were not significantly different (*SI Appendix, Phage Adaptation and Suppression of Resistance*).

Support for these results also comes from efficiency of plating (EOP) assays. EOP, the ratio of plaques that a phage lysate forms on different bacteria, is often used to indicate how well phage are adapted to different hosts. All  $\lambda_{trn+}$  phages had higher EOP on resistant hosts than  $\lambda_{trn}$  (Fig. 5C, F, and I,  $P = 0.022$ ,  $P = 0.045$ ,  $P = 0.037$ , respectively, two-sample Student's  $t$  tests). Although EOP alone is not indicative of improved suppression, these results support our conclusion that  $\lambda_{trn+}$  phages adapted to better suppress resistant hosts, whereas adaptation of  $\lambda_{unt+}$  phages did not improve suppression.

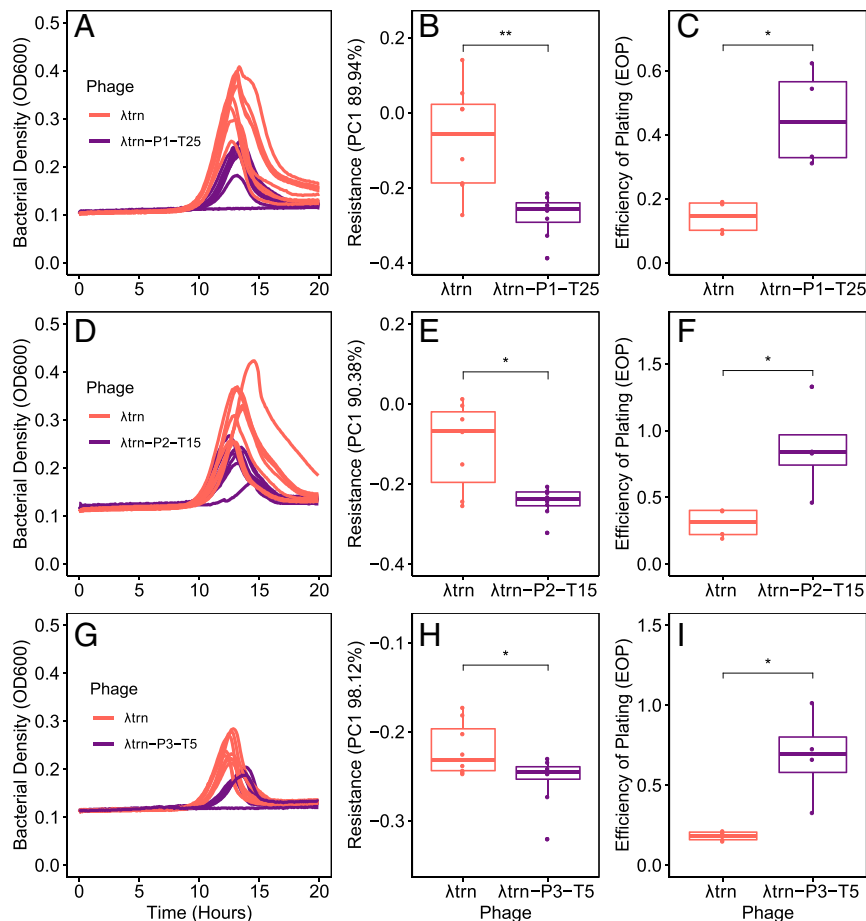
Two possibilities explain these results. First, the forms of resistance that evolved against  $\lambda_{trn}$  may have been easier for the phage to counter. This is consistent with the observation that initial resistance to  $\lambda_{trn}$  was only partial, whereas resistance to  $\lambda_{unt}$  was nearly complete (EOP = 0, *SI Appendix, Fig. S5D*). A second intriguing explanation is that during training,  $\lambda$  improved its capacity to evolve traits to counter resistance. Future studies will be designed to test these hypotheses and the role that phage evolvability plays in enhancing therapeutic efficacy.

**$\lambda_{trn}$  Adaptation via Recombination.** At this point in the study, we explored how phage training enabled  $\lambda_{trn}$  to gain its suppressive abilities (*SI Appendix, Table S1*). Previously, it was reported that five mutations in  $\lambda$ 's ( $\lambda_{unt}$ 's) host recognition gene  $J$  gave it the ability to use the new receptor, *OmpF* (26). In the same gene, there is an enigmatic ~1,300-bp region that experienced 49 mutations during phage training (Fig. 6A). These mutations appear to be the result of recombination between  $\lambda$ 's  $J$  gene (1,545 to 2,796) and REL606's *ECB\_00512* gene (882 to 2,217) (*SI Appendix, Fig. S8*). *ECB\_00512* shares homology with  $J$  and is positioned next to two other genes that share homology with lambdoid phages, suggesting that *ECB\_00512* is a genetic relict of a now-defunct prophage. The appearance of recombination in a gene under selection led us to question whether the recombination was adaptive. Using a previously reported phylogeny of the experiment in which the recombination evolved (27), we were able to deduce when the recombination occurred and engineer  $J$  alleles before and after the recombination. Next, we inserted the alleles and a genetic marker into  $\lambda_{unt}$  so that we could run competition experiments between pre- and postrecombination phages. We found that the recombination increased  $\lambda_{unt}$ 's ability to compete for wild type (REL606), *malT*<sup>-</sup>, and *malT*<sup>-</sup> *ompF*<sup>-</sup> host cells (Fig. 6B; paired Student's  $t$  test of  $\lambda$  growth rates,  $P$  values for wild type, *malT*<sup>-</sup>, and *malT*<sup>-</sup> *ompF*<sup>-</sup> were 0.002, 0.006, and 0.004, respectively). The recombination had the largest effect in competitions for *malT*<sup>-</sup> *ompF*<sup>-</sup> cells, which were the most difficult to infect and in which phage fitness doubled (ANOVA,  $P = 0.005$ ; Tukey's test,  $P < 0.05$ ).

