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Microbial adaptive evolution

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Abstract: Bacterial species can adapt to significant changes in their environment by mutation followed by selection, a phenomenon known as "adaptive evolution." With the development of bioinformatics and genetic engineering, research on adaptive evolution has progressed rapidly, as have applications of the process. In this review, we summarize various mechanisms of bacterial adaptive evolution, the technologies used for studying it, and successful applications of the method in research and industry. We particularly highlight the contributions of Dr. L. O. Ingram. Microbial adaptive evolution has significant impact on our society not only from its industrial applications, but also in the evolution, emergence, and control of various pathogens.

Keywords: Keywords Bacteria, Adaptive evolution mechanisms, Adaptive metabolic evolution

Introduction

Adaptive evolution by natural selection, as proposed by Darwin and elaborated by Huxley (Darwin, 1882; Huxley, 1942), is readily observed in microorganisms, which can adapt to environmental changes, such as exposure to heavy metals, air pollution, insecticides, and herbicides (Horinouchi et al., 2015). In part, this is due to the large numbers of individual organisms on which selection can operate and the strong selective pressure to which these organisms are subjected. For example, Staphylococcus aureus adapts to its host by outgrowth of individuals with increased antibiotic resistance and decreased virulence (Goerke & Wolz, 2010; Kahl, 2010), while Pseudomonas aeruginosa does so by loss of factors essential for acute infection and activation of pathways related to chronic inflammation (Smith et al., 2006). The mutualistic Rhizobiumlegume symbiosis has evolved for about 58 million years (Sprent, 2007) through acquisition of genes involved in nodulation (nod) and nitrogen fixation (nif/fix) (Remigi et al., 2016). Adaptive resistance to disparate toxins in Escherichia coli involves mutations of a set of genes associated with cell motility, transport, membrane structure, and metabolism, as well as genes that are not well characterized (Erickson et al., 2017). Adaptation has been reported for other species of bacteria, such as Salmonella enterica, Bacillus subtilis, and Clostridium sp., and for eukaryotic microorganisms such as Saccharomyces cerevisiae and Candida albicans (Foster, 2000). These cases show that microorganisms adapt to environmental changes through both temporary and permanent modifications. Temporary adaptation is realized by modulating the expression of genes related to phenotypic alterations (López-Maury et al., 2008), while adaptive evolution involves selection of mutations advantageous for survival in a particular new environment and represents permanent alteration in response to the changed environment. Generally, bacteria undergo adaptive evolution when the selection pressure is strong and persistent, while the temporary adaptation responds to short-term selection (Horinouchi & Furusawa, 2020).

In this review, we summarize some of the reported mechanisms of bacterial adaptive evolution (Table 1), as well as the methods for bacterial adaptive evolution study and application of bacterial adaptive evolution in research and industrial development (Fig. 1).

The Process and Mechanisms of Adaptive Evolution in Bacteria

Several processes, such as genetic drift and gene conversion and mutation (Duret & Galtier, 2009), can alter genetic information of microorganisms and these processes can influence their phenotypes.

Horizontal Gene Transfer

Genetic information can be transferred either vertically or horizontally. Vertical gene transfer passes genetic information from parent to offspring, while horizontal gene transfer occurs between different organisms and often between different species (Schönknecht et al., 2014). Horizontal gene transfer has been reported to be extensive, with at least 5–10% of a typical bacterial genome deriving from divergent species (Ochman et al., 2000). Bacteria can express genes obtained from other species to allow adaptation to different environmental conditions, for instance, imparting novel metabolic capacities (Levin & Cornejo, 2009). For example, changes of metabolic networks in E. coli are mostly derived from apparent horizontal gene transfer in the past 100 million years. Metabolic networks grow by acquiring genes that can utilize the nutrients in the altered environment but without interrupting the central metabolic network. In addition, genes involved in one compound metabolic pathway are frequently transferred in an operon (Pal et al., 2005). Horizontal gene transfer was also reported in pathogens, such as Streptococcus pneumoniae and Haemophilus influenzae (Levin & Cornejo, 2009). In the laboratory, horizontal gene transfer can be realized by conjugation,

