## Advances in Phage-Assisted Continuous Evolution and Application to Overcoming Bioinsecticide Resistance

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# Advances in Phage-Assisted Continuous Evolution and Application to Overcoming Bioinsecticide Resistance 

A dissertation presented by<br>Ahmed Hussein Badran<br>to

The Committee on Higher Degrees in Chemical Biology in partial fulfillment of the requirements for the degree of

Doctor of Philosophy in the subject of

Chemical Biology

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# Advances in Phage-Assisted Continuous Evolution and Application to Overcoming Bioinsecticide Resistance 


#### Abstract

The Bacillus thuringiensis $\delta$-endotoxins ( Bt toxins) are widely used insecticidal proteins in engineered crops that provide agricultural, economic, and environmental benefits, constituting a substantial and increasingly large portion of the total global production of various crops, including cotton, corn, maize and soybeans. Bt toxins are exquisitely selective for targeted pests, typically do not affect off-target insects, and are completely orthogonal to human biology. However, the development of insect resistance to Bt toxins endangers their longterm effectiveness.

In this thesis, I describe the development of methodology for the systematic directed evolution of novel Bt toxins to selectively affect resistant insects. Using Phage-Assisted Continuous Evolution (PACE), a previously developed general platform for the continuous directed evolution of biomolecules, I developed a highly sensitized selection for novel protein-protein interactions. This system robustly reported on interactions spanning affinities from low micromolar to picomolar. However, attempts at using this system for the directed evolution of novel protein-protein interactions were largely unsuccessful, presumably as a consequence of low mutagenesis efficiency.


To increase the utility of the platform, I sought to enhance the mutagenesis levels afforded by PACE, but current in vivo methods suffer from a lack of control, genomic instability, low efficiency, and narrow mutational spectra. I used a systematic, mechanism-driven approach to create a potent, inducible, broadspectrum, and vector-based mutagenesis system in E. coli that enhances mutation rates by 322,000 -fold over basal levels, surpassing the mutational efficiency and spectra of widely used in vivo and in vitro mutagenesis methods. This system enabled the high-frequency, broad-spectrum mutagenesis of chromosomal, episomal, and viral nucleic acids in vivo, and dramatically enhanced the success of PACE experiments, highlighting the importance of mutagenesis efficiency on selection outcome.

Using this enhanced mutagenesis approach and the previously described sensitized selection platform, I was able to evolve variants of the commonly used Bt toxin Cry1Ac that bind toxin binding region of a cadherin-like receptor from the insect pest Trichoplusia ni (TnCAD) that is not targeted by wild-type CrylAc. The resulting evolved Cry1Ac variants bind TnCAD with high affinity $\left(\mathrm{K}_{\mathrm{d}}=11-\right.$ 41 nM ), kill TnCAD-expressing insect cells that are not susceptible to wild-type Cry1Ac, and kill Cry1Ac-resistant T. ni insects up to 335-fold more potently than wild-type Cry1Ac. Our findings establish that the evolution of Bt toxins with novel insect cell receptor affinity can overcome Bt toxin resistance in insects and confer lethality approaching that of the wild-type Bt toxin against non-resistant insects.

In conclusion, these finding offer a novel mechanism of overcoming what is quickly becoming among the largest issue overshadowing the continued success of Bt toxins for pest control and management, and establish a platform for the detection and evolution of a wide array of protein-protein interactions.

Dedicated to my parents, Hussein and Eman.

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The research described in this thesis is the culmination of many years of collaboration with researchers from various disciplines and diverse backgrounds. The contributions presented herein would not have been possible without their support and hard work.

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## Chapter 1

Introduction to In Vivo Continuous Directed Evolution
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## 1.1 - Introduction: in vitro and in vivo continuous directed evolution

Initially demonstrated as a surrogate for Darwinian evolution by Spiegelman and coworkers almost five decades ago ${ }^{1}$, continuous directed evolution has long been envisioned as a potentially highly efficient method to discover novel biomolecules with activities of interest. In Spiegelman's seminal study, $\mathrm{Q} \beta$ bacteriophage genomic RNA was amplified based on its ability to serve as a substrate for purified Q $\beta$ RNA-dependent RNA-replicase. After 74 serial passages of this RNA genome, a variant was produced that was both $83 \%$ smaller and could be replicated 15 times faster than the starting Q $\beta$ RNA genome. Importantly, this study highlighted the critical nature of selection pressure design, as the evolved $\mathrm{Q} \beta$ RNA genome could be replicated at a significantly faster rate than the parental genome, but could no longer direct the synthesis of viral particles since this requirement was not implicit in the selection.

Thirty years later, Joyce and coworkers described the first system for the continuous directed evolution of catalytic function. The researchers established a selfsustaining RNA replication cycle for RNA molecules capable of catalyzing their own ligation to an RNA-DNA substrate ${ }^{2}$. Like the $\mathrm{Q} \beta$ system, the RNA ligase ribozyme continuous evolution system relied on exogenously supplied materials (reverse transcriptase and T7 RNA polymerase). Since these early studies, a number of additional continuous directed evolution systems have been described, the majority of which are limited to either catalytic RNAs or involve the evolution of alternative RNA functions ${ }^{2-7}$. Additionally, these methods have been exclusively carried out in vitro, where the comparative ease of manipulation and selection stringency adjustment can be exploited compared to in vivo methods. Nevertheless, these early landmark studies vividly
demonstrated the potential of continuous directed evolution and provided a foundation for subsequent advances.

All forms of Darwinian evolution must support four fundamental processes: translation (when the evolving molecule is not identical to the information carrier), selection, replication, and mutation (Figure 1.1). Traditional directed evolution methods handle each of these processes discretely, frequently requiring steps in which the researcher must perform experimental manipulations. In contrast, continuous directed evolution systems must seamlessly integrate all of these processes into an uninterrupted cycle. For the purposes of this review, we define continuous directed evolution as a general method capable of evolving a specific phenotype, at the level of an organism or a set of genes, over many cycles of mutation, selection, and replication with minimal researcher intervention. A continuous evolution method therefore must support all four stages of Darwinian evolution and allow the surviving genes from one generation to


Figure 1.1 | Schematic representation of directed evolution. All complete directed evolution methods must provide four major components: translation, selection or screening, replication, and mutation. Historical examples of each of these components are listed. Techniques that are particularly amenable to in vivo continuous evolution are shown in green.
spontaneously enter the translation, selection, replication, and mutation processes of the subsequent generation.

Many key studies on continuous evolution have relied on manual serial dilution of the evolving population as a mechanism for propagating genes and controlling selection stringency. We do not consider this technical manipulation to violate our definition, as such systems have been shown to be amenable to automation, yielding similar results ${ }^{8}$. While in vivo continuous evolution methods have exploited the natural occurrence of the three steps of Darwinian evolution in living organisms, these methods have also historically been constrained by modest scope, often focusing on easily selected phenotypes such as antibiotic resistance rather than traits associated with diverse applications and unmet needs. Recently, more general in vivo continuous directed evolution methods have been developed using various organisms, ranging from viruses to bacteria to higher eukaryotes. In this review, we highlight a sampling of recent developments in the field of in vivo continuous directed evolution over the past two decades and their impact, both realized and prospective, on the directed evolution community.

## 1.2 - Viral Continuous Evolution

With their high mutation rates ${ }^{9}$ and relative ease of manipulation and study, bacteriophages were used early on as model organisms for rapid directed evolution of readily selectable traits ${ }^{10}$. Moreover, the development of methods for continually culturing bacterial strains has greatly reduced the barrier for studying bacteriophage evolution under continuous selection pressure ${ }^{10,11}$. Of historical note is the early and
widespread use of both chemostats, cultures maintained through the continuous inflow of fresh growth medium, and auxostats, cultures regulated by a feedback mechanism that controls the inflow of growth medium based on a monitored culture parameter (Figure
1.2). Both methods have proven useful in continuous culturing of bacteriophageinfectable microbes. Methods for bacterial continuous evolution will be covered in the next section.

Among the earliest examples of viral continuous evolution is the 1997 work of Molineux and coworkers using $\Phi X 174$, a bacteriophage capable of propagating using $E$.


Figure 1.2 | Typical auxostats and chemostats. Fresh culture medium is pumped into a pre-sterilized container containing the microorganism of interest. Medium with cells is pumped out of the culture container. The rates of medium input and output are held constant in a chemostat system, and the growth rate is regulated by the composition of the medium. In an auxostat system, the medium flow rates are dynamically regulated by a controller in response to measurements made in the growing culture, which correspond directly (turbidity meter) or indirectly (other sensors) to the culture density. In schemes for viral continuous evolution, the auxostat or chemostat culture is pumped into a new vessel where the virus of interest is supplied (cellstat). Both cultures can be supplemented with additives supplied through a dedicated inlet. Selection stringency can be regulated by varying flow rates, changing temperature, or adding compounds to the auxostat, chemostat or cellstat. The depleted medium, cells and virus are pumped to a waste container.
coli or S. typhimurium ${ }^{12,13}$. These studies highlighted the ability of this phage to rapidly adjust to novel environments such as higher temperatures, as well as an abnormally high degree of mutational convergence depending on selection conditions. Additionally, substantial improvements in phage fitness were observed over relatively short time frames, with an average of 1-2 mutations per 24 hours (corresponding to $0.2-0.5 \%$ of the viral genome, and 0.003-0.005 mutations per generation per kilobase) in the absence of any added mutagens. In an expansion of this work by Bull and coworkers, $\Phi$ X174 phage was propagated on bacterial hosts under native conditions for six months, corresponding to $\sim 13,000$ phage generations ${ }^{14}$. Mutations continued to accumulate at a constant rate for the majority of the experiment, suggesting a potential arms race within the propagating phage pool. The researchers speculated that this arms race was driven by the high concentration of phage with respect to host cells, resulting in high levels of co-infection and competition between phage. While the mutation rates observed under these conditions were high with respect to the size of the viral genome and sufficient for rapid phage adaptation, higher rates are typically required to access gene-specific evolution goals (1-2 mutations per round per gene) ${ }^{15}$.

Similar phage propagation experiments were carried out by Molineux and coworkers using bacteriophage T 7 to study organismal phylogenetic histories ${ }^{16}$. To enhance the mutation rate, T 7 phage was serially passaged in the presence of the chemical mutagen MNNG ( $N$-methyl- $N^{\prime}$-nitro- $N^{\prime}$ '-nitrosoguanidine), resulting in variants with differential restriction enzyme cleavage patterns than the wild-type phage. The correct phylogeny of the diverging phage populations could be determined using these cleavage patterns, supporting their method for phylogenetic reconstruction and
suggesting maximization of parsimony as a promising method for determining ancestral characteristics. While this approach addressed the need for high mutagenesis rates during evolution, the selection was highly qualitative, requiring the accumulation of nondeleterious mutations that enabled restriction enzyme profiling. A similar strategy was later used by the same group to study the effects of successive severe population bottlenecking and expansion on viral fitness, demonstrating the remarkable plasticity of the T7 genome towards mutations and the interdependence of the accumulated mutations in specific phage linages ${ }^{17}$. These studies also highlight the utility of user-defined mutagenesis rates in continuous directed evolution, although chemical mutagens generally offer narrow mutational spectra and are potent carcinogens.

Recently, T7 phage was used by Barrick and coworkers to study organismal adaptation to an expanded genetic code ${ }^{18}$. Two versions of this phage, wild-type T 7 and the $\Delta 2 \mathrm{~T} 7$ hypermutator, were serially propagated using an E. coli strain capable of efficiently incorporating 3-iodotyrosine at amber stop codons. The use of a genetically encodable hypermutator resulted in broad mutational load to the T7 phage without the hazards typically associated with alternative chemical mutagens. Notably, two amber codon substitutions reached high frequencies in the evolving populations: Tyr88Amber in T7 RNA polymerase (T7 RNAP) and Tyr39Amber in T7 type II holin. Whereas the mutation in the RNAP was assumed to be tolerated due to a lack of interaction of this surface-exposed side chain with the remainder of the protein, the mutation in the type II holin was shown to be critical for function in the amber suppressor strain. The findings of this study suggest that an expanded genetic code may increase the evolvability of an organism.

Lambda bacteriophage has been used extensively to study host-virus interactions. Lambda phage natively recognizes LamB as the main point of entry into E. coli. Using a strictly lytic lambda phage, Lenski and coworkers studied the ability of this phage to continuously evolve the ability to use alternative outer membrane receptors as the point of entry ${ }^{19}$. Upon co-culturing this phage with host cells in glucose-limited conditions, the bacteria rapidly evolved resistance through downregulation of lam $B$ expression. The mutating pool of lambda phage then evolved compensatory mutations in the LamB recognition protein J , resulting in improved fitness on LamB, as well as facilitating the use a new receptor, OmpF . In response, the $E$. coli host reduced fitness of the mutant lambda phage through mutations to man $Y Z$, two proteins that form an inner membrane channel required for lambda phage entry. This coevolution highlights the utility of continuous evolution methods in revealing the dynamic interplay between host and virus evolution.

While these systems have enhanced our understanding of fundamental aspects of evolution, they generally are limited by an uncontrolled (usually low) mutagenesis rate intrinsic to the bacteriophage and host, and/or the requirement for broad organismal adaptation to an environmental challenge, rather than enabling the evolution of a specific biomolecular activity of interest. Our group has developed a bacteriophage-based continuous evolution system that attempts to address these two limitations. Phageassisted continuous evolution (PACE) is a general system for the directed evolution of biomolecules that relies on previously discussed methods for the continued culturing of E. coli, can be used to evolve, in principle, any activity that can be coupled to gene transcription in E. coli, and allows real-time modulation of selection stringency and
mutagenesis levels ${ }^{20}$.
Briefly, PACE takes advantage of the critical role of the minor coat protein pIII from the filamentous bacteriophage M13 during both infection and progeny release ${ }^{21}$. Phage lacking functional pIII have virtually no ability to propagate and are rapidly lost under continuous culturing conditions. However, host cell-provided pIII restores the virulence of the phage and allows robust phage propagation in continuous culture. Accordingly, phage-borne genes encoding the ability to trigger pIII in host cells gain a fitness advantage and propagate at the expense of unfit phage. To increase the mutation rate during PACE, an inducible plasmid driving the expression of error-prone E. coli polymerase subunits results in $\sim 100$-fold increased mutagenesis with a more-uniform distribution of mutations as compared to traditional chemical mutagens ${ }^{20}$. Due to the continuous flow nature of this system, mutations accumulate only within the phage genome and the gene to be evolved, reducing the likelihood of "cheaters" overtaking the population during selection.

PACE was initially used to evolve novel activity in T7 RNAP ${ }^{20}$. Whereas T7 RNAP efficiently initiates transcription using the native T7 promoter, it lacks detectable activity on the related T 3 promoter. Using a combined $\mathrm{T} 7 / \mathrm{T} 3$ promoter as an evolutionary stepping-stone, T7 RNAP variants capable of efficiently initiating transcription from the T3 promoter were evolved within a few days. This method has since been expanded to address the effects of varying levels of mutagenesis and selection stringency on enzyme evolution $^{22}$, the path dependence of convergent protein evolution ${ }^{23}$, the effects of neutral drift, negative selection, and stringency modulation on enzyme evolution ${ }^{24}$, and the rapid evolution of protease enzymes from pathogenic viruses that predict how viral proteases
evade clinically relevant antiviral drugs ${ }^{25}$. This system has been further modified to enhance its ability to serve as a basis for alternative selection schemes, and ongoing studies use PACE to mediate the continuous directed evolution of DNA-binding domains, protein-protein interactions, genome modification enzymes, proteases, and other enzymes ${ }^{25}$.

## 1.3 - Bacterial Continuous Evolution

Mechanisms that enable the efficient and unmonitored continuous propagation of bacteria and other microorganisms have served as a key component of many continuous evolution methods. While their utility has been extensively demonstrated for bacteriophage evolution efforts as highlighted in the previous section, these methods have also facilitated the study of continuous directed evolution of bacterial populations, especially in cases where the gene to be evolved is large or cannot be directly coupled to viral fitness. A recent demonstration assesses the evolution of population-wide antibiotic resistance. Using a continuous culture of E. coli, Collins and coworkers added increasing concentrations of the antibiotic norfloxacin to study population dynamics during increasing antibiotic selection pressure ${ }^{26}$. Surprisingly, the researchers found that single members of the population were, on average, less resistant to the antibiotic than the population as a whole. Additionally, resistant members were found to produce high levels of indole, a signaling molecule used by the surrounding, less resistant members to induce protective mechanisms against the antibiotic.

In a related study, Kishony and coworkers followed parallel populations of E. coli under differing antibiotic selection pressures using a bacterial culture device termed the
morbidostat ${ }^{27}$. Unlike the previous study in which the concentration of antibiotic is adjusted in 24-hour intervals, the morbidostat continuously adjusts the concentration of the antibiotic to maintain a nearly constant selection pressure (as judged by changes in cell density, thereby making it a variation on the prototypical auxostat). The parallel populations were challenged with different antibiotics, and followed using whole-genome sequencing to assess the nature of the mutations endowing the populations with antibiotic resistance. For chloramphenicol and doxycycline, resistance proceeded through multiple pathways, ultimately resulting in similar levels of antibiotic resistance using different sets of mutations. Conversely, resistance to trimethoprim proceeded through a highly sequential series of mutations in $D H F R$ and its associated promoter in all the parallel populations. Importantly, many resistance mutations that had been previously identified using plate-based methods were not found in this study, highlighting variable fitness costs for some mutations depending on selection conditions, and the stochasticity of evolution under selection conditions for which many potential pathways to increased fitness exist.

For some applications the basal rate of bacterial mutagenesis may not be high enough to provide access to necessary genetic changes on a practical timescale. Methods for the unbiased, yet targeted, mutagenesis of bacteria would dramatically facilitate these applications. An ideal method would require that the evolving gene(s) be replicated by an orthogonal, error-prone polymerase enzyme. One such system uses the E. coli DNA polymerase I (Pol I). Bacteria lacking Pol I are viable, suggesting that manipulation of this polymerase might be tolerated. Loeb and coworkers used previously reported mutations that increase the error rate of Pol I to continuously evolve TEM beta-
lactamases capable of hydrolyzing a third-generation lactam antibiotic, aztreonam ${ }^{28}$. Three serial dilutions of a growing bacterial culture in increasing concentrations of aztreonam strongly enriched clinically relevant TEM mutations. The utility of this technique extends beyond the continuous directed evolution of antibiotic resistance, as it also enables the potent and targeted in vivo mutagenesis of a gene of interest. It should be noted, however, that an inverse relationship exists between the length of the gene of interest and the mutagenesis rate using this system and others that depend on Pol I mutants ${ }^{28,29}$.

Bacterial continuous evolution has also been used to evolve phenotypes other than antibiotic resistance. The E. coli DNA polymerase III epsilon subunit DnaQ is responsible for the proofreading activity of most DNA replication. Dominant-negative variants of DnaQ provided in trans are known to have dramatic consequences on replication fidelity ${ }^{30}$. Integrating these principles, Ma and coworkers constructed a library of $d n a Q$ mutants using error-prone PCR to be expressed constitutively in continuously growing bacterial cultures ${ }^{31}$. Selection pressures in the form of increasing concentrations of $n$-butanol or acetic acid were applied to the growing cultures. Plasmids carrying mutagenic $d n a Q$ variants should be enriched at high concentrations of $n$-butanol or acetic acid because they endow their hosts with the ability to more quickly adapt to the strong selection pressure. Within 24 to 36 days of continuous evolution, the E. coli populations became adapted to the high solvent concentrations. As the researchers predicted, all the dnaQ variants that evolved in surviving cells were more mutagenic than the wildtype $d n a Q$, increased the mutation rate by up to 2,800 -fold, and contained mutations known to dramatically enhance mutagenesis ${ }^{30,31}$.

All of these examples of bacterial continuous evolution rely on the manual passaging of the bacteria being studied, or use an automated variant of a chemostat or auxostat. In either case, biofilm formation can dramatically affect the success of the experiment, as bacteria are known to attach to the culture vessel wall upon extended propagation. To ameliorate this issue, an apparatus dubbed the "GM3 cultivation device" was recently developed to allow the maintenance of steady-state microbial growth over extremely long timeframes (Figure 1.3). This apparatus uses two growth chambers that are cyclically used to culture the microbe of interest, with alternating rounds of chemical


Figure 1.3 | The GM3 cultivation device. A growing culture in the first vessel is supplemented with a defined ratio of relaxing and stressing medium. This ratio is regulated by a controller connected to a turbidity meter measuring cell density. After a defined growth time, the whole culture is transferred to the second vessel to limit selection escape through biofilm formation. Following this transfer, the first vessel is sterilized with 5 M NaOH and washed extensively to limit contamination. After another defined growth period in the second vessel, the growing culture is transferred back to the first vessel, and the cycle is repeated. The selection stringency is modulated through the ratio of the relaxing and stressing media, ultimately reaching up to $100 \%$ stressing medium. The depleted medium and cells are pumped to a waste container.
sterilization that ensure that members of the population do not escape selections for faster growth through biofilm formation.

In one application of the GM3 device, Mutzel and coworkers evolved E. coli containing the large-scale substitution of chromosomal thymine with 5-chlorouracil ${ }^{32}$. The researchers used a thymine auxotroph grown in continuous culture on two types of media: a permissive media with all essential nutrients including thymine, and a selective media of similar composition with the exception of thymine, which was substituted with 5-chlorouracil. To slowly modulate selection stringency they mixed varying ratios of the two media, starting from $100 \%$ thymine-containing media and slowly transitioning to $100 \% 5$-chlorouracil-containing media over six months. By the end of the experiment, strains with a significant number of mutations or chromosomal rearrangements that could grow using 5-chlorouracil were isolated. These strains were capable of incorporating 5chlorouracil at levels up to $90 \%$ of the chromosomal DNA, with the remaining $10 \%$ attributed to thymine. After further optimization, the fraction of chromosomal thymine was reduced to less than $2 \%$ through removal of a cryptic pathway to thymine deoxynucleotide production.

In another application of the same device, Hilvert and coworkers continuously evolved an artificial chorismate mutase enzyme that had been previously designed using a nine-amino-acid code ${ }^{33}$. Chorismate mutase natively converts chorismate to prephenate in the shikimate pathway, a critical step in the biosynthesis of the aromatic amino acids phenylalanine and tyrosine. A strain of E. coli lacking wild-type chorismate mutase and expressing the artificial variant was continuously propagated for more than 200 days, initially in low phenylalanine-containing media and slowly transitioning to media lacking
both phenylalanine and tyrosine. Bacteria carrying improved chorismate mutase mutants grew at a faster rate in the restrictive media, resulting in their enrichment over the course of the experiment. By the end of the experiment, chorismate mutase variants that expanded the nine amino acid code to ten or eleven amino acids could be isolated, and mutants generally had improved activity as compared to the parent. This study suggests that expanded genetic codes can result in improved evolvability, a similar conclusion to those reached by Barrick and coworkers using 3-iodotyrosine incorporation in T7 bacteriophage ${ }^{18}$.

## 1.4 - Eukaryotic Continuous Evolution

Viral and bacterial hosts are not suitable for the directed evolution of biomolecules in certain scenarios. In cases of industrial drug precursor production ${ }^{34}$ or whole-cell biocatalysis ${ }^{35}$, higher organisms with more extensive or relevant biosynthetic pathways may be necessary. Towards this end, continuous directed evolution techniques using eukaryotic organisms have also been developed.

In one of the earliest examples of eukaryotic continuous evolution, the Evolugator, a proprietary continuous culturing device that reduces biofilm formation and wall growth (Figure 1.4), was used to evolve thermotolerant filamentous fungi. During long-term continuous culturing of filamentous fungi, wall growth can be problematic as fungal cells rapidly aggregate, leading to non-uniform culture dilution. To circumvent this issue, de Crécy-Lagard and coworkers devised an alternative method for continuous fungi culturing that dramatically ameliorates fungal wall growth ${ }^{36,37}$. Using this platform over the course of four months, the researchers evolved two thermotolerant variants of
the entomopathogenic fungus Metarhizium anisopliae to facilitate the widespread adoption of this fungus for pest control ${ }^{37}$. While successful, this method for continuous directed evolution requires specialized equipment that cannot be readily generalized to


Figure 1.4 | Growth chamber of the Evolugator. a, The growing culture is shown on the right, and is completely contained within a tube clamped at regular intervals to limit unintentional mixing. The density of the culture is measured with a turbidity meter connected to a controller that dynamically regulates the in-flux of new medium. Air bubbles are included at regular intervals to increase the oxygenation level of the medium. b, Upon reaching high density, the right clamp closes, the tubing moves along the track, and the next clamp opens allowing for contact between the growing culture and the fresh medium. $\mathbf{c}$, The fresh medium mixes with the growing culture through diffusion, and the culture resumes growing. d, After sufficient time, the culture again reaches high density. The middle clamp then closes, the tubing shifts on the track once again, the next clamp opens and the new medium is allowed in. This cycle is then continued for the duration of the experiment.
alternative selection methodologies.
Cornish and coworkers recently noted that many in vivo selection methods do not take advantage of genetic recombination as a source of diversification, and reasoned that the selective induction of double-stranded breaks (DSBs) with high efficiency could dramatically increase the degree of recombination in Saccharomyces cerevisiae ${ }^{38}$. They developed a yeast continuous evolution system made of three parts: a plasmid that tightly controls the expression of the site-specific endonuclease I-SceI, a cassette plasmid that contains regions of homology to the target sequence flanked by I-SceI cleavage sites, and a target plasmid carrying the gene to be mutagenized. Upon induction of the endonuclease, the mutagenic cassette is liberated from its respective plasmid and goes on to mutate the region of interest through homology-directed recombination ${ }^{38}$. Using this system, the authors were able to evolve hisA variants capable of complementing trpl auxotrophy in yeast in less than one month. This system is accessible and potentially powerful but requires knowledge of the relevant regions of a gene to mutate since genetic diversity is dependent on homology-directed recombination.

One of the most useful features of a continuous directed evolution system is the ability to modulate the mutagenesis of the evolving genes in a manner that does not perturb either the selection or the organism. This feature was one of the major design considerations for the development of the PACE platform ${ }^{20}$, in which mutations accumulate only in replicating phage; the error-prone bacterial Pol I variants ${ }^{28}$, in which mutations accumulate only in ColE1-type origin vectors; and the I-SceI-based yeast recombination system ${ }^{38}$, in which mutations are restricted to regions highly homologous to the mutagenic cassette. All of these systems largely abrogate or avoid host strain
mutagenesis. A similar approach was recently developed by Chang Liu and coworkers using a system that is completely contained in yeast. The authors used an autonomous DNA replication system from Kluveromyces lactis to enable the replication of a gene of interest in the $S$. cerevisiae cytosol ${ }^{39}$. Due to the strict requirements for the orthogonal $K$. lactis DNA polymerase initiation, no crosstalk was observed between the K. lactis components and the native host machinery. To make this system more amenable to directed evolution, the authors used a homology-guided approach to create error-prone DNA polymerase variants that would only replicate the orthogonal plasmid. The optimized system was able to induce $\sim 300 x$ higher rates of mutagenesis in the orthogonal plasmid as compared to the background $S$. cerevisiae mutagenesis rate, with no reduction in the genomic replication fidelity. This system represents an important methodological advance in continuous directed evolution in eukaryotes.

## 1.5 - Discussion

Methods for the directed evolution of biomolecules have proven to be important technologies for generating new functional proteins and nucleic acids as research tools and therapeutics, as well as for facilitating the investigation of fundamental biological questions. Some of the limitations of traditional stepwise laboratory evolution approaches can be overcome by continuous directed evolution platforms. Continuous directed evolution intrinsically enables a broader exploration of sequence space in a practical timescale compared to traditional discrete laboratory evolution methods. Indeed, in vivo continuous evolution methods can enable $>10^{11}$ protein variants to be generated and subjected to selection over $>100$ generations of evolution in less than a week ${ }^{20}$. The
efficiency of continuous evolution methods can enable long evolutionary trajectories ${ }^{14,23,32,33}$ or access to highly evolved biomolecules with new properties that would otherwise require impractical time scales ${ }^{1,2,18,24,27,31,38}$. In addition, some continuous evolution platforms, including several described above, can avoid genetic bottlenecks from modest population sizes, modest screening throughput, or modest mutation rates that commonly constrain some traditional laboratory evolution methods. The minimal reliance on researcher intervention during continuous evolution can also make performing multiple parallel evolution experiments more accessible than using traditional directed evolution platforms ${ }^{12-14,18-20,22-24,27,31,39}$.

Continuous directed evolution methods are not without their own drawbacks and should be considered a complement, rather than a replacement, to other laboratory evolution approaches. Establishing a continuous cycle of translation, mutation, selection, and replication that is general for a range of biomolecules is challenging, and therefore most continuous evolution methods perform these key steps inside cells. As a result, while traditional in vitro directed evolution techniques enable exquisite control of selection stringency and mutation rate through simple adjustments of additive concentrations, analogous perturbations are more difficult to implement in vivo and generally must be empirically determined. Because in vivo continuous evolution platforms typically require continuous culture of microorganisms, contamination either by "cheaters" (uninteresting gene variants that bypass selections) or by inoculation with undesired organisms poses additional hurdles for implementing these methods.

Finally, the development of selection methods compatible with continuous evolution is typically more difficult than the development of analogous selections or
screens for traditional stepwise laboratory evolution methods. Evolved biomolecules with desired properties in a continuous evolution system must be linked to gene and organism replication, rather than to the generation of fluorescent or colorimetric signals that have proven to be robust staples of in vitro and cell-based screening. While establishing this linkage between desired biomolecule function and cell survival is relatively straightforward for genes that are natively associated with organismal fitness (such as antibiotic resistance, temperature or solvent tolerance, or improved growth rate), the design of selections for continuous evolution is more challenging for genes and gene products that do not intrinsically affect cellular survival. Fortunately, many creative strategies have been described for coupling a wide variety of molecular activities to cell survival, including protein-fragment complementation of enzymatic activities and organelle-specific localization signals, $n$-hybrid systems for binding activity and bondformation catalysis ${ }^{40,41}$, derepression-based methods for bond-cleaving activities ${ }^{42}$, gene regulation-based selections for activities associated with transcription or translation ${ }^{43}$, and $c i s$-acting elements for metabolite sensing ${ }^{44}$. We anticipate that the expansion of such selection methods to address an increasingly broad scope of molecular problems of interest will play a key role in fully realizing the potential and defining the future impact of continuous directed evolution.

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## Chapter 2

Development of a Sensitive Platform for the Detection and Continuous Evolution of Protein-Protein Interactions

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## 2.1 - Introduction: In vivo detection platforms for protein-protein interactions

Methods for the in vivo detection of protein-protein interactions offer a number of advantages over in vitro methods, notably the use of a native cellular environment and lack of biomolecule purification or preparation steps ${ }^{1}$. However, in vivo methods can lack the sensitivity afforded by in vitro methods, typically require the use of fusion proteins to reporters of the interaction, yield qualitative rather than quantitative measures of the interaction affinity, and have been known to produce a high frequency of false positives ${ }^{1}$. Despite this, methods for the in vivo detection of protein-protein interaction continue to be developed, as they enable biomolecule improvements through directed evolution to a greater extent than their in vitro counterparts ${ }^{1-3}$.