We find it remarkable that, through recombination, the relict DNA of a past infection provided information to improve infectivity of our contemporary phage. We expected that phage training worked entirely through the steady processes of coevolution, in which the phage makes incremental, reciprocal advances on its evolving host. However, recombination may accelerate training by transferring information from past phages that were well adapted to their host to new, naive therapeutic phages. This may be an important mechanism for phage training success because therapeutic phages are typically isolated independently from the target bacterium (9, 11, 13) and may not be well adapted to these hosts. Many, if not most bacteria possess genes that originated from phage genomes (22, 40), and phage recombination is frequently found in nature (41–43). Moreover, a previous study found that recombination with host-encoded phages resulted in a host-range expansion (42), suggesting that recombination could be a dependable mechanism that enhances the effectiveness of phage training beyond the coevolutionary arms race. While the use of phages with the potential to recombine has generally been avoided due to the risk of transducing bacterial virulence or antibiotic resistance genes (43), here we show a potential benefit of phage–host recombination in phage training. If recombination is a concern during phage therapy, the recombination machinery could be left intact during training and then knocked out before treatment.

**Repeatability of Phage Training.** So far, we have focused on a single trained phage,  $\lambda_{trn}$ , and its untrained ancestor. We have shown that  $\lambda_{trn}$  causes better suppression, delays the evolution of resistance, and forces bacteria to accumulate multiple, costly mutations to evolve resistance. Notably,  $\lambda_{trn}$  is also able to infect through both *LamB* and *OmpF* receptors. If we trained  $\lambda$  again, would we get the same result? Additionally, how important is the use of two receptors to the efficacy of phage therapeutics?

To answer these questions, we compared the efficacy of new, independently trained phages with  $\lambda_{unt}$  and  $\lambda_{trn}$ . First, we isolated 12 trained phages from different populations after 20 d of coevolution with REL606 (26). Of these phages, six could use both *LamB* and *OmpF* receptors ( $\lambda_{newOmpF+}$ ) and six could not use *OmpF* ( $\lambda_{newOmpF-}$ ). All new phages were genetically unique (*SI Appendix, Fig. S9*). We then conducted a 7-d coculture experiment



**Fig. 5.** Coevolved  $\lambda$ trn+ isolates show adaptation and improved suppression of phage-resistant bacteria. In all panels, comparisons are between an ancestral phage  $\lambda$ trn (red) and a contemporary  $\lambda$ trn+ phage (purple) isolated from the same population and timepoint as the resistant bacterial isolate. (A–C) pertain to host P1-T25-1-P. (D–F) pertain to host P2-T15-1-P. (G–I) pertain to host P3-T5-1-P. The bacterial isolates are labeled as in Fig. 4. All hosts represent the first day at which  $\lambda$ trn resistance was detected. (A, D, and G) Growth trajectories of replicate wells ( $n = 4$ ) inoculated with  $\sim 1,000$  cells of the resistant host and either  $\lambda$ trn or  $\lambda$ trn+ phage. (B, E, and H) Resistance of bacterial isolates to  $\lambda$ trn and respective  $\lambda$ trn+ phage (indicated by PC1, see *SI Appendix, Fig. S4*). In all populations, bacterial isolates are less resistant to  $\lambda$ trn+ phages than to  $\lambda$ trn (two-sample Student's  $t$  tests ( $*P < 0.05$ ,  $**P < 0.005$ ); B,  $P = 0.004$ ; E,  $P = 0.017$ ; H,  $P = 0.034$ ). (C, F, and I) EOP of  $\lambda$ trn and  $\lambda$ trn+ phages on respective resistant hosts compared to on REL606. In all populations, EOP is higher for  $\lambda$ trn+ phages than  $\lambda$ trn (C,  $P = 0.022$ ; F,  $P = 0.045$ ; I,  $P = 0.037$ ).

(similar to that shown in Fig. 1) using six replicate flasks of  $\lambda$ unt, six replicates of  $\lambda$ trn, and a single replicate of each  $\lambda$ newOmpF+ and  $\lambda$ newOmpF– phage (Fig. 7). Suppression by  $\lambda$ unt and  $\lambda$ trn recapitulated earlier results (Fig. 7A and Fig. 1A), but with more replicates, flasks with  $\lambda$ trn showed more variable outcomes. In two of six  $\lambda$ trn flasks, bacteria reached high densities earlier than expected (days 3 and 5), and in one replicate, bacteria were eradicated from the flask.

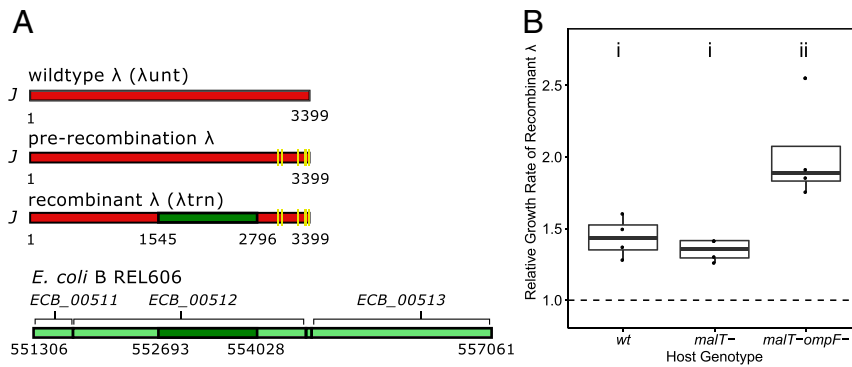
New, independently trained phages were better at suppressing bacteria than  $\lambda$ unt; however, the degree of suppression depended largely on whether phages could use two receptors.  $\lambda$ newOmpF+ phages showed strong and prolonged suppression that persisted throughout the experiment (Fig. 7B). Alternatively,  $\lambda$ newOmpF– phages showed less suppression, where significant differences in bacterial density compared to  $\lambda$ unt were intermittent (Fig. 7C). Comparing  $\lambda$ trn and  $\lambda$ newOmpF+ phages, we found no significant differences in suppression, suggesting that any trained phage that achieves OmpF+ will be as efficient at suppressing bacteria as  $\lambda$ trn (Fig. 7D). Altogether, our results show that coevolutionary phage training repeatedly improves therapeutic efficacy and that this effect is greatly enhanced by evolution to use multiple receptors.

