



Complete Genome Sequencing and Comparative Genomics of Three Potential Probiotic Strains, *Lacticaseibacillus casei* FBL6, *Lacticaseibacillus chiayiensis* FBL7, and *Lacticaseibacillus zeae* FBL8

Eiseul Kim, Seung-Min Yang, Dayoung Kim and Hae-Yeong Kim*

OPEN ACCESS

Edited by:

Si Hong Park, Oregon State University, United States

Reviewed by:

Zhi-Qiang Xiong, University of Shanghai for Science and Technology, China Corina-Diana Ceapa, Universidad Nacional Autónoma de México, Mexico

> *Correspondence: Hae-Yeong Kim hykim@khu.ac.kr

Specialty section:

This article was submitted to Food Microbiology, a section of the journal Frontiers in Microbiology

Received: 13 October 2021 Accepted: 10 December 2021 Published: 07 January 2022

Citation:

Kim E, Yang S-M, Kim D and Kim H-Y (2022) Complete Genome Sequencing and Comparative Genomics of Three Potential Probiotic Strains, Lacticaseibacillus casei FBL6, Lacticaseibacillus chiayiensis FBL7, and Lacticaseibacillus zeae FBL8. Front. Microbiol. 12:794315. doi: 10.3389/fmicb.2021.794315 Institute of Life Sciences & Resources and Department of Food Science and Biotechnology, Kyung Hee University, Yongin, South Korea

Lacticaseibacillus casei, Lacticaseibacillus chiaviensis, and Lacticaseibacillus zeae are very closely related Lacticaseibacillus species. L. casei has long been proposed as a probiotic, whereas studies on functional characterization for L. chiayiensis and L. zeae are some compared to L. casei. In this study, L. casei FBL6, L. chiayiensis FBL7, and L. zeae FBL8 were isolated from raw milk, and their probiotic properties were investigated. Genomic analysis demonstrated the role of L. chiayiensis and L. zeae as probiotic candidates. The three strains were tolerant to acid and bile salt, with inhibitory action against pathogenic bacterial strains and capacity of antioxidants. Complete genome sequences of the three strains were analyzed to highlight the probiotic properties at the genetic level, which results in the discovery of genes corresponding to phenotypic characterization. Moreover, genes known to confer probiotic characteristics were identified, including genes related to biosynthesis, defense machinery, adhesion, and stress adaptation. The comparative genomic analysis with other available genomes revealed 256, 214, and 32 unique genes for FBL6, FBL7, and FBL8, respectively. These genomes contained individual genes encoding proteins that are putatively involved in carbohydrate transport and metabolism, prokaryotic immune system for antiviral defense, and physiological control processes. In particular, L. casei FBL6 had a bacteriocin gene cluster that was not present in other genomes of L. casei, resulting in this strain may exhibit a wide range of antimicrobial activity compared to other L. casei strains. Our data can help us understand the probiotic functionalities of the three strains and suggest that L. chiayiensis and L. zeae species, which are closely related to L. casei, can also be considered as novel potential probiotic candidate strains.

Keywords: Lacticaseibacillus chiayiensis, Lacticaseibacillus zeae, complete genome sequencing, comparative genomics, probiotic, Lacticaseibacillus casei

INTRODUCTION

Probiotics are defined as live microorganisms that benefit host health when ingested in adequate amounts (Ye et al., 2020). Lactic acid bacteria can be utilized as probiotics provided that they have the desired properties, such as safety assurance for consumers, stability, and persistence in the gastrointestinal tract (Ye et al., 2020). Moreover, the ability to inhibit pathogens' growth, improve microbial balance in the intestines, and regulate mucosal and systemic immunity is required. Many strains belonging to lactic acid bacteria function as probiotics, and they also play a significant role in improving the quality of fermented foods (Zhang et al., 2018).

Lacticaseibacillus casei, Lacticaseibacillus chiaviensis, and Lacticaseibacillus zeae belong to the Lacticaseibacillus species and are very closely related phenotypically and genotypically along with Lacticaseibacillus paracasei and Lacticaseibacillus rhamnosus (Kim et al., 2020b). L. casei is one of the most studied lactic acid bacterial strains associated with probiotics and used in industrial and applied health applications (Hill et al., 2018). Strains considered to be probiotics have been proven to exhibit beneficial properties by promoting health associated with the regulation of immune response and improvement of atopic dermatitis (Mazé et al., 2010; Kang et al., 2017). L. casei is often used in the fermentation of dairy products, resulting in improved flavor and texture (Hill et al., 2018). L. chiayiensis was first isolated in 2018 from cow manure (Huang et al., 2018), and since then, this species has not been reported anymore. L. zeae, designated as an independent species from L. casei in 2020, has been said to exhibit antimicrobial activity against two strains of enterotoxigenic Escherichia coli (Zhou et al., 2014; Huang et al., 2020; Chen et al., 2021).

Whole-genome sequencing of potential probiotic strains ensures accurate taxonomic assignment while also providing genetic data concerning the presence of probiotic traits, possible metabolic activities, and safety assessment such as virulence factors, antibiotic resistance genes, and genetics related to hazardous metabolites (Guinane et al., 2016; Li et al., 2017). However, despite its importance for predicting the critical abilities of putative probiotic strains, the current genomic information of L. zeae and L. chiayiensis is fairly limited, resulting in impossible genetic access. Currently, one complete genome of L. zeae was reported but none for L. chiayiensis. However, the draft genome of L. chiayiensis has been reported in the literature (Huang et al., 2018). Also, reports on probiotic properties and genomic evidence to support their functionality are not yet available for the two species. Genomic analysis, together with experimental studies, is important for constructing a probiotic profile of a novel strain. Therefore, in this study, we investigated a phenotypic assay for L. casei FBL6, L. chiayiensis FBL7, and L. zeae FBL8 and identified related genes that are responsible for their probiotic properties. Moreover, to gain a better insight into the probiotic effects, the comparative genomic analysis was conducted among the newly sequenced three strains and publicly available genomes, as well as a comparison of genetic characteristics of the three species.

MATERIALS AND METHODS

Isolation of Strains and Identification

Raw milk samples were randomly collected from eight different ranches in Gyeonggi-do, Korea. Prior to the collection of raw milk samples, the udder was washed with distilled water and dried. The samples were obtained and directly placed into sterile tubes and immediately transferred to the laboratory. For the isolation of lactic acid bacterial strains, the serially diluted milk samples were spread on an MRS agar plate (Difco, Becton & Dickinson, Sparks, MD, United States) and incubated at 37°C for 48 h under anaerobic conditions. The different individual colonies were randomly selected according to morphological differences and purified on MRS broth (Difco). All isolates were stored at -80° C in glycerol until probiotic characterization.

Genomic DNA of the presumptive *Lacticaseibacillus* strain was extracted using the DNeasy Blood & Tissue Kits (Qiagen, Hilden, Germany) following the manufacturer's protocol to identify isolates. These strains were identified *via* 16S rRNA gene sequencing with 27F/1492R primer pairs. The identification of *L. casei, L. chiayiensis*, and *L. zeae* was performed using a realtime PCR method targeting unique genes for each species (Kim et al., 2020b, 2021). Three isolates demonstrating higher probiotic activities compared with other isolates were finally selected and designated respectively as FBL6, FBL7, and FBL8.

Genome Sequencing and Assembly

Cultured cells were harvested *via* centrifugation at 13,600 \times *g* for 5 min. The total genomic DNA for genome sequencing was extracted using the Wizard Genomic DNA Purification Kit (Promega, Madison, WI, United States) following the manufacturer's protocols. Genomic DNA was sheared into 10-kb fragments, and then SMRTbell libraries were prepared using the SMRTbell Template Prep Kit v. 1.0 (Pacific Bioscience, Menlo Park, CA, United States). Prepared libraries were sequenced on a PacBio Sequel I sequencer (Pacific Bioscience) using the Sequel Sequencing Kit v. 3.0 on single-molecule real-time sequencing technology cell 1M v. 2.0. The generated raw reads were filtered to remove adapter sequences and short reads. Filtered subreads were assembled through the hierarchical genome assembly process.

Genomic Analysis

Genes of genomes were predicted using Prokka v. 1.12, and the corresponding function annotation was performed by Clusters of Orthologous Groups (COGs). The most important probiotic genes and stress-related genes were determined by the Rapid Annotations using Subsystem Technology and Prokka. Putative virulence factors were detected using VirulenceFinder v. 2.0, and antimicrobial resistance genes acquired within three genomes were identified using the Comprehensive Antibiotic Resistance Database (CARD) v. 3.1.1 and ResFinder v. 4.1. The pathogenicity of the three genomes was determined using PathogenFinder v. 1.1. Putative prophage insert regions were identified using the PHage Search Tool Enhanced Release (PHASTER) (Arndt et al., 2016). Clustered Regularly Interspaced Short Palindromic Repeats (CRISPR) and CRISPR-associated genes (Cas) were detected using CRISPRCasFinder (Couvin et al., 2018). Secondary metabolite biosynthesis gene clusters were identified using antiSMASH bacterial v. 5.0 (Blin et al., 2019). Carbohydrate-active enzymes (CAZymes) within three genomes were identified using the CAZy database.¹

Comparative Genomic Analysis

For the comparative genomic analysis, publicly available genome sequences of L. casei, L. chiayiensis, L. zeae, and other reported Lacticaseibacillus species, L. paracasei, and L. rhamnosus, were downloaded from the NCBI database (Table 1). The phylogenetic relatedness among the FBL6, FBL7, and FBL8 strains and other strains was investigated using 16S rRNA gene sequences, average nucleotide identity (ANI), and core and pan-genome sequences to infer their evolutionary relationships. 16S rRNA gene sequences were extracted from whole-genome sequences, and a phylogenetic tree was created using the neighbor-joining method. A phylogenetic identification by ANI analysis was conducted using orthologous average nucleotide identity (OrthoANI) (Lee et al., 2016). A phylogenetic tree based on pan-genome was constructed using the pangenome workflow in the Anvi'o software v. 6.0 (Eren et al., 2015). Pan-genome and core-genome were analyzed using the Bacterial Pan-genome Analysis (BPGA) tool v. 1.3 with the default parameters. The assignment of COG functional categories for genes derived from core-genome and pan-genome was performed using USEARCH in the BPGA tool against the COG database.