Most widely applied methods for in vivo protein-protein interaction detection fall into one of two categories: split-protein complementation or $n$-hybrid schemes. In the former, a reporter of interest is split into two or more fragments and requires complementation by a protein-protein interaction to yield functional reporter. Notably examples of split reporters include ubiquitin, $\beta$-galactosidases, $\beta$-lactamases, luciferases, dihydrofolate reductases, and fluorescent proteins. In most cases, these reporters suffer from a high background activity in the absence of a protein-protein interaction, low activity upon complementation, or require the use of specialized techniques (e.g. flow cytometry) to quantify interaction affinity. In the latter, interaction of two or more biomolecules results in the requirement of transcriptional machinery upstream of a reporter of interest, resulting in transcriptional activation. N-hybrid systems have been demonstrated in organisms ranging from E. coli to immortalized human cell lines, highlighting the utility of the approach, but all seem to suffer from significant false
positive discovery frequency.
In this chapter, I design and optimize a system for the detection of protein-protein interactions for the ultimate use during Phage-Assisted Continuous Evolution. This system builds upon the work of many others using the bacterial 2-hybird. The finalized system demonstrates a very low false positive discovery frequency, can respond to interactions as low as micromolar affinities, and has a dynamic range rivaling the yeast counterpart.

## 2.2 - Development of a PACE selection for protein binding

PACE has mediated the rapid laboratory evolution of diverse protein classes including polymerases, proteases, and genome-editing proteins, yielding variants with highly altered activities and specificities ${ }^{5-11}$. While PACE has not been previously used to evolve protein-binding activity, we speculated that the bacterial 2-hybrid system ${ }^{12}$ could serve as the basis of a protein-binding PACE selection. The bacterial 2-hybrid consists of a DNA-binding protein domain fused to a target protein (the "bait"), and a prospective protein-binding partner (the "prey") fused to a transcriptional activation domain that recruits $E$. coli RNA polymerase ${ }^{12}$ (Figure 2.1A). Bait-prey binding results in localization of RNA polymerase upstream of a reporter gene, initiating gene expression. To adapt this system into a protein-binding selection for PACE, we envisioned that protein-target binding could instead activate the expression of the filamentous bacteriophage gene III, which is required for the infectivity of progeny phage ${ }^{5}$ (Figure 2.1B).

To maximize the sensitivity of the bacterial 2-hybrid, we extensively optimized
selection parameters including (i) choice of activation and DNA-binding domains, (ii) expression level of either protein partner, (iii) interaction binding affinity, (iv) DNAbinding domain multivalency state, (v) reporter gene ribosome-binding site, (vi) operator-promoter distance, (vii) RNA polymerase-promoter affinity, and (viii) DNAbinding domain-bait linker length. While the previously described bacterial 2-hybrid system yielded a 17 -fold increase in transcriptional activation using a model high-affinity


Figure 2.1 | Protein-binding phage-assisted continuous evolution (PACE). a, Anatomy of a phageinfected host cell during PACE. The host E. coli cell carries two plasmids: the accessory plasmid (AP), which links protein binding to phage propagation and controls selection stringency, and the mutagenesis plasmid (MP), which enables arabinose-inducible elevated level mutagenesis during PACE. $\mathbf{b}$, Following infection, selection phage (SP) that encode an evolving protein capable of binding to the target protein induces expression of gene III from the AP, resulting in the production of pIII, a phage protein required for progeny phage produced by that host cell to infect subsequent host cells. PACE takes place in a fixed-volume vessel (the "lagoon") that is continuously diluted with fresh host cells. Only those SP encoding proteins that bind the target can propagate faster than they are diluted out of the lagoon.
interaction (HA4 monobody binding to the SH2 domain of ABL1 kinase) ${ }^{13}$, our optimized system enhanced transcriptional activation > 200-fold using the same interaction (Figure 2.2-2.4). This system consisted of the E. coli RNA polymerase omega subunit (RpoZ) as the activation domain, the 434 phage cI repressor as the DNAbinding domain, and an optimized $\mathrm{P}_{\text {lacZ }}$-derived promoter $\left(\mathrm{P}_{\text {lacZ-opt }}\right)$ to drive reporter transcription. Together, these results extend and improve previously described bacterial systems ${ }^{12}$ that transduce protein-target binding into gene expression in a manner that can be easily tuned by the researcher.


Figure 2.2 | Bacterial 2-hybrid component validation. a, Plasmids encoding an IPTG-inducible $\lambda c I$ SH2 cassette ("DBD") and an ATc-inducible activator-HA4 cassette ("activator") were co-transformed into the E. coli S1030 host strain and induced using either or both small molecules. T4 AsiA-mediated transcriptional activation required low-level expression of the $\sigma 70$ (R541C/F563Y/L607P) mutant to alleviate AsiA toxicity ${ }^{4}$. Use of RpoZ as the activation domain showed the greatest degree of transcriptional activation ( $\sim 17$-fold). b, DNA-binding domain variation shows that multivalent phage repressors yield a greater degree of transcriptional activation than the monomeric zinc finger Zif268. $\mathbf{c}$, Transcriptional activation from a combination of the $\lambda \mathrm{cI}$ DNA binding domain and RpoZ transcriptional activator was evaluated using a number of previously evolved protein-protein interactions involving either monobodies or DARPins, showing the generality of binding interaction detection. Error bars reflect the standard deviation of at least three independent biological replicates.

| DBD | Activator | Promoter | Uninduced | Induced | Fold |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Lambda cl | Rpoz | cattaggcaccccgggcttacacttatgcttccggctcgtatgttgtgtcgaccg | 525 | 11689 | 22 |
| 434 cl | Rpoz | cattaggcaccccgggcttacacttatgcttccggctcgtatgttgtgtcgaccg | 330 | 18167 | 55 |
| 434 cl | Rpoz | cattaggcaccocgggettacacGtAatgcttccggcGcgtatgttgtgtcgaccg | 3252 | 182235 | 56 |
| 434 cl | Rpoz | cattaggcaccccgggetttacacGtAatgcttccggcGcgtatgGtgtgtcgaccg | 4542 | 467340 | 103 |
| 434 cl | Rpoz | cattaggcaccccgggettacacGtAatgettccggcGcgtaCgttgtgtcgaccg | 767 | 51636 | 67 |
| 434 cl | Rpoz | cattaggcacccogggetttacacGtAatgettccggcGcgtaCgGtgtgtcgaccg | 945 | 64088 | 68 |
| 434 cl | Rpoz | cattaggcaccccgggettGacacGtAatgcttccggcGcgtatgttgtgtcgaccg | 432159 | 712599 | 2 |
| 434 cl | Rpoz | cattaggcacccogggcttGacacGtAatgcttccggcGcgtatgGtgtgtcgaccg | 556230 | 750804 | 1 |
| 434 cl | Rpoz | cattaggcaccccgggcttacGcGtAatgcttccggcGcgtatgttgttcgaccg | 1015 | 97100 | 96 |
| 434 cl | Rpoz | cattaggcacccogggetGtacGcGtAatgcttccggcGcgtatgttgtgtcgaccg | 103 | 8579 | 83 |
| 434 cl | Rpoz | cattaggcacccogggetGtacGcGtAatgcttccggcGcgtaCgttgtgtcgaccg | 69 | 899 | 13 |
| 434 cl | Rpoz | cattaggcacccogggctGtacGcGtAatgcttccggcGcgtaCgGtgtgtcgaccg | 52 | 678 | 13 |
| 434 cl | Rpoz | cattaggcaccccgggctGtacGcGtAatgcttccggcGcgtatgttgCgtcgaccg | 202 | 1280 | 6 |
| 434 cl | Rpoz | cattaggcacccegggetGtacGcGtAatgcttccggcGcgtatgttgGgtcgaccg | 139 | 2307 | 17 |
| 434 cl | Rpoz | cattaggcaccccgggcttGacGcGtAatgcttccggcGcgtatgttgtgtcgaccg | 50526 | 494779 | 10 |
| 434 cl | Rpoz | cattaggcacccegggcttGacGcGtAatgcttccggcGcgtatgGtgtgtcgaccg | 66275 | 481567 | 7 |
| 434 cl | Rpoz | cattaggcacccogggeGttacacGtAatgcttccggcGcgtatgGtgtgtcgaccg | 229 | 1851 | 8 |
| 434 cl | Rpoz | cattaggcacccogggeAttacacGtAatgcttccggcGcgtatgGtgtgtcgaccg | 382 | 3450 | 9 |
| 434 cl | Rpoz | cattaggcacccogggcCttacacGtAatgcttccggcGcgtatgGtgtgtcgaccg | 131 | 3062 | 23 |
| 434 cl | Rpoz | cattaggcacccogggctGtacacGtAatgcttccggcGcgtatgGtgtgtcgaccg | 725 | 76430 | 105 |
| 434 cl | Rpoz | cattaggcacccogggctCtacacGtAatgcttccggcGcgtatgGtgtgtcgaccg | 80 | 668 | 8 |
| 434 cl | Rpoz | cattaggcaccccgggetttacacGtAatgcttccggcGcgtatgttgCgtcgaccg | 859 | 86407 | 101 |
| 434 cl | Rpoz | cattaggcaccccgggetttacacGtAatgcttccggcGcgtatgttgCgtcgaccg | 943 | 97337 | 103 |
| 434 cl | Rpoz | cattaggcaccccgggcttacacGtAatgcttccggcGcgtatgttgCgCcgaccg | 554 | 21807 | 39 |
| 434 cl | Rpoz | cattaggcaccccgggcttacacGtAatgcttccggcGcgtatgttgCgGcgaccg | 428 | 34919 | 82 |
| 434 cl | Rpoz | cattaggcaccccgggcttacacGtAatgcttccggcGcgtatgttgGgtcgaccg | 2229 | 309795 | 139 |
| 434 cl | Rpoz | cattaggcaccccgggcttacacGtAatgcttccggcGcgtatgttgGgCcgaccg | 989 | 92428 | 93 |
| 434 cl | Rpoz | cattaggcaccccgggcttacacGtAatgcttccggcGcgtatgttgGgGcgaccg | 1523 | 149661 | 98 |
| 434 cl | Rpoz | cattaggcaccccgggcttacacGtAatgcttccggcGcgtatgtgAgtcgaccg | 2203 | 296387 | 135 |
| 434 cl | Rpoz | cattaggcacccogggcttacacGtAatgcttccggcGcgtatgttgAgCcgaccg | 1271 | 167091 | 131 |
| 434 cl | Rpoz | cattaggcaccccgggcttacacGtAatgcttccggcGcgtatgttgAgGcgaccg | 1906 | 189337 | 99 |
| 434 cl | Rpoz | cattaggcacccogggcttacGcGtAatgcttccggcGcgtatgttgAgCcgaccg | 230 | 28708 | 125 |
| 434 cl | Rpoz | cattaggcaccccgggcttacGcGtAatgcttccggcGcgtatgttgAgGcgaccg | 269 | 42314 | 158 |
| 434 cl | Rpoz | cattaggcaccccgggctatacacGtAatgcttccggcGcgtatgttgAgCcgaccg | 122 | 10658 | 87 |
| 434 cl | Rpoz | cattaggcaccocgggctGtacacGtAatgcttccggcGcgtatgttgAgGcgaccg | 201 | 22016 | 109 |
| 434 cl | Rpoz | cattaggcaccccgggcttaacGcGtAatgcttccggcGcgtatgGtgAgCcgaccg | 566 | 24652 | 44 |
| 434 cl | Rpoz | cattaggcaccccgggctttacGcGtAatgcttccggcGcgtatgGtgAgGcgaccg | 753 | 78485 | 104 |
| 434 cl | Rpoz | cattaggcaccccgggctGtacacGtAatgcttccggcGcgtatgGtgAgCcgaccg | 878 | 26019 | 30 |
| 434 cl | Rpoz | cattaggcaccccgggctGtacacGtAatgcttccggcGcgtatgGtgAgGcgaccg | 1041 | 52307 | 50 |
| 434 cl | Rpoz | cattaggcaccccgggAttacacGtAatgcttccggcGcgtatgttgtgtcgaccg | 2480 | 164725 | 66 |
| 434 cl | Rpoz | cattaggcaccccgggettGcacGtAatgcttccggcGcgtatgttgtgtcgaccg | 1015 | 46198 | 46 |
| 434 cl | Rpoz | cattaggcaccccgggettacTcGtAatgcttccggcGcgtatgttgtgtcgaccg | 1294 | 151683 | 117 |
| 434 cl | Rpoz | cattaggcaccccgggettacTcGtCatgcttccggcGcgtatgttgtgtcgaccg | 1259 | 134645 | 107 |
| 434 cl | Rpoz | cattaggcaccccgggctttacTcGtAaAgcttccggcGcgtatgtgtgtcgaccg | 412 | 80809 | 196 |
| 434 cl | Rpoz | cattaggcaccccgggcttacTcGtAatgcttccggTGcgtatgttgtgtcgaccg | 613 | 38195 | 62 |
| 434 cl | Rpoz | cattaggcaccccgggcttacCcGtAatgcttccggcGcgtatgttgttcgaccg | 601 | 53127 | 88 |
| 434 cl | Rpoz | cattaggcaccocgggcttacacGtCatgcttccggcGcgtatgttgtgtcgaccg | 2975 | 371487 | 125 |
| 434 cl | Rpoz | cattaggcacccegggettacacGtCaAgcttccggcGcgtatgttgtgtcgaccg | 1903 | 255198 | 134 |
| 434 cl | Rpoz | cattaggcaccccgggcttacacGtCatgcttccggTGcgtatgttgtgtcgaccg | 1271 | 2597 | 2 |
| 434 cl | Rpoz | cattaggcaccccgggctttacacGtAaAgcttccggcGcgtatgttgtgtcgaccg | 1371 | 218447 | 159 |
| 434 cl | Rpoz | cattaggcaccccgggettaacacGtAaAgcttccggTGcgtatgttgtgtcgaccg | 813 | 62941 | 77 |
| 434 cl | Rpoz | cattaggcaccccgggettacacGtAatgcCtccggcGcgtatgttgtgtcgaccg | 33730 | 218546 | 6 |
| 434 cl | Rpoz | cattaggcaccccgggettacacGtAatgcttccggTGcgtatgttgtgtcgaccg | 1146 | 160609 | 140 |
| 434 cl | Rpoz | cattaggcaccocgggcttacacGtAatgcttccggcGTgtatgttgtgtcgaccg | 39981 | 777784 | 19 |
| 434 cl | Rpoz | cattaggcaccccgggettacacGtAatgettccggcGAgtatgttgtgtcgaccg | 6010 | 638749 | 106 |
| 434 cl | Rpoz | cattaggcaccccgggettaacacGtAatgcttccggcGcgtaGgttgtgtcgaccg | 489 | 46068 | 94 |
| 434 cl | Rpoz | cattaggcaccccgggctttacacGtAatgcttccggcGcgtatgtAgtgtcgaccg | 291 | 4553 | 16 |
| 434 cl | Rpoz | cattaggcaccccgggetttacTcGtAatgcttccggcGcgtatgttgAgCcgaccg | 685 | 44500 | 65 |
| 434 cl | Rpoz | cattaggcaccccgggcttacTcGtCatgcttccggcGcgtatgttgAgCcgaccg | 638 | 43688 | 68 |
| 434 cl | Rpoz | cattaggcacccogggetttacTcGtAaAgcttccggcGcgtatgtgAgCcgaccg | 488 | 18713 | 38 |
| 434 cl | Rpoz | cattaggcacccogggcttacTcGtAatgcttccggTGcgtatgttg AgCcgaccg | 278 | 9431 | 34 |
| 434 cl | Rpoz | cattaggcacccogggcttacacGtCatgcttccggcGcgtatgttg $\operatorname{Cocgaccg}$ | 1890 | 176933 | 94 |
| 434 cl | Rpoz | cattaggcaccocgggcttacacGtCaAgcttccggcGcgtatgttgAgCcgaccg | 709 | 68843 | 97 |
| 434 cl | Rpoz | cattaggcacccogggcttacacGtCatgcttccggTGcgtatgttgAgCcgaccg | 908 | 49205 | 54 |
| 434 cl | Rpoz | cattaggcaccocgggcttacacGtAaAgcttccggcGcgtatgttgAgCcgaccg | 1060 | 70184 | 66 |
| 434 cl | Rpoz | cattaggcaccccgggettaacacGtAaAgcttccggTGcgtatgttgAgCcgaccg | 524 | 17228 | 33 |
| 434 cl | Rpoz | cattaggcacccogggcttacacGtAatgcttccggTGcgtatgttgAgCcgaccg | 696 | 36530 | 52 |

b


Figure 2.3|Optimization of the $\mathbf{P}_{\text {lacz }}$ promoter for improved sensitivity and dynamic range. a,
Promoter and DNA-binding domain combinations tested during $P_{\text {lacz }}$ optimization, showing uninduced and induced levels of OD-normalized luminescence. The SH2/HA4 interaction pair was used in all cases. The fold activation in each case was calculated as the ratio of the induced and uninduced luciferase expression signals. $\mathbf{b}$, Graphical representation of the data in part (a), showing the wide distribution of promoter background levels and degrees of transcriptional activation. In both (A) and (B), the red and green dots indicate the starting ( $\mathrm{P}_{\text {lac62 }}$ ) and final ( $\mathrm{P}_{\text {lacZ-opt }}$ ) promoter/DNA-binding domain combinations, respectively. Each data point in (b) reflects the average of at least three independent biological replicates.


Figure 2.4 | Bacterial 2-hybrid optimization. a, Inducer titration of the interacting fusion proteins driving the 2-hyrbid system. The black and green lines represent the uninduced ( $0 \mu \mathrm{M}$ IPTG) and induced ( $1 \mu \mathrm{M}$ IPTG) levels of IPTG-inducible 434cI-SH2 expression, while ATc induces expression of the rpoZ-HA4 cassette. In subsequent graphs and assays, the expression level resulting from the IPTG-inducible $\mathrm{P}_{\text {lac }}$ promoter was measured by Western blot and approximated using a constitutive promoter to reduce experimental variability. $\mathbf{b}$, The degree of transcriptional activation using HA4 monobody mutants correlated with known binding affinities. The highest levels of activation resulted from $K_{d}=$ low $n M$ affinities, while weak affinities in the $K_{d}=$ low $\mu \mathrm{M}$ range could still be detected. $\mathbf{c}$, The relationship between DNA-binding domain multivalency state (monomeric, dimeric or tetrameric DNA-binding domain fused to the SH 2 domain) and transcriptional activation resulting from the SH2/HA4 interaction, with higher multivalency states yielding greater activation levels. d, RBS modification enables robust modulation of the relative activation levels from the $\mathrm{P}_{\text {lacz-opt }}$ promoter using the SH2/HA4 interaction. e, Operator-promoter binding site spacing strongly affects transcriptional activation levels. 434cI binding at 61 base pairs upstream of the $P_{\text {lacz-opt }}$ promoter resulted in the most robust activation. $\mathbf{f}$, Linker extension to include one, two, or three $\mathrm{G}_{4} \mathrm{~S}$ motifs result in reduced activation levels using the SH2/HA4 interacting pair. Error bars throughout this figure reflect the standard deviation of at least three independent biological replicates.

## 2.3 - PACE evolves monobodies with antigen affinity

The HA4 monobody (antibody mimetic) binds to the SH2 domain of ABL1 kinase $\left(\mathrm{K}_{\mathrm{d}}=7 \mathrm{nM}\right)$ in a manner highly dependent on HA4 residue $\mathrm{Y} 87^{13}$. The mutant HA4 Y87A monobody binds the ABL1 SH2 domain with 100- to 1,000-fold weaker affinity ${ }^{13}$. Whereas wild-type HA4 monobody fused to RpoZ in the presence of 434cISH2 resulted in potent transcriptional activation in the optimized bacterial 2-hybrid system described above, transcriptional activation using HA4 $4_{\mathrm{Y} 87 \mathrm{~A}}$ was negligible (Figure 2.5a). Next we tested the ability of this interaction to support phage propagation through activation of gene III expression. Selection phage (SP) expressing the rpoZ-HA4 fusion robustly propagate in the PACE format using host cell strains carrying accessory plasmids (APs) expressing the 434cI-SH2 fusion, in agreement with our transcriptional activation measurements (Figure 2.6a). Importantly, SPs encoding either rpoZ-HA4 Y87A or rpoZ alone did not support phage propagation, demonstrating the inability of the mutant HA4 monobody to support gene III expression (Figure 2.6a).

To validate the capability of protein-binding PACE to evolve a known proteinprotein interaction, we challenged the system to evolve a functional SH2-binding monobody starting from the inactive $\mathrm{HA} 4_{\mathrm{Y} 87 \mathrm{~A}}$ mutant. To revert the $\mathrm{HA} 4_{\mathrm{Y} 87 \mathrm{~A}}$ mutant back to a Tyr87 protein requires three adjacent point mutations (GCG to either TAT or TAC). The rpoZ-HA4 ${ }_{Y 87 A}$ SP was propagated during PACE for 66 h at a flow rate of 2.0 lagoon $\mathrm{vol} / \mathrm{h}$ in the absence of selection pressure (i.e., allowing evolutionary $\mathrm{drift}^{8}$ ), before engaging selection pressure by changing the host cell strain to one requiring SH2 binding-dependent phage propagation (Figure 2.5b). Under selection pressure, control lagoons that previously experienced neither drift nor mutagenesis, or that experienced
only mutagenesis, quickly lost their SPs encoding the evolving monobody population (phage "wash out"). In contrast, lagoons subjected to both drift and mutagenesis dropped markedly in phage titer for the first 12 h , but recovered over the next 24 h (Figure 2.5c). Sequence analysis of eight phage clones surviving 48 h of PACE revealed that all eight evolved either Tyr (three point mutations) or Trp (two point mutations) at HA4 position 87 (Figure 2.5b,c). We confirmed potent activation of transcription using either evolved consensus clone (Figure 2.6c). These results collectively demonstrate that proteinbinding PACE can rapidly evolve proteins with target affinity, even when multiple mutations are required to gain protein-binding activity.


Figure 2.5 | Protein-binding PACE selection development and stringency modulation. a, The relationship between target protein multivalency and transcriptional output measured by luciferase expression. The number of ABL1 SH2 domains available to bind the HA4 monobody was modulated by varying the 434cI DNA-binding domain multivalency state ( $1 \mathrm{x}, 2 \mathrm{x}, 4 \mathrm{x}$, or 6 x SH2). "No operator" indicates a scrambled 434cI operator control AP. b, During PACE, the inactive monobody mutant HA4 Y87A was subjected to no mutagenesis (MP not induced), enhanced mutagenesis (MP induced with arabinose), or enhanced mutagenesis with genetic drift (MP induced with arabinose in addition to an initial period of zero selection stringency), then selected for binding to the ABL1 SH2 target protein. c, The combination of drift and enhanced mutagenesis during PACE (green line) resulted in the evolution of Tyr and Trp residues at position 87, either of which restores SH2-binding activity, while no mutagenesis (red line) or enhanced mutagenesis without drift (blue line) resulted in phage washout. Error bars in (a) reflect the standard deviation of at least three independent biological replicates.

b

c


Figure 2.6 | Protein-binding PACE phage propagation and mutant evolution. a, Phage plaque formation as a function of target protein multivalency. "No operator" indicates a scrambled 434cI operator control AP, and "phage control" indicates an AP in which the phage shock promoter (activated by phage infection) drives gene III expression. b, Co-crystal structure of the ABL1 SH2 (blue) bound to the HA4 monobody (red), highlighting the interaction of HA4 Y87 (red spheres) with key residues of the phosophotyrosine-binding pocket (blue spheres) of the SH2 domain (PDB 3K2M). The phosphate ion is shown in orange at the interaction interface. c, Apparent binding activity of mutants of the HA4 monobody at position 87 . Tyrosine, tryptophan and phenylalanine are tolerated at position 87 and enable protein-protein interaction by bacterial 2-hybrid assay. Error bars reflect the standard deviation of at least three independent biological replicates.

## 2.4 - Discussion

The system presented in this chapter potently reports on protein-protein interactions in vivo, and can be used to evolve known antigen-monobody interactions in short timeframes. Importantly, the system enables a substantial degree of control to selection stringency through manipulations to the DNA-binding domain concentration and multimer state, ribosome-binding site strength, operator-promoter spacing, and was shown to enable the general detection of a number of unrelated protein-protein interactions. Further application of this system, however, towards the directed evolution of novel protein-protein interactions from non-functional starting materials were wholly unsuccessful, likely owing to low mutagenesis efficiencies in the system. In the next chapter, I address the issue of low mutagenesis to enable the application of the described
platform for robust protein-protein interaction evolution.

## 2.5-Methods

General methods. PCR was performed using PfuTurbo Cx Hotstart DNA polymerase (Agilent Technologies), VeraSeq ULtra DNA polymerase (Enzymatics), or Phusion U Hot Start DNA Polymerase (Life Technologies). Water was purified using a MilliQ water purification system (Millipore). Plasmids and selection phages were constructed using USER cloning (New England Biolabs). Genes were either synthesized as bacterial codonoptimized gBlocks Gene Fragments (Integrated DNA Technologies) or amplified by PCR from native sources. DNA vector amplification was carried out using NEB Turbo or DH5a cells (New England Biolabs).

Electrocompetent strain preparation. The previously described strains $\mathrm{S}_{1030}{ }^{8}$ and S2060 ${ }^{10}$ were used in all luciferase and plaque assays, as well as in PACE experiments. The glycerol stock of either strain was used to seed a $2-\mathrm{mL}$ overnight culture using 2 xYT media (United States Biological) supplemented with $10 \mu \mathrm{~g} / \mathrm{mL}$ tetracycline (Sigma Aldrich), $50 \mu \mathrm{~g} / \mathrm{mL}$ streptomycin (Sigma Aldrich), $10 \mu \mathrm{~g} / \mathrm{mL}$ fluconazole (TCI America), and $10 \mu \mathrm{~g} / \mathrm{mL}$ amphotericin B (TCI America) in a $37^{\circ} \mathrm{C}$ shaker at 230 rpm . The saturated culture was diluted 1,000-fold in 50 mL of the same supplemented media and grown under identical conditions until it reached mid log-phase $\left(\mathrm{OD}_{600} 0.5-0.8\right)$. Once the appropriate $\mathrm{OD}_{600}$ was reached, the cells were pelleted in a $50-\mathrm{mL}$ conical tube (VWR) centrifuged at $10,000 \mathrm{G}$ for 5 min at $4^{\circ} \mathrm{C}$. The supernatant was immediately decanted and the interior of the tube was wiped with a few Kimwipes (Kimberly-Clark) to remove residual media and salts. The cells were resuspended in 25 mL of pre-chilled, sterile filtered $10 \%$ glycerol in MilliQ purified water using a pipette to quickly break up the
pellet. The cells were centrifuged and washed an additional three times. After the last centrifugation step, the interior of the tube was wiped with a few Kimwipes to remove residual glycerol solution. The pellet was resuspended in as little volume as possible, typically $\sim 150 \mu \mathrm{~L}$, and split into $10 \mu \mathrm{~L}$ aliquots for storage. Cells were flash frozen using a liquid $\mathrm{N}_{2}$ bath, then quickly transferred to $-80^{\circ} \mathrm{C}$ for extended storage. Electrocompetent S1030 or S2060 cells produced by this method typically yielded $10^{7}$ $10^{8}$ colonies $/ \mu \mathrm{g}$ plasmid DNA and enable the simultaneous electroporation of up to three plasmids carrying orthogonal origins of replication and antibiotic resistance cassettes to yield transformants containing all plasmids.

General USER cloning. All plasmid and phage materials were constructed via USER cloning ${ }^{14}$. Briefly, primers were designed to include a single internal deoxyuracil base 15 20 bases from the 5 ' end of the primer, specifying this region as the "USER junction". Criteria for design of the USER junction were: it should contain minimal secondary structure, have $45^{\circ} \mathrm{C}<\mathrm{T}_{\mathrm{m}}<70^{\circ} \mathrm{C}$, and begin with a deoxyadenosine and end with a deoxythymine (to be replaced by deoxyuridine). The USER junction specifies the homology required for correct assembly. We note that PfuTurbo Cx Hotstart DNA polymerase (Agilent Technologies), VeraSeq ULtra DNA polymerase (Enzymatics), or Phusion U Hot Start DNA Polymerase (Life Technologies) are able to use primers carrying deoxyuracil bases, whereas some other polymerases undergo a phenomenon known as PCR poisoning and do not extend the primer.

All PCR products were purified using MinElute PCR Purification Kit (Qiagen) to $10 \mu \mathrm{~L}$ final volume and quantified using a NanoDrop 1000 Spectrophotometer (Thermo

Scientific). For assembly, PCR products carrying complementary USER junctions were mixed in an equimolar ratio (up to 1 pmol each) in a $10 \mu \mathrm{~L}$ reaction containing 15 units DpnI (New England Biolabs), 0.75 units USER (Uracil-Specific Excision Reagent) enzyme (Endonuclease VIII and Uracil-DNA Glycosylase, NEB), 50 mM potassium acetate, 20 mM Tris-acetate, 10 mM magnesium acetate, $100 \mu \mathrm{~g} / \mathrm{ml}$ BSA at pH 7.9 (1x CutSmart Buffer, New England Biolabs). The reactions were incubated at $37^{\circ} \mathrm{C}$ for 45 min, followed by heating to $80^{\circ} \mathrm{C}$ and slow cooling to $22^{\circ} \mathrm{C}$ at $0.1^{\circ} \mathrm{C} / \mathrm{s}$ in a temperaturecontrolled block. The hybridized constructs were directly used for heat-shock transformation of chemically competent NEB Turbo E. coli cells according to the manufacturer's instructions. Transformants were selected on $1.8 \%$ agar- 2 xYT plates supplemented with the appropriate antibiotic(s).

For SP cloning, the hybridized constructs were purified using EconoSpin purification columns (Epoch Life Sciences), eluted using $25 \mu \mathrm{~L} 10 \%$ glycerol, and transformed into electrocompetent S2060 cells carrying the phage-responsive AP pJC175e, which produces functional pIII in response to phage infection (this strain is henceforth referred to as S2208). Following recovery for $3-4 \mathrm{~h}$ at $37^{\circ} \mathrm{C}$ using 2 xYT (United States Biological) media, the culture was centrifuged and the supernatant was purified using a $0.22 \mu \mathrm{~m}$ PVDF Ultrafree centrifugal filter (Millipore). The supernatant was diluted serially in 100-fold increments and used in plaque assays using log-phase S2208 cells. Following overnight at $37^{\circ} \mathrm{C}$, single plaques were picked into 2 xYT media and grown for $12-18 \mathrm{~h}$ in a $37^{\circ} \mathrm{C}$ shaker at 230 rpm . The supernatant was purified again to yield clonal phage stocks. In all cases, cloned plasmids and phages were prepared using the TempliPhi 500 Amplification Kit (GE Life Sciences) according to the
manufacturers protocol and verified by Sanger sequencing.

