Comprehensive Approaches to Molecular Biomarker Discovery for Detection and Identification of *Cronobacter* spp. (*Enterobacter sakazakii*) and *Salmonella* spp.

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Cronobacter **spp. (formerly** *Enterobacter sakazakii***) and** *Salmonella* **spp. are increasingly implicated internationally as important microbiological contaminants in low-moisture food products, including powdered infant formula. Estimates indicate that 40 to 80% of infants infected with** *Cronobacter sakazakii* **and/or** *Salmonella* **in the United States may not survive the illness. A systematic approach, combining literature-based data mining, comparative genome analysis, and the direct sequencing of PCR products of specific biomarker genes, was used to construct an initial collection of genes to be targeted. These targeted genes, particularly genes encoding virulence factors and genes responsible for unique phenotypes, have the potential to function as biomarker genes for the identification and differentiation of** *Cronobacter* **spp. and** *Salmonella* **from other food-borne pathogens in low-moisture food products. In this paper, a total of 58 unique** *Salmonella* **gene clusters and 126 unique potential** *Cronobacter* **biomarkers and putative virulence factors were identified. A chitinase gene, a well-studied virulence factor in fungi, plants, and bacteria, was used to confirm this approach. We found that the chitinase gene has very low sequence variability and/or polymorphism among** *Cronobacter***,** *Citrobacter***, and** *Salmonella***, while differing significantly in other food-borne pathogens, either by sequence blasting or experimental testing, including PCR amplification and direct sequencing. This computational analysis for** *Cronobacter* **and** *Salmonella* **biomarker identification and the preliminary laboratory studies are only a starting point; thus, PCR and array-based biomarker verification studies of these and other food-borne pathogens are currently being conducted.**

Cronobacter spp. and *Salmonella* spp. are recognized as food-borne pathogens that cause serious human illness, and in infants, these pathogens are considered to be of great health concern (3, 6). In addition to *Salmonella*, *Cronobacter* spp. have been isolated not only from low-moisture food products such as powdered infant milk but also from fresh lettuce, frozen shellfish, ready-to-eat meat, and fermented and cooked food products (5, 17). In 2008, *Enterobacter sakazakii* was reclassified into the new genus *Cronobacter* (23, 24). Within the genus *Cronobacter*, there are five species: *C. sakazakii*, *C. malonaticus*, *C. turicensis*, *C. muytjensii*, and *C. dublinensis*. Further, three subspecies currently exist within the species *C. dublinensis*, including *dublinensis*, *lausannensis*, and *lactaridi*. A wide variety of other bacteria and pathogens, including *Pantoea agglomerans*, *Enterobacter cloacae*, *Staphylococcus aureus*, *Hafnia alvei*, *Citrobacter*, *Klebsiella pneumoniae*, *Klebsiella oxytoca*, *Escherichia vulneris* (2, 4), and *Listeria monocytogenes* (42), have also been found in powdered infant formula (PIF) and other low-moisture products (1–4, 7–9, 13, 26), as well as in foods of animal origin (28, 32).

In recent years, the use of molecular methods, such as mul-

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tiplex PCR (27), real-time PCR (21, 35), DNA microarrays (7, 34), automated ribotyping (33), amplified fragment length polymorphisms (AFLP) (18), full-length 16S rRNA gene sequencing (11, 12), and immunoassays (20, 44), for the detection and identification of the aforementioned pathogens has been intensively researched. The majority of these methods are heavily dependent on species-specific biomarker genes. One such gene is $gluA$ (α -1,4-glucosidase), which was identified as a biomarker gene in *Cronobacter* spp. and was not found in any other *Enterobacter* spp. (22, 39). Additionally, DNase (14), arginine dihydrolase (22), 16S-23S rRNA genes, internal transcribed spacer (ITS) regions (34), outer membrane protein A (*ompA*) (37, 45), ornithine decarboxylase (14), *recN*, *thdF*, and *rpoA* have been utilized as species-specific biomarkers via multilocus sequence analysis (30).