## Discussion

In phage therapy, the evolution of phage resistance is widespread and often renders phage therapeutics ineffective. Here, we evaluated

the prospect of coevolutionary phage training as an approach to improve therapeutic efficacy by comparing untrained and trained phages cocultured with a naïve target bacterium. We found that treatment with a trained phage,  $\lambda$ trn, led to improved and prolonged suppression of host populations and that the evolution of  $\lambda$ trn resistance was delayed as compared to treatment with untrained phage,  $\lambda$ unt. This prolonged suppression and delayed resistance was caused by several factors that all support coevolutionary phage training as an approach that could improve outcomes in phage therapy.

We found that it was more difficult for bacteria to evolve resistance to trained phage. First, whereas individual mutations conferred complete resistance to  $\lambda$ unt, individual mutations for  $\lambda$ trn resistance were  $\sim 100\times$  less common and only conferred partial resistance. Second, complete  $\lambda$ trn resistance required multiple mutations—both completely resistant bacteria isolated from the coevolution experiment had five putative resistance mutations. These differences appear to be due to the fact that  $\lambda$ trn can use two receptors (LamB and OmpF), whereas  $\lambda$ unt can only use LamB. When we investigated suppression by different trained phages, genotypes that could use both receptors were similar to  $\lambda$ trn, whereas trained phages that only used LamB were less suppressive than  $\lambda$ trn. Because phage resistance often evolves through mutations affecting receptors, deploying phages with a backup receptor might be similar



**Fig. 6.** (A) Schematic of  $\lambda$  host recognition gene *J* of three genotypes and relict prophage genes (*ECB\_00511*, *ECB\_00512*, and *ECB\_00513*) in host REL606 genome. The yellow lines indicate point mutations (C2999T, A3034G, T3230C, C3310T, G3319A, T3321A, and A3364T). The dark green boxes indicate the recombined segment from *ECB\_00512* (see alignment in *SI Appendix*, Fig. S8). The light green boxes indicate adjacent prophage genes that did not recombine. (B) Increase in exponential growth rate of recombinant  $\lambda$ , relative to prerecombination  $\lambda$ , when competing for three different *E. coli* host genotypes. The letters (i and ii) indicate groups that are statistically similar. The dashed line indicates where growth rate of the recombinant is equal to prerecombination  $\lambda$ .

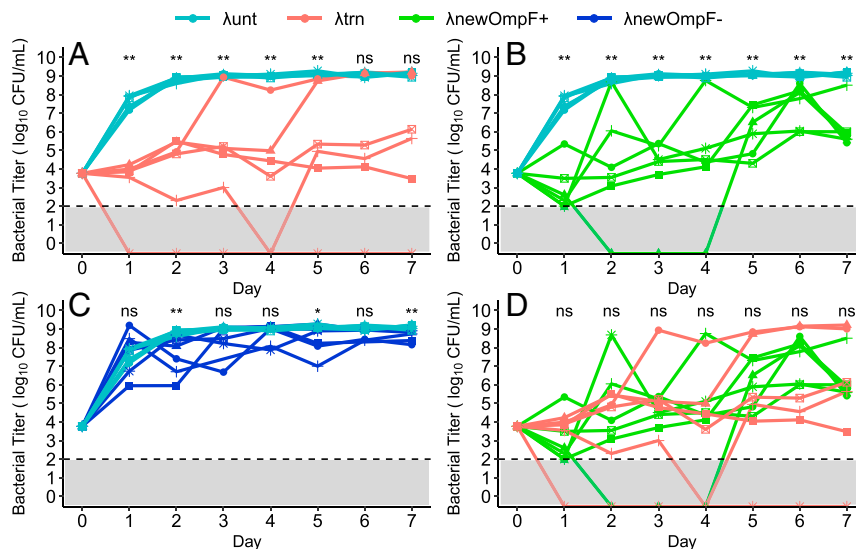
to using a drug mixture where multiple mutations are required for bacteria to survive the treatment. It is unclear whether evolving to use a new receptor is a typical outcome of phage training; nonetheless, the use of dual-receptor phages should be considered in developing future strategies for phage discovery (44), engineering (45, 46), and directed evolution.

Third, we found that  $\lambda_{trn}$  resistance mutations carried large growth costs, regardless of whether they conferred partial or complete resistance, whereas mutations for  $\lambda_{unt}$  resistance carried little cost. In conjunction with the fact that, initially, resistance to  $\lambda_{trn}$  is only partial, these large growth costs appear to have slowed the rate at which bacterial populations reached carrying capacity. Together, these factors may improve the ability of trained phage therapeutics, in combination with the host immune system, to resolve infections (47).

And fourth, we found that previously trained phages were better able to counter the evolution of resistance during the experiment. In all populations, coevolved  $\lambda_{trn}+$  phages, isolated from the same timepoint at which resistance was detected, were better able to

suppress and had higher EOP on partially resistant hosts than their ancestor,  $\lambda_{trn}$ . This was not true for coevolved  $\lambda_{unt}+$  phages, which never gained the ability to suppress resistant hosts. Although the role of phage coevolution in the efficacy of in vivo therapy has yet to be demonstrated, the ability of trained phages to coevolve with and counter host defenses may improve treatment outcomes.