Plaque assays. $\mathrm{S} 1030^{8}$ or $\mathrm{S} 2060^{10}$ cells transformed with the AP of interest were grown in 2xYT (United States Biological) liquid media supplemented with the appropriate antibiotics to an $\mathrm{OD}_{600}$ of $0.6-0.9$. The phage supernatant was diluted serially in three, 100 -fold increments to yield four total samples (undiluted, $10^{2}$-fold, $10^{4}$-fold, and $10^{6}$ fold diluted) to be used for infections. For each sample, $150 \mu \mathrm{~L}$ of cells were added to 10 $\mu \mathrm{L}$ of phage that had been filtered using a $0.22 \mu \mathrm{~m}$ PVDF Ultrafree centrifugal filter (Millipore). Within 1-2 min of infection, 1 mL of warm $\left(\sim 55^{\circ} \mathrm{C}\right)$ top agar $(7 \mathrm{~g} / \mathrm{L}$ bacteriological agar in 2 xYT ) was added to the phage/cell mixture, mixed by pipetting up and down once, and plated onto quartered plates that had been previously poured with 2 mL of bottom agar ( $18 \mathrm{~g} / \mathrm{L}$ bacteriological agar in 2 xYT ) in each quadrant. The plates were then grown overnight at $37^{\circ} \mathrm{C}$ before plaques could be observed.

Phage-Assisted Continuous Evolution (PACE). Host cell cultures, lagoons, media, and the PACE apparatus were as previously described ${ }^{8}$. Recombined selection phage harboring gene III (rSP) will poison a PACE experiment by outcompeting the evolving SP. We have noted that the likelihood of rSP occurrence in an SP stock increases with extended standing culture growth during the initial SP stock preparation. To reduce the likelihood of rSP formation, all SPs are repurified prior to any continuous evolution experiments. Briefly, SPs were plaqued on S2208 cells. A single plaque was picked into 2 mL 2 xYT (United States Biological) supplemented with the appropriate antibiotics and grown until the culture reached mid log-phase $\left(\mathrm{OD}_{600} 0.5-0.8\right)$. The culture was
centrifuged using a tabletop centrifuge for 2 min at $10,000 \mathrm{G}$, followed by supernatant filtration using a $0.22 \mu \mathrm{~m}$ PVDF Ultrafree centrifugal filter (Millipore). This short growth period routinely yields titers of $10^{6}-10^{8} \mathrm{pfu} / \mathrm{mL}$ and was found to minimize the occurrence of rSP during PACE experiments.

To prepare the PACE strain, the AP and MP were co-transformed into electrocompetent S1030 cells (see above) and recovered using Davis rich media ${ }^{8}$ (DRM) to ensure MP repression. Transformations were plated on $1.8 \%$ agar- 2 xYT containing 50 $\mu \mathrm{g} / \mathrm{mL}$ carbenicillin, $40 \mu \mathrm{~g} / \mathrm{mL}$ chloramphenicol, $10 \mu \mathrm{~g} / \mathrm{mL}$ fluconazole, $10 \mu \mathrm{~g} / \mathrm{mL}$ amphotericin B, 100 mM glucose (United States Biological) and grown for 12-18 h in a $37^{\circ} \mathrm{C}$ incubator. Following overnight growth, four single colonies were picked and resuspended in DRM, then serially diluted and plated on $1.8 \%$ agar- 2 xYT containing 50 $\mu \mathrm{g} / \mathrm{mL}$ carbenicillin, $40 \mu \mathrm{~g} / \mathrm{mL}$ chloramphenicol, $10 \mu \mathrm{~g} / \mathrm{mL}$ fluconazole, $10 \mu \mathrm{~g} / \mathrm{mL}$ amphotericin B, and either 100 mM glucose or 100 mM arabinose (Gold Biotechnology) and grown for $12-18 \mathrm{~h}$ in a $37^{\circ} \mathrm{C}$ incubator. Concomitant with this plating step, the dilution series was used to inoculate liquid cultures in DRM supplemented with 50 $\mu \mathrm{g} / \mathrm{mL}$ carbenicillin, $40 \mu \mathrm{~g} / \mathrm{mL}$ chloramphenicol, $10 \mu \mathrm{~g} / \mathrm{mL}$ tetracycline, $50 \mu \mathrm{~g} / \mathrm{mL}$ streptomycin, $10 \mu \mathrm{~g} / \mathrm{mL}$ fluconazole, $10 \mu \mathrm{~g} / \mathrm{mL}$ amphotericin B and grown for $12-18 \mathrm{~h}$ in a $37{ }^{\circ} \mathrm{C}$ shaker at 230 rpm . Following confirmation of arabinose sensitivity using the plate assay, cultures of the serially diluted colonies still in log-phase growth were used to seed a $25-\mathrm{mL}$ starter culture for the PACE chemostat.

Once the starter culture had reached log-phase density $\left(\mathrm{OD}_{600} 0.5-0.8\right)$, the $25-\mathrm{mL}$ culture was added directly to 175 mL of fresh DRM in the chemostat. The chemostat culture was maintained at 200 mL and grown at a dilution rate of $1.5-1.6 \mathrm{vol} / \mathrm{hr}$ as
previously described ${ }^{8}$. Lagoons flowing from the chemostats were maintained at 40 mL , and diluted as described for each experiment. Lagoons were supplemented with 25 mM arabinose to induce the MP for $8-16 \mathrm{~h}$ prior to infection with packaged SP. Samples were taken at the indicated time points, centrifuged at $10,000 G$ for 2 min , then filtered with a $0.2 \mu \mathrm{~m}$ filter and stored overnight at $4^{\circ} \mathrm{C}$. Phage aliquots were titered by plaque assay on S2208 cells (total phage titer) and S1030 or S2060 cells (rSP titer) for all time points.

Luciferase assays. Complementary plasmids (CPs) were co-transformed with an AP of interest into electrocompetent $\mathrm{S} 1030^{8}$ or $\mathrm{S} 2060^{10}$ cells and plated onto $1.8 \%$ agar- 2 xYT plates with $50 \mu \mathrm{~g} / \mathrm{mL}$ carbenicillin and $100 \mu \mathrm{~g} / \mathrm{mL}$ spectinomycin. After overnight growth at $37^{\circ} \mathrm{C}$, single colonies were each picked into 2 mL DRM supplemented with 50 $\mu \mathrm{g} / \mathrm{mL}$ carbenicillin, $100 \mu \mathrm{~g} / \mathrm{mL}$ spectinomycin, $10 \mu \mathrm{~g} / \mathrm{mL}$ tetracycline, $50 \mu \mathrm{~g} / \mathrm{mL}$ streptomycin, $10 \mu \mathrm{~g} / \mathrm{mL}$ fluconazole, $10 \mu \mathrm{~g} / \mathrm{mL}$ amphotericin B and grown for $12-18 \mathrm{~h}$ in a $37{ }^{\circ} \mathrm{C}$ shaker at 230 rpm . Following overnight growth, cultures were diluted 1000 -fold in a 96-well deep well plate containing $500 \mu \mathrm{~L}$ DRM with $50 \mu \mathrm{~g} / \mathrm{mL}$ carbenicillin, 100 $\mu \mathrm{g} / \mathrm{mL}$ spectinomycin and the indicated arabinose, IPTG or anhydrotetracycline (ATc) concentration to induce protein expression from either the AP or CP. Constitutive APs and CPs were used where no inducer concentration is given. After growth with shaking at $37^{\circ} \mathrm{C}$ for $4-5$ hours, $150 \mu \mathrm{~L}$ of each culture was transferred to a 96 -well black wall, clear bottom plate (Costar), and the $\mathrm{OD}_{600}$ and luminescence for each well was measured on an Infinite M1000 Pro microplate reader (Tecan). The $\mathrm{OD}_{600}$ of a well containing only media was subtracted from all sample wells to obtain a corrected $\mathrm{OD}_{600}$ value for each well. The raw luminescence value for each well was then divided by that well's corrected
$\mathrm{OD}_{600}$ value to obtain the luminescence value normalized to cell density. Each variant was assayed in at least biological triplicate, and the error bars shown reflect the standard deviations of the independent measurements.

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## Chapter 3

Potent In Vivo Mutagenesis Plasmids with Broad Mutational Spectra for Improved Outcome During Phage-Assisted Continuous Evolution

Parts adapted from: Badran \& Liu, Nature Communications 6, 8425 (2015).

## 3.1 - Introduction: unbiased and untargeted in vivo mutagenesis

Access to new mutations drives both natural and laboratory evolution. Native biological mutation rates are modest, occurring at frequencies of approximately one mutation per billion replicated DNA bases in most eukaryotes and prokaryotes ${ }^{1}$. Laboratory evolution methods must increase this mutation rate to accelerate the discovery of biomolecules with desired properties on a practical time scale. In addition to mutation rate, mutational spectrum is also a crucial component of the genetic diversity that fuels evolution. Access to diverse amino acid substitutions during evolution is enhanced by more complete coverage of the 12 possible mutation types.

Several systems to enhance mutational efficiency and broaden mutational spectra have been developed for use in laboratory evolution efforts ${ }^{15}$. In vitro mutagenesis through error-prone PCR, site-saturation mutagenesis, or DNA shuffling has become the standard approach to introduce diversity into genes of interest. Whereas in vitro mutagenesis methods enable control of mutation rate and mutational spectrum, in vivo mutagenesis methods enable mutation and selection cycles to be coupled, bypass transformation efficiency bottlenecks that frequently limit the size of gene populations that can be accessed following in vitro mutagenesis, and avoid labor-intensive library creation, cloning, and manipulation steps ${ }^{16}$. The difficulty of tuning mutagenic load and spectrum in live cells, however, has prevented the development of safe, effective in vivo mutagenesis methods that can rival or exceed the efficiency and mutational spectra of state-of-the-art in vitro methods.

The most commonly used in vivo mutagenesis methods include chemical mutagens, nucleobase analogs, UV light, and hypermutator strains ${ }^{17}$. Chemical mutagens
yield narrow mutagenic spectra and are potent human carcinogens. UV radiation is known to generate a wide mutation spectrum with little sequence preference, but with low potency that is limited by cellular toxicity. Perhaps the most widespread method for in vivo mutagenesis has been the use of hypermutator strains such as XL-1 Red ${ }^{18}$ that have been engineered to have higher mutation rates through the deletion or modification of genes involved in DNA replication and repair. These strains suffer from numerous drawbacks, however, including modest mutational potency (vide infra), moderately biased mutational preference ${ }^{19}$, poor transformation efficiency, slow growth rate, and difficulty of modification when additional genetic manipulations are required. In addition, the rate of mutagenesis is not controllable, and mutagenesis generally must be separated from other steps such as selection or screening due to the instability or poor growth of the strain. Loeb and coworkers previously described an elegant system that uses a low-fidelity E. coli DNA Pol I (LF-Pol I) to increase in vivo mutagenesis efficiency with a wide scope of mutational types ${ }^{20}$. Unfortunately, this method is restricted to Pol I temperature-sensitive strains and mutates only vectors carrying ColE1related origins of replication, with mutation rate being highly dependent on distance from the ColE1 origin ${ }^{2,20}$.

An ideal in vivo mutagenesis method should offer (i) a broad mutagenesis spectrum, (ii) a mutation rate that can be very high but is easily modulated by the researcher, and (iii) entirely episomal encoding so that it can be applied to virtually any E. coli strain. Here we describe the development of a general in vivo mutagenesis method that meets these criteria. We generate a series of vectors that enable robust chromosomal, episomal, and viral DNA mutagenesis in a strain-independent manner. Importantly, this
system outperforms commonly used in vivo mutator and chemical mutagenesis methods in mutational efficiency and spectrum, and can even achieve mutational potency and spectrum comparable to that of state-of-the-art in vitro mutagenesis methods. We apply this system to two directed evolution case studies in bacteria and bacteriophage, validating their ability to access biomolecule variants with novel properties with greater effectiveness than previously described methods. Collectively, this system substantially advances in vivo mutagenesis capabilities and increases the effectiveness of laboratory evolution efforts.


Figure 3.1 | Summary of major pathways that influence $\boldsymbol{E}$. coli DNA replication fidelity. Steps during replication and mutation correction are grouped according to their mechanisms of action. Methylated DNA is shown in black, unmethylated DNA is shown in grey, and the mutation to be corrected is depicted as "M". Gene superscripts denote if a mutator phenotype results upon gene deletion ${ }^{4}$ (1), gene overexpression ${ }^{5-9}(2)$ or modification of the chromosomal allele to circumvent potential knockout lethality ${ }^{5-10}$ (3).

| Strain | Genotype |
| :---: | :---: |
| MG1655 $\Delta$ recA | $F$ - ${ }^{-}$recA1918::apra, rph-1 $\lambda^{-}$ |
| CSH101 | F' lacI373 lacZ571 / ara-600 $\Delta$ (gpt-lac) 5 relA1 spoT1 thiE1 $\lambda^{-}$ |
| CSH102 | $F$ 'lacl373 lacZ572 / ara-600 $\Delta$ (gpt-lac) 5 relA1 spoT1 thiE1 $\lambda^{-}$ |
| CSH103 | F' lacI373 lacZ573 / ara-600 $\Delta$ (gpt-lac) 5 relAl spoT1 thiE1 $\lambda^{-}$ |
| CSH104 | F' lacl373 lacZ574 / ara-600 $\Delta$ (gpt-lac) 5 relA1 spoT1 thiE1 $\lambda^{-}$ |
| CSH105 | F' lacl373 lacZ575 / ara-600 $\Delta$ (gpt-lac) 5 relAl spoT1 thiE1 $\lambda^{-}$ |
| CSH106 |  |
| S1030 | F' proA $+B+\Delta(l a c I Z Y) ~ z z f:: T n 10$ lacI ${ }^{Q 1} P_{N 25}-$ tetR luxCDE / endA1 recA1 galE15 galK16 nupG rpsL UlacIZYA araD139 A (ara,leu) $7697 \mathrm{mcrA} \Delta(\mathrm{mrr}$ -hsdRMS-mcrBC) proBA::pir116 araE201 $4 r p o Z ~ \Delta f l u ~ \triangle c s g A B C D E F G ~$ $\triangle p g a C \lambda^{-}$ |
| S1021 | $F$ endA1 recAl galE15 galK16 nupG rpsL AlacIZYA araD139 (ara,leu) $7697 \mathrm{mcrA} \Delta(\mathrm{mrr}$-hsdRMS-mcrBC) proBA: :pirl16 araE201 ArpoZ $4 f l u \quad \triangle \operatorname{csg} A B C D E F G ~ \Delta p g a C \lambda^{-}$ |

Table 3.1 | Summary of all strains used in this chapter. MG1655 and CSH strains were obtained from the Yale University E. coli Genetic Stock Center.

## 3.2 - Mutagenesis plasmid minimization

Bacteria control the rate of chromosomal substitutions through a series of overlapping mechanisms that can be subdivided into three main pathways: proofreading (reduces mutation rate by a factor of $\sim 10^{2}$ substitutions $\mathrm{bp}^{-1}$ generation ${ }^{-1}$ ), mismatch repair (reduces mutation rate by $\sim 10^{3}$ substitutions $\mathrm{bp}^{-1}$ generation ${ }^{-1}$ ), and base selection (reduces mutation rate by $\sim 10^{5}$ substitutions $\mathrm{bp}^{-1}$ generation $\left.{ }^{-1}\right)^{21}($ Figure 3.1). These redundant replication maintenance mechanisms collectively account for the basal substitution rate of bacterial chromosomal DNA of $\sim 10^{-9}$ to $10^{-10}$ substitutions $\mathrm{bp}^{-1}$ generation ${ }^{-121}$. Based on prior knowledge of dominant mutators alleles that interfere with DNA replication fidelity, we sought to design a series of small-molecule inducible mutagenesis plasmids (MPs) that offer broad mutational spectra and high levels of mutagenesis in bacterial cells.

We recently reported the development and application of an MP for in vivo mutagenesis during phage-assisted continuous evolution (PACE) $)^{22}$. This MP increases
the mutation rate $\sim 100$-fold above the basal $E$. coli mutation rate through the arabinoseinduced expression of dnaQ926, a dominant negative variant of the $E$. coli DNA Pol III proofreading domain. This plasmid additionally provides $u m u D^{\prime}, u m u C$ and recA730, which together enable in vivo translesion mutagenesis employing UV light or chemical mutagens. This MP (designated MP1) results in a substitution rate of $7.2 \times 10^{-5}$ and $5.4 \times 10^{-}$
${ }^{8}$ substitutions $\mathrm{bp}^{-1}$ generation ${ }^{-1}$ for M13 phage and E. coli, respectively ${ }^{22,23}$. This mutation rate, however, is still several orders of magnitude below the mutation rates provided by conventional in vitro mutagenesis techniques ${ }^{24}$.

Since we sought to avoid the use of exogenous mutagens, we first minimized MP1 by removing $u m u D^{\prime}, u m u C$, and recA730 from MP1 to yield MP2 carrying only


Figure $3.2 \mid$ Mutagenesis plasmid (MP) design and effect on mutation rate in bacteria. The mutator genes tested are color-coded to indicate the canonical pathway being disrupted through the overexpression (A) or deletion (B) of that gene. All MPs express mutator genes from the E. coli arabinose-inducible $\mathrm{P}_{\mathrm{BAD}}$ promoter, with each gene preceded by a ribosome-binding site to enable translation from a single transcript. For (A), the mutagenesis rate $\mu_{\mathrm{bp}}$ (substitutions per base pair of the E. coli genome per generation) was calculated using rifampin resistance under uninduced ( 25 mM glucose, white bars) and induced ( 25 mM glucose +25 mM arabinose, black bars). For (B), the rifampin resistance of XL1-Blue (white bar) and XL1-Red (black bar) was used to calculate $\mu_{\mathrm{bp}}$. In all cases, all known 77 rifampin-resistant rpoB alleles were used to calculate the mutation rate. Error bars denote the standard deviation of at least three biological replicates.
dnaQ926, and observed mutation rates in the absence of mutagens to be modestly improved compared to MP1 through a rifampin-resistance assay using the nearly wildtype E. coli MG1655 $\Delta$ recA::apra (Table 3.1), enabling an average of $9.9 \times 10^{-8}$ substitutions $\mathrm{bp}^{-1}$ generation ${ }^{-1}$ (Figure 3.2). Since $d n a Q 926$ abrogates the proofreading component of DNA replication, we began assessing additional genes that when expressed from the MP can further enhance mutation rate.

## 3.3 - DNA methylation state manipulation enhances mutagenesis

Mismatch repair reduces the error rate of bacterial DNA replication by a factor of up to $\sim 10^{321}$. Specialized proteins monitor (MutSL) and excise (MutH) mismatched nucleotides following DNA replication, using DNA methylation (Dam) to indicate the parental strand and thus the basis for correction. Not surprisingly, the deletion of mutS, $m u t L$, or $m u t H$, and the overexpression of dam are known to have a strong mutator effect due to impaired mismatch repair ${ }^{4}$.

We added wild-type dam downstream of dnaQ926 on the same arabinoseinducible expression cassette to yield MP3, and observed increased mutagenesis potency but also increased uninduced background mutagenesis, likely due to a strong cryptic $\sigma^{70}$


Figure 3.3| Cryptic $\boldsymbol{\sigma}^{70}$ promoter at the 3' end of the dnaQ926 ORF. Annotated sequence of the predicted $\sigma^{70}$ promoter in MP3 bridging the $3^{\prime}$ end of the dnaQ926 ORF and RBS driving the dam ORF.
promoter at the 3' end of dnaQ926 (Figure 3.3). Overall, MP3 resulted in a 3-fold mutagenesis potency increase in the presence of arabinose relative to MP2 but $>60$-fold increase in background mutagenesis, greatly reducing the dynamic range of induced mutagenesis to only 11-fold (Figure 3.2).

To restore dynamic range, we installed the gene encoding the hemimethylated GATC-binding domain SeqA downstream of dam. Low-level expression of seqA is known to delay Dam methylation of hemimethylated GATC sequences ${ }^{25}$ and induce positive supercoils in chromosomal and episomal $\mathrm{DNA}^{26}$, which may reduce MP gene transcription in the absence of arabinose. Conversely, high-level seq $A$ expression results in a potent mutator response ${ }^{8}$ and induction of negative supercoils in chromosomal and episomal $\mathrm{DNA}^{26}$, potentially increasing global gene transcription, including that of the MP, upon induction with arabinose. Indeed, the MP carrying dnaQ926, dam, and seqA (MP4) resulted in $>60$-fold reduced background and 2-fold improved mutagenesis potency in the presence of arabinose, representing a cumulative $>100$-fold improvement in dynamic range, relative to MP3 (Figure 3.2). In agreement with previous reports showing that dominant-negative $d n a Q$ mutants partially saturate the mismatch repair response ${ }^{27}$, dominant-negative variants of $m u t S^{8,9}$, mutL $^{5,6}$, or $m u t H^{6}$ with $d n a Q 926$ had no additional effect on mutagenesis (Tables 3.2 and 3.3). Cumulatively, expression of dam and seqA from MP4 is sufficient to disrupt the mismatch repair response, enabling an average of $4.4 \times 10^{-7}$ substitutions $\mathrm{bp}^{-1}$ generation ${ }^{-1}$.


Table 3.2 | Summary of all ORFs carried by the MPs. All MPs use the identical vector backbone: a cloDF13 origin of replication (20-40 copies/cell), a chloramphenicol resistance cassette, the arabinose responsive promoter $\mathrm{P}_{\mathrm{BAD}}$ driving the mutator genes, and the weak promoter $\mathrm{P}_{\mathrm{C}}$ driving araC. Genes carried by each MP are arranged in the order found in the table and are highlighted according to their mechanism of action and/or the canonical repair pathway that they disrupt: proofreading (blue), translesion synthesis (purple), methyl-directed mismatch repair (red), base excision repair (green), base selection (yellow) and unknown (black). Additional optimizations included: codon usage optimization (opt) and increased ribosome-binding site strength $\left({ }^{*}\right)$. Boxes are not drawn to scale.

| Name | Uninduced $\mu_{\text {bp }}$ | Induced $\mu_{\text {bp }}$ | Viability (\%) | Name | Uninduced $\mu_{\mathrm{bp}}$ | Induced $\mu_{\text {bp }}$ | Viability (\%) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| None | $3.26 \mathrm{E}-11$ | $6.07 \mathrm{E}-12$ | 100 | MP-P8 | $5.49 \mathrm{E}-10$ | $1.31 \mathrm{E}-07$ | 32.8 |
| MP1 | $8.20 \mathrm{E}-10$ | $6.42 \mathrm{E}-08$ | 87.5 | MP-P9 | $3.28 \mathrm{E}-08$ | $7.04 \mathrm{E}-06$ | 2.9 |
| MP2 | $2.77 \mathrm{E}-10$ | $9.85 \mathrm{E}-08$ | 136.8 | MP6 | $2.44 \mathrm{E}-09$ | $6.24 \mathrm{E}-06$ | 1.7 |
| MP-B2 | $0.00 \mathrm{E}+00$ | $0.00 \mathrm{E}+00$ | 25.4 | MP-P11 | $1.66 \mathrm{E}-09$ | $5.30 \mathrm{E}-06$ | 1.4 |
| MP-B4 | $0.00 \mathrm{E}+00$ | $0.00 \mathrm{E}+00$ | 45.8 | MP-Q | $4.49 \mathrm{E}-10$ | $1.35 \mathrm{E}-07$ | 14.7 |
| MP-B5 | $0.00 \mathrm{E}+00$ | $0.00 \mathrm{E}+00$ | 55.9 | MP-Q2 | $1.55 \mathrm{E}-09$ | $9.24 \mathrm{E}-08$ | 20.6 |
| MP-C2 | $0.00 \mathrm{E}+00$ | $0.00 \mathrm{E}+00$ | 63.6 | MP-Q3 | $2.37 \mathrm{E}-10$ | $9.36 \mathrm{E}-08$ | 16.8 |
| MP-C3 | $0.00 \mathrm{E}+00$ | $0.00 \mathrm{E}+00$ | 53.4 | MP-Q4 | $1.94 \mathrm{E}-09$ | $2.64 \mathrm{E}-07$ | 15 |
| MP-D3 | $0.00 \mathrm{E}+00$ | $2.31 \mathrm{E}-09$ | 24.2 | MP-Q5 | $1.92 \mathrm{E}-09$ | $1.09 \mathrm{E}-07$ | 22.5 |
| MP-D4 | $0.00 \mathrm{E}+00$ | $2.59 \mathrm{E}-09$ | 68.6 | MP-Q6 | $9.86 \mathrm{E}-10$ | $1.83 \mathrm{E}-07$ | 16.3 |
| MP-E | $0.00 \mathrm{E}+00$ | $2.13 \mathrm{E}-10$ | 61 | MP5 | $4.79 \mathrm{E}-09$ | $2.01 \mathrm{E}-06$ | 3.8 |
| MP-E2 | $3.98 \mathrm{E}-10$ | $6.95 \mathrm{E}-10$ | 40.7 | MP-Q8 | $1.70 \mathrm{E}-10$ | $4.82 \mathrm{E}-08$ | 37.4 |
| MP-F2 | $9.83 \mathrm{E}-10$ | $2.68 \mathrm{E}-09$ | 48.3 | MP-Q9 | $2.50 \mathrm{E}-10$ | $1.88 \mathrm{E}-08$ | 73.7 |
| MP-F3 | $0.00 \mathrm{E}+00$ | $4.59 \mathrm{E}-09$ | 73.7 | MP-Q10 | $2.26 \mathrm{E}-09$ | $1.04 \mathrm{E}-08$ | 81.4 |
| MP-H | $0.00 \mathrm{E}+00$ | $7.07 \mathrm{E}-09$ | 94.1 | MP-Q11 | $1.16 \mathrm{E}-10$ | $1.15 \mathrm{E}-08$ | 66.1 |
| MP-H2 | $7.15 \mathrm{E}-10$ | $9.61 \mathrm{E}-09$ | 35.6 | MP-Q12 | $2.40 \mathrm{E}-10$ | $5.48 \mathrm{E}-09$ | 144.9 |
| MP-H3 | $1.27 \mathrm{E}-10$ | $2.75 \mathrm{E}-09$ | 71.2 | MP-Q13 | $3.98 \mathrm{E}-10$ | $4.24 \mathrm{E}-09$ | 101.7 |
| MP-H4 | $0.00 \mathrm{E}+00$ | $2.03 \mathrm{E}-09$ | 63.6 | MP-R | $9.47 \mathrm{E}-10$ | $1.64 \mathrm{E}-07$ | 13.9 |
| MP-I | $0.00 \mathrm{E}+00$ | $4.26 \mathrm{E}-09$ | 61 | MP-R2 | $7.52 \mathrm{E}-09$ | $2.37 \mathrm{E}-07$ | 13.1 |
| MP-I2 | $0.00 \mathrm{E}+00$ | $1.75 \mathrm{E}-09$ | 83.9 | MP-R3 | $1.12 \mathrm{E}-08$ | $1.17 \mathrm{E}-06$ | 4.3 |
| MP-I3 | $0.00 \mathrm{E}+00$ | $2.72 \mathrm{E}-09$ | 89 | MP-R4 | $2.34 \mathrm{E}-09$ | $6.94 \mathrm{E}-07$ | 3.7 |
| MP-J | $0.00 \mathrm{E}+00$ | $0.00 \mathrm{E}+00$ | 223.7 | MP-R5 | $4.90 \mathrm{E}-08$ | $4.35 \mathrm{E}-06$ | 5.8 |
| MP-J2 | $0.00 \mathrm{E}+00$ | $0.00 \mathrm{E}+00$ | 142.4 | MP-R6 | $5.80 \mathrm{E}-09$ | $1.71 \mathrm{E}-05$ | 0.7 |
| MP-J3 | $0.00 \mathrm{E}+00$ | $0.00 \mathrm{E}+00$ | 137.3 | MP-S | $3.23 \mathrm{E}-11$ | $6.29 \mathrm{E}-09$ | 115.3 |
| MP3 | $1.74 \mathrm{E}-08$ | $2.66 \mathrm{E}-07$ | 31.2 | MP-S2 | $1.73 \mathrm{E}-11$ | $5.76 \mathrm{E}-09$ | 313 |
| MP-K7 | $6.53 \mathrm{E}-10$ | $8.99 \mathrm{E}-08$ | 9.4 | MP-S3 | $6.85 \mathrm{E}-11$ | $2.68 \mathrm{E}-08$ | 428.4 |
| MP4 | $2.73 \mathrm{E}-10$ | $4.38 \mathrm{E}-07$ | 22.9 | MP-T | $1.92 \mathrm{E}-10$ | $2.77 \mathrm{E}-07$ | 13.6 |
| MP-K9 | $1.55 \mathrm{E}-09$ | $8.99 \mathrm{E}-08$ | 23.4 | MP-T2 | $1.93 \mathrm{E}-09$ | $9.59 \mathrm{E}-08$ | 23.1 |
| MP-K10 | $1.12 \mathrm{E}-11$ | $3.07 \mathrm{E}-08$ | 80.6 | MP-T3 | $8.70 \mathrm{E}-09$ | $1.55 \mathrm{E}-07$ | 12.6 |
| MP-K11 | $9.87 \mathrm{E}-11$ | $1.85 \mathrm{E}-08$ | 63.6 | MP-T4 | $6.09 \mathrm{E}-09$ | $2.42 \mathrm{E}-07$ | 13.7 |
| MP-K12 | $2.68 \mathrm{E}-10$ | $1.48 \mathrm{E}-08$ | 86.4 | MP-T5 | $6.28 \mathrm{E}-09$ | $1.65 \mathrm{E}-07$ | 21.7 |
| MP-K13 | $0.00 \mathrm{E}+00$ | $1.83 \mathrm{E}-08$ | 63.6 | MP-T6 | $2.50 \mathrm{E}-09$ | $2.29 \mathrm{E}-07$ | 16 |
| MP-K14 | $1.12 \mathrm{E}-09$ | $0.00 \mathrm{E}+00$ | 0.8 | MP-U | $1.90 \mathrm{E}-09$ | $2.66 \mathrm{E}-05$ | 0.6 |
| MP-L | $0.00 \mathrm{E}+00$ | $0.00 \mathrm{E}+00$ | 129.7 | MP-U2 | $8.02 \mathrm{E}-10$ | $2.88 \mathrm{E}-06$ | 1.7 |
| MP-L2 | $0.00 \mathrm{E}+00$ | $0.00 \mathrm{E}+00$ | 93.8 | MP-U3 | $6.66 \mathrm{E}-09$ | $1.49 \mathrm{E}-06$ | 2.8 |
| MP-P | $5.32 \mathrm{E}-10$ | $3.84 \mathrm{E}-09$ | 144.9 | MP-U4 | $1.36 \mathrm{E}-09$ | $2.51 \mathrm{E}-06$ | 3.7 |
| MP-P3 | $1.14 \mathrm{E}-09$ | $2.51 \mathrm{E}-07$ | 33.3 | MP-V | $4.59 \mathrm{E}-10$ | $1.49 \mathrm{E}-07$ | 5.7 |
| MP-P4 | $4.58 \mathrm{E}-09$ | $1.57 \mathrm{E}-07$ | 81.4 | MP-V2 | $7.79 \mathrm{E}-10$ | $2.88 \mathrm{E}-07$ | 7.9 |
| MP-P5 | $2.83 \mathrm{E}-10$ | $6.06 \mathrm{E}-07$ | 26.7 | MP-V3 | $2.95 \mathrm{E}-09$ | $6.44 \mathrm{E}-07$ | 3.4 |
| MP-P6 | $4.90 \mathrm{E}-10$ | $1.13 \mathrm{E}-07$ | 10.7 | MP-V4 | $1.35 \mathrm{E}-09$ | $5.98 \mathrm{E}-07$ | 4.6 |
| MP-P7 | $3.54 \mathrm{E}-10$ | $7.58 \mathrm{E}-08$ | 83.9 | MP-V5 | $2.38 \mathrm{E}-10$ | $5.09 \mathrm{E}-07$ | 6.2 |

Table 3.3 | Summary of induced and uninduced mutagenesis levels for all designed MPs. All MPs were tested using the rifampin resistance assay to assess their relative mutagenic load under uninduced (glucose) and induced (arabinose) conditions. The viability of the MP-carrying strains under the induced conditions (as a percentage of the viability of the strain without an MP) is also shown. Ideal MPs show low background and high induced mutagenesis, with only moderate reductions in viability.