During the past 2 decades, over 1,000 microbial genomes, including 1 genome from *Cronobacter* spp. (29) and 31 genomes from *Salmonella* strains, have been sequenced completely, and over 1,500 microbial genome sequences are in the process of being completed (http://www.ncbi.nlm.nih.gov/genomes/lproks .cgi?view-1). Genome sequence data have shown that bacterial DNA is highly dynamic, and the process of bacterial genome evolution demonstrates substantial differences, even within strains of the same genus. The size of the chromosome may also vary among strains from clinical isolates of *Cronobacter* (36), *Salmonella*, and other pathogens. Therefore, finding clinically useful biomarkers that can be used to specifically distin-

TABLE 1. Primers used in this study

Primer name	Expected size	Primer sequence ^{<i>a</i>}	Gene
sak Chi F	2.2 kb	ATGGCTACMAGYAAAYTRATY CAGGG	Chitinase
sak chi R		CACCTGRTAGTTRTGVCCTTTC CAGC	
ompA F ompA R	469 _{bp}	GGATTTAACCGTGAACTTTTCC CGCCAGCGATGTTAGAAGA	ompA

^a M, A or C; Y, C or T; R, A or G; V, A or C or G.

guish *Cronobacter* spp. and *Salmonella* spp. from the other food-borne pathogens in mixed bacterial populations is very challenging. A major obstacle for the development of genetic-based detection methods for specific pathogens is the identification of suitable target sequences. Additionally, many methods for detection and isolation of these pathogens in foods are labor intensive and time-consuming. Therefore, the aim of this study was to systematically collect and verify potential genetic biomarker genes through literature-based data mining, comparative genomic comparisons, and verification of specific selected biomarkers to enable the detection and differentiation of *Cronobacter* and *Salmonella* spp. from other food-borne pathogens in a direct, single-step, rapid PCR-based method for potential application to food samples and clinical specimens.

MATERIALS AND METHODS

Bacterial strains, DNA isolation, and target gene amplification. Seventeen *Cronobacter* strains were obtained from Larry Beuchat (University of Georgia, Center for Food Safety, Griffin, GA) and Dong-Hyun Kang (Washington State University, School of Food Science, Pullman, WA). All of these strains are potentially pathogenic and were isolated from a wide range of food samples and environmental and clinical sources. Strains were grown overnight in Luria-Bertani broth at 37°C, and genomic DNA was isolated using the Qiagen DNeasy kit following the manufacturer's recommendations. The degenerate primer set for chitinase and a nondegenerate primer set for the *ompA* gene, listed in Table 1, were novelly designed so as to amplify unique bands under standard PCR amplification conditions. PCR amplification was performed in a total volume of 50 μ l, containing 5 μ l of 10× reaction buffer, 1 μ l of deoxynucleoside triphosphates (dNTPs), 5 μ l of each of the primers (10 μ M), 1 μ l of template DNA (50 to 100 ng/ μ l), 0.25 μ l of *Taq* DNA polymerase (5 U/ μ l), and 32.75 μ l of PCR water to make up the final volume. The amplification was performed using an iCycler thermocycler (Bio-Rad, Hercules, CA). The PCR conditions used were 95°C for 2 min, followed by 30 cycles of 95°C for 10 s, 55°C for 30 s, 72°C for 2 min, and a final extension for 10 min at 72°C. A portion of these amplified PCR products were verified by agarose gel electrophoresis (Fig. 1).

DNA sequencing and phylogenetic analysis. In order to explore the evolutionary relationship obtained from an analysis of DNA polymorphisms of the chitinase gene among the tested strains of *Cronobacter* spp., *Salmonella* spp., and the other food-borne pathogens, the PCR products of the chitinase gene from various *E. sakazakii* strains were purified using QIAquick PCR purification columns and sequenced using the BigDye Terminator v3.1 cycle sequencing kit and a 3730 DNA analyzer (Applied Biosystems, Foster City, CA). Sequencher, version 4.9 (Gene Codes, Ann Arbor, MI), was used to trim, combine, and assemble the sequence data to form contiguous stretches. Phylogenetic trees were generated by comparing the nucleotide sequences using ClustalW (43), Phylip (http://evolution.genetics.washington.edu/phylip/general.html), and tree viewer software.