Despite the close relatedness of the phages that we used, the effects of  $\lambda_{trn}$  on the ecological and evolutionary dynamics of the microbial communities was vastly different from  $\lambda_{unt}$ . Flasks with  $\lambda_{unt}$  shifted from top-down (predator controlled) to bottom-up (resource limited) systems where bacterial populations were limited by the availability of glucose in less than 1 d. With  $\lambda_{trn}$ , flasks persisted as top-down systems in which phages suppressed bacterial populations below carrying capacity for several weeks. Moreover, the genetics underlying *E. coli*'s resistance evolution was very different. With untrained phage, bacteria acquired single, large-effect mutations that conferred complete resistance to  $\lambda_{unt}$ . However, with a trained phage, bacteria were constrained to evolve resistance through multiple mutations that each yield only partial



**Fig. 7.** Bacterial densities during 7 d of coculture with different phage genotypes. The data are repeated in different panels to aid visualization of paired comparisons: (A)  $\lambda_{unt}$  and  $\lambda_{trn}$ , (B)  $\lambda_{unt}$  and  $\lambda_{newOmpF+}$ , (C)  $\lambda_{unt}$  and  $\lambda_{newOmpF-}$ , and (D)  $\lambda_{trn}$  and  $\lambda_{newOmpF+}$ . For  $\lambda_{unt}$  and  $\lambda_{trn}$ , lines and symbols represent replicates ( $n = 6$ , each). For  $\lambda_{newOmpF+}$  and  $\lambda_{newOmpF-}$ , the lines and symbols represent different genotypes ( $n = 6$  genotypes, 1 replicate each, see *SI Appendix*, Fig. S9). The dashed line and gray shading denote limit of detection. The significant differences are indicated above days calculated via a Mann-Whitney *U* test (not significant [ns]  $P > 0.05$ ,  $*P = 0.041$ ,  $**P \leq 0.005$ ).

resistance. These observations are fascinating from a basic biology perspective because they show how slight alterations in genomes and the evolutionary history of parasites can change their host's ecology and evolution. From an applied standpoint, these observations provide proof of principle that directed evolution can vastly improve the effectiveness of phage therapeutics. Phage malleability is often lauded as a potential strength of phage therapy, and this is strongly supported by our findings.

Altogether, our results on *E. coli* and phage  $\lambda$  contribute to a small but growing body of work that supports coevolutionary phage training as a means to improve the efficacy of phage therapeutics. Three other studies were also successful at training despite employing divergent coevolutionary training protocols and analyzing different bacteria–phage pairs [*Flavobacterium columnare* and phage FCV1 (23), *E. coli* and phage T7 (48), and *Listeria monocytogenes* and phages LP-048 and LP-125 (49)]. Given publication bias toward positive results, we are unable to conclude how generalizable phage training is; however, we hope that this work will inspire new training efforts. The next phase of research will need to include clinically relevant bacterial strains and be performed in animal infection models that better mimic human infection conditions. Our work can be used to improve these phage training efforts by offering guidance on the types of mechanisms that focus phage adaptation toward enhanced therapeutic capacity.

## Materials and Methods

**Strains.** To study the effects of phage training on bacteria–phage coevolutionary dynamics, we used *E. coli* B strain REL606, as well as untrained ( $\lambda_{\text{unt}}$ ) and trained ( $\lambda_{\text{trn}}$ ) strains of phage  $\lambda$ . For  $\lambda_{\text{unt}}$ , we used phage  $\lambda_{\text{cl26}}$ , a strictly lytic form of  $\lambda$  that has been characterized and compared with the  $\lambda$  reference genome by Meyer et al. (26). For  $\lambda_{\text{trn}}$ , we used phage  $\lambda_{\text{28-11}}$ , a descendant of  $\lambda_{\text{cl26}}$  that was isolated from a plaque after coevolving with REL606 for 28 d (26, 27). Notably,  $\lambda_{\text{trn}}$  can infect through the native  $\lambda$  receptor, LamB, as well as another receptor, OmpF. We consider  $\lambda_{\text{trn}}$  trained because it has previously coevolved with host REL606. *SI Appendix, Table S1* shows genetic comparisons between  $\lambda_{\text{trn}}$  and  $\lambda_{\text{unt}}$ .

**Bacterial Suppression Experiment.** To determine whether trained ( $\lambda_{\text{trn}}$ ) phages would better suppress REL606 than untrained ( $\lambda_{\text{unt}}$ ) phages, we inoculated six replicate 50-mL flasks with 10 mL modified M9-G (recipe in ref. 26) and  $\sim 10^4$  cells. Of these flasks, three were inoculated with  $\sim 10^8$  particles of  $\lambda_{\text{unt}}$  and three with  $\sim 10^7$  particles of  $\lambda_{\text{trn}}$ . Flasks were incubated at 37 °C, shaking at 120 rpm. After 24 h, 100  $\mu\text{L}$  of each community was transferred into new flasks with 10 mL of fresh media. Flasks were propagated for 30 d. Each day, aliquots were removed to estimate bacterial and phage densities, as well as to preserve communities for later analyses. For bacteria, aliquots were diluted in M9-G with 0.01 M sodium citrate and plated on Luria–Bertani (LB) agar. For phages, 1-mL aliquots were treated with chloroform (5% vol/vol) and centrifuged (1 min at 15,000  $\times g$ ) to extract lysates. Then, lysates were diluted in M9-G, and 2- $\mu\text{L}$  aliquots were spotted on infused soft agar [LB agar except with 0.8% wt/wt agar and inoculated with  $\sim 10^8$  cells REL606 (26)]. Lastly, starting on day 3, aliquots were preserved by freezing at  $-80$  °C in 15% vol/vol glycerol.