## 3.4 - Cytosine deamination and reduced base excision repair

Overexpression of the catalytic domains of several cytidine deaminases in E. coli has been shown to have a mutagenic effect, resulting in primarily $\mathrm{C} \rightarrow \mathrm{T}$ transitions through a deoxyuracil intermediate ${ }^{28}$. The cytidine deaminase CDA1 from Petromyzon marinus is reported to promote the mutation of prokaryotic and eukaryotic genomic DNA ${ }^{28}$. Impairing uracil-DNA glycosylase (Ung) synergizes with the effect of deaminases and can enhance mutagenesis through disruption of the native uracil-excision repair pathway ${ }^{28}$ (Figure 3.1). Two natural protein inhibitors of Ung, Ugi and p56 ${ }^{29}$, inhibit Ung through mimicry of structural and electronic features of uracil-containing $\mathrm{DNA}^{29}$. As the p56:Ung interaction has been shown to be less stable than the Ugi:Ung interaction $^{29}$, we proceeded with Ugi.

We placed ugi and $c d a l$ downstream of $d n a Q 926, d a m$ and seqA to yield MP5, and observed a 5 -fold mutagenesis potency increase under induced conditions, representing an 18-fold increase in background mutagenesis compared to MP4 (Figure


Figure 3.4|Cryptic $\boldsymbol{\sigma}^{70}$ promoters at the 3 ' end of the seqA ORF. Annotated sequence of the predicted $\sigma^{70}$ promoters in MP5 bridging the 3 ' end of the seqA ORF and native RBS driving the ugi ORF.
3.2). This background increase was caused by two predicted $\sigma^{70}$ promoters at the $3^{\prime}$ end of the seq $A$ open reading frame, resulting in constitutive $u g i$ and $c d a l$ transcription (Figure 3.4). We considered this background mutation rate for MP5 to be acceptable, as it was only $\sim 5$-fold higher than the starting MP1. Alternative cytosine deaminases, including rat APOBEC1 and human AID, generally resulted in weaker effects on mutation rate than CDA1, in agreement with previous reports (CDA1 $\gg$ AID $\approx$ APOBEC1) $)^{28}$ (Tables 3.2 and 3.3). Overall, MP5 yielded $2.0 \times 10^{-6}$ substitutions $\mathrm{bp}^{-1}$ generation ${ }^{-1}$, a 31-fold increase in mutation rate relative to MP1 (Tables 3.2 and 3.3).

## 3.5 - Impairing mutagenic nucleobase export

Two major determinants of base selection during DNA replication are the catalytic alpha subunit of E. coli DNA Pol III, and the intracellular concentration of dNTPs (Figure 3.1). Mutations affecting the former are generally not viable or exert a mutator effect through reduced affinity to the proofreading domain, $\mathrm{DnaQ}^{7}$, whereas perturbations affecting the latter are generally more tolerated and can be modified to affect the mutational spectrum ${ }^{10}$. We screened a number of proteins that are known to compromise intracellular dNTP pools, and found expression of the emr $R$ transcriptional repressor to be the most promising (Figure 3.2; Tables 3.2 and 3.3).

Derepression by EmrR results in upregulation of emr $A B$, which produces a multidrug efflux pump responsible for antibiotic resistance and the putative export of mutagenic nucleobase intermediates ${ }^{30}$. In an unbiased screen, emr $R$ overexpression was found to have a potent mutator effect ${ }^{8}$, presumably as a consequence of retaining these mutagenic nucleobases within the cell. To decrease background mutagenesis compared to

MP5, we placed the emrR cassette between seqA and $u g i$, thereby disrupting the strong predicted $\sigma^{70}$ promoter, yielding MP6. MP6 exhibited 2 -fold lower background mutagenesis, while improving the overall mutator effect under induced conditions by 3fold (Figure 3.1).

## 3.6 - Features of the MP6 mutagenesis system

We chose MP6 for in-depth characterization because it offered the highest mutagenic potency with acceptable levels of toxicity ( $<100$-fold reduction in cell viability under maximal MP induction compared to the uninduced control). We retained native bacterial ribosome-binding sites (RBSs) upstream of the ORFs for four of the six MP6 genes. The exceptions are dam, which natively lacks a canonical RBS in the E. coli genome, and cdal, which derives from the eukaryote $P$. marinus and thus does not use a bacterial Shine-Dalgarno sequence. In an attempt to further enhance mutational potency by modulating the expression of dnaQ926, dam, seqA, emrR, ugi, and $c d a l$, we varied RBS upstream of each of these six genes by individually mutating them to fully complement the 16 S rRNA, and resulting in optimal transcript translation. Interestingly, strengthening the RBSs upstream of each of the six genes generally reduced the potency of the MP, with the exception of the seqA and dnaQ926 RBSs (Tables 3.2 and 3.3). Strengthening the seqA RBS proved highly lethal under induced conditions, likely as a consequence of impeded genomic replication (Tables 3.2 and 3.3). Increasing the strength of the dnaQ926 RBS enhanced the mutagenic potency of the MP by 4-fold under induced conditions, concomitant with a minor increase in background mutagenesis, but was more toxic to bacteria as evidenced by a greater loss of viability under induced
conditions (Tables 3.2 and 3.3). Additionally, measurement of the mutation rate of the resulting MP became irreproducible, consistent with MP instability under these conditions. These findings together suggest that additional mutagenic potency gains beyond that of MP6 may result in error catastrophe and reduced MP stability.

When induced, MP6 results in a 322,000 -fold increase in mutation rate of chromosomal DNA over that of wild-type E. coli, and a 100 -fold increase in mutation rate relative to that of MP1. Induced MP6 results in an average of $6.2 \times 10^{-6}$ substitutions $\mathrm{bp}^{-1}$ generation ${ }^{-1}$, representing to our knowledge the most potent inducible and genetically encodable mutagenesis method in bacteria reported to date (Table 3.4). This potency compares favorably to overexpression of PolB (D156A) $\left(\mu_{\mathrm{bp}}=3.2 \times 10^{-6}\right)$, dnaQ926 $\left(\mu_{\mathrm{bp}}=\right.$ $\left.2.4 \times 10^{-6}\right)$, or mutD5 $\left(\mu_{\mathrm{bp}}=3.9 \times 10^{-7}\right)$ (Table 3.4). We note that most previously published mutagenic constructs are not inducible, negatively affect host viability, and require overexpression of the mutagenic protein. In contrast, the MPs described here rely on lowlevel expression of multiple genes, thereby affecting multiple pathways and enabling broad mutagenic spectra.

Additional permutations of this design or the inclusion of alternative mutators impaired overall mutation rate, or strongly decreased host viability, as evidenced by the characteristics of 80 candidate MPs with mutation rates spanning five orders of magnitude (Figures 3.5-3.7; Tables 3.2 and 3.3). We observed that a loss of bacterial viability proportional to mutagenic potency beyond a mutation rate of $\sim 4 \times 10^{-7}$ substitutions $\mathrm{bp}^{-1}$ generation ${ }^{-1}$, corresponding to an average of $\sim 1.9$ substitutions genome ${ }^{-}$ ${ }^{1}$ generation $^{-1}$. Given that $\sim 10-30 \%$ of the $E$. coli genome has been estimated to be essential ${ }^{31}$, this rate corresponds to $\sim 0.2-0.6$ mutations in an essential gene/generation.

| Source organism | Gene(s) | Fraction Rif ${ }^{\text {R }}$ |  | $\mu_{\text {bp }}\left(\right.$ bp $^{-1}$ generation $\left.^{-1}\right)$ |  |  | vs <br> MP6 <br> (\%) | Dynamic range* | Ref. |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | - MP | + MP | - MP | + MP | Fold |  |  |  |
| Ec | dam | $9.00 \mathrm{E}-09$ | $3.00 \mathrm{E}-07$ | $6.16 \mathrm{E}-11$ | $2.05 \mathrm{E}-09$ | 0 | 0 | - | ${ }^{38}$ |
| Ec | dnaE173 | $5.00 \mathrm{E}-09$ | $7.20 \mathrm{E}-06$ | $3.42 \mathrm{E}-11$ | $4.93 \mathrm{E}-08$ | 1440 | 1 | 24 | 7 |
| Ec | dnaQ926 | $3.00 \mathrm{E}-08$ | $3.47 \mathrm{E}-04$ | $2.05 \mathrm{E}-10$ | $2.38 \mathrm{E}-06$ | 11567 | 38 | - | 28 |
| Ec | mutD5 | $3.00 \mathrm{E}-08$ | $5.70 \mathrm{E}-05$ | $2.05 \mathrm{E}-10$ | $3.90 \mathrm{E}-07$ | 1900 | 6 | - | 28 |
| $\boldsymbol{S c}$ | mag1 | $5.13 \mathrm{E}-08$ | $3.61 \mathrm{E}-06$ | $3.51 \mathrm{E}-10$ | $2.47 \mathrm{E}-08$ | 70 | 0 | - | 39 |
| Sc | mag1 | $1.00 \mathrm{E}-08$ | $2.00 \mathrm{E}-06$ | $6.85 \mathrm{E}-11$ | $1.37 \mathrm{E}-08$ | 200 | 0 | 200 | 47 |
| Ec | dinB | $4.00 \mathrm{E}-08$ | $4.55 \mathrm{E}-06$ | $2.74 \mathrm{E}-10$ | $3.11 \mathrm{E}-08$ | 114 | 0 | 114 | 48 |
| Ec | dnaE (K655Y) | $1.00 \mathrm{E}-08$ | $8.45 \mathrm{E}-06$ | $6.85 \mathrm{E}-11$ | $5.78 \mathrm{E}-08$ | 845 | 1 | - | 32 |
| Hs | AID | $1.30 \mathrm{E}-08$ | $1.03 \mathrm{E}-07$ | $8.90 \mathrm{E}-11$ | $7.05 \mathrm{E}-10$ | 8 | 0 | 8 | 49 |
| $\boldsymbol{R n}$ | APOBEC1 | $2.53 \mathrm{E}-08$ | $1.23 \mathrm{E}-05$ | $1.73 \mathrm{E}-10$ | $8.42 \mathrm{E}-08$ | 486 | 1 | 14 | 50 |
| Rn | APOBEC2 | $2.53 \mathrm{E}-08$ | $2.50 \mathrm{E}-08$ | $1.73 \mathrm{E}-10$ | $1.71 \mathrm{E}-10$ | 1 | 0 | - | 50 |
| Hs | AID | $2.53 \mathrm{E}-08$ | $1.66 \mathrm{E}-07$ | $1.73 \mathrm{E}-10$ | $1.14 \mathrm{E}-09$ | 7 | 0 | - | 50 |
| Hs | APOBEC3C | $2.53 \mathrm{E}-08$ | $2.93 \mathrm{E}-07$ | $1.73 \mathrm{E}-10$ | $2.01 \mathrm{E}-09$ | 12 | 0 | - | 50 |
| Hs | APOBEC3G | $2.53 \mathrm{E}-08$ | $2.70 \mathrm{E}-07$ | $1.73 \mathrm{E}-10$ | $1.85 \mathrm{E}-09$ | 11 | 0 | - | 50 |
| Ec | mutH (E56A) | $4.40 \mathrm{E}-08$ | $8.74 \mathrm{E}-06$ | $3.01 \mathrm{E}-10$ | $5.98 \mathrm{E}-08$ | 199 | 1 | - | 6 |
| Ec | mutH (K116E) | $4.40 \mathrm{E}-08$ | $8.40 \mathrm{E}-06$ | $3.01 \mathrm{E}-10$ | $5.75 \mathrm{E}-08$ | 191 | 1 | - | 6 |
| Ec | mutH (K79E) | $4.40 \mathrm{E}-08$ | $7.00 \mathrm{E}-06$ | $3.01 \mathrm{E}-10$ | $4.79 \mathrm{E}-08$ | 159 | 1 | - | ${ }^{6}$ |
| Ec | mutH (E77A) | $4.40 \mathrm{E}-08$ | $6.94 \mathrm{E}-06$ | $3.01 \mathrm{E}-10$ | $4.75 \mathrm{E}-08$ | 158 | 1 | - | ${ }^{6}$ |
| Ec | mutH (D70A) | $4.40 \mathrm{E}-08$ | $6.88 \mathrm{E}-06$ | $3.01 \mathrm{E}-10$ | $4.71 \mathrm{E}-08$ | 156 | 1 | - | 6 |
| Ec | mutH C 45 | $4.40 \mathrm{E}-08$ | $9.10 \mathrm{E}-07$ | $3.01 \mathrm{E}-10$ | $6.23 \mathrm{E}-09$ | 21 | 0 | - | 6 |
| Ec | mutL (R95F/N302A) | $4.40 \mathrm{E}-08$ | $1.17 \mathrm{E}-05$ | $3.01 \mathrm{E}-10$ | $8.03 \mathrm{E}-08$ | 267 | 1 | - | ${ }^{6}$ |
| Ec | mutL (R261H) | $4.40 \mathrm{E}-08$ | $1.04 \mathrm{E}-05$ | $3.01 \mathrm{E}-10$ | $7.13 \mathrm{E}-08$ | 237 | 1 | - | 6 |
| Ec | mutL (E29A) | $4.40 \mathrm{E}-08$ | $8.32 \mathrm{E}-06$ | $3.01 \mathrm{E}-10$ | $5.70 \mathrm{E}-08$ | 189 | 1 | - | ${ }^{6}$ |
| Ec | mutL (K307A) | $4.40 \mathrm{E}-08$ | $6.75 \mathrm{E}-06$ | $3.01 \mathrm{E}-10$ | $4.62 \mathrm{E}-08$ | 153 | 1 | - | 6 |
| Ec | mutL (N302A) | $4.40 \mathrm{E}-08$ | $3.50 \mathrm{E}-06$ | $3.01 \mathrm{E}-10$ | $2.40 \mathrm{E}-08$ | 80 | 0 | - | ${ }^{6}$ |
| Ec | mutL (R95F) | $4.40 \mathrm{E}-08$ | $1.27 \mathrm{E}-07$ | $3.01 \mathrm{E}-10$ | $8.69 \mathrm{E}-10$ | 3 | 0 | - | ${ }^{6}$ |
| Ec | mutL (K159E) | $4.40 \mathrm{E}-08$ | $7.26 \mathrm{E}-06$ | $3.01 \mathrm{E}-10$ | $4.97 \mathrm{E}-08$ | 165 | 1 | - | ${ }^{6}$ |
| Ec | mutL (R266E) | $4.40 \mathrm{E}-08$ | $6.05 \mathrm{E}-06$ | $3.01 \mathrm{E}-10$ | $4.14 \mathrm{E}-08$ | 138 | 1 | - | ${ }^{6}$ |
| Ec | mutL (R177E) | $4.40 \mathrm{E}-08$ | $1.77 \mathrm{E}-06$ | $3.01 \mathrm{E}-10$ | $1.21 \mathrm{E}-08$ | 40 | 0 | - | 6 |
| Ec | mutL (I90R) | $4.40 \mathrm{E}-08$ | $1.56 \mathrm{E}-07$ | $3.01 \mathrm{E}-10$ | $1.07 \mathrm{E}-09$ | 4 | 0 | - | 6 |
| Ec | mutL (R237E) | $4.40 \mathrm{E}-08$ | $1.40 \mathrm{E}-07$ | $3.01 \mathrm{E}-10$ | $9.58 \mathrm{E}-10$ | 3 | 0 | - | 6 |
| Ec | mutL (G238A) | $4.40 \mathrm{E}-08$ | $5.40 \mathrm{E}-08$ | $3.01 \mathrm{E}-10$ | $3.70 \mathrm{E}-10$ | 1 | 0 | - | ${ }^{6}$ |
| Ec | mutL (G238D) | $4.40 \mathrm{E}-08$ | $1.03 \mathrm{E}-05$ | $3.01 \mathrm{E}-10$ | $7.05 \mathrm{E}-08$ | 234 | 1 | - | ${ }^{6}$ |
| Ec | mutL (I90E) | $4.40 \mathrm{E}-08$ | $1.70 \mathrm{E}-08$ | $3.01 \mathrm{E}-10$ | $1.16 \mathrm{E}-10$ | 0 | 0 | - | 6 |
| Ec | mutS (S668A/T669V) | $4.40 \mathrm{E}-08$ | $1.33 \mathrm{E}-05$ | $3.01 \mathrm{E}-10$ | $9.12 \mathrm{E}-08$ | 303 | 1 | - | 6 |
| Ec | mutS (K620M) | $4.40 \mathrm{E}-08$ | $1.21 \mathrm{E}-05$ | $3.01 \mathrm{E}-10$ | $8.31 \mathrm{E}-08$ | 276 | 1 | - | 6 |
| Ec | mutS (D693A) | $4.40 \mathrm{E}-08$ | $1.15 \mathrm{E}-05$ | $3.01 \mathrm{E}-10$ | $7.90 \mathrm{E}-08$ | 262 | 1 | - | ${ }^{6}$ |
| Ec | mutS (E694Q) | $4.40 \mathrm{E}-08$ | $1.13 \mathrm{E}-05$ | $3.01 \mathrm{E}-10$ | $7.75 \mathrm{E}-08$ | 257 | 1 | - | ${ }^{6}$ |
| Ec | mutS (E694A) | $4.40 \mathrm{E}-08$ | $8.84 \mathrm{E}-06$ | $3.01 \mathrm{E}-10$ | $6.05 \mathrm{E}-08$ | 201 | 1 | - | ${ }^{6}$ |
| Ec | $\begin{aligned} & \text { mutS } \\ & (\mathrm{E} 694 \mathrm{~A} / \mathrm{S} 668 \mathrm{~A} / \mathrm{T} 669 \mathrm{~V}) \end{aligned}$ | $4.40 \mathrm{E}-08$ | $8.02 \mathrm{E}-06$ | $3.01 \mathrm{E}-10$ | $5.49 \mathrm{E}-08$ | 182 | 1 | - | ${ }^{6}$ |
| Ec | mutS (D693N) | $4.40 \mathrm{E}-08$ | $5.58 \mathrm{E}-06$ | $3.01 \mathrm{E}-10$ | $3.82 \mathrm{E}-08$ | 127 | 1 | - | ${ }^{6}$ |
| Ec | mutS (H760A) | $4.40 \mathrm{E}-08$ | $8.01 \mathrm{E}-07$ | $3.01 \mathrm{E}-10$ | $5.48 \mathrm{E}-09$ | 18 | 0 | - | ${ }^{6}$ |
| Ec | mutS (H728A) | $4.40 \mathrm{E}-08$ | $4.48 \mathrm{E}-07$ | $3.01 \mathrm{E}-10$ | $3.07 \mathrm{E}-09$ | 10 | 0 | - | ${ }^{6}$ |
| Ec | mutS (F596A) | $4.40 \mathrm{E}-08$ | $3.14 \mathrm{E}-07$ | $3.01 \mathrm{E}-10$ | $2.15 \mathrm{E}-09$ | 7 | 0 | - | ${ }^{6}$ |
| Ec | mutS (S612A) | $4.40 \mathrm{E}-08$ | $3.70 \mathrm{E}-08$ | $3.01 \mathrm{E}-10$ | $2.53 \mathrm{E}-10$ | 1 | 0 | - | ${ }^{6}$ |
| Ec | mutS (F36A) | $4.40 \mathrm{E}-08$ | $1.06 \mathrm{E}-05$ | $3.01 \mathrm{E}-10$ | $7.26 \mathrm{E}-08$ | 241 | 1 | - | ${ }^{6}$ |
| Ec | mutS (E38Q) | $4.40 \mathrm{E}-08$ | $4.19 \mathrm{E}-06$ | $3.01 \mathrm{E}-10$ | $2.87 \mathrm{E}-08$ | 95 | 0 | - | ${ }^{6}$ |
| Ec | mutS (D162R/E164R) | $4.40 \mathrm{E}-08$ | $4.30 \mathrm{E}-06$ | $3.01 \mathrm{E}-10$ | $2.94 \mathrm{E}-08$ | 98 | 0 | - | 6 |
| Ec | mutS (R163E) | $4.40 \mathrm{E}-08$ | $3.90 \mathrm{E}-08$ | $3.01 \mathrm{E}-10$ | $2.67 \mathrm{E}-10$ | 1 | 0 | - | ${ }^{6}$ |
| Ec | mutS (R197E/R198E) | $4.40 \mathrm{E}-08$ | $1.11 \mathrm{E}-05$ | $3.01 \mathrm{E}-10$ | $7.61 \mathrm{E}-08$ | 253 | 1 | - | ${ }^{6}$ |
| Ec | mutS <br> (R197E/R198E/R199E) | $4.40 \mathrm{E}-08$ | $6.15 \mathrm{E}-06$ | $3.01 \mathrm{E}-10$ | $4.21 \mathrm{E}-08$ | 140 | 1 | - | ${ }^{6}$ |
| Ec | mutS (E177A) | $4.40 \mathrm{E}-08$ | $1.10 \mathrm{E}-05$ | $3.01 \mathrm{E}-10$ | $7.50 \mathrm{E}-08$ | 249 | 1 | - | ${ }^{6}$ |
| Ec | mutS (T115A) | $4.40 \mathrm{E}-08$ | $7.99 \mathrm{E}-06$ | $3.01 \mathrm{E}-10$ | $5.47 \mathrm{E}-08$ | 182 | 1 | - | ${ }_{8}$ |
| Ec | dam | $3.00 \mathrm{E}-08$ | $2.00 \mathrm{E}-06$ | $2.05 \mathrm{E}-10$ | $1.37 \mathrm{E}-08$ | 67 | 0 | - | 8 |
| Ec | emrR | $3.00 \mathrm{E}-08$ | $5.00 \mathrm{E}-06$ | $2.05 \mathrm{E}-10$ | $3.42 \mathrm{E}-08$ | 167 | 1 | - | 8 |
| Ec | mutS* | $3.00 \mathrm{E}-08$ | $3.00 \mathrm{E}-07$ | $2.05 \mathrm{E}-10$ | $2.05 \mathrm{E}-09$ | 10 | 0 | - | 8 |
| Ec | seqA | $3.00 \mathrm{E}-08$ | $8.00 \mathrm{E}-07$ | $2.05 \mathrm{E}-10$ | 5.48E-09 | 27 | 0 | - | 8 |
| Ec | $\operatorname{din} B$ | $3.00 \mathrm{E}-08$ | $3.00 \mathrm{E}-07$ | $2.05 \mathrm{E}-10$ | $2.05 \mathrm{E}-09$ | 10 | 0 | - | 8 |
| Pa | $n f x B$ | $8.00 \mathrm{E}-08$ | $3.50 \mathrm{E}-06$ | $5.48 \mathrm{E}-10$ | $2.40 \mathrm{E}-08$ | 44 | 0 | - | 45 |
| Ll | dnaN | $8.00 \mathrm{E}-08$ | $9.80 \mathrm{E}-08$ | $5.48 \mathrm{E}-10$ | $6.71 \mathrm{E}-10$ | 1 | 0 | - | 45 |
| Ll | dnaA | $8.00 \mathrm{E}-08$ | $1.90 \mathrm{E}-07$ | $5.48 \mathrm{E}-10$ | $1.30 \mathrm{E}-09$ | 2 | 0 | - | 45 |
| Ll | uvrA, ysjE | $8.00 \mathrm{E}-08$ | $3.90 \mathrm{E}-08$ | $5.48 \mathrm{E}-10$ | $2.67 \mathrm{E}-10$ | 0 | 0 | - | 45 |
| Ll | uvrA | $8.00 \mathrm{E}-08$ | $1.10 \mathrm{E}-07$ | $5.48 \mathrm{E}-10$ | $7.53 \mathrm{E}-10$ | 1 | 0 | - | 45 |
| Ll | rnhA, sipL, purR | $8.00 \mathrm{E}-08$ | $4.80 \mathrm{E}-08$ | $5.48 \mathrm{E}-10$ | $3.29 \mathrm{E}-10$ | 1 | 0 | - | 45 |
| Ll | rnhA, sipL | $8.00 \mathrm{E}-08$ | $6.70 \mathrm{E}-08$ | $5.48 \mathrm{E}-10$ | $4.59 \mathrm{E}-10$ | 1 | 0 | - | 45 |
| Ll | rnhA | $8.00 \mathrm{E}-08$ | $1.40 \mathrm{E}-08$ | $5.48 \mathrm{E}-10$ | $9.58 \mathrm{E}-11$ | 0 | 0 | - | 45 |

Table 3.4 I Comparison of MP1-MP6 with previously described mutator plasmids.

| Ec | polB | 2.20E-08 | 2.32E-06 | 1.51E-10 | 1.59E-08 | 105 | 0 | 116 | 42 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Ec | polB Q779V | $2.20 \mathrm{E}-08$ | 6.14E-08 | $1.51 \mathrm{E}-10$ | $4.20 \mathrm{E}-10$ | 3 | 0 | - | 42 |
| Ec | polB $\triangle 780-783$ | $2.20 \mathrm{E}-08$ | $5.93 \mathrm{E}-08$ | $1.51 \mathrm{E}-10$ | $4.06 \mathrm{E}-10$ | 3 | 0 | - | 42 |
| Ec | polB (D156A) | $2.20 \mathrm{E}-08$ | $4.73 \mathrm{E}-04$ | $1.51 \mathrm{E}-10$ | $3.23 \mathrm{E}-06$ | 21478 | 52 | - | 42 |
| Ec | uvrAB | $7.90 \mathrm{E}-09$ | $5.40 \mathrm{E}-08$ | $5.41 \mathrm{E}-11$ | $3.70 \mathrm{E}-10$ | 7 | 0 | - | 51 |
| Ec | uvrABC | $7.90 \mathrm{E}-09$ | $1.90 \mathrm{E}-07$ | $5.41 \mathrm{E}-11$ | $1.30 \mathrm{E}-09$ | 24 | 0 | - | 51 |
| Hs | AID | $1.00 \mathrm{E}-08$ | $1.40 \mathrm{E}-07$ | $6.85 \mathrm{E}-11$ | 9.58E-10 | 14 | 0 | - | 41 |
| Hs | AID (K10E/E156G) | $1.00 \mathrm{E}-08$ | $6.30 \mathrm{E}-07$ | $6.85 \mathrm{E}-11$ | $4.31 \mathrm{E}-09$ | 63 | 0 | - | 41 |
| Hs | AID (K34E/K160E) | $1.00 \mathrm{E}-08$ | $4.20 \mathrm{E}-07$ | $6.85 \mathrm{E}-11$ | $2.88 \mathrm{E}-09$ | 42 | 0 | - | 41 |
| Hs | AID | $2.40 \mathrm{E}-08$ | $4.90 \mathrm{E}-07$ | $1.64 \mathrm{E}-10$ | 3.35E-09 | 20 | 0 | - | 52 |
| Hs | AID-3FL | $2.40 \mathrm{E}-08$ | $3.70 \mathrm{E}-07$ | $1.64 \mathrm{E}-10$ | $2.53 \mathrm{E}-09$ | 15 | 0 | - | 52 |
| Hs | AID-3GL | $2.40 \mathrm{E}-08$ | $1.60 \mathrm{E}-07$ | $1.64 \mathrm{E}-10$ | $1.10 \mathrm{E}-09$ | 7 | 0 | - | 52 |
| Hs | AAG | $1.00 \mathrm{E}-09$ | $2.00 \mathrm{E}-07$ | $6.85 \mathrm{E}-12$ | $1.37 \mathrm{E}-09$ | 200 | 0 | 1 | 40 |
| Hs | AAG(Y127I/H136L) | $1.00 \mathrm{E}-09$ | $1.15 \mathrm{E}-05$ | $6.85 \mathrm{E}-12$ | $7.87 \mathrm{E}-08$ | 11500 | 1 | 4 | 40 |
| Ec | nrdAB | $1.00 \mathrm{E}-08$ | $8.00 \mathrm{E}-08$ | $6.85 \mathrm{E}-11$ | $5.48 \mathrm{E}-10$ | 8 | 0 | - | 10 |
| Ec | nrdEF | $1.00 \mathrm{E}-08$ | $3.50 \mathrm{E}-07$ | $6.85 \mathrm{E}-11$ | $2.40 \mathrm{E}-09$ | 35 | 0 | - | 10 |
| Ec | $\operatorname{nrdA}(\mathrm{H} 59 \mathrm{~A}) \mathrm{B}$ | $1.00 \mathrm{E}-08$ | $3.80 \mathrm{E}-07$ | $6.85 \mathrm{E}-11$ | $2.60 \mathrm{E}-09$ | 38 | 0 | - | 10 |
| Hs | APOBEC3G | $2.60 \mathrm{E}-07$ | $2.40 \mathrm{E}-06$ | $1.78 \mathrm{E}-09$ | $1.64 \mathrm{E}-08$ | 9 | 0 | - | 53 |
| Hs | APOBEC3G (E259Q) | $2.60 \mathrm{E}-07$ | $3.60 \mathrm{E}-07$ | $1.78 \mathrm{E}-09$ | $2.46 \mathrm{E}-09$ | 1 | 0 | - | 53 |
| Hs | APOBEC3G (E254R) | $2.60 \mathrm{E}-07$ | $3.50 \mathrm{E}-06$ | $1.78 \mathrm{E}-09$ | $2.40 \mathrm{E}-08$ | 13 | 0 | - | 53 |
| Hs | APOBEC3G (R313E) | $2.60 \mathrm{E}-07$ | $2.60 \mathrm{E}-07$ | $1.78 \mathrm{E}-09$ | $1.78 \mathrm{E}-09$ | 1 | 0 | - | 53 |
| Hs | APOBEC3G (R320E) | $2.60 \mathrm{E}-07$ | $5.80 \mathrm{E}-07$ | $1.78 \mathrm{E}-09$ | $3.97 \mathrm{E}-09$ | 2 | 0 | - | 53 |
| Hs | APOBEC3G <br> (R313E/R320E) | $2.60 \mathrm{E}-07$ | $3.10 \mathrm{E}-07$ | $1.78 \mathrm{E}-09$ | $2.12 \mathrm{E}-09$ | 1 | 0 | - | 53 |
| Hs | APOBEC3G (R374E) | $2.60 \mathrm{E}-07$ | $5.50 \mathrm{E}-07$ | $1.78 \mathrm{E}-09$ | $3.77 \mathrm{E}-09$ | 2 | 0 | - | 53 |
| Hs | APOBEC3G (R376E) | $2.60 \mathrm{E}-07$ | $1.90 \mathrm{E}-06$ | $1.78 \mathrm{E}-09$ | $1.30 \mathrm{E}-08$ | 7 | 0 | - | 53 |
| Hs | APOBEC3G <br> (R374E/R376E) | $2.60 \mathrm{E}-07$ | $6.90 \mathrm{E}-07$ | $1.78 \mathrm{E}-09$ | $4.72 \mathrm{E}-09$ | 3 | 0 | - | 53 |
| Hs | APOBEC3G (R213E) | $2.60 \mathrm{E}-07$ | $4.40 \mathrm{E}-07$ | $1.78 \mathrm{E}-09$ | $3.01 \mathrm{E}-09$ | 2 | 0 | - | 53 |
| Hs | APOBEC3G (R215E) | $2.60 \mathrm{E}-07$ | $3.20 \mathrm{E}-07$ | $1.78 \mathrm{E}-09$ | $2.19 \mathrm{E}-09$ | 1 | 0 | - | 53 |
| Hs | APOBEC3G <br> (R213E/R215E) | $2.60 \mathrm{E}-07$ | $2.90 \mathrm{E}-07$ | 1.78E-09 | $1.99 \mathrm{E}-09$ | 1 | 0 | - | 53 |
| Ec | dnaQ926, umuD', umuC, recA730 | $2.83 \mathrm{E}-09$ | $9.38 \mathrm{E}-06$ | $1.94 \mathrm{E}-11$ | $6.42 \mathrm{E}-08$ | 3320 | 1 | 78 | ${ }^{23}$ |
| Ec | dnaQ926 | $2.83 \mathrm{E}-09$ | $1.44 \mathrm{E}-05$ | $1.94 \mathrm{E}-11$ | $9.85 \mathrm{E}-08$ | 5087 | 2 | 355 | This work |
| Ec | dnaQ926, dam | $2.83 \mathrm{E}-09$ | $3.88 \mathrm{E}-05$ | $1.94 \mathrm{E}-11$ | $2.66 \mathrm{E}-07$ | 13723 | 4 | 15 | This work |
| Ec | dnaQ926, dam, seqA | $2.83 \mathrm{E}-09$ | $6.39 \mathrm{E}-05$ | $1.94 \mathrm{E}-11$ | $4.38 \mathrm{E}-07$ | 22610 | 7 | 1604 | This work |
| $\begin{aligned} & E c, \text { PBS2, } \\ & \text { Pm } \end{aligned}$ | $\begin{aligned} & \text { dnaQ926, dam, seqA, } \\ & \text { ugi, cda1 } \end{aligned}$ | $2.83 \mathrm{E}-09$ | $2.93 \mathrm{E}-04$ | $1.94 \mathrm{E}-11$ | $2.01 \mathrm{E}-06$ | 103749 | 32 | 419 | This work |
| $\begin{aligned} & E c, \text { PBS2, } \\ & \text { Pm } \end{aligned}$ | $\begin{aligned} & \text { dnaQ926, dam, seqA, } \\ & \text { emrR, ugi, cdal } \end{aligned}$ | $2.83 \mathrm{E}-09$ | $9.11 \mathrm{E}-04$ | $1.94 \mathrm{E}-11$ | 6.24E-06 | 322414 | 100 | 34941 | This work |

Table 3.4 (Continued) I Comparison of MP1-MP6 with previously described mutator plasmids. In each case, the mutator genes are listed with the source organism(s): Ec $=$ Escherichia coli; $S c=$ Saccharomyces cerevisiae; Hs = Homo sapiens; $R n=$ Rattus norvegicus; Pa = Pseudomonas aeruginosa; Ll =Lactococcus lactis; PBS2 = Bacillus subtilis phage PBS2; Pm = Petromyzon marinus.