Extraction of unique genes and consensus genes of each genome. Representative strains (110 in total) of the 15 pathogens listed in Table 2, which are most commonly reported as the cause of food-borne illnesses from low-moisture foods such as dry milk, fruits, peanut butter, cheeses, and chocolate, were analyzed. The complete gene sequence of each bacterial genome was subjected to the BLAST search engine (using default parameters) and compared against each of

FIG. 1. Agarose gel electrophoresis analysis of PCR products targeting the chitinase (2.2-kb) and *ompA* (469-bp) genes.

the sequences of the remaining 14 genomes. If the sequence length (i.e., the total number of bases) of gene A was *l* and the total number of sequence identities (i.e., the number of identical bases) of gene A with gene B was *n*, then the identity ratio (similarity) between gene A and gene B was defined as *n*/*l*. The

^a See references 1-4, 7, 9, 13, and 26. Data from the second, fifth, and sixth columns were obtained from NCBI's Entrez database (http://www.ncbi.nlm.nih .gov/genomes/lproks.cgi).
 $b_t = 0.05$.

 c *t* = 0.1.

^d For more information, visit http://www.iit.edu/ncfst/resources/pdfs/2010poster _iafp_neupane_yerseniabovinemilk.pdf.

identity ratio measures the percentage of similarity between a target gene sequence and a query gene sequence. If the identity ratio between gene A in the query genome and a gene in 1 of 14 subject genomes was greater than or equal to a user-defined threshold, *t*, then gene A was said to have a hit in the subject genomes. For each query genome, genes that did not have any hits in the other 14 genomes were collected, and these genes were designated unique genes in the query genome. Various *t* values from 0.5 to 0.05, with a step size of 0.05, were tested, and results were manually analyzed. Manual verification of these computationally generated data showed that a *t* value between 0.05 and 0.1 would provide the best reasonable data representation. A threshold *t* value of 0.05 was chosen because it generated a reasonable amount of unique genes. The number of unique genes is shown in Table 2, third column. If gene A in the query genome had hits (various *t* values from 0.1 to 0.5 were tested, and a *t* value of 0.1 was chosen) in each of the remaining 14 genomes, then gene A was called a consensus gene. The number of consensus genes in each genome is shown in Table 2, fourth column. To find the unique genes that existed only in *Cronobacter* spp. and/or *Salmonella* spp. but not in the other 13 bacterial species, we performed BLAST search analyses of these two genomes against the other 13 genomes. The same threshold $(t = 0.05)$ was used for the genome comparisons, and a subset of the genes unique to *Cronobacter* spp. and *Salmonella* spp. is listed in Table 3.

Literature-based data mining and comparative analysis of unique gene clusters, putative virulence factors, and biomarker genes. Every unique gene cluster, putative virulence factor, and biomarker gene that we identified, shown in Tables 4 and 5, were based on scientific publications or protein sequence similarity searches (BLASTp) against the GenBank nonredundant protein database or were found by relying on keyword-based analysis of text-mined data from publically available databases such as NCBI (http://www.ncbi.nlm.nih.gov/gene) and ENA (http://www.ebi.ac.uk/ena/). The stand-alone BLAST program was downloaded from NCBI (http://blast.ncbi.nlm.nih.gov/Blast.cgi?CMD-Web&PAGE _TYPE-BlastDocs&DOC_TYPE-Download).

RESULTS

Analysis of genetic similarities. The complete gene data set of the *C. sakazakii* (CP000783) genome was used to make a gene-by-gene comparison with the representative strains from 13 other bacterial genera. *Salmonella enterica* serovar Enteritidis (CP001127), *Enterobacter cloacae* (CP001918), *Citrobacter koseri* (CP000822), *Enterobacter* sp. strain 638 (CP000653), *Klebsiella pneumoniae* (CP000964), *Shigella boydii* (CP000036), *Escherichia coli* O157:H7 (AE005174), *Pantoea ananatis* (CP001875), *Yersinia pestis* (CP000901), *Listeria monocytogenes* (AL591824), *Bacillus cereus* 03BB102 (CP001407), *Staphylococcus aureus* (CP001844), *Clostridium difficile* (AM180355), and *Campylobacter jejuni* (AL111168) were the representative strains used for comparing food-borne pathogens that may be isolated from PIF and other low-moisture food products. The number of genes, the number of unique genes, the total number of consensus genes, the percent GC content, and the size of the genomes (in no. of bp) of the different bacteria are presented in Table 2. We categorized these pathogens into different groups based on the number of unique genes, the GC content obtained from a genome-wide comparative analysis (Table 2), and the phylogenetic analysis of the *ompA* gene shown in Fig. 2B. The evolutionary implication of phylogenetic analyses of the chitinase and *ompA* genes is shown in Fig. 2. Among these genomes are the following groups: group 1, *C. sakazakii*, *Salmonella*, *Citrobacter*, *E. cloacae*, *Enterobacter*, *Shigella*, and *E. coli* O157:H7; group 2 (no chitinase gene), *Pantoea*, *Klebsiella*, and *Yersinia*; and group 3 (not shown in Fig. 2 due to no significant sequence similarity to *ompA* and chitinase genes in this group), *Listeria*, *B. cereus*, *Staphylococcus*, *C. difficile*, and *Campylobacter*. All pathogens in groups 1 and 2 have 50% or higher GC contents