**Bacterial and Phage Isolation.** To isolate bacteria, scrapes ( $\sim 2$   $\mu\text{L}$ ) of preserved, frozen communities were streaked on LB agar plates and incubated overnight at 37 °C. Then, colonies were isolated and streaked twice more to obtain clonal strains cleaned of phage. Strains were grown overnight at 37 °C in M9-G and preserved by freezing. To isolate phages, scrapes of ice were suspended in tubes with 1 mL of M9-G. Then, 10  $\mu\text{L}$  was inoculated in molten-infused ( $\sim 55$  °C) soft agar, poured over LB agar plates, and incubated overnight at 37 °C. From these plates, plaques were isolated and plated in infused soft agar two more times. Then, plaques were picked into tubes with 4 mL of M9-G and  $\sim 10^8$  cells REL606 and incubated overnight at 37 °C. Lastly, lysates were extracted and preserved as described above.

**Emergence of Resistance.** To determine when resistance evolved to  $\lambda_{\text{unt}}$  and  $\lambda_{\text{trn}}$ , we used 12 bacterial isolates from each community across various days of the coevolution experiment. We conducted resistance assays in liquid using 96-well plates and a plate reader (Tecan Sunrise). For each isolate, overnight cultures in LB were diluted and  $\sim 10^3$  cells inoculated into wells containing either 200  $\mu\text{L}$  of LBM9 or 150  $\mu\text{L}$  of LBM9 with 50  $\mu\text{L}$  of 0.22  $\mu\text{m}$

filtered lysate prepared in LBM9 ( $\sim 10^8$  phage particles, recipe in ref. 28). OD at wavelength 600 nm was read from plates over 20 h of incubation, shaking at 37 °C. We used LBM9 instead of M9-G for plate reader assays because experiments in M9-G were unable to distinguish between sensitivity and resistance against  $\lambda_{\text{unt}}$ . In M9-G, the native  $\lambda$  receptor, LamB, is down-regulated, and  $\lambda_{\text{unt}}$  does not adsorb to nor kill cells efficiently (50, 51). In contrast, LBM9 allowed us to distinguish sensitive, partial, and complete resistance.

**Estimating Resistance Mutation Rate.** To estimate REL606's mutation rate for resistance ( $\mu_r$ ) against  $\lambda_{\text{unt}}$  and  $\lambda_{\text{trn}}$ , we conducted Luria–Delbrück fluctuation tests in liquid culture. REL606 was grown in LB overnight, diluted, inoculated into independent isogenic cultures ( $\sim 10^3$  cells per well) in a 96-well plate, and grown again overnight. Cultures were diluted and 10  $\mu\text{L}$  inoculated into a new plate with 150  $\mu\text{L}$  of LBM9 and 50  $\mu\text{L}$  of filtered LBM9 lysate ( $\sim 10^8$  phage particles) in each well. To estimate  $\mu_r$  to  $\lambda_{\text{unt}}$ , fluctuation tests were conducted with  $10^4$ - and  $10^5$ -cell inoculums. To estimate  $\mu_r$  to  $\lambda_{\text{trn}}$ , we used  $10^7$ -cell inoculums. Plates were read for 20 h while shaking at 37 °C. Wells with no observable growth were deemed sensitive. The  $P_0$  method ( $P_0 = e^{-\mu_r N}$ ) was used to calculate  $\mu_r$ , where  $P_0$  is the proportion of wells that were sensitive,  $N$  is the number of cells inoculated in each well, and  $N_0$  is the number of cells used to start cultures ( $\sim 10^3$  cells). To screen for false positives, bacteria were isolated from wells showing resistance and tested in 96-well plates as described above.

**Bacterial and Phage Genomics.** To extract genomes, bacteria were streaked from frozen stocks onto LB agar and incubated overnight. Colonies were picked into respective growth media (M9-G for coevolution and LB for fluctuation test), incubated overnight, and genomes were extracted using an Invitrogen PureLink Genomic DNA Mini Kit. For phages, lysates were prepared by incubating  $\sim 2$   $\mu\text{L}$  from frozen stocks with  $\sim 10^8$  cells of REL606 overnight in M9-G and then extracted using 0.22- $\mu\text{m}$  filters. To extract genomes, 500  $\mu\text{L}$  of lysate was transferred to 1.5-mL microcentrifuge tubes with 50  $\mu\text{L}$  of DNase buffer (10 $\times$ ), 10 U of DNase I, and 1  $\mu\text{L}$  of 100 mg/mL RNaseA and incubated for 30 min at room temperature. Then, 20  $\mu\text{L}$  of 0.5 M ethylenediaminetetraacetic acid (EDTA), 2.5 U of proteinase K, and 25  $\mu\text{L}$  of 10% sodium dodecyl sulfate (SDS) were added and tubes incubated at 55 °C for 1 h. Lastly, phenol chloroform extractions were conducted to purify the phage DNA (52). The resulting supernatant and an equal volume of 100% EtOH were added to spin columns from a Purelink Genomic DNA Mini Kit and then washed and eluted according to the manufacturer's instructions. Finally, extracted bacterial and phage genomes were sent to the Microbial Genome Sequencing Center where they were indexed and sequenced on an Illumina NextSeq. 550. Sequences were analyzed using *breseq* (version 0.35.0), a computational pipeline for analyzing short-read resequencing data (34).

**Genetics of Resistance.** To investigate the relationship between the number of resistance mutations and the level of resistance in bacterial isolates, we first identified resistance mutations as those occurring in genes that are involved in  $\lambda$  infection or that evolved in multiple populations, fluctuation tests, or previous coevolution experiments. Then, we created a scale indicative of resistance by taking the difference in OD trajectories of bacterial cultures growing without and with phage and conducting PCA on these OD difference vectors in R version 3.6.1 (53). PCA revealed that PC1 explained 92.25% of the variance and discriminated between sensitive, partial, and complete resistance along a continuous scale. Using PC1 values as resistance scores, we used R to implement linear models (PC1  $\sim$  number of resistance mutations) testing the relationship between mutations and resistance against each phage.