In all cases, the fraction of cells showing rifampin resistance $\left(\mathrm{Rif}^{\mathrm{R}}\right)$ was used to calculate $\mu_{\mathrm{bp}}$ as described in the methods section, using $R=77$ sites, $N=10^{8}$, and $N_{0}=1.5 \times 10^{7}$ to approximate the levels as compared to the MP1-6 series. The fold increase in mutagenesis is shown for each MP (defined as the ratio of the mutagenesis in the strain without the MP vs. in the strain with the MP). All MPs are compared to MP6 in total mutagenesis efficiency. *In cases where the MP was inducible, the dynamic range represents the fold increase between the uninduced and induced states for strains carrying the MP.


Figure 3.5 | Effect of MPs on host viability under induced conditions. A) Relative cell viability was calculated as the fractional cell titer following arabinose induction as compared to the uninduced control for each MP. Viability is anti-correlated with mutagenic potency at high levels. B) The XL1Red strain shows the expected level of viability (compared to the control, XL1-Blue) given its mutagenic potency as compared to the designed MPs.


Figure 3.6 I Relationship between host viability and induced levels of mutagenesis for all MPs.
Low potency MPs which induce up to $\sim 4 \times 10^{-7}$ substitutions/bp/generation were well tolerated by the $E$. coli MG1655 DrecA::apra host, while higher levels of mutagenesis generally resulted in a reduced host viability, as expected. This inflection point corresponds to $\sim 1.9$ substitutions/genome/generation for wild-type $E$. coli MG1566 (genome size $=4.64 \times 10^{6} \mathrm{bp}$ ).


Figure 3.7 I Relationship between uninduced and induced levels of mutagenesis for all MPs.
Higher levels of background (uninduced mutagenesis) were generally accompanied by an increase in overall MP mutagenesis upon induction. The full data set is provided in Table 3.2.

To test the inducibility of MP6, we increased the concentration of glucose from 25 mM to 200 mM during the transformation and growth stages prior to induction to maximize catabolite repression of the arabinose-inducible promoter. Under these modified conditions, induction of log-phase cultures of MG1655 $\Delta r e c A::$ apra carrying MP6 with increasing concentrations of arabinose resulted in a 35,000-fold range of mutational potency between $10 \mu \mathrm{M}$ and 100 mM arabinose (Figure 3.8). Despite this strong induction effect, MP6-carrying cultures maintained low levels of mutagenesis when suppressed with 200 mM glucose (Figure 3.8).

To further evaluate MP6, we compared its performance with that of the most commonly used in vivo mutagenesis strain, XL1-Red (Agilent Technologies). XL1-Red is deficient in proofreading (mutD5), mismatch-repair (mutS) and base-excision (mut $T$ ) activities, resulting in high levels of substitutions in chromosomal and episomal DNA ${ }^{18}$.

However, the strain grows very slowly, is difficult to manipulate genetically, has poor transformation efficiency, and produces a fairly narrow mutagenic spectrum ${ }^{19}$. Using the rifampin resistance assay, we found that XL1-Red results in 8 substitutions genome ${ }^{-1}$ generation $^{-1}$, while MP6 in the induced state produces an average of 29 substitutions genome $^{-1}$ generation $^{-1}, \mathrm{a} \sim 4$-fold higher mutation rate (Figure 3.8). The uninduced state of MP6 yields similar background mutagenesis levels ( 0.01 substitutions genome ${ }^{-1}$ generation ${ }^{-1}$ ) as the non-mutagenic related strain XL1-Blue ( 0.005 substitutions genome ${ }^{-1}$ generation ${ }^{-1}$ ) (Figure 3.2 and 3.8). Together, these results establish that MP6 enables mutagenesis levels exceeding that of the most commonly used mutator E. coli strain, and offers the ability to control mutation rate with an exogenous small molecule.


Figure 3.8 | Features of the MP system. (A) The dynamic range of MP6 was evaluated using increasing concentrations of arabinose (black circles) in the presence of 25 mM glucose in all cases. Treatment with 200 mM glucose only (dotted line) showed low mutagenesis under identical conditions. Comparison of the mutation rate under induced and uninduced conditions reveals a 35,000 -fold dynamic range. Using the number of known unique mutations found in rifampin-resistant $r p o B$ alleles ( 77 sites), the average number of substitutions per $E$. coli genome per generation $\left(\mu_{\mathrm{g}}\right)$ was calculated for (B) MG1655 1 recA::apra without an MP (white bar) vs. carrying MP1-6 under induced conditions (black bars), and (C) XL1-Blue (white bar) vs. XL1-Red (black bar). Error bars denote the standard deviation of at least three biological replicates.

## 3.7 - MP6 augments M13 bacteriophage mutagenesis

To further characterize MP1, MP4, and MP6, we assessed their impact on the mutagenesis of bacteriophage DNA, a common component of laboratory screening and evolution efforts. We measured the mutagenesis rate of M13 phage in host cells harboring a variety of MP variants or in XL1-Red using a lacZ inactivation assay. Briefly, a lacZ cassette was integrated downstream of geneIII in the wild-type M13 genome to yield SP063, resulting in the production of blue plaques in the presence of an X-Gal analog (Figure 3.9). Disruption of the lacZ cassette due to high mutagenesis reduces or ablates this blue-plaque phenotype, enabling the estimation of phage mutagenesis rates. We compared the ratio of white:blue plaques (lacZ phenotype) using MP1, MP4, MP6, and XL1-Red.

Under conditions supporting phage inoculum expansion in overnight culture using S1030 cells (Figures 3.10 and 3.11; Table 3.1), we observed that the phage-borne lacZ inactivation rates scaled with MP potency, reaching up to $27 \%$ white plaques


Figure 3.9 | Plaque assay of the lacZ-carrying M13 phage SP063. SP063 carries the wild-type E. coli $\beta$-galactosidase gene with a consensus ribosome-binding site directly downstream of geneIII. Plating using soft agar containing S1030 cells in the presence of the X-Gal analog Bluo-Gal (Life Technologies) results in a strong, deep blue plaques (shown here as dark circles).
(representing mutant, inactive lacZ genes) after 18 to 24 h of culture with MP6 (Figure 3.12). As MP6 increases the rate of mutagenesis by $\sim 100$-fold as compared to MP1, the expected M13 bacteriophage mutation rate is elevated to $7.2 \times 10^{-3}$ substitutions $\mathrm{bp}^{-1}$ generation ${ }^{-1}$, resulting in an average of 22 substitutions genome ${ }^{-1}$ generation ${ }^{-1}$ in the SP063 phage. This mutagenesis potency of 2.3 substitutions $\mathrm{kbp}^{-1}$ ( $0.23 \%$ ) approaches the potency of the most commonly used in vitro mutagenesis methods, Mutazyme II ( $0.3 \%-1.6 \%$, Agilent Technologies).

To enable comparison to XL1-Red, which lacks an $F^{\prime}$ episome and thus cannot be infected by M13 phage particles but allows for the production of fully functional phage, purified SP063 dsDNA was transformed into S1021 (the $F^{-}$variant of S1030, Table 3.1) cells carrying the aforementioned MPs (induced prior to or after SP063 transformation, or both; Figure 3.11) or XL1-Red. Whereas phage produced from transformed XL1-Red cells only yielded an average of $5 \%$ white plaques on S1030 cells, phage produced from the S1021 strain carrying MP6 yielded $15 \%$ white plaques and MP1 and MP4 yielded 7\%


Figure 3.10| Optimization of phage inoculant for optimal expansion and mutagenesis. A) E. coli S1030 carrying MP6 were induced with arabinose during log-phase growth and concomitantly infected with serially diluted SP063 phage. Phage were titered after overnight propagation and the fold expansion of the phage population was determined. B) The percentage of white and light blue (lacZ ${ }^{-}$) plaques in the presence of Bluo-Gal suggests a correlation between phage population expansion and mutagenesis efficiency.
and $10 \%$ white plaques, respectively, on S1030 cells (Figure 3.12). These results further demonstrate the greater mutational potency of MP6 compared to that of XL1-Red, and also highlight the strain flexibility enabled by using inducible, genetically encodable mutagenesis systems.

## 3.8 - Mutational spectra of designed MPs

In addition to mutagenic potency, the distribution of mutation types is also important, as a narrow mutational spectrum limits the diversity of changes that can be accessed. To analyze the spectrum of produced mutations, we took advantage of previously reported distributions of rifampin-resistant rpoB mutants. Importantly, mutations covering each of the 12 possible transitions and transversions in the rpo $B$ gene are known to endow $E$. coli with resistance to high levels of rifampin ${ }^{32}$. We assessed the spectra of MP1, MP4, and MP6 by sequencing rifampin-resistant $r p o B$ alleles in mutated MG1655 $\Delta r e c A:: a p r a$, and compared the spectra of each to the $r p o B$ mutation spectrum afforded by XL1-Red (Figure 3.13). MP1 yielded a narrow mutagenic spectrum strongly


Figure 3.11 | Effect of MP pre-induction on phage mutagenesis. E. coli S1030 carrying MP6 were induced with arabinose during log-phase growth and concomitantly infected with SP063 phage at defined titers. Alternatively, infection was delayed for 1 h or 2 h . Phage were titered after overnight propagation and the percentage of white plaques in the presence of Bluo-Gal was counted.
biased towards $\mathrm{A}: \mathrm{T} \rightarrow \mathrm{T}: \mathrm{A}$ transversions, a known side-effect of using recA730-based mutators on genomic DNA ${ }^{33}$. Comparatively, the intermediate MP4 had a more uniform distribution, covering more transitions and a marked increase in $\mathrm{G}: \mathrm{C} \rightarrow \mathrm{A}: \mathrm{T}$ and A:T $\rightarrow$ G:C, a hallmark of mutagenesis methods that perturb the mismatch repair response ${ }^{34}$. MP6 exhibited a wider spectrum still, with a more uniform distribution of transitions and transversions. The identities of the observed rifampin-resistant mutations are in agreement with previous studies (Figure 3.13) ${ }^{32}$. Notably, XL1-Red exclusively displayed two types of mutations, $\mathrm{C}: \mathrm{G} \rightarrow \mathrm{T}: \mathrm{A}$ and $\mathrm{T}: \mathrm{A} \rightarrow \mathrm{C}: \mathrm{G}$ transitions (Figure 3.13). This observation is consistent with previous reports describing the narrow mutational spectrum of XL1-Red ${ }^{19}$. Additional MP characterization the $\beta$-galactosidase (lacZ) reversion strains developed by Miller and coworkers ${ }^{11}$ revealed similar mutational spectra


Figure 3.12 | In vivo mutagenesis of M13 bacteriophage DNA. (A) S1030 cells ( $F^{+}$) carrying the indicated MPs were infected with M13 bacteriophage carrying a constitutive lacZ expression cassette (SP063), accompanied by the induction of the MP using arabinose, or suppression of the MP using glucose. (B) XL1-Blue or XL1-Red cells were transformed with purified SP063 DNA and recovered after overnight growth. (C) S1021 cells (identical to S1030, but lacking $F^{\prime}$ ) carrying the indicated MPs were induced with arabinose or repressed with glucose for 2 h , transformed with purified SP063 DNA, and again induced with arabinose or repressed with glucose during recovery. For (A)-(C), progeny phage from the overnight propagation were plaqued on S1030 cells and stained using the X-Gal analog Bluo-Gal. The fraction of plaques that showed a white or light-blue lac $Z^{-}$phenotype reflecting loss-offunction mutation(s) is shown. Error bars denote the standard deviation of at least three biological replicates.

Bacterial rifampin resistance


Figure 3.13 | Mutagenic spectra of the MPs. (A-D) The rpoB locus of single rifampinresistant colonies was amplified by PCR and sequenced in both clusters I (aa 451-754) and II (aa 84-401). (E) Identities of the rifampin-resistant rpoB alleles from MP1, MP4, or MP6 mutagenesis, or using XL1-Red. The MPs yielded a wide distribution of mutation types, with the diversity of alleles strongly correlating with MP potency. (F-I) SP063 phage containing a constitutive lac $Z$ expression cassette was propagated on the indicated mutator strain under induced conditions, and mutations were analyzed by high-throughput sequencing. In all cases, the number of sequenced mutations ( n ) is indicated for the MP and XL1-Red assays. * For (D) and (E), all sequenced XL1-Red rifampin-resistant colonies carried the identical F505S/S531F rpoB genotype.
(Figure 3.14). Strains CSH101 to CSH106 each carry different nonfunctional missense mutants of $\mathrm{lac} Z$ at codon 461 (natively encoding glutamic acid) on the $F^{\prime}$ episome. If a mutation reverts the nonfunctional codon to a glutamic acid, the strain can synthesize functional LacZ and survives using lactose as the only carbon source. These six strains are designed to report on all 12 possible mutations using this codon reversion. Using these strains, we observed that MP1 had the most narrow episomal mutational spectrum, with a moderate bias towards G:C $\rightarrow \mathrm{A}: \mathrm{T}(\mathrm{CSH} 102)$ and $\mathrm{A}: \mathrm{T} \rightarrow \mathrm{G}: \mathrm{C}(\mathrm{CSH} 106)$ substitutions (Figure 3.14). MP4 showed an improved distribution of mutations, with a still moderate preference for $\mathrm{A}: \mathrm{T} \rightarrow \mathrm{G}: \mathrm{C}(\mathrm{CSH} 106)$ substitutions (Figure 3.14). MP6 showed a near equal distribution of mutations in all six strains, with the exception of A:T $\rightarrow$ C:G (CSH101) substitutions which were detected at 10 - to 100 -fold lower levels than the other substitutions (Figure 3.14). Taken together, these results suggest that MP6 generally outperforms the other MPs and XL1-Red based on both the frequency of lacZ reversion as well as the breadth of mutation types detected by these strains. Importantly, the mutational potency and spectra using the episomal lacZ reversion assays were in agreement with those from the rifampin resistance assays (Figure 3.13 and 3.14). These results establish the ability of the MPs to affect a wide variety of mutations in both genomic and episomal DNA.

To further characterize the mutagenic spectra, we propagated the lacZ-encoding phage SP063 using S1030 strains carrying MP1, MP4 and MP6, or transformed SP063 DNA directly into XL1-Red to produce progeny phage, and subjected the lacZ ORF from all the resultant phage to high-throughput DNA sequencing (Figure 3.13). The mutagenesis efficiency for all conditions was in agreement with that revealed by the other
assays (Figure 3.13 and 3.14). The MPs generated broad mutagenic spectra in progeny phage, consistent with both rpoB single clone sequencing and $\operatorname{lac} Z$ reversion assays, with the exception of MP1, which showed a more uniform distribution of mutation types using the phage assay and lac $Z$ reversion assays than using $r p o B$ sequencing. This discrepancy is likely a result of the MP1-encoded recA 730 allele, which selectively enhances the rate of $\mathrm{A}: \mathrm{T} \rightarrow \mathrm{T}:$ A transversions in DNA of strains lacking recA (MG1655 $\Delta r e c A::$ apra $)$, as it no longer competes for substrates with wild-type (CSH strains ${ }^{11}$,

Table 3.1) or reduced-activity recA mutants (S1021 and S1030, Table 3.1) for function. Interestingly, the MP6 mutagenic spectrum shows an enhancement in $\mathrm{C} \rightarrow \mathrm{T}$ transitions with a concomitant decrease in $\mathrm{T} \rightarrow \mathrm{C}$ transitions, a hallmark of cytidine deaminasemediated mutagenesis. Phage sequences produced from XL1-Red revealed a much narrower mutational spectrum, with a bias for $\mathrm{A}: \mathrm{T} \rightarrow \mathrm{C}: \mathrm{G}$ mutations. We further note that the number of mutations among the tested MPs does not agree with differences in mutagenesis potency, likely due to mutation accumulation in the bacteriophage genome,


Figure 3.14 | Analysis of $\boldsymbol{F}^{\prime}$ episomal mutations rates using various MPs. The frequency of lacZ+ revertants is the fraction of colonies surviving on lactose as the sole carbon source as compared to the total colony count (colonies that survive on glucose as sole carbon source). Each strain reports the MP's ability to increase the frequency of a specific mutation type.
which would negatively affect propagation and thus mutation accumulation. Taken together, these results reveal that the MPs developed in this study can outperform the most widely used in vivo and in vitro mutagenesis techniques (Figure 3.15) both in mutagenic potency and mutational breadth.


Figure 3.15 | Mutagenic spectra of commonly used mutagenesis techniques. (A-D)
Previously reported mutagenic spectra of four commonly used mutagenesis methods: LF Pol I ${ }^{2}$, mut $A^{3}$, Mutazyme II ${ }^{13}$ and EMS ${ }^{14}$.

## 3.9 - Evolution of antibiotic resistance using the designed MPs

To evaluate the impact of these MPs on laboratory evolutionary outcomes, we evolved antibiotic resistance in E. coli, as well as RNA polymerase substrate specificity changes in bacteriophage, using cells harboring different MPs. First we tested the ability of MP1, MP4, or MP6 to evolve resistance of E. coli strain MG1655 $\Delta r e c A:: a p r a ~ t o ~ a ~$ number of commonly used antibiotics. Mid-log-phase cultures of MG1655 $\Delta$ recA::apra carrying MP1, MP4, or MP6 were induced for 18-21 h, then serially diluted and plated on agar plates without antibiotics, or with $5-100 \mu \mathrm{~g} / \mathrm{mL}$ of carbenicillin, cephotaxime, fosfomycin, kanamycin, metronidazole, norfloxacin, rifampin, spectinomycin, streptomycin, or tetracycline. The antibiotic concentrations used in all ten cases were well above known MIC values (Table 3.5).

| Antibiotic | MIC (ug/mL) |
| :--- | :--- |
| carbenicillin | $2-25$ |
| cefotaxime | $0.016-0.25$ |
| fosfomycin | $0.125-8$ |
| kanamycin | $0.25-8$ |
| metronidazole | $8-32$ |
| norfloxacin | $0.016-0.125$ |
| rifampin | $0.5-16$ |
| spectinomycin | $8-64$ |
| streptomycin | $1-16$ |
| tetracycline | $0.5-8$ |

Table 3.5 | Minimum inhibitory concentrations (MICs) for selected antibiotics. All data regarding E. coli MICs was tabulated from the Antimicrobial Index Knowledgebase (http://antibiotics.tokue.com).

After only 18 h of growth on antibiotic-containing solid medium, large fractions of the bacterial population showed resistance to high concentrations of carbenicillin, fosfomycin, kanamycin, metronidazole, rifampin, spectinomycin, streptomycin, and tetracycline (Figure 3.16 and Table 3.5). No resistant colonies were detected for cefotaxime or norfloxacin. The frequency of antibiotic resistance strongly correlated with MP potency (Figure 3.16). For example, we observed the evolution of resistance to high levels of kanamycin with no intermediate selection step using MP6, which enabled up to $11 \%$ of the total population to grow in the presence of $30 \mu \mathrm{~g} / \mathrm{mL}$ kanamycin. In contrast, only $0.02 \%$ or $0.66 \%$ of the population survived this level of kanamycin when using MP1 or MP4, respectively (Figure 3.16).

We repeated these antibiotic resistance evolution experiments to compare the performance of these MPs to those of the commonly used chemical mutagens ${ }^{11}$ ethyl methanesulfonate (EMS), methylnitronitrosoguanidine (MNNG), and 2-aminopurine
(2AP), as well as UV irradiation, XL1-Red, and XL1-Blue (Figure 3.16 and Table 3.5). Importantly, UV irradiation can only be used for short durations due to toxicity from random crosslinking of cellular components. As such, mutagenesis with UV irradiation typically constitutes a single round of mutagenesis, while chemical mutagens, hypermutator strains and mutagenesis plasmids enable continuous mutagenesis. MP6 outperformed all six of the other mutagenesis treatments or strains for all but one of the antibiotics. Cephotaxime resistance was not observed from use of any of the MPs, but was weakly detected from the chemical mutagens (Figure 3.16). We speculate that the known ability of all three of these chemical mutagens to greatly enhance $\mathrm{G}: \mathrm{C} \rightarrow \mathrm{A}: \mathrm{T}$ transitions may contribute to the evolution of cephotaxime resistance. This finding further suggests that a period of neutral drift or intermediate selection pressure may be needed to evolve complex phenotypes requiring mutations to multiple cellular components.


Figure 3.16 | Comparison of MP6 and other mutagenesis approaches for the evolution of antibiotic resistance. (A) MG1655 дrecA::apra cells with or without MP6 were grown for 18-21 h under induced conditions. XL1-Blue and XL1-Red were grown for 18-21 h. (B) MG1655 $\mathbf{\Delta r e c A : : a p r a}$ cells were treated using chemical mutagens as previously described ${ }^{11}$. In all cases, cultures were plated on the indicated antibiotics following overnight culture in the absence of any selection. The numbers in parenthesis indicate the antibiotic concentrations used in $\mu \mathrm{g} / \mathrm{mL}$. The fraction of cells resistant to each antibiotic was calculated relative to the total number of cells on plates without antibiotics. Resistance to norfloxacin was not detected for any of the tested strains or treatments. XL1-Blue and XL1-Red are both inherently resistant to tetracycline and metronidazole, so no comparison is shown for either antibiotic. See Table 3.6 for full antibiotic resistance data. Error bars denote the standard deviation of at least three biological replicates.

Cumulatively, these results suggest that MP6 can rapidly generate strains with novel properties, outperforming several commonly using chemical mutagens, UV irradiation, and XL-1 Red.

|  | CRB | CTX | FOS | KAN | MTX | RIF | SPC | STR | TET |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| no MP | $0.00 \mathrm{E}+00$ | $0.00 \mathrm{E}+00$ | $1.10 \mathrm{E}-05$ | $5.78 \mathrm{E}-06$ | $2.22 \mathrm{E}-07$ | $5.56 \mathrm{E}-08$ | $0.00 \mathrm{E}+00$ | $6.67 \mathrm{E}-07$ | $0.00 \mathrm{E}+00$ |
| MP1 | $9.57 \mathrm{E}-06$ | $0.00 \mathrm{E}+00$ | $9.17 \mathrm{E}-04$ | $1.84 \mathrm{E}-04$ | $6.47 \mathrm{E}-01$ | $1.26 \mathrm{E}-05$ | $1.91 \mathrm{E}-07$ | $5.68 \mathrm{E}-06$ | $0.00 \mathrm{E}+00$ |
| MP4 | $1.37 \mathrm{E}-05$ | $0.00 \mathrm{E}+00$ | $6.97 \mathrm{E}-03$ | $6.56 \mathrm{E}-03$ | $1.52 \mathrm{E}-06$ | $6.17 \mathrm{E}-05$ | $1.14 \mathrm{E}-05$ | $1.56 \mathrm{E}-05$ | $5.97 \mathrm{E}-06$ |
| MP6 | $7.39 \mathrm{E}-04$ | $0.00 \mathrm{E}+00$ | $2.78 \mathrm{E}-02$ | $1.11 \mathrm{E}-01$ | $1.50 \mathrm{E}-04$ | $7.17 \mathrm{E}-04$ | $2.55 \mathrm{E}-04$ | $6.22 \mathrm{E}-04$ | $1.15 \mathrm{E}-04$ |
| 2AP | $1.17 \mathrm{E}-07$ | $2.80 \mathrm{E}-06$ | $4.83 \mathrm{E}-04$ | $1.53 \mathrm{E}-03$ | $2.03 \mathrm{E}-05$ | $1.03 \mathrm{E}-05$ | $2.50 \mathrm{E}-07$ | $3.17 \mathrm{E}-07$ | $0.00 \mathrm{E}+00$ |
| EMS | $0.00 \mathrm{E}+00$ | $1.67 \mathrm{E}-07$ | $3.75 \mathrm{E}-04$ | $8.17 \mathrm{E}-04$ | $1.10 \mathrm{E}-04$ | $6.68 \mathrm{E}-05$ | $0.00 \mathrm{E}+00$ | $1.33 \mathrm{E}-06$ | $0.00 \mathrm{E}+00$ |
| MNNG | $0.00 \mathrm{E}+00$ | $3.67 \mathrm{E}-07$ | $1.22 \mathrm{E}-04$ | $5.33 \mathrm{E}-04$ | $3.22 \mathrm{E}-05$ | $5.56 \mathrm{E}-06$ | $3.67 \mathrm{E}-05$ | $2.44 \mathrm{E}-07$ | $0.00 \mathrm{E}+00$ |
| UV | $0.00 \mathrm{E}+00$ | $0.00 \mathrm{E}+00$ | $5.00 \mathrm{E}-07$ | $7.49 \mathrm{E}-06$ | $0.00 \mathrm{E}+00$ | $0.00 \mathrm{E}+00$ | $0.00 \mathrm{E}+00$ | $2.89 \mathrm{E}-08$ | $0.00 \mathrm{E}+00$ |
| XL1-Blue | $0.00 \mathrm{E}+00$ | $5.40 \mathrm{E}-06$ | $0.00 \mathrm{E}+00$ | $8.66 \mathrm{E}-07$ | $4.82 \mathrm{E}-01$ | $0.00 \mathrm{E}+00$ | $0.00 \mathrm{E}+00$ | $0.00 \mathrm{E}+00$ | $9.44 \mathrm{E}-01$ |
| XL1-Red | $0.00 \mathrm{E}+00$ | $0.00 \mathrm{E}+00$ | $1.42 \mathrm{E}-03$ | $2.62 \mathrm{E}-04$ | $9.84 \mathrm{E}-01$ | $3.62 \mathrm{E}-05$ | $3.81 \mathrm{E}-06$ | $3.60 \mathrm{E}-05$ | $1.10 \mathrm{E}-04$ |

Table 3.6| Comparison of developed MPs to chemical mutagens, UV light and XL1-Red. The fraction of cells resistant to each antibiotic upon mutagenic treatment is shown for all tested antibiotics. No resistance was observed for norfloxacin using any MP, chemical mutagen, or strain. All MPs, chemical mutagens, and UV light treatments used E. coli MG1655 $\Delta$ recA::apra. CRB, $50 \mu \mathrm{~g} / \mathrm{mL}$ carbenicillin; CTX, $5 \mu \mathrm{~g} / \mathrm{mL}$ cefotaxime; FOS, $100 \mu \mathrm{~g} / \mathrm{mL}$ fosfomycin; KAN, $30 \mu \mathrm{~g} / \mathrm{mL}$ kanamycin, MTX, $100 \mu \mathrm{~g} / \mathrm{mL}$ metronidazole; RIF, $100 \mu \mathrm{~g} / \mathrm{mL}$ rifampin; SPC, $100 \mu \mathrm{~g} / \mathrm{mL}$ spectinomycin; STR, $50 \mu \mathrm{~g} / \mathrm{mL}$ streptomycin; TET, $10 \mu \mathrm{~g} / \mathrm{mL}$ tetracycline. We note that MP1 (recA730), XL1-Blue (recA1), and XL1-Red (wt recA) are all proficient at recombination, a known requirement for high-level resistance to metronidazole ${ }^{12}$.

Additionally, XL1-Blue and XL1-Red are both inherently resistant to tetracycline, explaining the observed high incidence of resistance.