Evaluation of the Probiotic Properties of FBL6, FBL7, and FBL8

Acid and Bile Salt Tolerance

Tolerance to acid and bile salt was observed according to the previous studies (Yu et al., 2019; Jomehzadeh et al., 2020). Each strain was incubated in MRS broth at 37°C overnight. Aliquots (0.1 mL) of each active culture were inoculated in 10 mL MRS broth adjusted to pH 2.5 with 0.1 N hydrochloric acid (HCl) and then incubated for 3 h at 37°C. Each strain was inoculated in MRS broth containing 0.3% ox gall bile salt (Sigma-Aldrich, St. Louis, MO, United States) and incubated for 24 h at 37°C to confirm tolerance to bile salt. After incubation, cell suspension was spread on an MRS agar plate, and then viable cell count that survived at low pH and bile salt were enumerated by plate counting. L. rhamnosus American Type Culture Collection (ATCC) 53103 (LGG) was utilized as the control. The survival rate (%) of each strain was calculated using the following formula: (N/N_0) \times 100, where N and N₀ denote viable cell numbers after culturing with low pH or bile salt and initial viable cell numbers, respectively.

Antimicrobial Activity

The antimicrobial activity of strains against pathogenic Grampositive and Gram-negative bacterial strains was determined using the well-diffusion method (Jomehzadeh et al., 2020). *Listeria monocytogenes* ATCC 19111, *L. ivanovii* ATCC 19119,

¹https://www.cazy.org/

Bacillus cereus ATCC 21772, E. coli O157:H7 ATCC 43894, E. coli O1:K1:H7 ATCC 11775, and Salmonella Enteritidis ATCC 4931 were grown on nutrient broth (Difco) at 37° C overnight. The FBL6, FBL7, and FBL8 strains were grown in MRS broth at 37° C for 24 h and then centrifuged at $8,000 \times g$ for 5 min to prepare a supernatant. The pathogens (10^{6} CFU/mL) were inoculated on Mueller–Hinton agar (Difco) and then cultured by putting the supernatant of the three strains in 8-mm-diameter wells. After incubation for 24 h at 37° C, antimicrobial activity was determined by measuring the inhibition zone surrounding the well.

Antioxidant Activity by Radical Scavenging Ability

The 2,2-diphenyl-1-picrylhydrazyl (DPPH) radical scavenging ability of the strains was analyzed according to the previous studies (Yu et al., 2019). The activated cell (200 μ L) was mixed with 1 mL of 0.4 mM DPPH solution and reacted in a dark room for 30 min. After centrifugation at 8,000 \times g for 5 min, the absorbance of each supernatant was measured at 517 nm. The control group used the same amount of distilled water as the sample, and 0.2 mM ascorbic acid was used as the positive control. Scavenging activity (%) was calculated using the following formula: $[1 - (A_{sample}/A_{control})] \times 100$, where $A_{control}$ and A_{sample} indicate the absorbance of the control and absorbance of the sample, respectively.

Adhesion Ability

The adhesion ability was evaluated using the human intestinal epithelial adenocarcinoma cell line (HT-29) (Yu et al., 2019). The HT-29 cell was obtained from the ATCC (Manassas, VA, United States). The cells were cultured in Roswell Park Memorial Institute (RPMI) 1640 medium containing fetal bovine serum (FBS, 10%, v/v) at 37°C in a humidified atmosphere of 5% CO2 until a 70-80% confluent monolayer was obtained. The HT-29 cells (1 \times 10⁵ cells/well) were seeded into a 24-well culture plate and cultured until a confluent monolayer was observed. After replacing the FBS-free RPMI 1640 medium, the isolates $(1 \times 10^8 \text{ CFU/mL})$ were added to each well, with each strain being tested in triplicates and incubated for 2 h. Subsequently, each well was rinsed three times with PBS, and the attached cells were lysed with 0.1% Triton X-100 (Sigma-Aldrich). The number of adherent bacteria was counted by spreading the serial dilutions on MRS agar. The adhesin value (%) was calculated using the following formula: $N_1/N_0\,\times\,100,$ where N_0 and N_1 denote the initial viable cell numbers and viable cell numbers obtained from the HT-29 cells, respectively.

Autoaggregation and Coaggregation

Autoaggregation and coaggregation tests were conducted according to previous studies (Lee et al., 2014). Autoaggregation of strains was observed to indirectly confirm intestinal cell adhesion. The cell (4 mL) suspended in PBS (10⁸ CFU/mL) was mixed by vortexing for 20 s and then incubated at room temperature for 5 h to determine autoaggregation. Each time, 0.1 mL of each supernatant was mixed with 0.9 mL PBS, and

TABLE 1 | Genome features of L. casei, L. chiayiensis, and L. zeae used in this study.

Organism name	Strain	Size (Mb)	GC%	CDS	Accession no.	Level
L. casei	ATCC 393	2.95296	47.9	2585	AP012544.1	Complete
L. casei	LC5	3.13287	47.9	2813	CP017065.1	Complete
L. casei	MGB0470	2.94091	47.9	2566	CP064303.1	Complete
L. casei	FBL6	3.13829	47.9	2908	CP074377.1	Complete
L. chiayiensis	NCYUAS	2.87209	47.1	2648	MSSM01	Contig
L. chiayiensis	BCRC 18859	2.66164	47.3	2144	NOXN01	Contig
L. chiayiensis	FBL7	2.85541	47.2	2744	CP074378.1	Complete
L. zeae	KCTC 3804	3.11033	47.8	2787	BACQ01	Contig
L. zeae	DSM 20178	3.12134	47.7	2812	AZCT01	Scaffold
L. zeae	CRBIP24.58	3.09086	47.8	2751	VBWN01	Contig
L. zeae	CRBIP24.44	3.08327	47.7	2804	VBWO01	Contig
L. zeae	CECT 9104	3.07341	48.0	2753	LS991421.1	Complete
L. zeae	FBL8	3.13252	47.8	2967	CP074379.1	Complete
L. paracasei	ATCC 334	2.92433	46.6	2608	CP000423.1	Complete
L. paracasei	Zhang	2.89846	46.4	2631	CP001084.2	Complete
L. paracasei	BL23	3.0792	46.3	2884	FM177140.1	Complete
L. paracasei	8700:02:00	3.02535	46.3	2794	CP002391.1	Complete
L. paracasei	BD-II	3.12729	46.3	2922	CP002618.1	Complete
L. paracasei	LC2W	3.07743	46.4	2862	CP002616.1	Complete
L. paracasei	W56	3.1321	46.3	2843	HE970764.1	Complete
L. paracasei	LOCK919	3.14337	46.2	2928	CP005486.1	Complete
L. paracasei	N1115	3.06428	46.5	2798	CP007122.1	Complete
L. paracasei	JCM 8130	3.0178	46.6	2730	AP012541.1	Complete
L. paracasei	CAUH35	2,97335	46.3	2684	CP012187.1	Complete
L. paracasei	19	3.07644	46.3	2807	CP012148.1	Complete
L paracasei	 KI 1	2 91889	46.6	2620	CP013921 1	Complete
L paracasei	IIA	3 24614	46.2	3001	CP014985 1	Complete
L. paracasei	TK1501	2.94254	46.5	2656	CP017716.1	Complete
L paracasei	FAM18149	2 96971	46.3	2727	CP017261 1	Complete
L. paracasei	TMW 1.1434	3.17011	46.3	2803	CP016355.1	Complete
L. paracasei	EG9	3.07441	46.4	2811	CP029546.1	Complete
L paracasei	Lpc10	3 05212	46.3	2801	CP029686 1	Complete
L. paracasei	ZFM54	3.04868	46.4	2802	CP032637.1	Complete
L. paracasei	AQ356	3.09656	46.3	2956	CP025499.1	Complete
L. paracasei	JH-SONE68	3.1812	46.4	2847	AP018392.1	Complete
L. paracasei	SBCM103299	3,18745	46.4	2922	CP035563.1	Complete
L paracasei	CBA3611	3 10253	46.3	2872	CP041657 1	Complete
L. paracasei	NJ	3.08341	46.4	2772	CP041944.1	Complete
L paracasei	10266	3 04491	46.4	2740	CP031785 1	Complete
L paracasei	IBB3423	3 24058	46.3	2969	CP022954 1	Complete
L paracasei	TD 062	2 86752	46.4	2555	CP044361 1	Complete
L. paracasei	CACC 566	3.2402	46.2	3015	CP048003.1	Complete
L paracasei	347-16	3 21903	46.2	2990	CP052065 1	Complete
L paracasei	L p02	3 09226	46.3	2793	CP039707 1	Complete
L paracasei	NFEJI04	3 19615	46.3	2979	CP050500 1	Complete
L paracasei	TK-P4A	3 08027	46.4	2833	CP045567 1	Complete
L paracasei	MGB0245	3 18613	46.3	2929	CP064299 1	Complete
L paracasei	MGB0734	3.30028	46.2	3004	CP064304 1	Complete
L paracasei	MGB0625	3 25115	46.3	2953	CP064311 1	Complete
L paracasei	MGB0747	3 14566	46.3	2886	CP064314 1	Complete
L paracasei	MGB0761	3 17238	46.2	2910	CP064316 1	Complete
L paracasei	7Y-1	3 25423	46.4	2964	CP065154 1	Complete
L paracasei	S-NA5	3 1/156	46 4	2856	CP068408 1	Complete
L. paracaser	0-INAU	3.14100	40.4	2000	UFU004U8.1	Complete