**Costs of Phage Resistance.** Competitions were conducted between coevolved bacterial isolates and an *ara+*-marked REL606 ancestor. To obtain the marked ancestor,  $\sim 10^8$  cells of REL606 (*ara-*) were plated on minimal-arabinose agar plates (5.34 g potassium phosphate dibasic anhydrous, 2 g potassium phosphate monobasic anhydrous, 1 g ammonium sulfate, 0.57 g sodium citrate dihydrate, 16 g agar, 4 g arabinose per liter of water, and supplemented to a final concentration of 1 mM magnesium sulfate, 0.0002% wt/vol thiamine, and 0.0002% wt/vol biotin). After 2 d of incubation at 37 °C, colonies were picked and streaked twice on tetrazolium-arabinose–indicator agar (Tet-*ara*) plates (10 g tryptone, 1 g yeast extract, 5 g sodium chloride, 16 g agar, 10 g arabinose per liter of water, and supplemented to a final concentration of 0.005% triphenyl tetrazolium chloride [TTC] indicator dye) to confirm marker presence and obtain isogenic stocks. To initiate competitions, colonies on Tet-*ara* plates were picked and incubated for 24 h as in the coevolution experiment. The next day, coevolved strains and the marked competitor were inoculated 1:9 or 1:99 to a



final volume of 100  $\mu$ L in fresh media. Upon inoculation, flasks were mixed, and an aliquot was diluted and plated on Tet-ara plates to enumerate initial densities ( $T_0$ ) of each strain. After competing at 37  $^{\circ}$ C for 24 h, aliquots were again diluted and plated on Tet-ara plates for final densities ( $T_F$ ). Finally, relative fitness ( $W$ ) was calculated for each strain where  $W = M_A / M_B$  and where  $M_A = \ln [T_F / T_0]$  of the coevolved strain and  $M_B = \ln [T_F / T_0]$  of the marked ancestor.

**Phage Adaptation and Suppression of Resistance.** First, coevolved phages were isolated from frozen communities as described above. Then, plate reader experiments were conducted as described in *Emergence of Resistance* except with the following changes: phage lysates were prepared on REL606, but 96-well plates were inoculated with representative resistant bacteria. Ancestral ( $\lambda$ unt and  $\lambda$ trn) and coevolved phages ( $\lambda$ unt+ and  $\lambda$ trn+) were inoculated at various dilutions and were also enumerated by spotting 2  $\mu$ L of the lysate dilution series on soft agar plates infused with REL606 in quadruplicate. Then, PCA was conducted on OD growth trajectories of bacteria–phage cocultures where phage inoculum densities were not significantly different between treatments. We also spotted 2  $\mu$ L of the dilution series on resistant isolates to calculate EOP on resistant hosts where  $EOP = [\text{titer on resistant host}] / [\text{titer on REL606}]$ .

**Phage Adaptation via Recombination.** We constructed four-phage strains from  $\lambda$ unt with pre- and postrecombination  $J$  alleles, both with and without a *lacZ* genetic marker, in order to isolate the effect of the  $J$  mutations. Using a previously constructed phylogeny of the experiment in which the recombination evolved (27), we determined that the recombination occurred within a  $J$  allele that had already evolved seven mutations (C2999T, A3034G, T3230C, C3310T, G3319A, T3321A, and A3364T). Therefore, we constructed alleles with these seven mutations with and without the recombination. Fortunately, the seven mutations do not overlap with the recombination, so we were able to PCR amplify DNA fragments with either the seven mutations or the entire gene using the primers in *SI Appendix, Table S2*. These fragments were ligated into a plasmid using an Invitrogen TA Cloning Kit, and the plasmids were used to transform *E. coli* DH5- $\alpha$ .  $\lambda$ unt was modified by infecting these cells and then screening for particles that could use the nonnative *OmpF* receptor as a result of incorporating the  $J$  alleles from the plasmid. We constructed two independent versions of each phage genotype and the incorporation of the desired alleles was sequence verified. Next, we added a *lacZ* genetic marker which causes the phage to produce blue

plaques (54, 55). Head-to-head competitions were performed in conditions identical to the original evolution experiment (26). Competitions for three different hosts were evaluated: wild type (REL606), *malT*<sup>-</sup> (REL606 with a 25-bp duplication in *malT*), and *malT*<sup>-</sup> *ompF*<sup>-</sup> (*malT*<sup>-</sup> with a single base substitution resulting in an amino acid change [N52K] in *ompF* [full genome in ref. 26]). Four replicates were performed for each competition. Half of the competitions were conducted with prerecombination genotypes marked with *lacZ* and the other half with the postrecombination genotype marked. Each flask was initiated with  $\sim 10^6$  particles of each  $\lambda$  genotype and  $\sim 10^8$  cells. Initial and final phage densities were enumerated by counting plates on X-gal agar indicator plates (recipe in ref. 54).

**Repeatability of Phage Training.** New trained phages were isolated from the last day of a previous coevolution experiment (26) that was run for 20 d under identical conditions as the experiment where  $\lambda$ trn evolved. We selected phages from six replicates where phages were previously found to gain *OmpF* use in addition to *LamB* ( $\lambda$ .newOmpF+) and six phages from unique replicates where the  $\lambda$ s remained reliant on *LamB* ( $\lambda$ .newOmpF-). We verified their phenotypes by plating the phages with cells lacking *LamB*. The experiment was set up identically to the *Bacterial Suppression Experiment* except with the following phage treatments: six replicate flasks of  $\lambda$ unt, six replicates of  $\lambda$ trn, and a single replicate of each new trained phage ( $n = 24$  total flasks). The experiment was run for 7 d, and bacterial densities were measured daily by enumerating colonies on LB plates. New trained phages were Sanger sequenced by PCR amplifying  $J$  from plaques (primers in *SI Appendix, Table S2*) and sequencing using the reverse primer ( $J$  positions 2,500 to 3,399).