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Table 1. The l	Process	and	Mechanism	of	Adaptive Evolution

Process	Mechanisms	Reference Schönknecht et al. (2014)		
Horizontal gene transfer	Gene transfer between different species or different organisms.			
Plasmids and phages as vectors for host evolution	Evolution-related genes transferred by plasmids or phages.	Davies et al. (2016); Robicsek et al. (2006)		
Coevolution of bacteria in the same community	Bacterial adaptive mutations benefit the whole community.	Meyer & Kassen (2007)		
Gene duplication and amplification (GDA)	Bacteria adapted to various environments by increasing the copy number of specific genes—can be flanked by insertion sequences (ISs).	Bergthorsson et al. (2007)		
ISs	Mobilize specific genes within or among different microorganisms yielding desired characteristics.	Siguier et al. (2014)		
Specific gene mutations promote adaptive evolution	Single or multiple mutations in the genome leads to the desired selectable phenotype.	Chauliac et al. (2020); Conrad et al. (2010); Kim et al. (2008)		
Bacterial parallel evolution	The same mutation arises in all independent selections for the desired phenotype.	Bailey et al. (2017); Shi et al. (2020)		

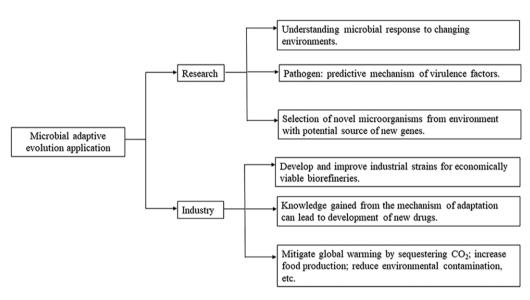


Fig. 1. Microbial adaptive evolution application.

transformation, and transduction, as a prelude to adaptive metabolic evolution.

Demonstrating that horizontal gene transfer can promote fitness, Power et al. co-cultured two B. *subtilis* strains that had 7% DNA sequence difference over multiple rounds of growth and stationary phase (Power et al., 2021). They observed the rapid emergence of hybrid organisms with gene transfer swaps of approximately 12% of the core genome in just 200 generations and 60% of core genes replaced in at least one population. Moreover, many of the individual hybrids exhibited increased fitness, particularly in survival at stationary phase (Power et al., 2021). Thus, horizontal gene transfer can promote adaptive evolution.

Plasmids and Phages as Vectors for Host Evolution

Plasmids and phages also serve as vectors for horizontal gene transfer. Toxins and antibiotic resistance genes in bacteria are often found on plasmids or temperate phages. As one of many examples, fluoroquinolone resistance of gram-negative pathogens is conferred by the Qnr proteins (quinolone resistance proteins) that protect DNA gyrase from quinolone inhibition. The *qnr* genes achieved global distribution through a variety of plasmid environments and bacterial genera (Robicsek et al., 2006).

DNA sequences from phages are more common in pathogens than nonpathogenic bacteria (Busby et al., 2013) and are linked to increased virulence (Figueroa-Bossi & Bossi, 1999). This is due in part to genes carried on the phages but also to their potential to mutate the host genome by insertion (Letarov & Kulikov, 2009). For example, *P. aeruginosa* evolved in the laboratory with or without the transposable phage ϕ 4 showed that the phage ϕ 4 could integrate into the bacterial genome randomly, especially into the motility-related genes and quorum-sensing-system regulators that were essential for virulence (Davies et al., 2016).

Coevolution of Bacteria in the Same Community

Bacteria that share the same environment can collectively engage in adaptive evolution in a way that mutually benefits the community as a whole. For the study of community composition effects on evolution, Lawrence et al. (Lawrence et al., 2012) prepared bacterial communities composed of either one species or a five-species mixture and cultured them on a beech tea medium. Their results showed that the complexity of the community influenced bacterial adaptive evolution and this impact could not be predicted with results obtained with a single species alone. Thus, complex communities can drive adaptive evolution through multiple pathways that are not available to single species (Meyer & Kassen, 2007).