(Continued)

TABLE 1 | (Continued)

Organism name	Strain	Size (Mb)	GC%	CDS	Accession no.	Level
L. paracasei	S-NB	3.15214	46.4	2868	CP068416.1	Complete
L. paracasei	HL182	3.14151	46.3	2854	CP072181.1	Complete
L. paracasei	2A	3.04223	46.3	2767	CP073916.1	Complete
L. paracasei	GR0548	3.01478	46.3	2753	CP078097.1	Complete
L. rhamnosus	ATCC 53103	3.00505	46.7	2687	AP011548.1	Complete
L. rhamnosus	GG (ATCC 53103)	3.01011	46.7	2703	FM179322.1	Complete
L. rhamnosus	Lc 705	3.03311	46.6	2652	FM179323.1	Complete
L. rhamnosus	ATCC 8530	2.96034	46.8	2623	CP003094.1	Complete
L. rhamnosus	LOCK900	2.88338	46.8	2586	CP005484.1	Complete
L. rhamnosus	LOCK908	2.9909	46.8	2666	CP005485.1	Complete
L. rhamnosus	LRB	2.93495	46.8	2428	CP016823.1	Complete
L. rhamnosus	BFE5264	3.11476	46.8	2785	CP014201.1	Complete
L. rhamnosus	Pen	2.88497	46.8	2570	CP020464.1	Complete
L. rhamnosus	4B15	3.04784	46.7	2727	CP021426.1	Complete
L. rhamnosus	LR5	2.97259	46.7	2655	CP017063.1	Complete
L. rhamnosus	DSM 14870	3.01315	46.7	2698	CP006804.1	Complete
L. rhamnosus	GG	3.01012	46.7	2699	CP031290.1	Complete
L. rhamnosus	LR-B1	3.0075	46.7	2677	CP025428.1	Complete
L. rhamnosus	hsryfm 1301	3.06781	46.8	2769	CP044228.1	Complete
L. rhamnosus	BIO6870	3.00671	46.7	2691	CP044506.1	Complete
L. rhamnosus	BIO5326	2.98957	46.8	2655	CP046267.1	Complete
L. rhamnosus	LV108	2.92366	46.8	2630	CP053619.1	Complete
L. rhamnosus	JL-1	3.0075	46.7	2686	CP046395.1	Complete
L. rhamnosus	TK-F8B	3.05844	46.7	2730	CP045586.1	Complete
L. rhamnosus	B6	2.92449	46.8	2647	CP067042.2	Complete
L. rhamnosus	LDTM7511	3.00747	46.7	2670	CP051227.1	Complete
L. rhamnosus	CE1	2.93517	46.8	2564	CP073317.1	Complete
L. rhamnosus	X253	2.99115	46.8	2653	CP073711.1	Complete
L. rhamnosus	AS	2.93512	46.8	2561	CP073915.1	Complete
L. rhamnosus	CAU 1365	2.99104	46.8	2658	CP082961.1	Complete
L. rhamnosus	PMC203	2.99312	46.7	2647	CP086326.1	Complete
L. rhamnosus	NCTC13710	2.99105	46.8	2661	LR134322.1	Complete
L. rhamnosus	NCTC13764	2.98839	46.8	2658	LR134331.1	Complete

absorbance was measured at 600 nm. The following formula was used to calculate autoaggregation of strain (%): A0– (At/A0) \times 100, where At and A0 denote the absorbance at 5 h and absorbance at 0 h, respectively.

For the measurement of coaggregation, the cell suspensions of each strain and pathogenic strain were mixed and then vortexed for 20 s. The control tubes were prepared using 4 mL of putative probiotic strain and pathogenic strain in each tube. After incubation for 5 h, the absorbance of the suspension was measured at 600 nm. The following formula was used to calculate the coaggregation of a strain: {[$(A_x + A_y)/2$] – $A_{mix}/(A_x + A_y)/2$] × 100, where A_x and A_y denote the bacterial suspension in the control tube, and A_{mix} indicates the mixed bacterial suspension at 5 h.

Statistical Analysis

All experiments for probiotic properties were conducted in triplicate, and the statistical analysis of values was performed using R version 4.1.0. Significant differences (p < 0.05) between

the mean \pm standard deviation values were determined by one-way analysis of variance and Duncan's multiple range test.

RESULTS AND DISCUSSION

General Genome Features

The complete genome of *L. casei* FBL6 contained a chromosome of 3,138,294 bp with a guanine-cytosine (GC) content of 47.9% (**Supplementary Table 1**). The complete genomes of *L. chiayiensis* FBL7 and *L. zeae* FBL8 contained a chromosome of 2,855,405 bp with a GC content of 47.2% and a chromosome of 3,132,522 bp with a GC content of 47.8%, respectively. Previous studies have reported that strains occurring in host-associated environments, such as the gut and oral, showed small genome size and gene number, whereas strains present in soil have the largest genome size (Bentkowski et al., 2015; Cobo-Simón and Tamames, 2017; Jia et al., 2022). They also reported a positive correlation between genome size and ubiquity, suggesting that

microorganisms with larger genome size can adapt to more environmental conditions. FBL6, FBL7, and FBL8 had a larger genome size and higher GC content than *L. acidophilus* NCFM (1,993,564 bp, 34.7%), *L. helveticus* CAUH18 (2,160,583 bp, 36.8%), and *L. johnsonii* ZLJ010 (1,999,879 bp, 34.91%) but were similar to *L. plantarum* EM (3,649,371 bp, 44.14%), *L. paracasei* ZFM54 (3,048,677 bp, 46.35%), and *L. rhamnosus* GG (3,010,111 bp, 46.7%) (Altermann et al., 2005; Kankainen et al., 2009; Yang et al., 2016; Zhang et al., 2019; Kim et al., 2020a; Qureshi et al., 2020). Among these, *L. plantarum*, which is ecologically flexible, has a large genome size (Kim et al., 2020a), similar to *L. casei*, *L. chiayiensis*, and *L. zeae*, indicating that the latter can adapt well to various environments.

In each genome, 2,908 coding genes of FBL6, 2,744 genes of FBL7, and 2,967 genes of FBL8 were assigned to COG families comprising 20 functional categories. In the three genomes, most coding genes were classified for general function prediction only (R, 13.11–13.43%), carbohydrate transport and metabolism (G, 11.68–13.01%), transcription (K, 8.87–9.19%), and amino acid transport and metabolism (E, 8.78–8.97%) (**Supplementary Figure 1**). The high proportion of genes involved in carbohydrate and amino acid metabolism indicates that three strains might utilize and degrade a wide range of carbohydrates and proteins (Heo et al., 2021).

Phylogenetic Comparison of *L. casei*, *L. chiayiensis*, and *L. zeae*

Phylogenetic comparison based on the 16S rRNA gene sequences demonstrated that *L. casei*, *L. chiayiensis*, and *L. zeae* were clustered according to the species (**Figure 1A**). In a phylogenetic tree based on the 16S rRNA gene sequences, FBL6 demonstrated a 99.62% similarity to other *L. casei* strains. In addition, it showed a high degree of similarity to *L. chiayiensis* (99.43%) and *L. zeae* (99.36%). FBL7 exhibited a 99.81% similarity to other *L. chiayiensis* strains and a high degree of similarity to *L. zeae* (99.49%). In some *L. zeae* strains, the 16S rRNA gene was present as a short fragment; thus, the remaining strains except these were compared with the 16S rRNA gene of FBL8. As a result, FBL8 demonstrated a high similarity (99.87%) to the *L. zeae* CECT9104 and *L. zeae* CRBIP24.44 strains.

According to the orthoANI calculation, FBL6 shared 95.36-95.81% sequence similarity to other L. casei genomes and 88.09-93.75% to L. chiayiensis and L. zeae genomes (Supplementary Table 2). L. casei FBL6 demonstrated a closer relationship with LC5. L. casei LC5 is a probiotic strain isolated from fermented dairy products and used as commercial probiotics (Kang et al., 2017). This strain has a probiotic effect on atopic dermatitis. FBL7 demonstrated 99.24 and 98.67% similarity to the genomes of L. chiayiensis NCYUAS and BCRC 18859, respectively. FBL8 shared 96.65-99.56% sequence similarities to other L. zeae genomes and high sequence similarities to other L. casei and L. chiayiensis genomes (88.12-94.38%). Also, in the phylogenetic analysis based on core-genome and pangenome, FBL6, FBL7, and FBL8 were classified as L. casei, L. chiayiensis, and L. zeae and demonstrated a closer relationship with L. casei LC5, L. chiayiensis CRBLP24.58, and L. zeae NCYUAS, respectively (**Figures 1B,C**). The three species showed a high similarity to the 16S rRNA gene, which is more than 99.17% of each other, and it was confirmed that this gene could not be distinguished. Conversely, the analysis based on the whole-genome sequence clearly distinguishes the three species, suggesting that the genome sequence can help in achieving better understanding of the evolutionary history than the 16S rRNA gene.