**Data Availability.** Data and code are available, and raw sequencing reads data have been deposited in GitHub (<https://github.com/joshborin/CoevolPhage-Training>) and the National Center for Biotechnology Information Sequence Read Archive (Accession no. PRJNA675654).

**ACKNOWLEDGMENTS.** We thank members Sarah Medina and Elijah Horwitz of the J.R.M. laboratory for productive discussions and feedback on this study. This work was supported by the United States–Israel Binational Science Foundation (Grant 2017056), the NIH Grant R01 (Grant GM088344), the Chris Wills Endowed Graduate Student Research Award, and the NIH Cell and Molecular Genetic Training Program (Grant T32GM007240).

- Interagency Coordination Group on Antimicrobial Resistance, “No time to wait: Securing the future from drug-resistant infections. Report to the secretary-general of the United Nations” (Geneva, World Health Organization, 2019).
- S. B. Levy, B. Marshall, Antibacterial resistance worldwide: Causes, challenges and responses. *Nat. Med.* **10**, S122–S129 (2004).
- J. Davies, D. Davies, Origins and evolution of antibiotic resistance. *Microbiol. Mol. Biol. Rev.* **74**, 417–433 (2010).
- X. X. Zhang, T. Zhang, H. H. Fang, Antibiotic resistance genes in water environment. *Appl. Microbiol. Biotechnol.* **82**, 397–414 (2009).
- M. A. Cooper, D. Shlaes, Fix the antibiotics pipeline. *Nature* **472**, 32 (2011).
- R. Tommasi, D. G. Brown, G. K. Walkup, J. I. Manchester, A. A. Miller, ESKAPEing the labyrinth of antibacterial discovery. *Nat. Rev. Drug Discov.* **14**, 529–542 (2015).
- K. E. Kortright, B. K. Chan, J. L. Koff, P. E. Turner, Phage therapy: A renewed approach to combat antibiotic resistant bacteria. *Cell Host Microbe* **25**, 219–232 (2019).
- R. T. Schooley, S. Strathdee, Treat phage like living antibiotics. *Nat. Microbiol.* **5**, 391–392 (2020).
- R. T. Schooley *et al.*, Development and use of personalized bacteriophage-based therapeutic cocktails to treat a patient with a disseminated resistant *Acinetobacter baumannii* infection. *Antimicrob. Agents Chemother.* **61**, e00954-17 (2017).
- R. M. Dedrick *et al.*, Engineered bacteriophages for treatment of a patient with a disseminated drug-resistant *Mycobacterium abscessus*. *Nat. Med.* **25**, 730–733 (2019).
- S. Aslam *et al.*, Early clinical experience of bacteriophage therapy in 3 lung transplant recipients. *Am. J. Transplant.* **19**, 2631–2639 (2019).
- C. Torres-Barceló, Phage therapy faces evolutionary challenges. *Viruses* **10**, 323 (2018).
- B. K. Chan *et al.*, Phage treatment of an aortic graft infected with *Pseudomonas aeruginosa*. *Evol. Med. Public Health* **2018**, 60–66 (2018).
- F. Oechslin, Resistance development to bacteriophages occurring during bacteriophage therapy. *Viruses* **10**, 351 (2018).
- J. E. LeClerc, B. Li, W. L. Payne, T. A. Cebula, High mutation frequencies among *Escherichia coli* and *Salmonella* pathogens. *Science* **274**, 1208–1211 (1996).
- A. Oliver, R. Cantón, P. Campo, F. Baquero, J. Blázquez, High frequency of hypermutable *Pseudomonas aeruginosa* in cystic fibrosis lung infection. *Science* **288**, 1251–1254 (2000).
- S. E. Luria, M. Delbrück, Mutations of bacteria from virus sensitivity to virus resistance. *Genetics* **28**, 491–511 (1943).
- R. C. T. Wright, V. P. Friman, M. C. M. Smith, M. A. Brockhurst, Cross-resistance is modular in bacteria–phage interactions. *PLoS Biol.* **16**, e2006057 (2018).
- F. Rohwer, M. Youle, H. Maughan, N. Hisakawa, *Life in Our Phage World: A Centennial Field Guide to the Earth’s Most Diverse Inhabitants* (Wholon, 2015).
- B. H. Burrowes, I. J. Molineux, J. A. Fralick, Directed in vitro evolution of therapeutic bacteriophages: The Appelmans protocol. *Viruses* **11**, 241 (2019).
- Y. Yang *et al.*, Development of a bacteriophage cocktail to constrain the emergence of phage-resistant *Pseudomonas aeruginosa*. *Front. Microbiol.* **11**, 327 (2020).
- C. Rohde *et al.*, Expert opinion on three phage therapy related topics: Bacterial phage resistance, phage training, and prophages in bacterial production strains. *Viruses* **10**, 178 (2018).
- E. Laanto, K. Mäkelä, V. Hoikkala, J. J. Rantavirta, L. R. Sundberg, Adapting a phage to combat phage resistance. *Antibiotics (Basel)* **9**, 291 (2020).
- M. E. Woolhouse, J. P. Webster, E. Domingo, B. Charlesworth, B. R. Levin, Biological and biomedical implications of the co-evolution of pathogens and their hosts. *Nat. Genet.* **32**, 569–577 (2002).
- A. R. Hall, P. D. Scanlan, A. D. Morgan, A. Buckling, Host–parasite coevolutionary arms races give way to fluctuating selection. *Ecol. Lett.* **14**, 635–642 (2011).
- J. R. Meyer *et al.*, Repeatability and contingency in the evolution of a key innovation in phage lambda. *Science* **335**, 428–432 (2012).
- A. Gupta *et al.*, Leapfrog dynamics in phage–bacteria coevolution revealed by joint analysis of cross-infection phenotypes and whole genome sequencing. *bioRxiv* [Preprint] (2020). <https://doi.org/10.1101/2020.10.31.337758> (Accessed 2 November 2020).
- J. R. Meyer *et al.*, Ecological speciation of bacteriophage lambda in allopatry and sympatry. *Science* **354**, 1301–1304 (2016).
- K. L. Petrie *et al.*, Destabilizing mutations encode nongenetic variation that drives evolutionary innovation. *Science* **359**, 1542–1545 (2018).
- A. Buckling, P. B. Rainey, Antagonistic coevolution between a bacterium and a bacteriophage. *Proc. Biol. Sci.* **269**, 931–936 (2002).
- B. J. Bohannan, R. E. Lenski, Linking genetic change to community evolution: Insights from studies of bacteria and bacteriophage. *Ecol. Lett.* **3**, 362–377 (2000).
- W. N. Chaudhry *et al.*, Leaky resistance and the conditions for the existence of lytic bacteriophage. *PLoS Biol.* **16**, e2005971 (2018).
- W. A. Rosche, P. L. Foster, Determining mutation rates in bacterial populations. *Methods* **20**, 4–17 (2000).
- D. E. Deatherage, J. E. Barrick, “Identification of mutations in the laboratory-evolved microbes from next-generation sequencing data using breseq” in *Engineering and Analyzing Multicellular Systems*, L. Sun, W. Shou, Eds. (Humana Press, New York, NY, 2014), pp. 165–188.