Gene Duplication and Amplification

Gene duplications are pervasive (Bergthorsson et al., 2007) and provide opportunities for increasing expression of a gene and for introducing genomic variability, which in turn facilitates adaptation to various environments. For example, antibiotics resistance can be realized by increasing the gene copies encoding antibiotic hydrolytic enzymes, efflux pumps, or target enzymes (Sandegren & Andersson, 2009). The pathogen S. enterica subsp. enterica serovar Typhimurium LT2 exhibited tandem genetic duplications in all regions of the chromosome with sizes from a few kilobases to several megabases in response to adaptation to various environmental challenges (Andersson et al., 1998; Nilsson et al., 2006; Straus & Straus, 1976). Spirochetes of the Borrelia burgdorferi sensu lato (s.l.) species can cause Lyme disease (Centers for Disease Control and Prevention, 2007; Piesman & Gern, 2004). Their success as pathogens depends, in part, on the PFam54-related genes in the B. burgdorferi genome, which exist as a tandem array and whose diverse products can target different innate immune proteins (Wywial et al., 2009). Finally, it should be noted that the high ethanol productivity of an ethanologenic E. coli strain KO11 developed by Dr. Ingram and his co-workers is a result of a 20-fold duplication of a single PET operon (pdc and adhB genes of Zymomonas mobilis) (Ohta et al., 1991; Turner et al., 2012). These studies show that gene duplication is not uncommon during adaptive evolution and differs from more stable mutation-derived adaptation.

Insertion Sequences

Insertion sequences (ISs) are small pieces of DNA that transpose within or between genomes and can influence host genome evolution. IS elements are widespread and can occur in high copy numbers in bacterial genomes. Different IS elements have different functions and their effects on the host genome depend on their particular transposition mechanism (Siguier et al., 2014).

As an example of IS contribution in adaptive evolution, insertion of IS10 in *yqhC* that encodes a regulatory protein in the ethanologenic *E. coli* strain EMFR9 led to higher resistance to the inhibitor furfural (Miller et al., 2009; Turner et al., 2011). Another example is that transposon insertion in a *Sinorhizobium* strain that was incompatible with soybean led to effective derivatives that could generate N_2 -fixing nodules in soybean roots (Zhao et al., 2018).

Specific Gene Mutations Promote Adaptive Evolution

In some instances, adaptive evolution results from gain of function mutations in specific gene(s) that allow adaptation to a specific environment. A strain of *Bacillus coagulans* selected for growth under oxygen-limiting conditions carried mutations in a gene encoding a glycerol (polyol) dehydrogenase that established a new fermentation pathway to D-(-)-lactic acid (Chauliac et al., 2020; Wang, Ingram & Shanmugam, 2011). Similarly, a specific mutation in *lpd*-encoding lipoamide dehydrogenase, a component of the

pyruvate dehydrogenase complex, supported anaerobic growth of a negative *E*. coli mutant during metabolic evolution (Kim et al., 2008). This mutation also introduced a homo-ethanol fermentation pathway in the adapted derivative that is not detectable in the wild-type *E*. coli. In addition, specific mutations in the RNA polymerase (RNAP) genes exhibited wide effects on bacterial phenotypes (Klein-Marcuschamer et al., 2009). Conrad et al. repeatedly found *rpoC* mutations (RNAP β' -subunit) during *E*. coli K-12 adaptive evolution for optimal growth in M9 minimal medium with various carbon sources (glycerol, glucose, and lactate) (Conrad et al., 2010). These studies show that specific but unexpected mutations allow bacteria to overcome a constraining physiological stress.