Pan-Genome and Core-Genome

Pan-genome and core-genome are used for investigating genomic diversity within closely related microorganisms or the same species (Zhang et al., 2019). Pan-genome is the entire set of genes of all strains that reflects the receptive capacity of the genetic determinants (Zhang et al., 2019). A core-genome is a set of genes shared by all strains in a species, including genetic determinants, for maintaining the characteristics of species (Bosi et al., 2016; Zhang et al., 2019). Four genomes of L. casei had a pan-genome of 3,423 orthologs, which were divided into a core-genome of 1,890 orthologs (55.21%), an accessory-genome of 853 orthologs (24.92%), and a unique genome of 680 orthologs (19.87%) (Figure 2). The pan-genome size was 1.24 times the average size of these four genomes, and the core-genome constituted approximately 68.84% of each L. casei genome. In the core-genome, 1,570 orthologs could be assigned in 20 COG categories. Some highly conserved functional categories, such as general function prediction only (R, 13.65%), carbohydrate transport and metabolism (G, 10.06%), and function unknown (S, 9.21%), were enriched among the core-genome of L. casei (Figure 2).

Three genomes of *L. chiayiensis* had a pan-genome of 2,876 orthologs, divided into a core-genome of 1,897 orthologs (65.96%), an accessory-genome of 512 orthologs (17.80%), and a unique genome of 467 orthologs (16.24%) (**Figure 2**). In the *L. chiayiensis* core-genome, 1,523 ortholog gene clusters could be assigned in 20 COG categories. Some highly conserved functional categories, such as general function prediction only (R, 13.48%), carbohydrate transport and metabolism (G, 11.20%), and transcription (K, 9.39%), were enriched among the coregenome of *L. zeae*.

Six genomes of L. zeae had a pan-genome of 3,574 orthologs, which were divided into a core-genome of 2,052 orthologs (57.41%), an accessory-genome of 988 orthologs (27.64%), and a unique genome of 534 orthologs (14.94%) (Figure 2). In the coregenome, 1,687 orthologs could be assigned in 20 COG categories. Some highly conserved functional categories, such as general function prediction only (R, 13.84%), carbohydrate transport and metabolism (G, 10.32%), and amino acid transport and metabolism (E, 9.12%), were enriched among the core-genome of L. zeae. Other Lactobacillus species, such as L. johnsonii and L. ruminis, which have a relatively small genome size, had a high proportion of genes related to core functions, such as translation, replication, and cell cycle control (Kant et al., 2017; Zhang et al., 2019). Contrarily, owing to its large genome size, L. casei, L. chiayiensis, and L. zeae had a relatively high number of proteins for amino acids and carbohydrate metabolisms, similar to L. plantarum (Boekhorst et al., 2004; Zhang et al., 2019).



Unique Genome Characteristics Unique Genome of *L. casei* FBL6

Lacticaseibacillus casei FBL6 had 256 unique genes, including 126 proteins with known functions and 130 hypothetical proteins of unknown function (Supplementary Table 3). To further investigate the function of the encoded protein of unique genes, they were assigned to the COG categories. Of the 256 individual genes in the FBL6 genomes, 100 were assigned to 13 COG categories (Supplementary Figure 2). In total, 24 genes were enriched in carbohydrate transport and metabolism (G, 24%). It contains genes such as PTS sugar transporter subunits IIB and IIA and PTS lactose/cellobiose transporter subunit IIA. These individual genes may endow FBL6 with probiotic strain properties that utilize various carbohydrates (Zhang et al., 2019). A total of 16 genes in the FBL6 genome were assigned to replication, recombination, and repair (L, 16%), containing genes associated with mobile elements. Furthermore, 16 genes were assigned in transcription (K, 16%), containing several transcriptional regulators. Previous study has reported that the presence of these transcriptional regulators can act on specific genes to regulate the expression and give them several benefits

when they are present in an environment such as the gut (Zhang et al., 2019). However, further research is required to determine their association with genes and probiotics affected by transcriptional regulators.

Unique Genome of L. chiayiensis FBL7

Lacticaseibacillus chiayiensis FBL7 had 214 unique genes, including 140 proteins with known functions and 87 hypothetical proteins (**Supplementary Table 4**). Of the 214 unique genes, 73 were assigned to 17 COG categories (**Supplementary Figure 2**). A total of 13 genes were abundant in replication, recombination, and repair (L, 17.8%). In FBL7, CRISPR-associated protein Cas4 (locus_00047), which is not found in other *L. chiayiensis* strains, was present. This gene is one of the core CRISPRassociated (Cas) proteins involved in the prokaryotic immune system for antiviral defense (Zhang et al., 2012). Owing to the presence of this protein, FBL7 may be protected against mobile elements, including viruses, but other *L. chiayiensis* strains may not. Nine genes were assigned to carbohydrate transport and metabolism (G, 12.34%) and nine also to amino acid transport and metabolism (E, 12.34%). These unique genes endow FBL7



with the ability to obtain extra resources and protect itself against adverse stimuli, allowing better adaptation to various environments (Zhang et al., 2019).

Unique Genome of L. zeae FBL8

Lacticaseibacillus zeae FBL8 had 32 unique genes, including 26 proteins with known functions and 6 hypothetical proteins (**Supplementary Table 5**). Of the 32 unique genes, 17 were assigned to 11 COG functional categories (**Supplementary Figure 2**). Three genes were assigned to replication, recombination, and repair (L, 17.65%), containing several transposases and mobile element proteins. Two genes were assigned to the cell wall, membrane, and envelopment biogenesis (M, 11.76%). Two genes were assigned to signal transduction mechanisms (T, 11.76%), including two-component system sensors, histidine kinase, and response regulator. For lactic acid bacteria to survive while passing through the gastrointestinal tract, they need to have the ability to sense and respond to

conditions in various changing environments (Zhang et al., 2019). They are generally detected by a two-component system (Cui and Qu, 2011), which consists of a membrane-associated histidine kinase that detects specific environmental signals and a cytoplasmic response regulator regulating gene expression (Cui and Qu, 2011). FBL8 carried a distinguished two-component system sensor histidine kinase. Thus, this unique gene might confer FBL8 to control various physiological processes, such as stress and toxicity.

Comparative Genomic Analysis of Lacticaseibacillus Strains

Comparative genomic analysis was performed to compare the genomic characteristics between these three strains and other reported 83 *Lacticaseibacillus* strains. Of the 237,017 coding genes, 896 genes were shared by all genomes, comprising the core-genome. Accessory-genome is composed of 5,467 coding genes, and 1,642 coding genes were found only in a single

genome. The pan- and core-genome were annotated COG database and then assigned to functional categories. Some highly conserved functional categories, such as translation, ribosomal structure and biogenesis (J, 12.71%), general function prediction only (R, 12.35%), function unknown (S, 10.45%), and amino acid transport and metabolism (E, 7.4%), were enriched among the core-genome of Lacticaseibacillus strains (Supplementary Figure 3). Translation functions are important for maintaining physiological parameters during changes to which gut microorganisms are exposed, suggesting their adaptive and survival roles (Sharma et al., 2018). Similar to our study, genomic analysis of Bifidobacterium showed high conservation of "Translation, ribosomal structure, and biogenesis (J)" class in the core-genome, demonstrating the importance of information storage for these bacteria to adapt and survive in the gut (Sharma et al., 2018). In addition, for the accessory-genome and unique-genome, we observed enrichment of genes in the COG category "Carbohydrate transport and metabolism (G, 17.73-17.52%)." Among the 1,642 unique genes, 65, 70, and 8 coding genes were specific to L. casei FBL6, L. chiaviensis FBL7, and L. zeae FBL8, respectively. These unique genes include MucBP domain-containing protein, LysM peptidoglycan-binding domain-containing protein, and hypothetical proteins.

Probiotic-Related Genes Lifestyle Adaptation to Stress

Lactic acid bacteria, which are widely used in food fermentation, need to survive in various environmental conditions, including pH, salinity, and temperature (Ye et al., 2020). Resistance to environmental conditions is one of the desirable properties of lactic acid bacteria. Proteins of adaptation to stress regulate evolution tolerance and demonstrate genetic adaptation (Ye et al., 2020).

L. casei FBL6, L. chiayiensis FBL7, and L. zeae FBL8 contained several genes encoding stress-related proteins (Table 2). The FBL6 genome harbored the eight genes (locus_00683 to locus_00690), which encodes F0F1 ATP synthetase, and the gene locus_01410, which encodes the cholylglycine hydrolase; these proteins are associated with resistance to low pH and bile. Cholylglycine hydrolase is responsible for converting conjugated bile acid into free bile acid and confers probiotics in the gastrointestinal tract (Heo et al., 2021). FBL6 genome possessed genes encoding heat stress proteins, including molecular chaperone (locus_02010), dnaK (locus_00321), GroES (locus_02686), GroEL (locus_02687), and heat shock protein GrpE (locus_00320). Furthermore, this genome has an ABC transport system (locus_01791 to locus_01794) and glycine betaine ABC transport system (locus_02770 to locus_02772), which may have an osmotic pressure function (Heo et al., 2021). FBL6 may be involved in oxidative stress resistance by encoding proteins such as thiol peroxidase (locus_01096), thioredoxin reductase (locus_00895), and glutaredoxin (locus_00073), which catalyze glutathione-dependent disulfide reductions (Zhang et al., 2019). FBL6, FBL7, and FBL8 contained genes encoding stress-related proteins, such as bile, acid, and oxidative stress

tolerance genes. Moreover, two genomes carried genes that encode proteases related to stress response, heat stress proteins. These results suggest that three strains might resist multiple stress conditions and thus reach the intestines through the gastrointestinal tract.