and similar genome sizes, except for *Y. pestis*, which has a 47% GC content.

Identification of unique gene clusters, putative virulence factors, and biomarker genes of *Cronobacter* **spp.,** *Salmonella* **spp., and the other food-borne pathogens.** The number of unique genes was 268 in *C. sakazakii* and 401 in *Salmonella*. Some of these unique genes in *C. sakazakii* are clustered and are listed as hypothetical genes, with the original annotation provided in GenBank format. Table 3 lists 58 unique clusters of genes, including 8 plasmid-borne genes whose protein products are involved in bacterial pathogenesis and/or have functions or form structures that are important to *Salmonella*. Likewise, Table 3 also lists 15 unique gene clusters (each gene cluster has a minimum of 3 genes) from *Cronobacter* spp. whose protein products are also hypothesized to have important functional or structure roles or are involved in pathogenesis. These gene clusters could be used to design a series of unique primers for PCR assays potentially useful for the detection and identification of *Cronobacter* and *Salmonella* strains. As an example, there are unique multicopy plasmidborne genes or clusters listed in Table 3, including *estP*, a putative esterase or pesticide-degrading enzyme (10) that may exist only in *Salmonella*. Therefore, these genes have potential application in designing a rapid and sensitive diagnostic test to distinguish *Salmonella* spp. from related organisms due to the genes' high copy numbers and unique nature; however, comprehensive studies to determine the universal presence of biomarkers, including those that are plasmid encoded in a broad array of *Salmonella* isolates, would need to be conducted.

Table 4 lists potential biomarkers identified based on scientific publications and protein sequence similarity searches (BLASTp) against the GenBank nonredundant protein database or by relying on keyword-based analysis of text-mined data from publically available databases such as NCBI (http://www.ncbi .nlm.nih.gov/gene) and ENA (http://www.ebi.ac.uk/ena/). In Table 5, the protein homology using the stand-alone BLAST program downloaded from NCBI (http://blast.ncbi.nlm.nih .gov/Blast.cgi?CMD-Web&PAGE_TYPE-BlastDocs&DOC _TYPE-Download) is shown for putative virulence factors and unique biomarker gene discovery. Any protein having an identity of 80% or greater and greater than or equal to 70% query coverage by using the BLASTp program of the BLAST package was considered to have similarity.

Cronobacter **yellow pigment gene cluster.** *E. sakazakii* (now *C. sakazakii*) was designated a distinct species in 1980 by Farmer et al. (14) and was named in honor of the Japanese bacterial taxonomist/microbiologist Riichi Sakazaki (1920 to 2002), who discovered a distinct yellow-pigmented variant of *E. cloacae*; however, today non-pigment-producing strains are known to exist within the genus *Cronobacter*. In the present study, genes responsible for the production of the yellow pigment were used as one of the three targets for the identification of *C. sakazakii*. The *crt* operon in *C. sakazakii*, which contributes to the formation of the yellow pigment (25), was not found in other bacteria shown in Table 4, except for *P. ananatis*, a plant pathogen, which also produces a yellow pigment. The carotenoid pigment biosynthesis enzymes are encoded by multiple genes within the *crt* operon. There are 7 genes in this operon, including beta-carotene hydroxylase (*crtZ*), phytoene synthase (*crtB*), phytoene dehydrogenase

TABLE 3. Select unique genes/regions of *Cronobacter* and *Salmonella* spp. based on comparative computational analysis