Bacterial Parallel Evolution

Given that specific mutations can allow adaptation to a specific environmental condition, it is not surprising that the same mutation or mutations may arise repeatedly in bacteria subjected to the same condition. For instance, Dr. Ingram's laboratory adapted two separate cultures of an ethanologenic E. coli strain LY180 for growth in lignocellulosic acid hydrolysate over hundreds of generations. After genome sequence analysis, six common mutations were found in two lineages, strains AQ15 and SL112, indicating parallel evolution (Shi et al., 2020). A second example is provided by Burkholderia dolosa, a pathogen that can cause disease in humans. Lieberman et al. compared the genetic adaptation of B. dolosa in patients during the epidemic spread and found that the bacteria acquired 17 overlapping nonsynonymous mutated genes in multiple subjects, suggesting parallel evolution (Lieberman et al., 2011). Another example of parallel evolution is Bacteroides fragilis, abundant in healthy people (Faith et al., 2013; Schloissnig et al., 2013). To evaluate the evolution within individual microbiomes, Zhao et al sequenced the genomes of 602 isolates of B. fragilis from 12 healthy subjects (Zhao et al., 2019). They found that 16 genes in B. fragilis had mutations within tested individuals, 5 of which were mutated in multiple individuals. These mutated genes were involved in polysaccharide utilization, cell-envelope biosynthesis, and other uncharacterized pathways. In summary, parallel evolution emerges after strong selection and suggests limited avenues for mutational adaptation to a specific environmental condition (Bailey et al., 2017).

Analytical Methods for Bacterial Adaptive Evolution

Adaptive Laboratory Evolution

Adaptive laboratory evolution (ALE) allows rapid evaluation of the adaptive potential of microorganisms. Such an evolution helps us understand fundamental evolutionary principles, including drug resistance in microbial pathogens (Donald & Van Helden, 2009), insect resistance toward pesticides (Renton, 2013), and acquisition of novel metabolic activities (Miller et al., 2009; Shi et al., 2016). For instance, long-term evolution in the laboratory of an ethanologenic E. coli strain LY195 in mineral salts medium with lignocellulosic acid hydrolysate containing growth inhibitors led to the strain MM160. Strain MM160 produced 29 g/l ethanol with a yield of 0.21 g ethanol/g bagasse dry weight during liquefaction plus simultaneous saccharification and cofermentation (L + SScF) (Geddes et al., 2011). Similarly, a strain of E.coli K-12 adapted for growth on L-1,2-propanediol (L-1,2-PDO) as the carbon source in M9 minimal medium was analyzed by Lee and Palsson (Lee & Palsson, 2010). Six mutations accumulated in the adapted strain

during the process of evolution, and five of them were within the coding regions of *fucO*, *ilvG1*, *rrID*, and *ylbE1* (with two mutations). IS5 was found between two *fuc* regulons (*fucAO* and *fucPIKUR* operons). Two mutations (*fucO* and its promoter) involved in the L-1,2-PDO catabolic pathway occurred early during adaptive evolution and supported growth in this new medium, while the other later mutations apparently improved fitness (Lee & Palsson, 2010).

Flux Balance Analysis

Flux balance analysis (FBA) has been developed to analyze metabolic flux change in reconstructed metabolic networks (Varma & Palsson, 1994). More recently, researchers combined FBA with ecological interactions among multiple bacteria to perform metabolic network study of species in a specific environment (Louca & Doebeli, 2015; O'Brien et al., 2013; Zomorrodi & Maranas, 2012). To generate credible predictions between evolutionary and ecosystem-level outcomes, researchers integrated the FBA model with both evolutionary dynamics and cellular constraints. The combined framework is called evolution with flux balance analysis (evoFBA). Some studies found that the metabolic, physiological, and ecological properties of those coexisting species are consistent with evoFBA predictions (Grosskopf et al., 2016).

Different Omics Approaches

With the development of bioinformatics, different omics approaches have been used for understanding and predicting the molecular mechanisms of bacterial temporary and permanent responses to different environments. These omics are used independently to study bacterial adaptation to a specific environment, such as identifying genes related to tolerance to lignocellulosic acid hydrolysates by genome sequencing (Shi et al., 2020), and capturing expression patterns of growth-dependent genes in *Salmonella* and *Pseudomonas* by transcriptome analysis (Imdahl et al., 2020).