### 3.10 - MP6 enables direct RNA polymerase evolution during PACE

Next we compared the performance of MP1 and MP6 during phage-assisted continuous evolution (PACE) $)^{22,23,35-37}$ of T7 RNA polymerase. We previously showed that PACE can evolve T7 RNA polymerase to recognize the distant T3 promoter $\left(\mathrm{P}_{\mathrm{T} 3}\right)$
(Figure 3.17), but only using either an intermediate evolutionary stepping-stone (a T7/T3 hybrid promoter) $)^{22,35,36}$, or an initial period of evolutionary drift in the absence of
selection pressure ${ }^{23}$. Without either an evolutionary stepping-stone or initial evolutionary drift, PACE cannot evolve T7 RNAP variants that recognize $\mathrm{P}_{\mathrm{T} 3}$, leading to rapid phage washout ${ }^{22,23,35,36}$. We compared the ability of MP1 and MP6 to rapidly evolve $\mathrm{P}_{\mathrm{T} 3}$-active T7 RNAP variants in the absence of evolutionary drift, or under conditions in which the selection stringency was slightly reduced. Importantly, previous attempts of T7 RNAP evolution towards $\mathrm{P}_{\mathrm{T} 3}$ activity using MP1 required a drift period of virtually no selection pressure over 18 h to yield $\mathrm{P}_{\mathrm{T} 3}$-active variants, whereas the high or intermediate selection pressures resulted in rapid phage washout ${ }^{23}$.

In agreement with our previous results, T7 RNAP phage added to lagoons fed by host cells harboring MP1 under high or intermediate selection stringency rapidly washed out in $<20 \mathrm{~h}$ of PACE when required to recognize $\mathrm{P}_{\mathrm{T} 3}$ (Figure 3.18). In contrast, both lagoons tested in which host cells harbored MP6 enabled the propagation of T7 RNAP


Figure 3.17 | Activity of T7 RNAP on cognate and non-cognate promoters. Log-phase S1030 cells carrying accessory plasmids (APs) with a geneIII cassette with an upstream phage shock protein (PSP), T7, hybrid T7/T3, or T3 promoter were infected with selection phage (SPs) carrying the wild-type T7 RNAP. The fraction of output phage vs. input phage indirectly reports on the activity of the T7 RNAP on the various promoters. Enrichment factors of $\sim 100$ or less indicate extremely weak to non-existent activity.
phage on host cells requiring $\mathrm{P}_{\mathrm{T} 3}$ recognition under high or intermediate selection stringency, with nearly $10 \%$ of both populations after only 10 h of PACE exhibiting activity on $\mathrm{P}_{\mathrm{T} 3}$ by activity-dependent plaque assays (Figure 3.18). Sequencing confirmed mutations M219K/E222K/E222Q together with N748D in all surviving clones (Figure 3.19), in agreement with previous findings of our group and others ${ }^{22,23,35,36,38}$. The ability of MP6 to enable the discovery of $\mathrm{P}_{\mathrm{T3}}$-active T7 RNAP variants highlights the ability of this MP to access mutations more efficiently, and thus mediate a more thorough and larger sampling of sequence space. Collectively, these results establish that the enhanced mutagenesis mediated by the new MPs can enable accelerated access to evolved proteins that are difficult to access directly using previous methods.

### 3.11 - Discussion

Using a systematic, mechanism-guided approach, we developed a series of


Figure 3.18 | Continuous evolution of $\mathbf{P}_{\mathbf{T 3}}$-active RNAP variants. S 1030 cells carrying an accessory plasmid (AP) encoding $\mathrm{P}_{\mathrm{T} 3}$ upstream of M13 bacteriophage geneIII and either MP1a or MP6a were infected with selection phage (SP) carrying wild-type T7 RNAP under conditions in which selection stringency was high ( $0 \mathrm{ng} / \mathrm{mL}$ ATc) or moderate ( $30 \mathrm{ng} / \mathrm{mL}$ ATc). (A) Total phage titers at 10 h and 20 h after lagoon inoculation with the SP encoding T7 RNAP. (B) Titers of phage encoding evolved RNAP variants active on $\mathrm{P}_{\mathrm{T} 3}$. The limit of detection is $50 \mathrm{pfu} / \mathrm{mL}$.
vectors that express a variety of genes known to adversely affect DNA replication fidelity. In total we generated and assayed 80 candidate MPs with mutation rates spanning five orders of magnitude (Figures 3.6 and 3.7; Tables 3.2 and 3.3). The resulting MPs enable highly potent, broad-spectrum, inducible, vector-based in vivo mutagenesis that rival the performance characteristics of popular in vitro methods such as error-prone PCR, while offering key advantages of in vivo mutagenesis. These advantages include enabling mutation and selection cycles to be coupled, and bypassing


Figure 3.19| Single-phage plaque sequencing of $\mathbf{P}_{\mathbf{T 3}}$-active SPs. Single phage plaques at 10 h of PACE using the $\mathrm{P}_{\mathrm{T} 3}$ AP were isolated and subjected to Sanger sequencing. All clones carried T7 RNAP variants with conserved mutations known to confer activity on $\mathrm{P}_{\mathrm{T} 3}$ (blue), as well as additional mutations that may further enhance activity (black). Silent mutations were also detected (red).
transformation efficiency bottlenecks that limit the size of populations that can be generated from DNA diversified in vitro. The MPs developed here offer major advantages over current in vivo mutagenesis methods such as chemical mutagens or base analogs, UV irradiation, or constitutive hypermutator strains. Hypermutator strains, for example, generally suffer from poor transformation efficiency (XL1-Red, $\sim 1 \times 10^{6} \mathrm{cfu} / \mu \mathrm{g}$ plasmid DNA), high instability, and narrow mutagenic spectra. MP6 increases the mutation rate of $E$. coli by 322,000 -fold, and substantially exceeds both the mutation rate and the mutagenic spectra of XL1-Red. Importantly, MP6 can enable approximately $\sim 2.3$ substitutions $\mathrm{kbp}^{-1}$ in a gene of interest using phage vectors in a single generation, with additional increases in mutagenesis efficiency concomitant with longer propagation times.

To demonstrate the utility of these vectors, we used a whole-genome mutagenesis approach to evolve high-level antibiotic resistance in E. coli. In the absence of any prior selection or mutagenesis step, MP6 rapidly mediates the evolution of antibiotic resistance to many commonly used antibiotics within 18 h . The efficiency and effectiveness of antibiotic resistance mediated by MP6 compares favorably with that of a number of potent chemical mutagens (2AP, EMS, MNNG), UV irradiation, and the hypermutator strain XL1-Red. In addition, we observed that MP6 enables the continuous evolution of T7 RNA polymerase variants capable of initiating transcription at the non-cognate T3 promoter in less than 10 h , without requiring evolutionary stepping-stones or an initial period of evolutionary drift. We anticipate that these MPs will broadly enable the use of in vivo mutagenesis to provide efficient access to rare solutions in sequence space that would otherwise be much more difficult to reach using current in vitro or in vivo
methods. Importantly, the MPs offer non-targeted mutagenesis enhancements that complement sequence-targeted mutagenesis approaches such as MAGE ${ }^{39}$ or using CRISPR-Cas $9{ }^{40}$. Furthermore, the MPs operate largely independently of host recombination pathways and bias mutagenesis towards substitutions rather than insertions or deletions, both of which are desirable characteristics in library generation during directed evolution. The properties of MP6, which include very high mutagenesis efficiency, broad mutational spectrum, small-molecule inducibility, and compatibility with a variety of bacterial strains, together represent a substantial advance in in vivo mutagenesis methodology for the laboratory evolution community.

### 3.12 - Methods

General methods. All PCR reactions were performed using PfuTurbo Cx polymerase (Agilent Technologies) or VeraSeq ULtra polymerase (Enzymatics). Water was purified using a MilliQ water purification system (Millipore, Billerica MA). All MPs were constructed using USER cloning (New England Biolabs). Native E. coli genes were amplified by PCR directly from genomic DNA, and non-bacterial genes were synthesized as bacterial codon-optimized gBlocks Gene Fragments (Integrated DNA Technologies). All DNA cloning was carried out using NEB Turbo cells (New England Biolabs).

General MP strain preparation. Mid log-phase $\left(\mathrm{OD}_{600}=\sim 0.5-0.8\right)$ cells of the strain of interest grown in 2xYT (United States Biological) were transformed with the desired MP, and recovered for 45 min in Davis rich media ${ }^{23}$ to suppress MP induction. All transformations were plated on 2 xYT in 1.8\% agar (United States Biological) containing $40 \mu \mathrm{~g} / \mathrm{mL}$ chloramphenicol (Sigma Aldrich), $10 \mu \mathrm{~g} / \mathrm{mL}$ fluconazole (TCI America), 10 $\mu \mathrm{g} / \mathrm{mL}$ amphotericin B (TCI America), 25 mM glucose (United States Biological) and grown for $12-18 \mathrm{~h}$ in a $37^{\circ} \mathrm{C}$ incubator. Colonies transformed with the appropriate MP were picked the following day and grown in Davis rich media containing $40 \mu \mathrm{~g} / \mathrm{mL}$ chloramphenicol, $10 \mu \mathrm{~g} / \mathrm{mL}$ fluconazole, and $10 \mu \mathrm{~g} / \mathrm{mL}$ amphotericin B for $12-18 \mathrm{~h}$. Following overnight growth of the MP-carrying strains, cultures were diluted 1,000-fold into fresh Davis rich media containing $40 \mu \mathrm{~g} / \mathrm{mL}$ chloramphenicol, $10 \mu \mathrm{~g} / \mathrm{mL}$ fluconazole, and $10 \mu \mathrm{~g} / \mathrm{mL}$ amphotericin B . The remainder of each experiment is described in each of the following sections.

Rifampin resistance assay. Upon reaching mid log-phase, cultures were induced with 25 mM arabinose (Davis rich media + arabinose) or suppressed with 25 mM glucose (Davis rich media only) and allowed to continue growth for an additional $\sim 18-24 \mathrm{~h}$ in a $37^{\circ} \mathrm{C}$ shaker. The high arabinose concentration ensures sufficient induction of the plasmidborne mutators MG1655 $\Delta$ recA::apra despite arabinose catabolism by this strain upon glucose depletion. For XL1-Blue and XL1-Red strains, cultures were started directly from glycerol stocks according to the manufacturer's instructions and incubated for an identical amount of time as the MP-carrying strains. After overnight growth, cultures were serially diluted in 10 -fold increments and plated on 2 xYT-agar containing $10 \mu \mathrm{~g} / \mathrm{mL}$ fluconazole, $10 \mu \mathrm{~g} / \mathrm{mL}$ amphotericin B , and 100 mM glucose $+/-100 \mu \mathrm{~g} / \mathrm{mL}$ rifampin. After 18-24 h, the number of colonies on the glucose +/- rifampin plates was counted for each culture. The mutation efficiency induced by the MP ( $\mathrm{t}_{\mathrm{bp}}$, substitutions $\mathrm{bp}^{-1}$ generation ${ }^{-1}$ ) was calculated using the equation: $\mu_{b p}=f /\left[R x \ln \left(N / N_{0}\right)\right]$, where $f$ is the frequency of rifampin-resistant mutants (as compared to the glucose control), $R$ is the number of unique sites yielding rifampin resistance (77 previously identified sites; we identified only 21 sites across both $r p o B$ clusters in our experiments), $N$ is the final population size, and $N_{0}$ is the population size at which resistance is first observed (empirically determined to be $\sim 1.5 \times 10^{7}$ ). To calculate $\mu_{\mathrm{G}}$, $\mu_{\mathrm{bp}}$ was multiplied by the genome size, which for MG1655 was $4.64 \times 10^{6} \mathrm{bp}$.

Episomal lacZ reversion assay. Upon reaching mid log-phase, the cultures were induced with 25 mM arabinose or suppressed with 25 mM glucose, and allowed to continue growth for an additional $\sim 18-24 \mathrm{~h}$. After overnight growth, the cultures were centrifuged
for $2 \min$ at $10,000 \mathrm{x}$ rcf and resuspended in an equal volume of $10 \%$ glycerol. This procedure was carried out twice to remove trace glucose or other carbon sources from the supernatant prior to plating. Washed cells were serially diluted in 10 -fold increments using $10 \%$ glycerol and plated on M9 minimal media agar supplemented with 5 mM $\mathrm{MgSO}_{4}, 0.01 \%$ thiamine, 335 phase, the cultures were induced with 25 mM arabinose or suppressed with 25 mM glucose, and allowed to continue growth for an additional $\sim 18$ 24 h . After overnight lac $Z$ reversion, and not purely due to extracellular lactose hydrolysis. After extended growth ( $\sim 24-36 \mathrm{~h}$ ), the fraction of lactose-catabolizing colonies was calculated using the number of blue colonies on the lactose plates vs. the total number of colonies on the glucose plates.

Phage lacZ inactivation assay. Upon reaching mid log-phase, the cultures were induced with 25 mM arabinose or suppressed with 25 mM glucose, allowed to grow for an additional 0-2 h , then, in the case of strain S 1030 , infected with SP063 phage, and allowed to grow for an additional ~18-24 h. For S1021 and XL1-Red (Agilent Technologies), SP063 DNA was miniprepped from infected S1030 cells and electroporated into these strains as they both lack F' episomes. For F${ }^{-}$cells, cultures were either induced for 2 h prior to being made electrocompotent, induced immediately following transformation, induced both prior to and following electroporation, or not induced at all. After overnight growth and phage propagation, the cultures were centrifuged 2 min at $10,000 \mathrm{x}$ rcf and the supernatant was filtered through a $0.2 \mu \mathrm{~m}$ PVDF filter (Millipore). The supernatant was serially diluted in 10-fold increments using Davis rich media and plaqued on S1030 cells using 1.8\% 2xYT-agar for the bottom layer and
$0.6 \% 2 x$ YT-agar supplemented with $400 \mu \mathrm{~g} / \mathrm{mL}$ Bluo-Gal (Life Technologies) for the top layer. The fraction of white or light blue plaques plaques (lacZ ${ }^{-}$phenotype) was counted as a function of all plaques (blue + light blue + white), and used as a measure of mutation frequency for the lac $Z$ cassette.

Sanger sequencing of rpoB mutations. Rifampin-resistant colonies were picked into 96 well plates and grown overnight in Davis rich media supplemented with $100 \mu \mathrm{~g} / \mathrm{mL}$ rifampin. Following overnight growth, $10 \mu \mathrm{~L}$ aliquots were heated at $100^{\circ} \mathrm{C}$ for 10 min , followed by PCR using primers AB1678 (5'-AATGTCAAATCCGTGGCGTGAC) and AB1682 (5'-TTCACCCGGATACATCTCGTCTTC) to amplify an $r p o B$ fragment containing both clusters I and II. Each fragment was sequenced twice using primers AB1680 (5'-CGGAAGGCACCGTAAAAGACAT) and AB1683 (5'CGTGTAGAGCGTGCGGTGAAA).

High-throughput sequencing of lacZ mutations. SP063 phage that was propagated using S1030 carrying MP1, MP4 or MP6, produced by XL1-Red following SP063 DNA electroporation, or the unmutated stock phage was amplified by PCR using primers AB437 (5’-GGCGCTGGTAAACCATATG) and DB213 (5’-

GGAAACCGAGGAAACGCAA) to yield a $\sim 3,400 \mathrm{bp}$ fragment containing the lacZ gene. SP063 phage that was propagated under similar conditions on S1030 cells was used as the negative control. Three biological replicates were carried out for each of the aforementioned samples. The resulting PCR products were purified by gel electrophoresis using a $1 \%$ agarose gel and prepared for HTS using a Nextera kit
(Illumina) and a previously described procedure ${ }^{37}$. Briefly, $4 \mu \mathrm{~L}$ of DNA ( $2.5 \mathrm{ng} / \mu \mathrm{L}$ ), 5 $\mu \mathrm{L}$ TD buffer, and $1 \mu \mathrm{~L}$ TDE1 were mixed together and then heated to $55^{\circ} \mathrm{C}$ for 5 min . After purification (Zymo DNA purification kit), the resultant "tagmented" DNA samples were amplified with Illumina-supplied primers using the manufacturer's protocol. The resulting PCR products were then purified using AMPure XP beads and the final concentration of DNA was quantified using PicoGreen (Invitrogen) and qPCR. The samples were sequenced on a MiSeq Sequencer (Illumina) in $2 \times 300$ paired-end runs using the manufacturer's reagents following the manufacturer's protocols.

High-throughput sequencing data analysis. A previously described custom MATLAB script ${ }^{37}$ (available upon request) was used to align MiSeq reads with Q score $\geq 30$ to the wild-type sequence and count the nucleotide positions from which the experimental sample deviates from the wild-type sequence, yielding called mutations with $\geq 99.9 \%$ accuracy, corresponding to $>3$ standard deviations above the mean error rate of the MiSeq high-throughput sequencing reads. To compensate for systemic sample preparation and sequencing errors, the observed fraction of mutations at each nucleotide position of the wild-type $\operatorname{lac} Z$ reference gene was subtracted from the fraction of mutations in a given experimental sample to result in the "corrected fraction mutated". Mutations were defined as nucleotide positions with a corrected fraction mutation that is both greater than the average corrected fraction mutated of the treatment of interest and at least one standard deviation higher than the corrected fraction mutation of the wild-type reference sequence. Duplicates belonging to set of paired-end reads were treated as a single sample, while duplicate reads of the same region with alternative adaptor/index
sequences were not removed so as not to introduce bias into the sequencing analysis. This process yielded an average of $\sim 50,000$ reads per position for each of the sequenced samples.

Evolution of novel antibiotic resistance. MG1655 дrecA::apra cells without an MP or carrying MP1, MP4, or MP6 were grown for 18-21 hr in Davis rich media containing 40 $\mu \mathrm{g} / \mathrm{mL}$ chloramphenicol, $10 \mu \mathrm{~g} / \mathrm{mL}$ fluconazole, $10 \mu \mathrm{~g} / \mathrm{mL}$ Amphotericin B, and supplemented with 200 mM arabinose to induce the MPs. Small molecule and UV mutagenesis was carried out as previously described ${ }^{11}$. For 2AP treatment, log-phase MG1655 DrecA::apra cells were diluted to $\sim 1000$ cells, the media was supplemented with $700 \mu \mathrm{~g} / \mathrm{mL} 2 \mathrm{AP}$ (TCI America), and the culture was allowed for grow at $37^{\circ} \mathrm{C}$ for an additional 18-21 hr . For EMS treatment, 2 mL of a log-phase MG1655 $\Delta r e c A::$ apra culture ( $\sim 1 \times 10^{8}-1 \times 10^{9}$ cells) was centrifuged, washed twice with 1 mL A buffer on ice, then supplemented with $14 \mu \mathrm{~L}$ EMS (TCI America). Cells were lightly vortexed, and allowed to shake at 200 rpm at $37^{\circ} \mathrm{C}$ for 45 min . After this time, the culture was centrifuged, washed twice with 1 mL A buffer on ice, diluted by 20 -fold into Davis rich media without antibiotics, and allowed to grow for 18-21 hr. For MNNG treatment, 2 mL of a log-phase MG1655 $\Delta$ recA: $:$ apra culture $\left(\sim 1 \times 10^{8}-1 \times 10^{9}\right.$ cells) was centrifuged, washed twice with 1 mL citrate buffer ( pH 5.5 ) on ice, supplemented with $111 \mu \mathrm{~L}$ of $1 \mathrm{mg} / \mathrm{mL}$ MNNG (TCI America) and placed in a $37^{\circ} \mathrm{C}$ water bath for 30 min . Following treatment, the cells were centrifuged, washed twice with 1 mL 0.1 M potassium phosphate buffer ( pH 7.0 ), diluted by 4 -fold into Davis rich media without antibiotics, and allowed to grow for 18-21 hr. For UV irradiation, 2 mL of a log-phase MG1655 $\Delta$ recA::apra
culture ( $\sim 1 \times 10^{8}-1 \times 10^{9}$ cells) was centrifuged, resuspended in 1 mL 0.1 M MgSO 4 and placed on ice for 10 min . Cells were placed in a petri dish and exposed to UV light from a SM-36-2GR UV lamp (American Air \& Water) for 1 min , uncovered, at a distance of $\sim 10 \mathrm{~cm}$. Immediately following UV exposure, cells were diluted by 20 -fold into Davis rich media without antibiotics, and allowed to grow for 18-21 hr. For XL1-Blue and XL1-Red strains, cultures were started directly from glycerol stocks according to the manufacturer's instructions and allowed to grow for 18-21 hr in Davis rich media. Following overnight growth, all cultures were serially diluted in Davis rich media and plated on 2xYT-agar containing $10 \mu$ cell fluconazole, $10 \mu$ fluc amphotericin B, and 100 mM glucose $+/-$ the appropriate antibiotic. After overnight growth ( $\sim 18-24 \mathrm{~h}$ ), the numbers of colonies on the glucose $+/-$ antibiotics plates were counted.

Continuous evolution of $\mathbf{P}_{\text {T3 }}$-active T7 RNAP variants. Two modified versions of MP1 and MP6 (DP1 and DP6, respectively) were generated to enable robust phage propagation during PACE. These MPs carry all of the components of their respective MPs, in addition to the previously described anhydrotetracycline (ATc)-dependent drift promoter driving geneIII ${ }^{23}$. S1030 strains carrying either MP in addition to the $\mathrm{P}_{\mathrm{T} 3}$ accessory plasmid (AP) were inoculated into host-cell cultures (chemostats) and grown at a dilution rate of $1.6 \mathrm{vol} / \mathrm{hr}$ as previously described ${ }^{23}$. Lagoons flowing from the respective chemostats were maintained at 40 mL , diluted at $0.75 \mathrm{vol} / \mathrm{hr}$, and supplemented with either 25 mM arabinose only (high stringency) or 25 mM arabinose with $30 \mathrm{ng} / \mathrm{mL}$ ATc (intermediate stringency) for 8 h prior to infection with packaged T 7 RNAP SP. We note that concentrations exceeding $30 \mathrm{ng} / \mathrm{mL}$ for extended timeframes
during PACE ( $>24 \mathrm{hr}$ ) result in excision of the evolving gene from the selection phage. As continuous flow conditions effectively enrich for SPs capable of rapid replication, selection phage with smaller genomes are rapidly enriched to totally dominate the evolving pool. Each lagoon was infected with $4 \times 10^{9} \mathrm{pfu}$, resulting in an initial titer of $10^{8}$ $\mathrm{pfu} / \mathrm{mL}$ of the lagoon. Samples were taken 10 h and 20 h after infection, centrifuged at $10,000 \mathrm{rcf}$ for 2 min , then sterile filtered with a $0.2 \mu \mathrm{~m}$ filter and stored overnight at $4^{\circ} \mathrm{C}$. Phage aliquots were titered on S1030 cells carrying either the PSP-geneIII AP (total phage) or the $\mathrm{P}_{\mathrm{T} 3}$-geneIII AP ( $\mathrm{P}_{\mathrm{T} 3}$-active phage).

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## Chapter 4

Continuous evolution of $\boldsymbol{B}$. thuringiensis toxins overcomes insect resistance Parts adapted from: Badran et al., Nature (2016) [in press]

## 4.1 - Introduction: The importance of Bacillus thuringiensis toxins

The expression of insecticidal toxins derived from Bacillus thuringiensis (Bt) has proven to be a valuable strategy for agricultural pest management ${ }^{3}$. Bt toxins are multidomain proteins that kill insects by selectively binding midgut cell proteins to trigger a series of events leading to cell permeabilization and death. Bt toxin-producing crops have been widely adopted in agriculture with substantial economic and environmental benefits ${ }^{4}$, and have increased global agricultural productivity by an estimated $\$ 78$ billion from 1996 to $2013^{5}$. Bt toxin resistance has rapidly evolved among insect pests both in the laboratory and in the field, and threatens the continued success of this important strategy for pest control ${ }^{6}$. While researchers have developed approaches to manage insect resistance to Bt toxins, such as using multiple Bt toxins that recognize different binding sites in the insect midgut, or preserving susceptible alleles in insect populations, the development of insect resistance to Bt toxins remains the most serious current threat to sustaining the gains offered by transgenic crops ${ }^{6}$.

Bt toxins interact with protein receptors on the surface of insect midgut cells, leading to pore formation in the cell membrane and cell death ${ }^{7}$. Bt toxin resistance is commonly associated with the mutation, down-regulation, or deletion of these receptors ${ }^{4}$. Among the known Bt toxin receptors are the cadherin-like proteins ${ }^{8}$, and mutations in the midgut cadherin gene are associated with high-level resistance in major agricultural pests including $H$. virescens ${ }^{9}, P$. gossypiella ${ }^{10}$, and $H$. armigera ${ }^{11}$. We hypothesized that it might be possible to overcome Bt toxin resistance by evolving novel Bt toxins that bind with high affinity to non-cognate receptors in insects. If successful, such an approach has the potential to alter toxin specificity, improve toxin potency, and bypass resistance
mechanisms in insects.
In this chapter we used phage-assisted continuous evolution (PACE) to rapidly evolve Bt toxins through $>500$ generations of mutation, selection, and replication to bind a non-cognate receptor expressed on the surface of insect midgut cells. The PACEderived Bt toxins bind the new receptor with high affinity and specificity, induce lysis of insect cells in a manner dependent on the expression of the new target receptor, and enhance the insecticidal activity against both sensitive and Bt-resistant insect larvae up to 335-fold. Collectively, these results establish an approach to overcoming Bt toxin resistance and also provide a new platform for the rapid evolution of other proteinbinding biomolecules.

## 4.2 - Bt toxin target receptor design

Bt toxins exhibit potent insecticidal activity through disruption of the osmotic balance in insect midgut cells as a consequence of pore formation ${ }^{7}$. The events ultimately leading to cell death include a series of protein-protein binding events that are critical for Bt toxin activation and membrane insertion ${ }^{7,8}$. To illuminate the requirements for Bt toxin-mediated insecticidal activity, as well as to develop a strategy to overcome Bt toxin resistance, we sought to evolve Cry1Ac, the most widely used Bt toxin, to bind a noncognate insect cell membrane receptor from Trichoplusia ni (cabbage looper) Among the insect pests that have developed Bt resistance in agricultural settings, $T$. ni has been widely studied, with high-level resistance known to occur following long-term toxin exposure ${ }^{4}$.

Prior studies of Cry 1 Ac binding to cadherin-like receptor proteins from
lepidopteran insects identified highly conserved epitopes proximal to the plasma membrane that are required for toxin binding ${ }^{19,20}$. Sequence alignment of known Cry 1 Ac binding receptors suggests a short $\sim 50$-amino acid motif, the toxin-binding region (TBR), in cadherin-like proteins that is necessary for Cry1Ac binding and insecticidal activity (Figure 4.1a). Importantly, Cry1Ac toxicity in $T$. $n i$ is not mediated through binding a cadherin-like receptor, but instead is genetically associated with the $A B C C 2$ gene and down-regulation of the aminopeptidase $A P N I^{21-23}$. Further, Cry1Ac resistance in $T$. $n i$ is not dependent on the $T$. ni cadherin-like receptor $\mathrm{TnCAD}^{23}$, as we confirm below. We hypothesized that evolved Cry1Ac mutants capable of binding TnCAD with high affinity would create a new mechanism of action that might restore insecticidal activity against Cry1Ac-resistant T. ni.

The TBR of TnCAD differs from that of cadherin-like proteins from susceptible lepidopteran species at seven amino acid positions (Figure 4.1a,b). To create an evolutionary stepping-stone from cadherin-like proteins that bind Cry1Ac to TnCAD, three residues (F1433, S1436, and A1437) from the TBR of susceptible lepidopteran species ${ }^{20,24-26}$ were introduced into TnCAD, resulting in an artificial receptor fragment designated TnTBR3 (Figure 4.1a,b). We constructed APs expressing various TnTBR3 fragments fused to 434cI and assessed transcriptional activation levels in the presence of various domains of Cry 1Ac fused to RpoZ (Figure 4.1c). Only Cry 1Ac containing all three domains of the active toxin (residues 1-609) showed binding activity for TnTBR3 fragments, with TnTBR3 fragment 3 (TnTBR3-F3) showing the greatest degree of transcriptional activation at $\sim 8$-fold (Figure 4.1c). To assess
a


Figure 4.1 | Choice of Cry1Ac and TnTBR3 fragments used in PACE. a, Protein sequence alignment of known Cry1Ac-binding motifs from cadherin receptors in a number of lepidopteran species, as well as the cadherin receptor from Trichoplusia ni (TnCAD). The toxin-binding region (TBR; shown in red) of the known Cry 1 Ac-binding motifs differs from TnCAD at seven positions (shown in blue). Mutation of three residues in the TnCAD TBR (M1433F, L1436S, and D1437A) to resemble the corresponding positions of the cadherin-receptor TBRs yielded the evolutionary steppingstone target TnTBR3. b, Schematic representations of the Cry1Ac and T. ni TBR3/CAD full-length receptors and fragments tested in this study. The red stars in the TnTBR3 variants represent the three mutations introduced into TnCAD to generate TnTBR3. c, Transcriptional activation assay using Cry 1Ac and TnTBR3 fragments shows that the greatest degree of transcriptional activation resulted from full-length Cry1Ac together with TBR3 fragment 3 (TnTBR3-F3). RpoZ-Cry1Ac and 434cITnTBR3 fusions were used in all cases. d, Overnight phage enrichment assays using selection phages (SPs) that encode either kanamycin resistance ( $\mathrm{Kan}^{\mathrm{R}}$ ) only or $\mathrm{Kan}^{\mathrm{R}}$ together with RpoZ-Cry1Ac. Compared to the Kan ${ }^{\text {R }}$-only SP, the RpoZ-Cry1Ac SP enriches $>26,000$-fold overnight. e, Continuous propagation assays in the PACE format using either the Kan ${ }^{\mathrm{R}}$-only SP or the RpoZ-Cry1Ac SP show that the moderate affinity of Cry1Ac for TnTBR3 allows phage propagation at low flow rates $(\leq 1.5$ lagoon vol/h).
if this modest level of transcriptional activation was sufficient to support PACE, we constructed an SP carrying the rpoZ-CrylAc fusion gene and observed $\sim 100$-fold phage enrichment using a strain carrying the cognate TnTBR3-F3 AP after propagation overnight in a culture without continuous flow, whereas a control SP lacking the rpoZCrylAc fusion did not replicate (Figure 4.1d,e). These findings identified TnTBR3-F3 as a promising evolutionary stepping-stone to serve as a starting target for continuous evolution in PACE.

## 4.3 - Continuous evolution of Cry1Ac to bind TnCAD

Encouraged by these results, we performed 528 h of PACE on Cry1 Ac in four segments while varying mutagenesis levels and selection stringency (Figure 4.2). For the first two segments ( $0-144 \mathrm{~h}$, and 144-276 h), the AP in the host cells expressed the TnTBR3-F3 stepping-stone target fused to 434cI. For the final two segments of PACE (276-396 h, and 396-528 h), the AP expressed the TnCAD-F3 final target fused to 434cI. To enhance mutagenesis, we used our recently described MP4 ${ }^{2}$ mutagenesis plasmid during PACE for binding to TnTBR3-F3 (PACE segments 1 and 2). MP4 offers moderate mutagenesis rates that we speculated could help avoid creating early mutations that destroy the ability of Cry 1 Ac to kill insects, which is not explicitly selected during PACE. During the final two PACE segments for binding to TnCAD-F3 (PACE segments 3 and 4) we used MP6, which induces a greater mutation rate and broader mutational spectrum than MP4 ${ }^{2}$. This change was motivated by consistent phage washout during TnCAD-F3 PACE attempts with MP4, suggesting that higher levels of mutagenesis were required to access rare Cry 1 Ac mutational combinations that conferred binding to the
a


b
d


e


Figure 4.2| Continuous evolution of Cry1Ac variants that bind the Trichoplusia ni cadherin receptor.