Species	GenBank accession no.	Positions	Gene function (unique gene locus tags)
Salmonella spp.	CP001125.1 ^a	20447–23029	EstP, putative pesticide-degrading enzyme; esterase
	CP001125.1 ^a	85623-83905	Histidine kinase
	CP001125.1 ^a	88002-87088	Response regulator receiver protein
	CP001125.1 ^a	92586-93302	TriD protein
	CP001125.1 ^a	93314–93598	Putative entry exclusion protein
	CP001125.1 ^a CP001125.1 ^a	93616-94623 82199-82840	TriE protein Chloramphenicol acetyltransferase 2
	NC 014476^a	42152-48198	spvDCBAR gene cluster, virulence gene
	CP001127.1	17869-19968	Exochitinase
	CP001127.1	25762-28428	Outer membrane usher protein FimD
	CP001127.1	35340-37058	Arylsulfotransferase (asst) superfamily protein
	CP001127.1	213571–212303	Putative fimbrial-like adhesin protein
	CP001127.1	249550-246581	Viral enhancin protein
	CP001127.1	250369-251670	Shikimate transporter
	CP001127.1	343747-344484	Gram-negative pili assembly chaperone
	CP001127.1	344508–347018	Outer membrane fimbrial usher protein
	CP001127.1	347040-347510	Putative fimbrial structural subunit
	CP001127.1	392509-391751	Fimbrial chaperone protein
	CP001127.1	397279-396350	Fimbrial chaperone protein
	CP001127.1	406659-405202	Outer membrane protein OprM
	CP001127.1 CP001127.1	566030-565194	Probable secreted protein Lytic enzyme
	CP001127.1	664550-665164 699362-697905	O-antigen conversion protein
	CP001127.1	785621–786787	Hydrolase, UxaA family
	CP001127.1	853136-853906	O-antigen export system, permease protein
	CP001127.1	986043-985153	Transcriptional regulator, LysR family
	CP001127.1	1179341-1180033	Oligogalacturonate-specific porin
	CP001127.1	1242120-1241122	Putative fimbrial protein
	CP001127.1	1292378-1293106	Pertussis toxin, subunit 1 subfamily
	CP001127.1	1295248-1294439	Cytolethal distending toxin B
	CP001127.1	1433385-1434401	Tetrathionate reductase gene cluster
	CP001127.1	1435347-1437095	Sensor kinase
	CP001127.1	1444369-1445862	Type III secretion outer membrane pore, YscC/HrcC family
	CP001127.1	1445855-1447054	Type III secretion apparatus protein, YscD/HrpQ family
	CP001127.1	1679794-1678562	L-Lactate oxidase
	CP001127.1 CP001127.1	1692014-1693240 2187749-2186574	Secreted effector protein Wzy
	CP001127.1	2191447–2190167	Putative O-antigen transporter
	CP001127.1	2264284-2263262	Putative fimbrial protein
	CP001127.1	2828458–2829702	Enterochelin esterase
	CP001127.1	2933896-2931884	Cell invasion protein SipA
	CP001127.1	2934982-2933960	Type III effector protein IpaD/SipD/SspD
	CP001127.1	2938091-2936310	Cell invasion protein SipB
	CP001127.1	2943452-2942442	Antigen presentation protein SpaN
	CP001127.1	2945168-2943873	Flagellum-specific ATP synthase
	CP001127.1	2945572-2945165	Surface presentation of antigens protein Spak
	CP001127.1	2948796-2947678	Invasion protein InvE
	CP001127.1 CP001127.1	2951227-2950478 2999371–2998574	Invasion protein Beta-lactamase domain protein
	CP001127.1	3095222-3092733	Fimbrial usher protein
	CP001127.1	3207119-3206064	Putative methyl-accepting chemotaxis protein
	CP001127.1	3783645-3784859	O-antigen ligase
	CP001127.1	4335277-4336125	ClpP protease
	CP001127.1	4341875-4343800	Tail protein
	CP001127.1	4455678-4458116	CshB porin
	CP001127.1	4459680-4460462	CshE pilin
	CP001127.1	4700538-4699453	Putative major fimbrial subunit
	CP001127.1	4703584-4701155	Outer membrane usher protein SfmD
Cronobacter spp.	CP000783.1 CP000783.1	268708-272424 273598-287078	Hypothetical protein (ESA 00298-ESA 00300) Hypothetical protein (ESA 00304-ESA 00310, except alginate O-acetyltransferase AlgI [ESA_00303], putative lipoprotein [ESA_00305], and the alpha-2- macroglobulin family region [ESA_00308])
	CP000783.1	578742-591835	Hypothetical protein (ESA_00611, ESA_00612, ESA_00615, ESA_00616, and ESA 00618)
	CP000783.1	957212-969835	Hypothetical protein (ESA 00981-ESA 00990, except putative invasin [ESA_00987] and phage integrase [ESA_00990])