Often, researchers have combined two or more omics tools to obtain a better understanding of bacterial adaptive evolution. For example, O'Brien et al. analyzed a respiratory pathogen S. pneumoniae, which causes about 1 million deaths per year worldwide, by genome and transcriptome studies to predict the mechanism of antibiotic resistance as well as in vivo infection conditions (O'Brien et al., 2009). Proteomics combined with genomics was used to analyze different lineages of Mycobacterium tuberculosis (Yimer et al., 2020) and in a separate study (Felix et al., 2021) Francisella tularensis, a pathogen causing the acute human respiratory disease tularemia, to decipher the virulence factors and infection mechanisms in these pathogens. Similarly, Agostini et al. applied genomics, proteomics, and metabolomics in concert to identify the adaptive mechanism of E. coli to fluorinated indoles (Agostini et al., 2021). By analyzing E. coli strains before and after adaptation for growth with fluorinated amino acids, they found that, in addition to specific mutations, gene expression regulation networks as well as membrane integrity and protein folding were also changed in the adapted derivatives (Agostini et al., 2021). Inverse metabolic engineering (IME) is also a useful method to understand the mechanism of adaptive evolution (Hong & Nielsen, 2012). With the development of genome editing systems and sequencing technology, IME has been extensively used for modifying industrial bacteria to decrease side products and improve target product titer and yield (Jaffe et al., 2015; Zhu et al., 2014).

Adaptive Evolution Application in Research and Industry

After designing an appropriate selection, growth-based metabolic adaptive evolution is a powerful tool for selecting beneficial mutations. This is usually carried out in a continuous culture or by sequential transfers of the culture under selecting conditions (Wang et al., 2011). Dr. Ingram and his group included adaptive metabolic evolution as a critical step during the development of various industrially relevant microorganisms and some of these are detailed subsequently to highlight the work in this special volume dedicated to Dr. Ingram's contributions to industrial microbiology (Table 2).

Metabolic Engineering of E. coli to Produce Ethanol

E. coli KO3 is an ethanologenic strain carrying alcohol dehydrogenase II (adhB) and pyruvate decarboxylase (pdc) from Z. mobilis in the chromosome. Adaptive metabolic evolution of strain KO3 under appropriate conditions produced strain KO4, with increased ethanol yield from 0.13 to 0.56 (g ethanol/g glucose consumed) and an increase in volumetric productivity of ethanol from 0.4 (strain KO3) to 1.5 (strain KO4) (g ethanol/[l h]). The higher ethanol yield than the theoretical value of 0.51 is apparently a result of the rich medium containing unaccounted for sugars used in these experiments (Ohta et al., 1991). Specific genetic intervention by introducing casAB genes encoding Enzyme II^{cellobiose} and phosphobeta-glucosidase from Klebsiella oxytoca P2 followed by adaptive metabolic evolution expanded sugar utilization characteristics of the ethanologenic E. coli to include cellobiose (Moniruzzaman et al., 1997). Further adaptive metabolic evolution of the ethanologenic E. coli strains for growth in medium containing ethanol as high as 50 g/l led to strain LY01, which produced an ethanol titer of over 60 g/l at a theoretical yield of 0.44 (g/g glucose consumed) (Yomano et al., 1998). The mutations in strain LY01 that related to higher ethanol tolerance included a nonfunctional fnr gene and overexpression of gcv genes (involved in glycine metabolism), betIBA, and betT (increased betaine production) (Gonzalez et al., 2003). This group also used adaptive metabolic evolution to derive strains that could grow rapidly in mineral salts medium (to lower the cost of nutrients in an industrial process), in the presence of various inhibitors (for rapid fermentation of all the sugars in lignocellulosic biomass), etc. (Table 2).