Figure 4.2 (Continued) Continuous evolution of Cry1Ac variants that bind the Trichoplusia ni cadherin receptor. a, PACE was executed in four segments. The first two segments implemented the designed TnTBR3-F3 "stepping-stone" target under intermediate levels of mutagenesis (MP4). The final two segments implemented the final TnCAD-F3 target under high levels of mutagenesis (MP6). Phage titer (colored lines) and lagoon flow rate (grey lines) are shown at all sampled time points. The dotted lines indicate transfer of evolving phage to a new lagoon fed by the host cell culture corresponding to the next segment of PACE. b, $\mathbf{c}$, Transcriptional activation assays using 434cI-TnTBR3-F3 (b) or 434cI-TnCAD-F3 (c) and individual RpoZ-Cry1Ac variants evolved during PACE, compared to wild-type RpoZ-Cry1Ac (wt). d, Oligotyping analysis of lagoon samples during PACE based on high-throughout DNA sequencing data. Oligotypes containing high frequency mutations ( $\geq$ $1 \%$ ) are represented by different polygons, colored based on the stage in which they first became abundant in the evolving Cry1Ac gene pool. Mutations in Cry1Ac for each oligotype are shown in the table. Numbers in parentheses indicate the oligotype number assigned to that mutant following a synonymous (silent) mutation. e, Plausible evolution trajectories over the entire PACE experiment derived from oligotyping analysis strongly suggests instances of recombination during PACE, and also reveals the influence of mutation rate, selection stringency, and target protein on evolutionary outcomes. The colors and numbers in each circle correspond to those in (d).

We increased selection stringency during PACE by increasing lagoon flow rates and reducing the number of TnTBR3-F3 or TnCAD-F3 fragments participating in Cry 1 Ac variant recognition (Figure 2.4, 2.5a). At the end of every segment, we assayed the ability of evolved Cry1Ac clones to activate transcription in host E. coli cells expressing either the TnTBR3-F3 or the TnCAD-F3 fragment. Phage surviving 528 h of PACE experienced on average 511 generations of mutagenic replication under selection conditions ${ }^{1}$.

Single-clone sequencing at the end of the first segment (144 h PACE on cells containing four copies of TnTBR3-F3 associated with each $\mathrm{P}_{\text {lacZ-opt }}$ promoter) showed a strong consensus of two coding mutations in CrylAc, and one coding mutation in rpoZ (Figure 4.3). The three mutations together resulted in 11-fold higher transcriptional activation than that of the wild-type rpoZ-CrylAc fusion. At the end of the second
segment (276 h PACE with two copies of TnTBR3-F3 per $\mathrm{P}_{\text {lacZ-opt }}$ promoter), even greater degrees of transcriptional activation were observed, up to 20 -fold higher than the level resulting from the starting fusion protein (Figure 4.2b, 4.3a). At the end of third segment (396 h PACE with four copies of TnCAD-F3 per $\mathrm{P}_{\text {lacZ-opt }}$


Figure 4.3 | Single-clone sequencing and evolved Cry1Ac characterization following PACE using the bacterial 2-hybrid luminescence reporter.

Figure 4.3 | (Continued) Single-clone sequencing and evolved Cry1Ac characterization following PACE using the bacterial 2-hybrid luminescence reporter. a, Coding mutations of the tested RpoZCry1Ac clones at the end of each of the four segments of PACE. Consensus mutations are colored according to the segment in which they became highly enriched in the population (Fig. 3a). Mutations colored in black were observed at low abundance ( $\leq 5 \%$ of sequenced clones). b, Mutational dissection of the consensus mutations from the first segment of PACE reveals the requirement for both D384Y and S404C to achieve high-level transcriptional activation using the TnTBR3-F3 target. Mutations listed in red occurred in the RpoZ activation domain, whereas mutations listed in blue occurred in the Cry1Ac domain. Error bars reflect the standard deviation of at least three independent biological replicates. c, Structure of wild-type Cry1Ac (PDB: 4ARX) showing the positions of the evolved consensus mutations. The colors correspond to the PACE segments shown in Fig. 3 during which the mutations became highly abundant.
promoter), Cry1Ac variants evolved with greatly enhanced apparent affinity for TnCADF3 (Figure 4.2c, 4.3a). Whereas wild-type Cry1Ac could not detectably activate transcription when challenged to bind TnCAD-F3, single Cry1Ac variants emerging from a total of 384 h of PACE robustly activated transcription up to 210 -fold above background in the absence of Cry1Ac variant expression. The end of the fourth segment (528 h PACE with one copy of TnCAD-F3 per $\mathrm{P}_{\text {lacZ-opt }}$ promoter) yielded CrylAc mutants that could activate transcription when challenged to bind TnCAD-F3 by up to 500-fold (Figure 4.2c, 4.3a), suggesting strong binding to the TnCAD-F3 final target.

## 4.4 - Characterization of evolved Cry1Ac variants

DNA sequencing of individual clones surviving 528 h of PACE revealed a number of consensus genotypes carrying up to 16 mutations per clone out of 22 consensus mutations (C15W, F68S, A164S, R198G, G286D, T304N, M322K, E332G, A344E, Q353H, T361I, S363P, D384Y, T386A, S404C, N417D, E461K, N463S, A $534 \mathrm{~V}, \mathrm{E} 515 \mathrm{~K}, \mathrm{~A} 534 \mathrm{~V}$, and S582L), most of which localize to domain II, the predicted
cadherin-binding domain of Cry 1 Ac (Figure 4.1, 4.3). To illuminate the evolution trajectories en route to TnCAD-F3 binding activity, we analyzed all lagoon samples, collected every 12-24 h, by high-throughput DNA sequencing using both shorter-read (Illumina) and longer-read (Pacific Biosciences) methods (Figure 4.4). These efforts identified 25 mutations commonly occurring over the 528 h of PACE (Figure 4.1, 4.3). Oligotyping analysis ${ }^{27}$ of the long-read data revealed plausible evolutionary trajectories over the entire course of the experiment (Figure 4.2d,e). While PACE does not explicitly promote recombination as a mechanism of gene diversification, we observed multiple


Figure 4.4 | High-throughput DNA sequencing of PACE Cry1Ac selection phage libraries. The number of reads mapped to the wt rpoZ-CrylAc reference sequence using (a) Pacific Biosciences (PacBio) or (b) Illumina sequencing. Time points are colored according to the corresponding segment of the PACE experiment (Fig. 3A). c, In general, the majority of PacBio reads aligned to the wt rpoZCrylAc reference sequence were found to cluster around $\sim 2,200$ base pairs, corresponding to the size of the full-length fusion gene and indicating high-quality sequencing reads. d, Illumina high-throughput sequencing yielded a number of high quality SNPs across all time points. The corresponding mutations are shown in (e).
putative recombination events during the course of Cry1Ac evolution (Figure 4.2e).
These recombination events, which we presume arose from multiple phage occasionally infecting the same host cell, yielded seminal, highly functional new variants.

Based on our mutational analysis, we designed and synthesized consensus
Cry1Ac variants containing the most commonly observed mutations (Figure 4.5a).
Purified activated Cry1Ac variants encoding PACE-derived consensus mutations bind very strongly to a TnCAD fragment containing the TBR (TnCAD-FL; Figure 4.1b) by ForteBio bio-layer interferometry analysis $\left(\mathrm{K}_{\mathrm{d}}=11-41 \mathrm{nM}\right)$, with evolved


Figure 4.5| Characterization of consensus evolved Cry1Ac variants. a, Consensus evolved Cry1Ac mutant sequences, including the D384Y/S404C double mutant (DM) that enabled TnTBR3-F3 recognition during the first segment of PACE. b, SDS-PAGE analysis of Cry1Ac variants following trypsin digestion, revealing proteolytic instability of consensus evolved variants. $\mathrm{S}=$ solubilized crude Bt crystals; $\mathrm{T}=$ trypsin-treated. c, Toxicity assays using Sf9 cells expressing the ABCC2 (black) or TnCAD receptor (green). Cells were incubated with Cry1Ac variants following trypsin digestion at the concentrations of activated toxin shown. Cry1Ac-induced cell permeabilization causes a fluorescent dye to enter cells, resulting in an increase in fluorescence. The evolved Cry1Ac variants, but not wild-type Cry1Ac, induce permeabilization of cells expressing TnCAD. Error bars reflect the standard deviation of at least three independent biological replicates. d, Insect larvae diet bioassays using wild-type and evolved consensus Cry1Ac variants, showing the loss of evolved Cry1Ac potency in insect larvae arising from impaired stability.

Cry1Ac variants C03 and C05 exhibiting the highest binding affinity (Figure 4.6). In contrast, wild-type Cry1Ac exhibited no detectable affinity for TnCAD under the same conditions. These results together establish the ability of protein-binding PACE to rapidly evolve extensively mutated proteins with high target affinity.

CrylAc requires activation by proteases in the insect midgut ${ }^{4}$. The evolved consensus mutants, however, exhibited extensive proteolysis in the presence of trypsin under conditions in which the wild-type Cry1Ac was cleanly cleaved into its active form (Figure 4.5b). Thermal melting studies confirmed this reduced stability (consensus variants: $\mathrm{T}_{\mathrm{m}}=\sim 45^{\circ} \mathrm{C}$; wild-type Cry $1 \mathrm{Ac}: \mathrm{T}_{\mathrm{m}}=71{ }^{\circ} \mathrm{C}$; Figure 4.6). Despite this lower stability, trypsin-activated consensus variants robustly killed Sf 9 cells expressing the TnCAD receptor, whereas wild-type Cry 1 Ac did not exhibit toxicity at the tested concentration (Figure 4.5c). Moreover, these consensus evolved Cry1Ac mutants showed insecticidal activity in T. ni larvae, although they were less potent than wild-type Cry1Ac (Figure 4.5d).

We hypothesized that a subset of the consensus mutations were impairing apparent toxin potency against insect larvae by decreasing Cry1Ac stability and thus promoting degradation in insect gut. We generated Cry1Ac variants containing reversions of the identified consensus mutations, with a focus on mutations that arose during earlystage evolution on the stepping-stone target (Figure 4.2e), and evaluated their ability to survive trypsin treatment and to kill Sf 9 insect cells and $T$. ni insect larvae (Figure 4.6). Using this approach, we identified mutations D384Y and S404C, two mutations that arose early during PACE against the TBR3 stepping-stone target (Figures 4.2d, 4.2e, 4.5a), as the main source of reduced protein stability. Variants lacking these two


Table 4.1 | Mutations and in vitro properties of Cry1Ac variants derived from PACE.


Table 4.1 (Continued) | Mutations and in vitro properties of Cry1Ac variants derived from PACE.
mutations, but containing the other seven consensus C05 mutations, exhibited greatly improved, wild-type-like stability $\left(\mathrm{T}_{\mathrm{m}}=\sim 60^{\circ} \mathrm{C}\right)$. Variants lacking D384Y and S404C also exhibited proteolytic resistance similar to that of wild-type Cry1Ac, while retaining high binding affinity to $\mathrm{TnCAD}-\mathrm{FL}\left(\right.$ up to $\left.\mathrm{K}_{\mathrm{d}}=11 \mathrm{nM}\right)$ (Figures 4.6a, 4.6b, 4.5).

We assayed the toxicity of two evolved consensus Cry1Ac variants (C05 and C 03 ) and three stabilized evolved consensus Cry1Ac variants ( $\mathrm{C} 05 \mathrm{~s}, \mathrm{C} 03 \mathrm{~s}$, and A 01 s ) lacking D384Y and S404C to cultured Sf9 insect cells expressing an ABCC2 receptor (positive control) or TnCAD. The stabilized evolved Cry1Ac variants retain their ability to bind to the cognate ABCC 2 receptor, while acquiring the ability to potently kill Sf 9 cells expressing TnCAD, in contrast to the ability of wild-type Cry 1 Ac to only kill cells expressing the cognate ABCC 2 receptor, but not cells expressing TnCAD (Figure 4.6c).

## 4.5 - In vivo activity of evolved Cry1Ac variants

Finally, we assayed the insecticidal activity of the stabilized evolved Cry1Ac variants against Cry1Ac-sensitive T. ni larvae when added to their diet. Consistent with the above in vitro results, the stabilized evolved Cry1Ac variants exhibited substantially increased toxicity to $T$. ni larvae compared with that of the consensus evolved Cry 1Ac mutants prior to stabilization (Figure 4.6d). Interestingly, the stabilized evolved Cry1Ac variants also exhibited up to 4 -fold more potent insecticidal activity against Cry1Acsensitive $T$. $n i$ than that of wild-type Cry1Ac, suggesting that the evolved ability of the toxins to recognize a non-cognate receptor with high affinity may augment their insecticidal potency, even against insects susceptible to wild-type Cry1Ac. These results also suggest that the evolution of Bt toxins that recognize non-cognate or novel receptors


Figure 4.6 | Characterization of stabilized evolved Cry1Ac variants reveals potently enhanced activity. a, Sequence, thermal stability, and TnCAD target-binding affinity of unstable and stabilized PACE evolved consensus mutants. b, SDS-PAGE analysis of trypsin digestion reactions showing dramatically enhanced stability upon D384Y and S404C reversion. $\mathrm{S}=$ solubilized crude Bt crystals; T $=$ trypsin-treated. $\mathbf{c}$, Toxicity assays using Sf9 cells overexpressing the ABCC 2 (black) or TnCAD receptor (green), demonstrating maintained activity of stabilized variants against both ABCC 2 or TnCAD. All variants were used at 10 ppm . Error bars reflect the standard deviation of at least three independent biological replicates. d, e, Highly purified wild-type Cry1Ac, evolved consensus variants, or stabilized evolved variants were added to the diets of Cry1Ac-susceptible (d) or Cry1Ac-resistant (e) T. $n i$ larvae at the indicated doses. Stabilized evolved variants moderately enhance mortality and growth inhibition in Cry 1Ac-susceptible larvae compared to wild-type Cry1Ac. Stabilized evolved variants greatly outperform wild-type Cry 1 Ac toxin in killing and inhibiting the growth of Bt toxin-resistant $T$. $n i$ larvae.
could expand the range of insects that can be targeted by Bt toxins, consistent with previous in vitro studies ${ }^{28,29}$ using designed Bt toxin derivatives.

Next we evaluated the insecticidal activity of the stabilized evolved Cry1Ac variants against Cry1Ac-resistant T. ni larvae. T. ni resistance to Cry1Ac has been genetically mapped to the $A B C C 2$ transporter gene and down-regulation of expression of $A P N I^{21,22}$, and is not dependent on alteration of the cadherin-like receptor ${ }^{23}$. Indeed, we observed $\sim 1,000$-fold lower potency of wild-type Cry 1 Ac against a Cry1Ac-resistant $T$. $n i$ strain, compared to the potency of wild-type Cry1Ac against susceptible T. $n i^{30}$ (Figure 4.6e). Compared to wild-type Cry1Ac, stabilized evolved Cry1Ac variants C 05 s , C03s, and A01s showed dramatically improved activity against Cry1Ac-resistant T. ni, inducing larval mortality up to 335 -fold more potently and larval growth inhibition up to 282-fold more potently than wild-type Cry1Ac (Figure 4.6e). Importantly, these evolved and stabilized Cry1Ac variants showed similar toxicity in Bt-resistant T. ni (as potent as $\left.\mathrm{LC}_{50}=0.15 \mathrm{ppm}\right)$ as that of wild-type Cry1Ac in susceptible larvae $\left(\mathrm{LC}_{50}=0.04 \mathrm{ppm}\right)$ (Figure 4.6e). Taken together, these results establish that the evolution of novel receptor affinity among Bt toxins can provide a solution to overcome Bt toxin resistance in an agricultural pest.

To characterize the species profile of their insecticidal activity, we tested the evolved Cry1Ac variants in diet bioassays on 11 additional agricultural pests: a lepidopteran related to $T$. $n i$ (Chrysodeixis includes, soybean looper) that encodes a cadherin-like receptor highly homologous to TnCAD, eight more distantly related lepidopteran pests (Heliothis virescens, tobacco budworm; Helicoverpa zea, corn earworm; Plutella xylostella, diamondback moth; Agrotis ipsilon, black cutworm;

Spodoptera frugiperda, fall armyworm; Anticarsia gemmatalis, velvetbean caterpillar; Diatraea saccharalis, sugarcane borer; and Spodoptera eridania, southern armyworm), and three non-lepidopteran pests (Leptinotarsa decemlineata, Colorado potato beetle; Lygus lineolaris, tarnished plant bug; and Diabrotica virgifera virgifera, western corn rootworm) (Figures 4.7, 4.8). As expected, the stabilized evolved Cry1Ac variants were up to 20 -fold more potent than wild-type Cry 1 Ac against C. includes, and comparably potent as wild-type Cry 1Ac against the other lepidopteran pests assayed (Figure 4.7a). Neither the evolved nor wild-type Cry1Ac exhibited insecticidal activity against the lepidopteran S. eridania or the three non-lepidopterans tested (Figure 4.7b-h). These results further support the mechanism of action of the PACE-evolved Bt toxins as binding to non-cognate cadherin receptor in $T . n i$ and the related cadherin receptor in $C$. includes, while retaining binding to cognate receptors in all tested lepidopteran species. These data also reveal that the evolved Bt toxins did not acquire activity against species lacking a receptor homologous to TnCAD . Taken together, these findings demonstrate that an evolved Bt toxin that binds a novel target can potently kill closely related insect pest species, while maintaining a similar overall insect spectrum specificity as the parental Bt toxin.

## 4.6 - Discussion

Protein-binding PACE was able to rapidly discover variants of Cry1Ac that bind with high affinity to the non-cognate receptor TnCAD. Perhaps unsurprisingly, we observed a moderate reduction in stability of the evolved variants as compared to wildtype Cry1Ac, as this was not an implicit requirement of the selection. Interestingly, the


Figure 4.7 | Insect diet bioassay activity of PACE-evolved Cry1Ac variants against various agricultural pests. Two consensus and three stabilized PACE-evolved Cry1Ac variants were tested for activity in eleven pests: a, Chrysodeixis includes (soybean looper); b, Heliothis virescens (tobacco budworm); c, Helicoverpa zea (corn earworm); d, Plutella xylostella (diamondback moth); e, Agrotis ipsilon (black cutworm); f, Spodoptera frugiperda (fall armyworm); g, Anticarsia gemmatalis (velvetbean caterpillar); h, Diatraea saccharalis (sugarcane borer); Spodoptera eridania (southern armyworm); Leptinotarsa decemlineata (Colorado potato beetle); and Lygus lineolaris (tarnished plant bug). Stabilized variants showed enhanced activity in $C$. includens and $H$. virescens as compared to wild-type Cry1Ac, and comparable activity to wild-type Cry1Ac in H. zea, P. xylostella, A. ipsilon, $S$. frugiperda, A. gemmatalis, and D. saccharalis. No activity was observed for any of the Cry1Ac variants at any tested dose for $S$. eridania, L. decemlineata or $L$. lineolaris. No insect larvae mortality was observed for $S$. frugiperda, although high toxin doses greatly stunted growth.
two mutations that reduced Cry1Ac stability (D384Y and S404C) arose within the first few days of PACE on the stepping-stone target TnTBR3-F3 and were inherited by virtually all subsequent evolved variants (Figure 4.2e). It is tempting to speculate that these mutations broadened the substrate scope of Cry 1 Ac binding to enable downstream protein evolution, at the expense of stability, but were not required once affinity for the TnCAD-F3 receptor fragment evolved. Comparing the TnCAD binding affinities of Cry1Ac variants with and without D384Y and S404C suggests that they do not impair, and in some contexts may enhance, TnCAD binding in vitro and during PACE, two contexts in which their negative impact on stability likely does not limit potency (Figure

## 4.6).

Additional affinity measurements of reverted consensus mutations reveal the key roles of E461K and N463S to achieve high-affinity binding to TnCAD (Figure 4.6). Both of these mutations evolved in quick succession early during the third PACE

|  | T. $n i$ | C. includens | H. virescens | H. zea | P. xylostella | A. ipsilon | S. frugiperda | L. decemlineata | D. virgifera |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| T. ${ }^{\text {ni }}$ | - | 78.6 (1362) | 57.9 (1004) | 57.3 (993) | 53.1 (920) | 51.8 (897) | 51.2 (888) | 25.6 (443) | 26.1 (453) |  |
| C. includens | 76.8 (1362) |  | 55.7 (988) | 54 (958) | 51.8 (918) | 49.9 (884) | 49.8 (883) | 24.6 (437) | 25.5 (452) |  |
| H. virescens | 58 (1004) | 57 (988) | - | 84.5 (1464) | 55.4 (959) | 58.9 (1021) | 57.3 (992) | 26 (451) | 25.7 (445) |  |
| H. zea | 57.4 (993) | 55.4 (958) | 84.6 (1464) | - | 54.6 (945) | 58.7 (1016) | 57.3 (992) | 26.3 (455) | 25.4 (439) |  |
| P. xylostella | 53.6 (920) | 53.5 (918) | 55.9 (959) | 55 (945) | - | 49.4 (848) | 50.5 (867) | 24.6 (422) | 25.3 (435) |  |
| A. ipsilon | 51 (897) | 50.2 (884) | 58 (1021) | 57.7 (1016) | 48.2 (848) | - | 53.1 (935) | 24 (422) | 25 (440) |  |
| S. frugiperda | 51.2 (888) | 50.9 (883) | 57.2 (992) | 57.2 (992) | 50 (867) | 53.9 (935) | - | 25.7 (445) | 25.1 (436) |  |
| L. decemlineata | 26.3 (443) | 25.9 (437) | 26.7 (451) | 27 (455) | 25 (422) | 25 (422) | 26.4 (445) | - | 39.6 (668) |  |
| D. virgifera | 26.8 (453) | 26.8 (452) | 26.4 (445) | 26 (439) | 25.8 (435) | 26.1 (440) | 25.8 (436) | 39.6 (668) | - |  |
| b | T. ni | C. includens | H. virescens | H. zea | P. xylostella | A. ipsilon | S. frugiperda | L. decemlineata | D. virgifera | > $70 \%$ |
| T. ni | - | 76.9 (170) | 55.2 (122) | 54.3 (120) | 52 (115) | 47.5 (105) | 47.1 (104) | 24 (53) | 22.2 (49) |  |
| C. includens | 75.2 (170) | - | 51.3 (116) | 51.3 (116) | 47.8 (108) | 42.5 (96) | 42.5 (96) | 22.6 (51) | 22.6 (51) |  |
| H. virescens | 55 (122) | 52.3 (116) | - | 81.5 (181) | 50 (111) | 49.5 (110) | 47.7 (106) | 23.4 (52) | 19.8 (44) |  |
| H. zea | 53.8 (120) | 52 (116) | 81.2 (181) | - | 49.3 (110) | 50.2 (112) | 47.5 (106) | 24.2 (54) | 19.3 (43) |  |
| P. xylostella | 52 (115) | 48.9 (108) | 50.2 (111) | 49.8 (110) | - | 43.9 (97) | 48 (106) | 22.2 (49) | 19 (42) |  |
| A. ipsilon | 47.3 (105) | 43.2 (96) | 49.5 (110) | 50.5 (112) | 43.7 (97) | - | 42.8 (95) | 18.5 (41) | 18.9 (42) |  |
| S. frugiperda | 46.8 (104) | 43.2 (96) | 47.7 (106) | 47.7 (106) | 47.7 (106) | 42.8 (95) | - | 24.8 (55) | 23.4 (52) |  |
| L. decemlineata | 22.3 (53) | 21.4 (51) | 21.8 (52) | 22.7 (54) | 20.6 (49) | 17.2 (41) | 23.1 (55) | - | 38.2 (91) |  |
| D. virgifera | 20.2 (49) | 21 (51) | 18.1 (44) | 17.7 (43) | 17.3 (42) | 17.3 (42) | 21.4 (52) | 37.4 (91) | - |  |

Figure 4.8 | Comparison of cadherin receptor sequence identity. The \% sequence identity using the full-length cadherin receptor (a) or fragment used for directed evolution experiments (b) for insects tested in Extended Data Figure 8. Numbers in parenthesis denote the number of identical amino acids between the two receptors. In general, mortality and stunting data from diet bioassays correlates with cadherin receptor sequence identity.
segment (Figure 4.2e), consistent with their contribution to TnCAD binding. Similarly, reversion analysis also shows that S582L can enhance affinity to TnCAD (Figure 4.6), in agreement with its evolution near the end of the third PACE segment and its predominance among subsequent Cry 1 Ac variants. Importantly, all three mutations lie on the same face of Cry 1 Ac (albeit in different domains), consistent with direct interaction with the cadherin receptor fragments.

Collectively, our findings establish for the first time that the laboratory evolution of novel or enhanced Bt toxin-receptor interactions can overcome insect resistance to Bt toxins. This strategy complements other approaches to limit the incidence of Bt toxin resistance. The "gene pyramiding" strategy for resistance management ${ }^{31}$, for example, has been shown to be effective to delay resistance development in insect populations, but requires the availability of multiple effective toxins with distinctively different binding sites in target insects. The refuge strategy ${ }^{6}$ is effective to slow the development of resistance, but necessitates that the resistance is a recessive trait, depends on a low initial frequency of resistance alleles in the field, requires compliance by growers, and delays but does not overcome resistance. The engineering of pre-oligomerized Bt toxins to reduce the reliance on cadherin receptor interaction ${ }^{32}$ has also been shown to enhance toxicity in resistant insects, but elimination of the integral recognition event with cadherin greatly reduces the target specificity of the toxin, creating a risk to non-target organisms.

The approach presented herein enables targeting of Bt-resistant pests through the evolution of high-affinity receptor-binding Bt toxin variants designed to bind specific proteins in target insects. In principle, this strategy should be applicable to target a variety
of insect pests for which midgut cell-membrane proteins have been identified. While the evolution of insect resistance to an evolved Bt toxin is a likely possibility, this work has the potential to provide access to many new Bt toxins that individually or in combination could substantially extend the effectiveness of this important approach to pest control. We also note that the ability of protein-binding PACE to rapidly evolve novel proteinprotein interactions as demonstrated in this study may prove useful in the discovery or improvement of protein therapeutics.

## 4.7-Methods

General methods. PCR was performed using PfuTurbo Cx Hotstart DNA polymerase (Agilent Technologies), VeraSeq ULtra DNA polymerase (Enzymatics), or Phusion U Hot Start DNA Polymerase (Life Technologies). Water was purified using a MilliQ water purification system (Millipore). Plasmids and selection phages were constructed using USER cloning (New England Biolabs). Genes were either synthesized as bacterial codonoptimized gBlocks Gene Fragments (Integrated DNA Technologies) or amplified by PCR from native sources. Crylac was amplified by PCR from the B. thuringiensis strain $B t \_$B107284 and cloned into the $B t$ expression vector pMON101647 using Hot Fusion ${ }^{33}$ to generate the expression plasmid pMON133051, which served as a template for amplifying Crylac fragments for constructing PACE vectors. The toxin-binding region from T. ni cadherin (A1133-T1582, AEA29692.10), referred to as TnCAD-FL, was synthesized using 45-60-mer oligonucleotides (Integrated DNA Technologies) by overlap extension PCR using KOD Hot Start DNA polymerase (EMD Millipore). The synthetic wild-type TnCAD-FL template was used to generate the TnTBR3-FL fragment via sitedirected mutagenesis using the QuikChange II kit according to the manufacturers' instructions. (Agilent Technologies). DNA vector amplification was carried out using NEB Turbo or DH5a cells (New England Biolabs).

Electrocompetent strain preparation. The previously described strains S1030 ${ }^{14}$ and S2060 ${ }^{16}$ were used in all luciferase and plaque assays, as well as in PACE experiments. The glycerol stock of either strain was used to seed a $2-\mathrm{mL}$ overnight culture using 2 xYT media (United States Biological) supplemented with $10 \mu \mathrm{~g} / \mathrm{mL}$ tetracycline (Sigma

Aldrich), $50 \mu \mathrm{~g} / \mathrm{mL}$ streptomycin (Sigma Aldrich), $10 \mu \mathrm{~g} / \mathrm{mL}$ fluconazole (TCI America), and $10 \mu \mathrm{~g} / \mathrm{mL}$ amphotericin B (TCI America) in a $37^{\circ} \mathrm{C}$ shaker at 230 rpm . The saturated culture was diluted 1,000-fold in 50 mL of the same supplemented media and grown under identical conditions until it reached mid log-phase $\left(\mathrm{OD}_{600} 0.5-0.8\right)$. Once the appropriate $\mathrm{OD}_{600}$ was reached, the cells were pelleted in a $50-\mathrm{mL}$ conical tube (VWR) centrifuged at $10,000 G$ for 5 min at $4^{\circ} \mathrm{C}$. The supernatant was immediately decanted and the interior of the tube was wiped with a few Kimwipes (Kimberly-Clark) to remove residual media and salts. The cells were resuspended in 25 mL of pre-chilled, sterile filtered $10 \%$ glycerol in MilliQ purified water using a pipette to quickly break up the pellet. The cells were centrifuged and washed an additional three times. After the last centrifugation step, the interior of the tube was wiped with a few Kimwipes to remove residual glycerol solution. The pellet was resuspended in as little volume as possible, typically $\sim 150 \mu \mathrm{~L}$, and split into $10 \mu \mathrm{~L}$ aliquots for storage. Cells were flash frozen using a liquid $\mathrm{N}_{2}$ bath, then quickly transferred to $-80^{\circ} \mathrm{C}$ for extended storage.

Electrocompetent S1030 or S2060 cells produced by this method typically yielded $10^{7}$ $10^{8}$ colonies $/ \mu \mathrm{g}$ plasmid DNA and enable the simultaneous electroporation of up to three plasmids carrying orthogonal origins of replication and antibiotic resistance cassettes to yield transformants containing all plasmids.

General USER cloning. All plasmid and phage materials were constructed via USER cloning ${ }^{34}$. Briefly, primers were designed to include a single internal deoxyuracil base 1520 bases from the 5 ' end of the primer, specifying this region as the "USER junction". Criteria for design of the USER junction were: it should contain minimal secondary
structure, have $45^{\circ} \mathrm{C}<\mathrm{T}_{\mathrm{m}}<70^{\circ} \mathrm{C}$, and begin with a deoxyadenosine and end with a deoxythymine (to be replaced by deoxyuridine). The USER junction specifies the homology required for correct assembly. We note that PfuTurbo Cx Hotstart DNA polymerase (Agilent Technologies), VeraSeq ULtra DNA polymerase (Enzymatics), or Phusion U Hot Start DNA Polymerase (Life Technologies) are able to use primers carrying deoxyuracil bases, whereas some other polymerases undergo a phenomenon known as PCR poisoning and do not extend the primer.