Regulatory proteins such as transcriptional regulators and sigma factors are important for microorganisms to adapt to different environments (Zhang et al., 2019). FBL6 had genes encoding several proteins involved in transcriptional regulation, including 110 transcriptional regulators and one sigma factor (RpoD). FBL7 and FBL8 had 100 and 105 transcriptional regulators, respectively, and one sigma factor in both strains. These genomes had fewer regulatory proteins than other probiotic species, L. johnsonii, and similar to L. plantarum (Zhang et al., 2018, 2019). A previous study has demonstrated that many regulatory proteins are contained in large genomes, contributing to various lifestyle differences (Zhang et al., 2019). Thus, L. johnsonii does not require a complex regulatory system, whereas L. casei, L. chiayiensis, and L. zeae, with their free-living lifestyle, appear to have regulatory machinery that can adapt to various environmental niches (Zhang et al., 2019).

Adhesion

Adhesion to the intestinal mucosa epithelium is a prerequisite for demonstrating a probiotic effect, and bacterial surface proteins are known to be involved in the colonization of the intestinal mucosa (Ye et al., 2020). The potential surface exposure protein of lactic acid bacteria plays a significant role in bacterial interactions with the environment or host (Ye et al., 2020). L. casei FBL6 encodes cell-surface proteins, such as lipoprotein signal peptide (locus 00412) and elongation factor Tu (locus_00531) (Table 2). In addition, in this genome, coding genes, such as LPXTG-specific sortase (locus_00278) and exopolysaccharides (eps) cluster, which are related to strain adhesion to the surrounding epithelial tissue, were contained within the FBL6 genome. Exopolysaccharide contributes strains and host interactions within the intestinal epithelial cells and mucosa and is involved in certain essential functions of probiotics, such as immunomodulation, antioxidation, aggregation, and biofilm formation (Alayande et al., 2020). Sortase-dependent proteins are cell-surface proteins in lactic acid bacteria and play a significant role in adhesion (Alayande et al., 2020). Therefore, the adhesion-related genes identified in the FBL6 genome may provide stability of strain and prolong its antagonistic effect on unwanted gut microorganisms, aiding in the effective colonization of the intestinal environment and inhibition of pathogens. Similarly, genes related to adhesion were also present in L. chiayiensis FBL7 and L. zeae FBL8.

Safety Assessment

One of the essential requirements for probiotics is their safety. Probiotics should be least resistant to critical antibiotics, as antibiotic resistance in bacteria can be inherent or acquired through mutation or horizontal gene transfer (Soni et al., 2021). The search using ResFinder and CARD returned no hits for antibiotic resistance genes in *L. casei* FBL6, *L. chiayiensis* FBL7, and *L. zeae* FBL8 genomes. As a result of the strain's pathogenicity

TABLE 2 | Genes coding for proteins involved in stress resistance.

Stress response	Product	FBL6	FBL7	FBL8
Bile resistance	Choloylglycine hydrolase family protein	locus_01410	locus_02697	locus_00436
Acid resistance	ATP synthase F0 sector subunit a	locus_00690	locus_00547	locus_01156
	ATP synthase F0 sector subunit c	locus_00689	locus_00548	locus_01157
	ATP synthase F0 sector subunit b	locus_00688	locus_00549	locus_01158
	ATP synthase subunit delta	locus_00687	locus_00550	locus_01159
	ATP synthase subunit alpha	locus_00686	locus_00551	locus_01160
	ATP synthase gamma chain	locus_00685	locus_00552	locus_01161
	ATP synthase subunit beta	locus_00684	locus_00553	locus_01162
	ATP synthase epsilon chain	locus_00683	locus_00554	locus_01163
Heat stress	Molecular chaperone	locus_02010	locus_00102	locus_00670
	Chaperone protein DnaK	locus_00321	locus_00937	locus_01529
	Heat shock protein 10 kDa family chaperone GroES	locus_02686	locus_01554	locus_02145
	Heat shock protein 60 kDa family chaperone GroEL	locus_02687	locus_01553	locus_02144
	Heat shock protein GrpE	locus_00320	locus_00938	locus_01530
Oxidative stress	Thiol peroxidase, Tpx-type	locus_01096	locus_00148	locus_00723
	Thioredoxin reductase	locus_00895	locus_00225	locus_00806
	Glutaredoxin related protein	locus_00073	locus_01187	locus_01788
Osmotic pressure	Choline ABC transport system, ATP-binding protein OpuBA	locus_01791	locus_02395	locus_00076
	Choline ABC transport system, permease protein OpuBB	locus_01792	locus_02394	locus_00075
	Choline ABC transport system, choline-binding protein OpuBC	locus_01793	locus_02393	locus_00074
	Choline ABC transport system, permease protein OpuBD	locus_01794	locus_02392	locus_00073
	Glycine betaine ABC transport system, ATP-binding protein OpuAA	locus_02770	locus_01474	locus_02058
	Glycine betaine ABC transport system, permease protein OpuAB	locus_02771	locus_01473	locus_02057
	Glycine betaine ABC transport system, glycine betaine-binding protein OpuAC	locus_02772	locus_01472	locus_02056
Adhesion	Translation elongation factor Tu	locus_00531	locus_00720	locus_01319
	Sortase, LPXTG specific	locus_02776	locus_01468	locus_02052
	Tyrosine-protein kinase transmembrane modulator EpsC	locus_02868	locus_01384	locus_01909
	Tyrosine-protein kinase EpsD	locus_02869	locus_01383	locus_01965
	Tyrosine-protein kinase transmembrane modulator EpsC	locus_02925	locus_01310	locus_01966
	Putative glycosyltransferase EpsH	locus_00767	locus_00473	locus_00265
	putative glycosyltransferase EpsJ	locus_01171	locus_00072	locus_00640
	Putative glycosyltransferase EpsH	locus_01607	locus_01313	locus_01082
	putative sugar transferase EpsL	locus_02878	locus_01369	locus_01959
	Putative glycosyltransferase EpsH	locus_02922	locus_02552	locus_01912
	Transmembrane protein EpsG	locus_02927	locus_01308	locus_01907

investigation, the calculated matched pathogenic families for FBL6 were 0, and the unmatched pathogenic families were 83. The probability that the strain is a human pathogen is 0.218; thus, this strain was predicted not to be a pathogen. These results suggest that this depicts the safety of the strain and reduces the risk of transferring antibiotic resistance genes to the host's native gut microbiota. Also, FBL7 and FBL8 did not contain pathogenicity factors. The probability of being a pathogen in the three genomes was very low (FBL7, 0.164; FBL8, 0.213), and these strains were predicted to be non-human pathogens. Therefore, FBL6, FBL7, and FBL8 strains are safe.

Mobile Genetic Element Analysis

PHAST predicted one intact prophage element and questionable prophage element in *L. casei* FBL6 and *L. chiayiensis* FBL7, respectively, and two intact prophage elements in *L. zeae* FBL8. Prophages are often detected in the genomes of probiotic

Lactobacillus species (Stefanovic and McAuliffe, 2018; Feyereisen et al., 2019; Zhang et al., 2019). The prophage region in FBL6 extended from 1,379,286 to 1,410,750 bp and contained 46 proteins with an intact prophage element from locus_01305 to locus_01350 (Supplementary Table 6); this was the part of the prophage BH1 detected in Lactobacillus (accession no. NC_048737). For FBL7, the prophage region contained 52 proteins with a questionable prophage element (Supplementary Table 7). The genes in the prophage region were homologous to the genes of bacteriophage T25 (NC_048625) observed in Lactobacillus. For FBL8, the prophage 1 region contained 50 proteins with an intact prophage element, and prophage 2 contained 19 proteins with an intact prophage element (Supplementary Table 8). The genes in prophage 1 and 2 regions were homologous to a gene of phage BH1 (NC_048737) found in Lactobacillus and a gene of phage StauST398 (NC_023499) found in Staphylococcus, respectively. In these bacteriophage regions,

virulence factors or genes related to pathogenic properties could not be detected.

CRISPR refers to a family of DNA repeats providing acquired immunity to foreign genetic elements (Zhang et al., 2019). These are composed of short and highly conserved repeats, interspaced by spacers, which are variable sequences, and often exist adjacent to the cas genes. The presence of these CRISPR loci increases the genomic stability of strains, allowing them to adapt to various environments. The FBL6 genome contained two CRISPR loci (Supplementary Table 9). The genomes of FBL7 and FBL8 harbored CRISPR regions, with associated spacer and Cas-gene. The FBL7 genome contained three CRISPR loci. The detected CRISPR Cas system was of type IIA (cas1, cas9, and csn2) and type IC (cas1, cas2, cas3, cas4, cas5, cas7, and cas8). The FBL8 genome contained five CRISPR loci. The detected CRISPR/CRISPRassociated (Cas) system was of type IC (cas1, cas2, cas3, cas4, cas5, cas7, and cas8). The presence of these CRISPR loci will provide the strains with the ability to defend themselves against plasmids, phages, and insertion sequences (Alayande et al., 2020). Therefore, the CRISPR Cas system could prevent L. casei, L. chiayiensis, and L. zeae from acquiring virulence or antibiotic resistance genes through horizontal gene transfer.