Continued on following page

^a GenBank accession number for a plasmid-borne gene.

(*crtI*), phytoene desaturase (*crtL*), zeaxanthin glucosyl transferase (*crtX*), isopentenyl pyrophosphate isomerase (*idi*), and geranylgeranyl diphosphate synthase (*crtE*). Although these *crt* operon genes theoretically can be used as targets for bacterial detection, recent studies have shown that approximately 5 to 7% of strains are nonpigmented variants (22; http://www.foodmicrobe .com/food%20poisoning%20microorganisms.htm). Recently, yellow pigment gene clusters from three *Cronobacter* strains, *C. sakazakii* ATCC BAA-894 (GenBank accession no. CP000783.1), *C. sakazakii* BAC 9E10 (GenBank accession no. AM384990.1), and *C. turicensis* z3032 (GenBank accession no. FN543093.1), have been sequenced. Based on the sequence alignment (data not shown), their DNA sequences are very similar, with only a few nucleotide polymorphisms scattered over the entire 7.6-kb region sequenced; however, there are two significant sequence variabilities in the *crtZ* gene region. Although the genomic method for the identification of all *Cronobacter* spp. based on yellow pigment genes as the sole biomarker for clinical diagnosis and early detection could be hampered by these restrictions, since there is limited sequence information to determine if these nonpigmented strains are due to a mutated gene(s), the implication of a consensus sequence in this operon in the genus *Cronobacter* demonstrates that there is an excellent opportunity to design universal biomarker gene targets for the identification and detection of *Cronobacter* spp. if also combined with the other suitable biomarkers for identifying nonpigmented *Cronobacter* strains.

Cronobacter **O-antigen gene cluster.** Another potential strainor serogroup-specific gene cluster, the O-antigen gene cluster, was investigated to determine its suitability as a biomarker (15, 16, 38, 41). The O-antigen gene cluster contains genes with distinctly different functions, including genes involved in the processing and assembly of the O antigen. The genes that encode the O antigen flippase (*wzx*) and the O antigen polymerase (*wzy*) are extensively used as biomarker genes for *Salmonella* and *E. coli* serotyping (15, 16) and may be suitable biomarkers for *Cronobacter* spp. as well (Table 4). Both the *wzx* and *wzy* genes show limited homology to the same genes in other food-borne pathogens, as confirmed by computational comparative analysis among genomes, making them ideal identification targets for our purposes. It is not clear, however, how much genetic variability of the *wzx* and *wzy* genes exists within *Cronobacter* spp., *Salmonella* spp., and the other food-borne pathogens due to the limited availability of genomic sequences in the public databases. As shown in Table 4, the *wzx* gene may not be a suitable biomarker due to significant genetic similarity among *Cronobacter* spp., *Salmonella* spp., and *E. coli*; however, the *wzy* gene may be suitable.

*Cronobacter***- and** *Salmonella***-specific virulence factors.** In order to more fully evaluate strain-specific biomarker genes for the differentiation of *Cronobacter* and *Salmonella* spp. from the other food-borne pathogens, a systematic approach, combining literature-based data mining (Table 4) and comparative genome analysis (Table 5), was conducted. In Tables 4 and 5, we present an analysis of components of bacterial pathogenesis, including genes that play a role in infection, colonization, and adhesion. In this study, a total of 44 biomarker genes listed in Table 4 were collected by literature-based data mining, and the 14 genomes listed in Table 2 were compared by using the sequences of individual *C. sakazakii* genes as reference sequences. In Table 4, two important virulence biomarker genes in *Cronobacter* spp., which are absent in all other pathogens, were analyzed. One gene that was analyzed is a putative hemolysin/hemagglutinin (ESA_02516; GenBank accession no. YP_001438597.1), while another is a putative adhesin (ESA_02084; GenBank accession no. YP_001438170.1). Another putative virulence factor, chitinase, which is of significant clinical importance, was also found to be a suitable biomarker gene for *Cronobacter* spp. Virulence genes listed in Table 4, such as a gene encoding the hydrolytic enzyme extracellular metalloprotease, *prt1*, a secretion and transport gene, *tatB*, and *virK*, were also analyzed and compared to other pathogens, as well. For the purpose of serotyping, it is necessary to generate a group of species- and serotype-specific biomarker genes. In this study, we found a series of consensus genes (speciesspecific biomarkers), including 16S rRNA, *gyrB*, *rpoB*, *recN*,