All PCR products were purified using MinElute PCR Purification Kit (Qiagen) to $10 \mu \mathrm{~L}$ final volume and quantified using a NanoDrop 1000 Spectrophotometer (Thermo Scientific). For assembly, PCR products carrying complementary USER junctions were mixed in an equimolar ratio (up to 1 pmol each) in a $10 \mu \mathrm{~L}$ reaction containing 15 units DpnI (New England Biolabs), 0.75 units USER (Uracil-Specific Excision Reagent) enzyme (Endonuclease VIII and Uracil-DNA Glycosylase, NEB), 50 mM potassium acetate, 20 mM Tris-acetate, 10 mM magnesium acetate, $100 \mu \mathrm{~g} / \mathrm{ml}$ BSA at pH 7.9 (1x CutSmart Buffer, New England Biolabs). The reactions were incubated at $37^{\circ} \mathrm{C}$ for 45 min, followed by heating to $80^{\circ} \mathrm{C}$ and slow cooling to $22^{\circ} \mathrm{C}$ at $0.1^{\circ} \mathrm{C} / \mathrm{s}$ in a temperaturecontrolled block. The hybridized constructs were directly used for heat-shock transformation of chemically competent NEB Turbo E. coli cells according to the manufacturer's instructions. Transformants were selected on $1.8 \%$ agar- 2 xYT plates supplemented with the appropriate antibiotic(s).

For SP cloning, the hybridized constructs were purified using EconoSpin purification columns (Epoch Life Sciences), eluted using $25 \mu \mathrm{~L} 10 \%$ glycerol, and transformed into electrocompetent S2060 cells carrying the phage-responsive AP
pJC175e, which produces functional pIII in response to phage infection (this strain is henceforth referred to as S2208). Following recovery for $3-4 \mathrm{~h}$ at $37^{\circ} \mathrm{C}$ using 2 xYT (United States Biological) media, the culture was centrifuged and the supernatant was purified using a $0.22 \mu \mathrm{~m}$ PVDF Ultrafree centrifugal filter (Millipore). The supernatant was diluted serially in 100-fold increments and used in plaque assays using log-phase S2208 cells. Following overnight at $37^{\circ} \mathrm{C}$, single plaques were picked into 2 xYT media and grown for $12-18 \mathrm{~h}$ in a $37^{\circ} \mathrm{C}$ shaker at 230 rpm . The supernatant was purified again to yield clonal phage stocks. In all cases, cloned plasmids and phages were prepared using the TempliPhi 500 Amplification Kit (GE Life Sciences) according to the manufacturers protocol and verified by Sanger sequencing.

Plaque assays. S $1030^{14}$ or $\mathrm{S} 2060^{16}$ cells transformed with the AP of interest were grown in 2xYT (United States Biological) liquid media supplemented with the appropriate antibiotics to an $\mathrm{OD}_{600}$ of 0.6-0.9. The phage supernatant was diluted serially in three, 100 -fold increments to yield four total samples (undiluted, $10^{2}$-fold, $10^{4}$-fold, and $10^{6}$ fold diluted) to be used for infections. For each sample, $150 \mu \mathrm{~L}$ of cells were added to 10 $\mu \mathrm{L}$ of phage that had been filtered using a $0.22 \mu \mathrm{~m}$ PVDF Ultrafree centrifugal filter (Millipore). Within 1-2 min of infection, 1 mL of warm $\left(\sim 55^{\circ} \mathrm{C}\right)$ top agar $(7 \mathrm{~g} / \mathrm{L}$ bacteriological agar in 2 xYT ) was added to the phage/cell mixture, mixed by pipetting up and down once, and plated onto quartered plates that had been previously poured with 2 mL of bottom agar ( $18 \mathrm{~g} / \mathrm{L}$ bacteriological agar in 2 xYT ) in each quadrant. The plates were then grown overnight at $37^{\circ} \mathrm{C}$ before plaques could be observed.

Phage-Assisted Continuous Evolution (PACE). Host cell cultures, lagoons, media, and the PACE apparatus were as previously described ${ }^{14}$. Recombined selection phage harboring gene III (rSP) will poison a PACE experiment by outcompeting the evolving SP. We have noted that the likelihood of rSP occurrence in an SP stock increases with extended standing culture growth during the initial SP stock preparation. To reduce the likelihood of rSP formation, all SPs are repurified prior to any continuous evolution experiments. Briefly, SPs were plaqued on S2208 cells. A single plaque was picked into 2 mL 2 xYT (United States Biological) supplemented with the appropriate antibiotics and grown until the culture reached mid log-phase $\left(\mathrm{OD}_{600} 0.5-0.8\right)$. The culture was centrifuged using a tabletop centrifuge for 2 min at $10,000 \mathrm{G}$, followed by supernatant filtration using a $0.22 \mu \mathrm{~m}$ PVDF Ultrafree centrifugal filter (Millipore). This short growth period routinely yields titers of $10^{6}-10^{8} \mathrm{pfu} / \mathrm{mL}$ and was found to minimize the occurrence of rSP during PACE experiments.

To prepare the PACE strain, the AP and MP were co-transformed into electrocompetent S1030 cells (see above) and recovered using Davis rich media ${ }^{14}$ (DRM) to ensure MP repression. Transformations were plated on $1.8 \%$ agar- 2 xYT containing 50 $\mu \mathrm{g} / \mathrm{mL}$ carbenicillin, $40 \mu \mathrm{~g} / \mathrm{mL}$ chloramphenicol, $10 \mu \mathrm{~g} / \mathrm{mL}$ fluconazole, $10 \mu \mathrm{~g} / \mathrm{mL}$ amphotericin B, 100 mM glucose (United States Biological) and grown for 12-18 h in a $37^{\circ} \mathrm{C}$ incubator. Following overnight growth, four single colonies were picked and resuspended in DRM, then serially diluted and plated on $1.8 \%$ agar- 2 xYT containing 50 $\mu \mathrm{g} / \mathrm{mL}$ carbenicillin, $40 \mu \mathrm{~g} / \mathrm{mL}$ chloramphenicol, $10 \mu \mathrm{~g} / \mathrm{mL}$ fluconazole, $10 \mu \mathrm{~g} / \mathrm{mL}$ amphotericin B, and either 100 mM glucose or 100 mM arabinose (Gold Biotechnology) and grown for $12-18 \mathrm{~h}$ in a $37^{\circ} \mathrm{C}$ incubator. Concomitant with this plating step, the
dilution series was used to inoculate liquid cultures in DRM supplemented with 50 $\mu \mathrm{g} / \mathrm{mL}$ carbenicillin, $40 \mu \mathrm{~g} / \mathrm{mL}$ chloramphenicol, $10 \mu \mathrm{~g} / \mathrm{mL}$ tetracycline, $50 \mu \mathrm{~g} / \mathrm{mL}$ streptomycin, $10 \mu \mathrm{~g} / \mathrm{mL}$ fluconazole, $10 \mu \mathrm{~g} / \mathrm{mL}$ amphotericin B and grown for $12-18 \mathrm{~h}$ in a $37{ }^{\circ} \mathrm{C}$ shaker at 230 rpm . Following confirmation of arabinose sensitivity using the plate assay, cultures of the serially diluted colonies still in log-phase growth were used to seed a $25-\mathrm{mL}$ starter culture for the PACE chemostat.

Once the starter culture had reached log-phase density $\left(\mathrm{OD}_{600} 0.5-0.8\right)$, the $25-\mathrm{mL}$ culture was added directly to 175 mL of fresh DRM in the chemostat. The chemostat culture was maintained at 200 mL and grown at a dilution rate of $1.5-1.6 \mathrm{vol} / \mathrm{hr}$ as previously described ${ }^{14}$. Lagoons flowing from the chemostats were maintained at 40 mL , and diluted as described for each experiment. Lagoons were supplemented with 25 mM arabinose to induce the MP for 8-16 h prior to infection with packaged SP. Samples were taken at the indicated time points, centrifuged at $10,000 G$ for 2 min , then filtered with a $0.2 \mu \mathrm{~m}$ filter and stored overnight at $4^{\circ} \mathrm{C}$. Phage aliquots were titered by plaque assay on S2208 cells (total phage titer) and S1030 or S2060 cells (rSP titer) for all time points.

Mutagenesis during PACE. The basal mutation rate of replicating filamentous phage in E. coli $\left(7.2 \times 10^{-7}\right.$ substitutions $/ \mathrm{bp} /$ generation $)$ is sufficient to generate all possible single but not double mutants of a given gene in a $40-\mathrm{mL}$ lagoon following one generation of phage replication. For the 2,139 bp rpoZ-CrylAc target, a basal mutation rate of $7.2 \times 10^{-7}$ substitutions/bp/generation applied to $2 \times 10^{10}$ copies of the gene (a single generation) in a $40-\mathrm{mL}$ lagoon yields $\sim 3.1 \times 10^{7}$ base substitutions, easily enough to cover all 6,417 single point mutants but not all double mutants. Arabinose induction of our first generation
mutagenesis plasmid (MP), MP1, increased the phage mutation rate by $\sim 100$-fold, yielding $7.2 \times 10^{-5}$ substitutions/bp/generation, yielding $\sim 3.1 \times 10^{9}$ substitutions spread over $2 \times 10^{10}$ copies of the gene after a single generation. This enhanced mutation rate is sufficient to cover all possible single mutants $\left(6.4 \times 10^{3}\right.$ possibilities) and double mutants (4.1 $\times 10^{7}$ possibilities), but no triple mutants $\left(2.6 \times 10^{11}\right.$ possibilities) after a single phage generation. Our recent efforts to enhance mutagenesis in PACE yielded the improved MP6 system ${ }^{2}$, which increases the phage mutation rate by an additional 100 -fold as compared to MP1, resulting in $7.2 \times 10^{-3}$ substitutions/bp/generation, yielding $\sim 3.1 \times 10^{11}$ substitutions spread over $2 \times 10^{10}$ copies of the gene after a single generation. This elevated mutation rate is sufficient to cover all possible single mutants $\left(6.4 \times 10^{3}\right.$ possibilities), double mutants ( $4.1 \times 10^{7}$ possibilities), and many triple mutants $\left(2.6 \times 10^{11}\right.$ possibilities) after a single phage generation.

Luciferase assays. Complementary plasmids (CPs) were co-transformed with an AP of interest into electrocompetent $\mathrm{S} 1030^{14}$ or $\mathrm{S} 2060^{16}$ cells and plated onto $1.8 \%$ agar- 2 xYT plates with $50 \mu \mathrm{~g} / \mathrm{mL}$ carbenicillin and $100 \mu \mathrm{~g} / \mathrm{mL}$ spectinomycin. After overnight growth at $37^{\circ} \mathrm{C}$, single colonies were each picked into 2 mL DRM supplemented with 50 $\mu \mathrm{g} / \mathrm{mL}$ carbenicillin, $100 \mu \mathrm{~g} / \mathrm{mL}$ spectinomycin, $10 \mu \mathrm{~g} / \mathrm{mL}$ tetracycline, $50 \mu \mathrm{~g} / \mathrm{mL}$ streptomycin, $10 \mu \mathrm{~g} / \mathrm{mL}$ fluconazole, $10 \mu \mathrm{~g} / \mathrm{mL}$ amphotericin B and grown for $12-18 \mathrm{~h}$ in a $37^{\circ} \mathrm{C}$ shaker at 230 rpm . Following overnight growth, cultures were diluted 1000 -fold in a 96-well deep well plate containing $500 \mu \mathrm{~L}$ DRM with $50 \mu \mathrm{~g} / \mathrm{mL}$ carbenicillin, 100 $\mu \mathrm{g} / \mathrm{mL}$ spectinomycin and the indicated arabinose, IPTG or anhydrotetracycline (ATc) concentration to induce protein expression from either the AP or CP. Constitutive APs
and CPs were used where no inducer concentration is given. After growth with shaking at $37^{\circ} \mathrm{C}$ for $4-5$ hours, $150 \mu \mathrm{~L}$ of each culture was transferred to a 96 -well black wall, clear bottom plate (Costar), and the $\mathrm{OD}_{600}$ and luminescence for each well was measured on an Infinite M1000 Pro microplate reader (Tecan). The $\mathrm{OD}_{600}$ of a well containing only media was subtracted from all sample wells to obtain a corrected $\mathrm{OD}_{600}$ value for each well. The raw luminescence value for each well was then divided by that well's corrected $\mathrm{OD}_{600}$ value to obtain the luminescence value normalized to cell density. Each variant was assayed in at least biological triplicate, and the error bars shown reflect the standard deviations of the independent measurements.

High-throughput sequencing and oligotype analysis. Raw reads are deposited in the NCBI Sequence Read Archive with accession number PRJNA293870, and all custom scripts used in analysis are available at http://github.com/MonsantoCo/BadranEtAl2015. Illumina reads obtained from each time point were mapped to the SP055-rpoZ-cMyc-Cry1Ac1-d123 reference sequence using bowtie v2.1.0 ${ }^{35}$, and the resulting SAM files were combined into a single BAM file using samtools v0.1.19 ${ }^{36}$. This BAM file was used as input to freebayes v0.9.21-12-g92eb53a ${ }^{37}$ to call SNPs, using the command "freebayes --use-best-n-alleles 1 --pooled-continuous --use-reference-allele --theta 500000000 --min-alternate-fraction 0.01 --ploidy 1 --region SP055-rpoZ-cMyc-Cry1Ac1-d123:2833-4971." The analysis is encapsulated in the custom script "ill.callsnps.sh." PacBio polymerase reads were demultiplexed with RS_Resequencing_Barcode. 1 workflow provided by PacBio. Polymerase reads with quality score lower than 0.80 (defined by the PacBio scoring algorithm) or shorter than 50bp were filtered. High quality reads were processed
into subreads after sequencing primers and adaptors were removed. Circular consensus reads (or reads-of-inserts) were obtained by calling consensus of subreads generated from the same polymerase reads. These circular consensus reads were mapped to the SP055-rpoZ-cMyc-CrylAc1-d123 reference sequence using BLASR v1.3.1.142244 ${ }^{38}$, and the alignment was exported as an aligned FASTA sequence using the custom script "SAMtoAFA.py." The aligned FASTA was used as input to the oligotyping platform ${ }^{27}$, manually specifying entropy components as the positions at which the Illumina data defined informative SNPs. Only oligotypes that occur at $>1 \%$ in at least one sample were retained. This methodology resulted in informative changes at 25 of the 27 specified components. Oligotypes with gaps at the specified components, likely due to indels in the PacBio sequencing or alignment, were reassigned to other oligotypes with nucleotides in those positions only when it could be done unambiguously, and discarded otherwise, resulting in a total fraction abundance $<1$ in Fig. 5D. The resulting oligotype-percent abundance matrix was read into R and analyzed using the custom script "PedigreeAndMullerPlot.R." The pedigree was refined manually, assuming that singlemutant derivatives of previous oligotypes are due to de novo mutation, while double, triple, or greater mutations that can be explained by recombination of previously observed oligotypes was due to recombination, since the latter are highly unlikely to arise by multiple point mutation after the start of the PACE experiment.

High-throughput primary Bt toxin preparation and analysis. Wild-type CrylAc was cloned into the Bt expression vector pMON262346 using BspQ1 endonuclease restriction sites. Consensus PACE-evolved CrylAc variants were synthesized (Gen9) and cloned
into the $B t$ expression vector pMON262346 using Hot Fusion ${ }^{33}$. Reversion mutants of consensus Cry1Ac PACE variants were generated via PCR with Phusion High-Fidelity DNA polymerase (New England Biolabs) and mutant primers followed by Hot Fusion into the $B t$ expression vector pMON 262346 . The resulting plasmids were transformed into the protease-deficient $B t$ strain EG10650 ${ }^{39}$ for protein expression. Cells were grown from single colonies in 96-well plates (Thermo Scientific, AB-0932) overnight in $400 \mu \mathrm{~L}$ Brain Heart Infusion Glycerol (BHIG) media (VWR) supplemented with $5 \mu \mathrm{~g} / \mathrm{mL}$ chloramphenicol. Overnight cultures were used to prepare glycerol stocks (15\% glycerol final concentration) and stored at $-80^{\circ} \mathrm{C}$ for future protein expression. Following overnight growth, $10 \mu \mathrm{~L}$ of each culture was used to inoculate 1 mL of complete $C 2$ medium ${ }^{40}$ containing $5 \mu \mathrm{~g} / \mathrm{mL}$ chloramphenicol in 96 -well plates. The plates were incubated at $26^{\circ} \mathrm{C}$ with vigorous shaking at 550 rpm in a Multitron shaking incubator (Infors HT) for 72 hr . The cells were harvested by centrifugation at $3,200 \mathrm{G}$ for 15 min at $4^{\circ} \mathrm{C}$. The supernatant was decanted and a single 3.5 mm glass bead was added to each well of the plate. The pellet was then resuspended in 1 ml of TX wash buffer composed of 10 mM Tris- $\mathrm{HCl}, \mathrm{pH} 7.5,0.005 \%$ Triton X-100 supplemented with 25 units/mL Benzonase ${ }^{\circledR}$ (EMD Millipore), and 2 mM MgCl 2 , incubated at room temperature for 30 60 min (with vigorous vortexing every 10 min ), then centrifuged at $3,200 \mathrm{G}$ for 15 min at $4^{\circ} \mathrm{C}$. The resulting pellet was resuspended and centrifuged under identical conditions two additional times.

The washed spore/crystal pellet from each 1-mL culture was solubilized in the 96well plate using $300 \mu \mathrm{~L}$ of solubilization buffer composed of 50 mM CAPS, pH 11 , and 10 mM DTT, then incubated while shaking at room temperature for 1 h . The insoluble
debris was pelleted by centrifugation at $3,200 G$ for 15 min at $4{ }^{\circ} \mathrm{C}$, and $200 \mu \mathrm{~L}$ of the supernatant were transferred to a sterile U-bottom 96-well plate. To each well, $10 \mu \mathrm{~L}$ of $0.2 \mathrm{mg} / \mathrm{mL}$ trypsin in 1 M Tris- $\mathrm{HCl}, \mathrm{pH} 7.5$ was added. The mixture was incubated at $37^{\circ} \mathrm{C}$ for 2 h while shaking at 150 rpm , followed by quenching using $2 \mu \mathrm{~L} 0.1 \mathrm{M}$ PMSF. The solution was filtered using a Millipore multiscreen plate with a $0.22 \mu \mathrm{~m}$ membrane. Protein stability was assessed by SDS-PAGE and quantified using spot densitometry. Proteins purified using this protocol were tested in downstream insect cell assays.

Secondary Bt toxin purification and analysis. Bt glycerol stocks described above were used for large-scale protein expression and purification. A 2-mL starter culture of BHIG medium supplemented with $5 \mu \mathrm{~g} / \mathrm{mL}$ chloramphenicol was inoculated from the glycerol stocks and grown overnight at 280 rpm in a $28^{\circ} \mathrm{C}$ shaker. The following day, the saturated culture was transferred into 500 mL complete C 2 medium containing $5 \mu \mathrm{~g} / \mathrm{mL}$ chloramphenicol in a 2 L baffled flask and grown for an additional 72 h at $26^{\circ} \mathrm{C}$ while shaking at 280 rpm . Sporulation and crystal formation in the culture was verified by optical microscopy of a $2-\mu \mathrm{L}$ aliquot of the saturated $B t$ culture. Upon confirmation of crystals, the partially lysed sporulated cells were harvested by centrifugation at $10,000 G$ for 12 min at $4^{\circ} \mathrm{C}$. The pellet was then resuspended in 100 mL TX wash buffer composed of 10 mM Tris- $\mathrm{HCl}, \mathrm{pH} 7.5$, and $0.005 \%$ Triton $\mathrm{X}-100$ supplemented with 0.1 mM PMSF, 25 units/mL Benzonase ${ }^{\circledR}$ (Sigma-Aldrich), and 2 mM MgCl , incubated at room temperature for 30-60 min (with vigorous vortexing every 10 min ), then centrifuged at $3,200 \mathrm{G}$ for 15 min at $4^{\circ} \mathrm{C}$. The resulting pellet was resuspended and centrifuged under identical conditions two additional times.

The washed spore/crystal pellet was solubilized in 120 mL 50 mM CAPS, pH 11 , 10 mM DTT at room temperature for 1 h while shaking at 130 rpm . The solubilized protein was separated from the insoluble debris by centrifugation at $35,000 G$ for 20 min at $4{ }^{\circ} \mathrm{C}$. The supernatant was transferred to a fresh flask, and then supplemented with 10 $\mathrm{mL} 0.2 \mathrm{mg} / \mathrm{mL}$ Trypsin in 1 M Tris- HCl at pH 7.5 . The mixture was incubated at $30^{\circ} \mathrm{C}$ for 2-6 h with shaking at 150 rpm and trypsinization was monitored by SDS-PAGE. Once the trypsin digestion reaction was complete, the mixture was centrifuged at $3,200 G$ for 15 min at $4^{\circ} \mathrm{C}$. The clear supernatant was removed and mixed with PMSF to 1 mM final concentration. The sample was loaded on a 5-10 mL Q-Sepharose (GE Healthcare) anion exchange column at a flow-rate of $4 \mathrm{~mL} / \mathrm{min}$ and the trypsin resistant core of the toxin was eluted in 25 mM sodium carbonate, pH 9 supplemented with $200-400 \mathrm{mM} \mathrm{NaCl}$. Fractions containing the toxin tryptic cores were pooled, concentrated (Millipore Amicon Ultra-15 centrifugal filter Units, Fisher) and loaded on a Hiload Superdex 200 gel filtration column using an ÄKTA chromatography system (GE Healthcare, United Kingdom). The column was pre-equilibrated and run with 25 mM sodium carbonate at pH 10.5 supplemented with $1 \mathrm{mM} \beta$-mercaptoethanol. Only the monomer peak of the toxin fractions was collected in each case and concentrated to $1-3 \mathrm{mg} / \mathrm{mL}$. The final protein concentration was quantified by spot densitometry. The quality of the trypsinized toxin was assessed using the peptide mass fingerprinting (PMF) method that was based on in-gel digestion of proteins by trypsin and mass spectrometry (MS) analysis of the resulted peptides.

## T. ni receptor fragment expression and purification. Custom expression vectors

pMON251427 and IS0008 (same as pMON251427 but with wild-type TnCAD) were used to express TnTBR3 and TnCAD fragments in Escherichia coli. Both vectors contain an N-terminal MBP-TVMV protease cleavage site $\operatorname{tag}^{41}$ and a C-terminal 6 x histidine tag flanking the receptor fragment of interest, with the ORF driven by the T 7 promoter. Expression vectors were transformed into commercial BL21 ( $\lambda \mathrm{DE} 3$ ) competent cells (Life Technologies) that had been previously transformed with TVMV protease expression vector (pMON101695; encodes constitutive TVMV protease from a pACYC184 (New England Biolabs) backbone). A single colony was inoculated in 2 mL of LB media supplemented with $50 \mu \mathrm{~g} / \mathrm{mL}$ kanamycin and $25 \mu \mathrm{~g} / \mathrm{mL}$ chloramphenicol, and grown at $37^{\circ} \mathrm{C}$ for 4 h to generate a starter culture, which was used to prepare glycerol stocks and stored at $-80^{\circ} \mathrm{C}$ for the future protein expression. A second starter culture was inoculated using the BL21 ( $\lambda \mathrm{DE} 3$ ) strain glycerol stocks in 2 mL of LB media supplemented with $50 \mu \mathrm{~g} / \mathrm{mL}$ kanamycin and $25 \mu \mathrm{~g} / \mathrm{mL}$ chloramphenicol and grown in a $25^{\circ} \mathrm{C}$ shaker ( 280 rpm ) for 15 h . The culture was transferred into 500 mL of Terrific Broth medium ( $24 \mathrm{~g} / \mathrm{L}$ yeast extract, $12 \mathrm{~g} / \mathrm{L}$ tryptone, and $5 \mathrm{~g} / \mathrm{L}$ glucose) supplemented with $50 \mu \mathrm{~g} / \mathrm{mL}$ kanamycin and $25 \mu \mathrm{~g} / \mathrm{mL}$ chloramphenicol, and grown at $37^{\circ} \mathrm{C}$ for 4 h at 280 rpm , then transferred to $15^{\circ} \mathrm{C}$ and grown for and additional 48 h after supplementation with IPTG to a final concentration of 0.1 mM .

The cells were harvested by centrifugation at $10,000 G$ for $12 \min$ at $4^{\circ} \mathrm{C}$. The bacterial cell pellet was resuspended in affinity buffer A ( 25 mM Tris- HCl at $\mathrm{pH} 8.0,0.5$ $\mathrm{M} \mathrm{NaCl}, 15 \mathrm{mM}$ imidazole, and 0.2 mM CaCl 2 ) containing 125 units $/ \mathrm{mL}$ of Benzonase (EMD Millipore), 10,000 units/mL of Chicken egg white lysozyme (Sigma Aldrich) and 1x BugBuster (Novagen). The cell slurry was incubated at room temperature for 15 min ,
followed by sonication using Cell Disruptor W-0375 (Heat Systems-Ultrasonics) at 45\% Duty Cycle (output No.5) for 30 seconds with 60 second rests for a total of three cycles. The cell lysate was centrifuged at $35,000 G$ for 20 min at $4^{\circ} \mathrm{C}$. The supernatant was loaded onto a $5-\mathrm{mL} \mathrm{Ni}-\mathrm{NTA}$ column that had been pre-equilibrated using affinity buffer A. After extensive washing with affinity buffer A, the receptor fragment was eluted with the affinity buffer B ( 25 mM Tris- HCl at $\mathrm{pH} 8.0,0.1 \mathrm{M} \mathrm{NaCl}, 250 \mathrm{mM}$ imidazole, 0.2 $\left.\mathrm{mM} \mathrm{CaCl}_{2}\right)$. Fractions containing the receptor fragment were pooled, concentrated and loaded on a Hiload Superdex 200 gel filtration column using an ÄKTA chromatography system (GE Healthcare, United Kingdom). The column was pre-equilibrated and run with 25 mM Tris- HCl at $\mathrm{pH} 8.0,0.1 \mathrm{M} \mathrm{NaCl}, 0.2 \mathrm{mM} \mathrm{CaCl}_{2}$. Dimer and monomer peaks of the T. ni TBR3 and CAD fractions were collected separately and concentrated to 1-2 $\mathrm{mg} / \mathrm{mL}$. Only TnTBR3 and TnCAD monomers were used for Cry 1 Ac 1 binding studies.

Fluorescence thermal shift (FTS) assays. All assays were performed using a BioRad CFX96 real-time PCR thermal cycler, enabling thermal manipulations and dye fluorescence detection. The fluorescence sensitive dye SYPRO orange (Life Technologies, S6650) was used at a 5 x concentration in all assays. The temperature was increased by $0.5^{\circ} \mathrm{C}$ each cycle over a temperature range of $25-90^{\circ} \mathrm{C}$. Assay reactions were performed in 96-well white PCR plates (Bio-Rad, No. HSP9631), and heat-sealed (Thermo Scientific, No. ALPS3000) to reduce volume loss through evaporation. The data was analyzed using the CFX manager software.

Protein-protein interaction affinity measurement. The Octet ${ }^{\mathrm{Qk}}$ (ForteBio) and the Dip
and Read ${ }^{\text {TM }} \mathrm{Ni}-\mathrm{NTA}$ (NTA) biosensors were used to measure the affinity of Cry 1 Ac and its variants to immobilized 6xHis-TnCAD or TnTBR3 receptor fragments in 25 mM TrisHCl at $\mathrm{pH} 8.5,0.1 \mathrm{M} \mathrm{NaCl}, 0.1 \mathrm{mg} / \mathrm{ml} \mathrm{BSA}, 0.05 \%$ Tween 20 according to the manufacturer's instructions. Octet Data Acquisition 7.1.0.100 software was used for data acquisition, and ForteBio Data Analysis 7 software was used for data analysis. At least four readings at different Cry 1 Ac 1 concentrations (2-100 nM) were used for each receptor fragment-Bt toxin interaction and a global fit was used to calculate binding affinities.

Insect cell assays. Sf9 cells (Life Technologies) were plated in Sf-900 ${ }^{\text {TM }}$ III SFM (Life Technologies) at a density of 50,000 cells/well in a 96 -well optical bottom black plate (Nunc, Thermo Scientific). The cells were incubated at $27^{\circ} \mathrm{C}$ overnight to allow for adherence to the plate. Following overnight incubation, the medium was aspirated from the cells and $100 \mu \mathrm{~L}$ of p 3 or p 4 generation (third or fourth generation of baculovirus amplification in Sf 9 cells following initial transfection with plasmid) recombinant baculovirus encoding each receptor diluted in SFM was added to each well. The plates were kept in a humidified environment to prevent evaporation and incubated at $27^{\circ} \mathrm{C}$ for 48 h . Receptor expression was confirmed by western blotting. Toxins were diluted to the same protein concentration in 25 mM sodium carbonate at pH 11 , supplemented with 1 $\mathrm{mM} \beta$-mercaptoethanol, followed by an additional 10 -fold dilution in unsupplemented Grace's Media with $2 \mu \mathrm{M}$ SYTOX Green Nucleic Acid Stain (Life Technologies, S7020). The media was removed from the wells without disturbing the attached cells, and the diluted toxins or buffer controls were added to respective wells. The fluorescence was
measured on a CLARIOstar microplate reader (BMG Labtech) after incubation for 4 h . The fluorescence intensity of control cells expressing $\beta$-glucuronidase (GUS) was subtracted from wells expressing the variable receptor fragments with or without toxins. Replicates were averaged and signal was plotted for each toxin condition.

Primary insect diet bioassays. Insect diet bioassays using the evolved consensus Cry 1 Ac variants were performed as previously described ${ }^{42}$. Briefly, 200 mL of artificial diet in 96-well plates were overlaid with 20 mL aliquots of toxin Bt spore/crystal or Bt crystal suspension, dried, after which wells were infested with neonate insect eggs suspended in $0.2 \%$ agar, dried again, sealed with Mylar sheets, and incubated at $20^{\circ} \mathrm{C}$, $60 \% \mathrm{RH}$, in complete darkness for 5 days. The plates were scored on day 5 for larval mortality and growth stunting. Each assay was carried out in three independent biological replicates with eight insects per replicate.

Secondary insect diet bioassays. An inbred Bt-susceptible laboratory strain of $T$. ni, (designated the Cornell strain) ${ }^{43}$, and a Cry1Ac-resistant strain nearly isogenic to the Cornell strain, GLEN-Cry1Ac-BCS ${ }^{44}$, were maintained on a wheat germ-based artificial diet at $27^{\circ} \mathrm{C}$ with $50 \%$ humidity and a photoperiod of 16 h light and 8 h dark ${ }^{43}$. Diet surface overlay bioassays were conducted to determine the insecticidal activity of the toxins in the susceptible and Cry $1 \mathrm{Ac}-$ resistant $T$. ni, as previously described ${ }^{43}$. Briefly, $200 \mu \mathrm{~L}$ of toxin solution was spread on the surface of 5 mL of artificial diet in $30-\mathrm{mL}$ plastic rearing cups (diet surface area was $\sim 7 \mathrm{~cm}^{2}$ ), and 10 neonatal larvae were placed into each rearing cup after the toxin solution had dried. For each bioassay, 7-8
concentrations of the toxin were used and each treatment included five replicates (50 larvae total per concentration). Larval growth inhibition (neonates that did not reach $2^{\text {nd }}$ instar after 4 days) and mortality were recorded after 4 days of feeding. The observed larval growth inhibition and mortality were corrected using Abbott's formula ${ }^{45}$. Both $\mathrm{IC}_{50}$ and $\mathrm{LC}_{50}$ values and their $95 \%$ confidence intervals were calculated by probit analysis using the computer program POLO (LeOra Softare, 1997).

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