Secondary Metabolic Product

The probiotic strain should survive in the intestine by competing with other microorganisms after adhesion or colonization in the gut (Heo et al., 2021). Strains with the ability to produce bacteriocin have the advantage of competing with other gut microorganisms (Heo et al., 2021). L. casei FBL6 encoded three secondary metabolic enzymes, ribosomally synthesized, and posttranslationally modified peptide product (RiPP) cluster, all of which were predicted to produce bacteriocin. The first RiPPlike cluster demonstrated high similarity to bacteriocin IIc (Figure 3A). Some core biosynthetic genes and other genes in this cluster were specifically present only in FBL6 but not in different L. casei strains (Supplementary Table 10). These genes were helix-turn-helix transcriptional regulators, Blp family class II bacteriocin. In the second RiPP cluster, a gene encoding bacteriocin sakacin-P was only present in FBL6. Sakacins, class II bacteriocin, were first identified in L. sakei and demonstrated a bactericidal effect on food pathogens and spoilage species (Fallico et al., 2011). In particular, it has been reported that sakacin-P has relatively high activity against L. monocytogenes compared with other bacteriocins and is therefore promising for use in the food industry (Møretrø et al., 2000). Due to the presence of this gene, FBL6 may have antimicrobial activity against pathogens, but other L. casei strains may not. Moreover, the Rrf2 family transcriptional regulator, ABC transporter permease, and transporter-related genes in the third RiPP cluster were specifically present only in the FBL6 genome. L. chiayiensis FBL7 encoded five RiPP clusters, all of which were predicted to be bacteriocins, such as sakacin-P and bacteriocin IIc (Figure 3B). Unlike other L. chiayiensis strains, some transcriptional regulators, DNA-binding proteins, and hypothetical proteins were only present in the FBL7 genome (Supplementary Table 11). L. zeae FBL8 encoded four RiPP clusters, all of which were predicted to be bacteriocins

(**Figure 3C**). The RiPP clusters in FBL8 were also present in other *L. zeae* genomes (**Supplementary Table 12**).

Carbohydrate-Active Enzymes

The L. casei FBL6 genome contained 119 genes in the CAZymes gene families as follows: 61 glycoside hydrolases (GHs), 40 glycosyltransferases (GTs), 3 carbohydrate esterases (CEs), 1 auxiliary activity (AA), 13 carbohydrate-binding modules (CBMs), and 1 polysaccharide lyase (PL) (Figure 4). The L. chiayiensis FBL7 genome contained 105 genes in CAZymes gene families: 60 GHs, 29 GTs, 3 CEs, 1 AA. 11 CBMs, and 1 PL. Among them, GH78, GT0, and CBM48 were only predicted in FBL7, not in other L. chiayiensis strains. The L. zeae FBL8 genome contained 115 genes in CAZymes gene families: 56 GHs, 43 GTs, 3 CFs, 1 AA, 9 CBMs, and 3 PLs. The results demonstrated that the carbohydrate utilization patterns of FBL6, FBL7, and FBL8 were different. GH127 (B-L-arabinofuranosidase) and GT111 $(\beta$ -1,3-galactofuranosyltransferase) were only predicted in the FBL6 strain, whereas GH154 (β-glucuronidase) and GH43-11 (β-xylosidase) were only predicted in the FBL7 strain. Also, GH15 (glucoamylase), GH105 (unsaturated rhamnogalacturonyl hydrolase), and PL8 (hyaluronate lyase) were only predicted in the FBL8 strain. A previous study has reported that the larger the number of CAZymes encoding genes in the genome, the higher the probiotic potential for immune stimulation and pathogen defense (Zhang et al., 2018). FBL6, FBL7, and FBL8 exhibited a higher diversity of carbohydrate-activation enzymes, which were relatively abundant than other strains.

Probiotic Properties Under *in vitro* Conditions

Acid and Bile Resistance

The effects of probiotic strains depend on their ability to multiply in the gastrointestinal tract to exhibit functionality and survive in natural host defenses (Ye et al., 2020). For the cells to reach the intestine and exhibit functionality, probiotic strains must be resistant to low pH and bile salt (Yu et al., 2019). The ability of the strains to survive in simulated gastric juice and bile salt was evaluated in vitro. The survival of FBL6, FBL7, and FBL8 was not affected at all by the low-acid environment, and these strains exhibited survival rates of 96.7 \pm 12.75% to 120.3 \pm 6.14%, confirming the high stability against acid (Figure 5A). Also, the three strains showed survival rates of 85.4 \pm 8.97% to $108.8 \pm 9.10\%$ at a high concentration of bile salt, indicating that they were not affected by bile salt to survive (Figure 5B). Therefore, these results suggest that three strains possess the characteristics of probiotics with high survival rates at low pH and bile concentration.

Antioxidant Activity

The DPPH radical scavenging activity of the strains was analyzed to observe the antioxidant effect, which is one of the probiotic properties. As a result, the three strains exhibited a DPPH scavenging potential (**Figure 5C**). There is no significant difference in DPPH radical scavenging activity between *L*. *chiayiensis* FBL7 strain and control strain, *L. rhamnosus* GG. The *L. casei* FBL6 and *L. zeae* FBL8 strains showed lower activities.





FIGURE 3 | Biosynthetic gene cluster of secondary metabolites. Gene clusters for the biosynthesis of bacteriocin in (A) *L. casei* FBL6, (B) *L. chiayiensis* FBL7, and (C) *L. zeae* FBL8. The red, pink, blue, green, and gray arrows represent core biosynthetic genes, additional biosynthetic genes, transport-related genes, regulatory genes, and other genes, respectively.

The DPPH radical scavenging activities of the three strains ranged from 41.0 \pm 4.62% to 88.6 \pm 9.52%, and all strains exhibited antioxidant activity.

Antimicrobial Properties

The inhibitors produced by probiotic strains can be alternatives to antibiotics (Li et al., 2021). The antimicrobial properties of the three strains against the representative pathogenic strains were investigated. *L. casei* FBL6, *L. chiayiensis* FBL7, and *L. zeae* FBL8 had a broad antimicrobial spectrum (**Table 3**). These strains exhibited antimicrobial activity against Gram-negative bacteria and Gram-positive bacteria, such as *Listeria*, *B. cereus*, *E. coli*, and *Salmonella*. The antimicrobial activity of probiotic strains is mainly mediated by the production of some inhibitory substances, such as bacteriocins and lactic acid (Ye et al., 2020). These strains have genes involved in the production of antimicrobial peptides in the genomes, and it is presumed that these substances contributed to the inhibitory effect on pathogenic strains.

Adhesion Ability

The adhesion ability of probiotic strain has been proven to vary depending on their species or strain because the production of proteinaceous secretory adhesion and the properties of bacterial cell membranes contribute to intestinal cell attachments (Yu et al., 2019). L. casei FBL6 exhibited an adhesion capability of $85.4 \pm 1.37\%$, which is higher than that of the control strain, L. rhamnosus GG (Figure 5D). This result is consistent with a previous study demonstrating the probiotic L. casei strain's high adhesion ability (Yu et al., 2019). L. chiayiensis FBL6 and L. zeae FBL7 strains demonstrated lower adhesion capabilities than L. rhamnosus GG but were similar to other probiotic strains, such as L. plantarum subsp. plantarum SW03, L. rhamnosus KCTC 12202BP, and L. gasseri 5R01 (Oh and Jung, 2015; Son et al., 2017; Oh et al., 2018). These results suggest that three strains have potentially fulfilled the adhesion capacity requirements for probiotics.

Autoaggregation and Coaggregation

Autoaggregation is the phenomenon of clumping of bacteria of the same strain and is correlated with the adhesion ability of the probiotic strain to the intestinal epithelial cells (Lee et al., 2014). This ability is a precondition for colonization and improved persistence in the gastrointestinal tract (Lee et al., 2014). The autoaggregation rates of FBL6, FBL7, and FBL8 were measured. The results indicated that all strains possessed autoaggregation phenotypes (**Figure 5E**) and showed higher autoaggregation





than the control strain, namely *L. rhamnosus* GG, except for *L. zeae* FBL8. There is no significant difference in autoaggregation between *L. zeae* FBL8 and *L. rhamnosus* GG.

Coaggregation refers to clumping between two different species. The coaggregation ability of the probiotic and pathogenic strains may hinder colonization by pathogenic strains in the gut, allowing a host defense mechanism against infection (Lee et al., 2014). Coaggregation of FBL6, FBL7, and FBL8 strains with pathogenic strains was measured. All strains demonstrated coaggregation with three pathogenic strains compared with the control strain, *L. rhamnosus* GG, except for the coaggregation of FBL8 with *S.* Typhimurium. FBL6 showed the best coaggregation rate with *S. aureus* ($46.8 \pm 5.41\%$) (**Figure 5F**). The genomic analysis and *in vitro* studies suggest that these strains may have adhesion ability in human intestinal epithelial cells.