TABLE 5. Putative virulence factors and unique biomarker genes for distinguishing *Cronobacter*, *Salmonella*, and *E. coli* from other food-borne pathogens based on literature-based data mining combined with comparative genome analysis

^a Twelve other genomes used in this study.

FIG. 2. Phylogenetic analysis of the chitinase (A) and *ompA* (B) genes shows 2 distinct groups. Protein accession numbers correspond to GenBank.

thdF, *rpoA*, *ileS*, elongation factor G (*EF-G*), and *lepA*, through literature data mining and computational analysis suitable for our purposes. In Table 4, we listed only 3 (*Clostridium*, *Campylobacter*, and *Listeria*) out of 5 bacterial species in group 3 food-borne pathogens, due to their importance and the frequencies of their appearance in low-moisture food products.

Verification of analysis of chitinase and *ompA* **genes as potential biomarkers.** As stated above, to verify these virulence factors and unique genes as potential biomarkers (Tables 3 to 5), we amplified and sequenced the PCR products generated from the targeted genes. For this process, we chose two target genes with good potential as biomarkers. One is the chitinase

^a Originally provided by Michael Musgrove, USDA, ARS.

 \degree Now *C. muytjensii*.

gene, which was identified by the comprehensive sequence comparisons, and the other is the *ompA* gene, identified by literature-based data mining. Chitinase is a putative virulence factor, and there are various chitinase enzymes present in many organisms, including bacteria. The sequence divergence of the chitinase gene has been used to identify and characterize stage-specific and/or organism-specific genes in several species (9, 31, 40). OmpA is the outer membrane protein A, previously shown to play a role in the invasion of various mammalian host cells. The length of the chitinase gene is ca. 2.2 kb. The primers (Table 1) used for the amplification of the chitinase gene are based on the consensus sequences identified in *Salmonella* and *C. sakazakii* through sequence alignments (data not shown). We found that the chitinase gene was present in all 17 tested *Cronobacter* strains, which originated from three different sources (i.e., environmental, food, and clinical origins). This primer set also amplified the chitinase gene from *Salmonella enterica* (data not shown). The primers targeting the *ompA* gene yielded a 469-bp fragment. However, the *ompA* gene was found only in 11 out of 17 *Cronobacter* strains tested (Table 6) and in 10 out of 15 genomes listed in Table 2. Some of these PCR results are shown in Fig. 1. Partial sequences of the chitinase gene in *Cronobacter* spp. from various strains and the *ompA* gene sequences of *Cronobacter* spp. were analyzed via construction of phylogenetic trees. *C. sakazakii* was demonstrated to be close to *Salmonella*, *Citrobacter*, and *Cronobacter*

turicensis with regard to sequence similarity of the chitinase gene (Fig. 2A). The phylogenetic analysis of the *ompA* gene (Fig. 2B) was consistent with the genome-level comparison shown in Table 2. Among the food-borne pathogens tested and shown in Table 2, only *Salmonella*, *Citrobacter*, and *Cronobacter* spp. have similar chitinase or chitinase-like genes, as determined by computational blasting and experimental detection of PCR products; however, the chitinase gene is also present in other bacterial pathogens (Fig. 2A), such as *Vibrio coralliilyticus*, *Yersinia bercovieri* ATCC 43970, and others.