Improved Succinate Production in E. coli

Succinic acid has been identified by the US Department of Energy as one of the top 12 building block chemicals that could be produced from renewable feedstock (Werpy et al., 2004). Microbial production of succinic acid from carbohydrates offers the opportunity to be "green," since succinic acid is biosynthesized using CO_2 as one of the substrates (Jantama, Haupt, et al., 2008). Dr. Ingram's laboratory engineered E. coli to produce succinic acid in M9 minimal medium using simple batch fermentations without introducing any foreign genes (strain KJ122) (Jantama, Zhang, et al., 2008). Metabolic evolution for high titer of succinate production led to overexpression of phosphoenolpyruvate carboxykinase (pck), GalP permease (qalP), and glucokinase (qlk), and inactivation of PtsI to support the energy requirements of an O2-limited production platform (Zhang et al., 2009). Further adaptive metabolic evolution of strain KJ122 in mineral salts medium enhanced the rate of growth and xylose fermentation to succinate by selecting for a unique mutation in the galactose permease that supported Table 2. Summary of the Work on Adaptive Metabolic Evolution by Dr. Ingram and His Group

Product	Character	Strain	Titer (g/l)	Yield (g product/ g sugar)	Cell density (g/l)	Productivity (g product/ [l h])	References
Ethanol	Ethanologenic	KO3	10.4	0.13	0.03 ^b	0.4	Ohta et al. (1991)
	Escherichia coli	KO4	52.8	0.56	0.04 ^b	1.5	
	Ethanol tolerance	KO11	52.7	0.38	2.80		Gonzalez et al. (2003);
		LY01	61	0.44	4.00		Yomano et al. (1998)
	Fermentation in	KO11	26.9	0.30			Jarboe et al. (2007)
	mineral salts medium	LY168	45.5	0.51			
	Tolerance to	LY180	~0.35		0.06		Geddes et al. (2014);
	inhibitors in lignocellulosic acid hydrolysate	Various strains ^a	~42		3.60		Miller et al. (2009); Shi et al. (2016); Turner et al. (2011); Wang et al. (2012); Zheng et al. (2012)
	Cellobiose	KO11(pLOI1906)	1	0.01	0.30		Moniruzzaman et al.
	metabolization in ethanologenic E. coli	KO11(pLOI1910)	45.4	0.51	3.10		(1997)
Succinate	E. coli C for succinate	KJ012	0.71	0.13	0.30	0.04	Jantama, Haupt et al.,
	production under	KJ060	86.56	0.92	2.20	0.9	(2008); Jantama,
	$low-O_2$ condition	KJ122	80.89	0.96	2.10	0.84	Zhang et al. (2008); Zhang et al. (2009)
	Succinate production with xylose	KJ122 AS1600a	37.49 84.26	0.81 0.88	1.80 2.14	0.31 0.96	Sawisit et al. (2015)
L-Alanine	L-Alanine production	XZ111 XZ132	7.57 114.04	0.06 0.94	2.03	4.04	Zhang et al. (2007)
	medium						
D-Lactate	D-(–)-Lactic acid	W3110	19.46	0.46	0.60	0.21	Grabar et al. (2006);
	production in mineral salts medium	TG114	117.10	0.97	2.31	2.88	Zhou et al. (2003)
Malate	Mineral salts	КЈ060	22.44	0	1.90	0.47	Zhang et al. (<mark>2011</mark>)
	medium fermentation	XZ658	33.41	1.04	2.50	0.47	

Note. Rows in **bold** are after adaptation of the strain listed in the above row.

^aHere just shows the strain with highest ethanol production and cell yield among all the adapted strains.

^bg cell weight/g glucose.

xylose transport (strain AS1600a) (Sawisit et al., 2015). This adaptive evolution increased succinate productivity from xylose threefold from 0.3 to 0.96 g/(l h), comparable to that of succinate productivity from glucose or a mixture of sugars (Table 2).