FIGURE 5 | Evaluation of the probiotic properties of *L. casei* FBL6, *L. chiayiensis* FBL7, and *L. zeae* FBL8. (A) The acid and (B) bile tolerance of three strains. (C) The antioxidant activity and (D) adhesion activity of three strains. (E) The autoaggregation and (F) coaggregation of three strains on *S.* Typhimurium ATCC 14028, *S. aureus* ATCC 6538, and *E. coli* ATCC 43894. Data value represents the mean \pm standard deviation (n = 3). Different letters on each bar indicate significant differences (p < 0.05).

Strains	Antimicrobial activity against pathogenic strains ^a						
	L. monocytogenes ATCC 19111	<i>B. cereus</i> ATCC 21772	<i>E. coli</i> O157:H7 ATCC 43894	<i>E. coli</i> O1:K1:H7 ATCC 11775	S. Enteritidis ATCC 4931	<i>L. ivanovii</i> ATCC 19119	
L. casei FBL6	++	++	++	+++	+++	+++	
L. chiayiensis FBL7	++	++	++	++	++	++	
<i>L. zeae</i> FBL8	++	++	+++	+++	++	++	
L. rhamnosus GG	+++	++	++	+++	+++	+++	

^a The diameter of the inhibition zone was evaluated according to the following criteria: very strong (+++, \geq 17 mm), strong (++, 11–17 mm), weak (+, 5–10 mm), no inhibition (–).

CONCLUSION

This study was conducted to demonstrate the probiotic properties of L. casei FBL6, L. chiayiensis FBL7, and L. zeae FBL8 isolated from raw milk. The FBL7 and FBL8 strains are the first L. chiayiensis and L. zeae strains with phenotype and genotype studies. For the first time, this study revealed that L. chiayiensis and L. zeae, like L. casei, also exhibit probiotic properties. The genome sequencing and comparative genomic analysis data indicated that three strains play a role as a potential probiotic candidate with antibacterial activity and the ability to survive in environmental stresses, such as acid, bile, temperature, and oxidative stress. Comparative genomic analysis indicated the L. casei FBL6 carried a sakacin-P gene cluster that was not found in other L. casei genomes. Moreover, genes related to adaptation, such as carbohydrate-active enzymes and secondary metabolite gene clusters specific to the genomes of three strains, were also revealed. Our analysis results could provide a genetic basis for further investigation to show the three strains' functional

mechanism of probiotic characteristics. However, it is necessary to further elucidate its specific benefits for host health through *in vitro* and *in vivo* experiments.

DATA AVAILABILITY STATEMENT

The datasets presented in this study can be found in online repositories. The names of the repository/repositories and accession number(s) can be found below: NCBI AND CP074377.1, CP074378.1, CP074379.1.

AUTHOR CONTRIBUTIONS

EK and H-YK contributed to the conception and design of this study. EK and S-MY performed the genome analysis and comparative genomic analysis. S-MY and DK performed the *in vitro* probiotic test. EK prepared a draft manuscript. H-YK reviewed and edited the manuscript. All authors contributed to manuscript revision, read, and approved the submitted version.

FUNDING

This research was supported by Basic Science Research Program through the National Research Foundation of Korea

REFERENCES

- Alayande, K. A., Aiyegoro, O. A., Nengwekhulu, T. M., Katata-Seru, L., and Ateba, C. N. (2020). Integrated genome-based probiotic relevance and safety evaluation of *Lactobacillus reuteri* PNW1. *PLoS One* 15:e0235873. doi: 10.1371/ journal.pone.0235873
- Altermann, E., Russell, W. M., Azcarate-Peril, M. A., Barrangou, R., Buck, B. L., McAuliffe, O., et al. (2005). Complete genome sequence of the probiotic lactic acid bacterium *Lactobacillus acidophilus* NCFM. *Proc. Natl. Acad. Sci. U. S. A.* 102, 3906–3912. doi: 10.1073/pnas.0409188102
- Arndt, D., Grant, J. R., Marcu, A., Sajed, T., Pon, A., Liang, Y., et al. (2016). PHASTER: a better, faster version of the PHAST phage search tool. *Nucleic Acids Res.* 44, W16–W21. doi: 10.1093/nar/gkw387
- Bentkowski, P., Van Oosterhout, C., and Mock, T. (2015). A model of genome size evolution for prokaryotes in stable and fluctuating environments. *Genome Biol. Evol.* 7, 2344–2351. doi: 10.1093/gbe/evv148
- Blin, K., Shaw, S., Steinke, K., Villebro, R., Ziemert, N., Lee, S. Y., et al. (2019). AntiSMASH 5.0: updates to the secondary metabolite genome mining pipeline. *Nucleic Acids Res.* 47, W81–W87. doi: 10.1093/nar/gkz310
- Boekhorst, J., Siezen, R. J., Zwahlen, M. C., Vilanova, D., Pridmore, R. D., Mercenier, A., et al. (2004). The complete genomes of *Lactobacillus plantarum* and *Lactobacillus johnsonii* reveal extensive differences in chromosome organization and gene content. *Microbiology* 150, 3601–3611. doi: 10.1099/mic. 0.27392-0
- Bosi, E., Monk, J. M., Aziz, R. K., Fondi, M., Nizet, V., and Palsson, B. (2016). Comparative genome-scale modelling of *Staphylococcus aureus* strains identifies strain-specific metabolic capabilities linked to pathogenicity. *Proc. Natl. Acad. Sci. U. S. A.* 113, E3801–E3809. doi: 10.1073/pnas.1523199113
- Chen, Y., Liu, S., Yu, C., Azevedo, P., Liu, S., O, K., et al. (2021). Evaluating the Effectiveness of *Lactobacillus zeae* against Enterotoxigenic *Escherichia coli* F4 Infection in an *In Vitro* Porcine Intestinal Epithelial Cell Model. ACS Food Sci. Technol. 1, 215–228. doi: 10.1021/acsfoodscitech.0c00069
- Cobo-Simón, M., and Tamames, J. (2017). Relating genomic characteristics to environmental preferences and ubiquity in different microbial taxa. BMC Genomics 18:499. doi: 10.1186/s12864-017-3888-y
- Couvin, D., Bernheim, A., Toffano-Nioche, C., Touchon, M., Michalik, J., Néron, B., et al. (2018). CRISPRCasFinder, an update of CRISRFinder, includes a portable version, enhanced performance and integrates search for Cas proteins. *Nucleic Acids Res.* 46, W246–W251. doi: 10.1093/nar/gky425
- Cui, Y., and Qu, X. (2011). Comparative analysis of two component signal transduction systems of the *Lactobacillus acidophilus* group. *Brazilian J. Microbiol.* 42, 147–157. doi: 10.1590/S1517-83822011000100019
- Eren, A. M., Esen, ÖC., Quince, C., Vineis, J. H., Morrison, H. G., Sogin, M. L., et al. (2015). Anvi'o: an advanced analysis and visualization platform for 'omics data. *PeerJ* 3:e1319. doi: 10.7717/peerj.1319
- Fallico, V., McAuliffe, O., Ross, R. P., Fitzgerald, G. F., and Hill, C. (2011). "The potential of lacticin 3147, enterocin AS-48, lacticin 481, variacin and sakacin P for food biopreservation," in *Protective Cultures, Antimicrobial Metabolites* and Bacteriophages for Food and Beverage Biopreservation, ed C. Lacroix (Amsterdam: Elsevier), 100–128. doi: 10.1533/9780857090522.1.100
- Feyereisen, M., Mahony, J., Kelleher, P., Roberts, R. J., O'Sullivan, T., Geertman, J. M. A., et al. (2019). Comparative genome analysis of the *Lactobacillus brevis* species. *BMC Genomics* 20:416. doi: 10.1186/s12864-019-5783-1
- Guinane, C. M., Crispie, F., and Cotter, P. D. (2016). "Value of microbial genome sequencing for probiotic strain identification and characterization:

(NRF) funded by the Ministry of Education (Grant No. 2020R1A6A3A01100168).

SUPPLEMENTARY MATERIAL

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fmicb. 2021.794315/full#supplementary-material

promises and pitfalls," in *The Gut-Brain Axis Dietary, Probiotic, and Prebiotic Interventions on the Microbiota*, eds N. Hyland and C. Stanton (Amsterdam: Elsevier), 45–60. doi: 10.1016/B978-0-12-802304-4.00004-9