35. M. Zylcz, D. Ang, K. Liberek, C. Georgopoulos, Initiation of lambda DNA replication with purified host- and bacteriophage-encoded proteins: The role of the dnaK, dnaJ and grpE heat shock proteins. *EMBO J.* **8**, 1601–1608 (1989).
36. C. Pagnout et al., Pleiotropic effects of rfa-gene mutations on Escherichia coli envelope properties. *Sci. Rep.* **9**, 9696 (2019).
37. C. Roncero, M. J. Casadaban, Genetic analysis of the genes involved in synthesis of the lipopolysaccharide core in Escherichia coli K-12: Three operons in the rfa locus. *J. Bacteriol.* **174**, 3250–3260 (1992).
38. W. Banzhaf et al., *Evolution in Action: Past, Present and Future* (Springer, 2020).
39. B. Andrews, S. Fields, Distinct patterns of mutational sensitivity for  $\lambda$  resistance and maltodextrin transport in *Escherichia coli* LamB. *Microb. Genom.* **6**, e000364 (2020).
40. S. Casjens, Prophages and bacterial genomics: What have we learned so far? *Mol. Microbiol.* **49**, 277–300 (2003).
41. R. J. Juhala et al., Genomic sequences of bacteriophages HK97 and HK022: Pervasive genetic mosaicism in the lambdoid bacteriophages. *J. Mol. Biol.* **299**, 27–51 (2000).
42. H. Zhang, D. E. Fouts, J. DePew, R. H. Stevens, Genetic modifications to temperate Enterococcus faecalis phage Ef11 that abolish the establishment of lysogeny and sensitivity to repressor, and increase host range and productivity of lytic infection. *Microbiology (Reading)* **159**, 1023–1035 (2013).
43. R. Monteiro, D. P. Pires, A. R. Costa, J. Azeredo, Phage therapy: Going temperate? *Trends Microbiol.* **27**, 368–378 (2019).
44. K. E. Kortright, B. K. Chan, P. E. Turner, High-throughput discovery of phage receptors using transposon insertion sequencing of bacteria. *Proc. Natl. Acad. Sci. U.S.A.* **117**, 18670–18679 (2020).
45. K. Yehl et al., Engineering phage host-range and suppressing bacterial resistance through phage tail fiber mutagenesis. *Cell* **179**, 459–469.e9 (2019).
46. M. Dunne et al., Reprogramming bacteriophage host range through structure-guided design of chimeric receptor binding proteins. *Cell Rep.* **29**, 1336–1350.e4 (2019).
47. D. R. Roach et al., Synergy between the host immune system and bacteriophage is essential for successful phage therapy against an acute respiratory pathogen. *Cell Host Microbe* **22**, 38–47.e4 (2017).
48. E. Monferrer, P. Domingo Calap, Virus-host coevolution as a tool for controlling bacterial resistance to phage therapy. *J. Biotech. Biomed.* **2**, 096–104 (2019).
49. T. L. Peters, Y. Song, D. W. Bryan, L. K. Hudson, T. G. Denes, Mutant and recombinant phages selected from in vitro coevolution conditions overcome phage-resistant Listeria monocytogenes. *Appl. Environ. Microb.* **86**, e02138-20 (2020).
50. A. Weissbach, F. Jacob, Effect of glucose on the formation of bacteriophage  $\lambda$ . *Nature* **193**, 197–198 (1962).
51. W. V. Howes, Effect of glucose on the capacity of Escherichia coli to be infected by a virulent lambda bacteriophage. *J. Bacteriol.* **90**, 1188–1193 (1965).
52. E. J. Wood, "DNA, RNA, and Protein" in *At the Bench: A Laboratory Navigator*, K. Barker, Ed. (Cold Spring Harbor Laboratory Press, 1998), p. 460.
53. R Development Core Team, *R: A Language and Environment for Statistical Computing* (R Foundation for Statistical Computing, Vienna, 2019).
54. A. R. Burmeister, R. E. Lenski, J. R. Meyer, Host coevolution alters the adaptive landscape of a virus. *Proc. Biol. Sci.* **283**, 20161528 (2016).
55. Y. Shao, I. N. Wang, Bacteriophage adsorption rate and optimal lysis time. *Genetics* **180**, 471–482 (2008).