L-Alanine Production in E. coli With Metabolic Evolution and Genome Engineering

Metabolic engineering of *E. coli* to produce L-alanine was another success story from the lab of Dr. Ingram. After appropriate metabolic engineering of the required pathway in *E. coli*, adaptive metabolic evolution led to twofold increased specific productivity and about 20-fold increased volumetric productivity at a titer of 1.3 M (Zhang et al., 2007). The resulting strain and its derivatives are currently employed as microbial biocatalysts for commercial production of L-alanine (Table 2).

Metabolic Engineering and Metabolic Evolution of E. coli to Produce Lactate

Biopolymer based on polylactic acid (PLA) is a renewable, environmentally friendly polymer that is produced from an appropriate blend of the two isomers of lactic acid. Although L-(+)-lactic acid is produced by several bacteria, microorganisms that produce pure D-(-)-lactic acid as the sole fermentation product in mineral salts medium are uncommon. To address this problem, Dr. Ingram's group engineered *E. coli* to produce D-lactic acid in mineral salts medium (Zhou et al., 2003). Grabar et al. deleted the methylglyoxal synthase gene to realize D-lactate production with no detectable chiral impurity (Grabar et al., 2006) (Table 2).

In addition to the previous discussion, there are several additional microorganisms developed with the help of adaptive metabolic evolution, such as increasing ethanol tolerance (Sanchez et al., 1992) and realizing xylose metabolism (Diao et al., 2013; Runquist et al., 2009) in *S. cerevisiae* and improving lactate tolerance in *Lactobacillus casei* (Overbeck et al., 2017; Serrazanetti et al., 2009; Wu et al., 2012).

Conclusion and Future Perspective

Bacterial adaptive evolution requires designing appropriate selection conditions to identify desired mutations in the population. This process, both man-made and naturally occurring, has broad significance. Some of the evolved strains are beneficial, such as new or improved ability of industrial microorganisms to produce various desired products, while others are harmful, like pathogens' resistance to antibiotics or evolving the ability to infect new hosts, including humans.

An understanding of the mechanisms leading to adaptive evolution in various environments is important to predict and control evolving diseases as well as to optimize industrial microorganisms. Recent developments in molecular biology and bioinformatics will likely contribute to future work on bacterial adaptive evolution mechanisms. For instance, recently developed single-cell sequencing has been applied to single human cells, such as normal immune cells (Tang et al., 2019) and acute myeloid leukemia tumor cells (Pellegrino et al., 2018). This method could be harnessed to observe the growth, expansion, and evolution of subpopulations within a community of cells in order to address the dynamic evolution behavior and its mechanisms. This technique has also been applied to perform transcriptome analysis of individual Salmonella and Pseudomonas bacteria cells (Imdahl et al., 2020), providing a new approach to explore bacterial evolution as well. Moreover, a large number of bacterial species cannot be engineered, because they cannot be cultured, as is the case of some human pathogens (Oliver, 2010). In the future, we can use single-cell sequencing to peer into the adaptive evolution mechanisms of these nonculturable bacteria.

Detailed analysis of the adapted derivatives has helped establish the physiological/biochemical functions of several genes that were annotated as unknown function, even in well-characterized organisms such as *E. coli*. In this context, it should be noted that the microbiome of the world has great untapped potential, in both metabolic pathways and secondary metabolites, and only a small fraction of this potential has been realized due to the lack of tools to engineer a vast array of these microorganisms. Genetic and omics tools combined with adaptive evolution are a promising approach to tap into this reservoir of metabolic versatility.

It should be mentioned that the current pandemic created by the SARS-CoV-2 is a result of adaptive evolution of the virus to human hosts (Rochman et al., 2021). Further adaptation of the virus to better suit the environment, in this case humans, is the delta variant of the virus (van Oosterhout et al., 2021). As the mechanisms of adaptive evolution are deciphered, the predictability of such evolution can be improved to better control emerging diseases.

As stated by Theodosius Dobzhansky, "Nothing in biology makes sense except in the light of evolution" (Ayala, 1977).

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Data Availability

The data that support the findings of this study are available from the related references.

Conflict of Interest

The authors declare no conflict of interest.

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