- Heo, S., Kim, J.-H., Kwak, M.-S., Sung, M.-H., and Jeong, D.-W. (2021). Functional annotation genome unravels potential probiotic *Bacillus velezensis* Strain KMU01 from traditional Korean fermented kimchi. *Foods* 10:563. doi: 10.3390/ foods10030563
- Hill, D., Sugrue, I., Tobin, C., Hill, C., Stanton, C., and Ross, R. P. (2018). The *Lactobacillus casei* group: history and health related applications. *Front. Microbiol.* 9:2107. doi: 10.3389/fmicb.2018.02107
- Huang, C. H., Chen, C. C., Liou, J. S., Lee, A. Y., Blom, J., Lin, Y. C., et al. (2020). Genome-based reclassification of *Lactobacillus casei*: emended classification and description of the species *Lactobacillus zeae*. *Int. J. Syst. Evol. Microbiol*. 70, 3755–3762. doi: 10.1099/ijsem.0.003969
- Huang, C. H., Liou, J. S., Lee, A. Y., Tseng, M., Miyashita, M., Huang, L., et al. (2018). Polyphasic characterization of a novel species in the *Lactobacillus casei* group from cow manure of Taiwan: description of *L. chiayiensis* sp. nov. *Syst. Appl. Microbiol.* 41, 270–278. doi: 10.1016/j.syapm.2018.01.008
- Jia, J., Liu, M., Feng, L., and Wang, Z. (2022). Comparative genomic analysis reveals the evolution and environmental adaptation of *Acinetobacter johnsonii*. *Gene* 808:145985. doi: 10.1016/j.gene.2021.145985
- Jomehzadeh, N., Javaherizadeh, H., Amin, M., Saki, M., Al-Ouqaili, M. T. S., Hamidi, H., et al. (2020). Isolation and identification of potential probiotic *Lactobacillus* species from feces of infants in southwest Iran. *Int. J. Infect. Dis.* 96, 524–530. doi: 10.1016/j.ijid.2020.05.034
- Kang, J., Chung, W. H., Lim, T. J., Whon, T. W., Lim, S., and Nam, Y. D. (2017). Complete genome sequence of *Lactobacillus casei* LC5, a potential probiotics for atopic dermatitis. *Front. Immunol.* 8:413. doi: 10.3389/fimmu.2017.00413
- Kankainen, M., Paulin, L., Tynkkynen, S., Von Ossowski, I., Reunanen, J., Partanen, P., et al. (2009). Comparative genomic analysis of *Lactobacillus rhamnosus* GG reveals pili containing a human-mucus binding protein. *Proc. Natl. Acad. Sci.* U. S. A. 106, 17193–17198. doi: 10.1073/pnas.0908876106
- Kant, R., Palva, A., and Von Ossowski, I. (2017). An *in silico* pan-genomic probe for the molecular traits behind *Lactobacillus ruminis* gut autochthony. *PLoS One* 12:e0175541. doi: 10.1371/journal.pone.0175541
- Kim, E., Yang, S. M., Cho, E. J., and Kim, H. Y. (2020b). Novel real-time PCR assay for *Lactobacillus casei* group species using comparative genomics. *Food Microbiol.* 90:103485. doi: 10.1016/j.fm.2020.103485
- Kim, E., Chang, H. C., and Kim, H. Y. (2020a). Complete genome sequence of *Lactobacillus plantarum* EM, A putative probiotic strain with the cholesterollowering effect and antimicrobial activity. *Curr. Microbiol.* 77, 1871–1882. doi: 10.1007/s00284-020-02000-8
- Kim, E., Yang, S.-M., and Kim, H.-Y. (2021). Differentiation of *Lacticaseibacillus zeae* Using Pan-Genome Analysis and Real-Time PCR Method Targeting a Unique Gene. *Foods* 10:2112. doi: 10.3390/foods10092112
- Lee, I., Kim, Y. O., Park, S. C., and Chun, J. (2016). OrthoANI: an improved algorithm and software for calculating average nucleotide identity. *Int. J. Syst. Evol. Microbiol.* 66, 1100–1103. doi: 10.1099/ijsem.0.000760
- Lee, K. W., Park, J. Y., Sa, H. D., Jeong, J. H., Jin, D. E., Heo, H. J., et al. (2014). Probiotic properties of *Pediococcus* strains isolated from jeotgals, salted and fermented Korean sea-food. *Anaerobe* 28, 199–206. doi: 10.1016/j.anaerobe. 2014.06.013
- Li, B., Jin, D., Evivie, S. E., Li, N., Yan, F., Zhao, L., et al. (2017). Safety assessment of *Lactobacillus helveticus* KLDS1.8701 based on whole genome sequencing and oral toxicity studies. *Toxins (Basel)*. 9:301. doi: 10.3390/toxins9100301

- Li, X. Y., Li, L. X., Li, Y., Zhou, R. C., Li, B., Gu, X., et al. (2021). Complete genome sequencing of Peyer's patches-derived *Lactobacillus taiwanensis* CLG01, a potential probiotic with antibacterial and immunomodulatory activity. *BMC Microbiol.* 21:68. doi: 10.1186/s12866-021-02127-z
- Mazé, A., Boël, G., Zúñiga, M., Bourand, A., Loux, V., Yebra, M. J., et al. (2010). Complete genome sequence of the probiotic *Lactobacillus casei* strain BL23. *J. Bacteriol.* 192, 2647–2648. doi: 10.1128/JB.00076-10
- Møretrø, T., Aasen, I. M., Storrø, I., and Axelsson, L. (2000). Production of sakacin P by *Lactobacillus sakei* in a completely defined medium. *J. Appl. Microbiol.* 88, 536–545. doi: 10.1046/j.1365-2672.2000.00994.x
- Oh, N. S., Joung, J. Y., Lee, J. Y., and Kim, Y. (2018). Probiotic and antiinflammatory potential of *Lactobacillus rhamnosus* 4B15 and *Lactobacillus gasseri* 4M13 isolated from infant feces. *PLoS One* 13:e0192021. doi: 10.1371/ journal.pone.0192021
- Oh, Y. J., and Jung, D. S. (2015). Evaluation of probiotic properties of *Lactobacillus* and *Pediococcus* strains isolated from Omegisool, a traditionally fermented milletalcoholic beverage in Korea. *LWT Food Sci. Technol.* 63, 437–444. doi: 10.1016/j.lwt.2015.03.005
- Qureshi, N., Gu, Q., and Li, P. (2020). Whole genome sequence analysis and *in vitro* probiotic characteristics of a *Lactobacillus* strain *Lactobacillus* paracasei ZFM54. *J. Appl. Microbiol.* 129, 422–433. doi: 10.1111/jam.14627
- Sharma, V., Mobeen, F., and Prakash, T. (2018). Exploration of survival traits, probiotic determinants, host interactions, and functional evolution of bifdobacterial genomes using comparative genomics. *Genes (Basel)*. 9:477. doi: 10.3390/genes9100477
- Son, S. H., Jeon, H. L., Jeon, E. B., Lee, N. K., Park, Y. S., Kang, D. K., et al. (2017). Potential probiotic *Lactobacillus plantarum* Ln4 from kimchi: evaluation of βgalactosidase and antioxidant activities. *LWT Food Sci. Technol.* 85, 181–186. doi: 10.1016/j.lwt.2017.07.018
- Soni, R., Nanjani, S., and Keharia, H. (2021). Genome analysis reveals probiotic propensities of *Paenibacillus polymyxa* HK4. *Genomics* 113, 861–873. doi: 10. 1016/j.ygeno.2020.10.017
- Stefanovic, E., and McAuliffe, O. (2018). Comparative genomic and metabolic analysis of three *Lactobacillus paracasei* cheese isolates reveals considerable genomic differences in strains from the same niche. *BMC Genomics* 19:205. doi: 10.1186/s12864-018-4586-0
- Yang, Y., An, H., Zhai, Z., Wang, G., Li, J., and Hao, Y. (2016). Complete genome sequence of *Lactobacillus helveticus* CAUH18, A potential probiotic strain originated from koumiss. *J. Biotechnol.* 224, 18–19. doi: 10.1016/j.jbiotec.2016. 03.004

- Ye, K., Li, P., and Gu, Q. (2020). Complete genome sequence analysis of a strain Lactobacillus pentosus ZFM94 and its probiotic characteristics. Genomics 112, 3142–3149. doi: 10.1016/j.ygeno.2020.05.015
- Yu, H. S., Jang, H. J., Lee, N. K., and Paik, H. D. (2019). Evaluation of the probiotic characteristics and prophylactic potential of *Weissella cibaria* strains isolated from kimchi. *LWT* 112:108229. doi: 10.1016/j.lwt.2019. 05.127
- Zhang, J., Kasciukovic, T., and White, M. F. (2012). The CRISPR Associated Protein Cas4 Is a 5' to 3' DNA Exonuclease with an Iron-Sulfur Cluster. *PLoS One* 7:e47232. doi: 10.1371/journal.pone.0047232
- Zhang, W., Ji, H., Zhang, D., Liu, H., Wang, S., Wang, J., et al. (2018). Complete genome sequencing of *Lactobacillus plantarum* ZLP001, a potential probiotic that enhances intestinal epithelial barrier function and defense against pathogens in pigs. *Front. Physiol.* 9:1689. doi: 10.3389/fphys.2018.01689
- Zhang, W., Wang, J., Zhang, D., Liu, H., Wang, S., Wang, Y., et al. (2019). Complete Genome sequencing and comparative genome characterization of *Lactobacillus johnsonii* ZLJ010, a potential probiotic with health-promoting properties. *Front. Genet.* 10:812. doi: 10.3389/fgene.2019.00812
- Zhou, M., Yu, H., Yin, X., Sabour, P. M., Chen, W., and Gong, J. (2014). Lactobacillus zeae protects Caenorhabditis elegans from enterotoxigenic Escherichia coli-caused death by inhibiting enterotoxin gene expression of the pathogen. PLoS One 9:e89004. doi: 10.1371/journal.pone.008 9004

Conflict of Interest: The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

Publisher's Note: All claims expressed in this article are solely those of the authors and do not necessarily represent those of their affiliated organizations, or those of the publisher, the editors and the reviewers. Any product that may be evaluated in this article, or claim that may be made by its manufacturer, is not guaranteed or endorsed by the publisher.

Copyright © 2022 Kim, Yang, Kim and Kim. This is an open-access article distributed under the terms of the Creative Commons Attribution License (CC BY). The use, distribution or reproduction in other forums is permitted, provided the original author(s) and the copyright owner(s) are credited and that the original publication in this journal is cited, in accordance with accepted academic practice. No use, distribution or reproduction is permitted which does not comply with these terms.