DISCUSSION

The discovery of reliable candidate biomarkers for accurate, rapid, and sensitive detection of *Cronobacter* and *Salmonella* spp. in complex food matrices and clinical samples remains difficult. This is likely due to several reasons. First, sequence availability detailing genetic differences among food-borne pathogens is very limited. As an example, information as to DNA sequence divergence between *Salmonella* and *E. coli* with respect to their O-antigen gene clusters, a common genus- and strain-specific biomarker for differentiation, is incomplete (Table 4). Second, the lack of a comprehensive understanding of phenotypic differences among food-borne pathogens and the absence of particular traditional phenotypic markers may lead to a false-positive diagnosis, as may occur with the absence of the yellow pigment in some strains of *Cronobacter* spp. (Table 4). Third, the ability to define a set of biomarkers with a role in bacterial pathogenesis or bacterial metabolism that also function as genus-specific markers will provide a more complete and novel picture of the biological activity of food-borne pathogens of interest rather than relying on a single biomarker for identification.

In order to identify potential biomarkers for distinguishing *Cronobacter*, *Salmonella*, and the other food-borne pathogens and for developing sensitive and accurate DNA-based detection and identification methods, we investigated a number of candidate biomarker genes. These included genes involved in yellow pigment formation in *C. sakazakii* (metabolites), the O-antigen cluster genes *wzx* and *wzy*, unique genes, and virulence factors common to major food-borne pathogens. The data shown in Tables 3, 4, and 5 in this report are consistent with those shown in a prior report by Healy et al. (19), which demonstrate that many biomarkers were genes related to cell wall/membrane biogenesis/degradation, secretion, and extracellular structures such as fimbriae and flagella. This approach for identifying these putative biomarkers was validated by amplifying and sequencing a particular chitinase gene that showed greater sequence similarity between *Cronobacter* and *Salmonella* but was absent in other major food-borne pathogens most frequently found in PIF. As presented in Results, the data obtained in this study demonstrate that chitinase could be a suitable candidate biomarker. In this research, we tested only 17 individual *Cronobacter* strains and 4 *Salmonella* strains; therefore, researchers should be cautious when selecting chitinase as the sole biomarker for detection and diagnostic purposes until more comprehensive screening for this gene in *Cronobacter* and *Salmonella* spp. is performed. The potential biomarkers listed in Tables 3, 4, and 5 will provide a complete and solid foundation for scientists to draw reliable conclusions

based on multiple biomarker genes rather than relying on an individual gene, particular data set, or single experiment.

In this study, we also performed a computational analysis of unique and consensus genes of 15 major food-borne and human pathogens. In total, we identified 292 and 425 unique genes for *Cronobacter* and *Salmonella* spp., respectively, that are distinguished from similar genes in other pathogens by a threshold, *t*, equal to 0.05. Because of the similarity of the genome sequences, the numbers of both the unique and consensus genes suggest that *Cronobacter*, *Salmonella*, *Shigella*, and *Enterobacter* are genetically more closely related to each other than to other food-borne pathogens, which is not a surprising finding. Further, for detection and diagnostic purposes, this approach could be applied to the use of microarray or target-enrichment strategies for next-generation sequencing technologies when the choice of putative biomarkers can be categorized by functional activities and/or if the number of selected biomarker genes is not a limiting factor. Most importantly, by focusing on a limited number of candidate biomarkers presented in this paper rather than on the whole genome or single biomarkers, appropriate "first tier" and "second tier" of biomarkers are provided for researchers to analyze samples in a complex food matrix or for clinical diagnostic applications. The quantification and characterization of a set of unique biomarkers for various food-borne and human pathogens can be reasonably obtained by either real-time PCR (RT-PCR) or microarray assays, allowing for the detection and identification of important food-borne pathogens based on their genetic differences using currently available technology.

The approaches described above represents our first attempt to describe a systematic approach to identify biomarkers for various food-borne pathogens. Currently, no conventional laboratory method can definitively detect and identify all six of the newly defined species of *Cronobacter* spp. Recent advances in the areas of genomics and high-throughput studies, as well as the development of new technologies, are improving our understanding of the molecular mechanisms of *Cronobacter* and *Salmonella* pathogenesis and are helping to develop effective biomarker identification computational pipelines, an important step toward identifying highly pathogenic *Cronobacter* spp. and differentiating the other major food-borne pathogens in a timely manner. However, our computational analysis for *Cronobacter* and *Salmonella* biomarker identification and the studies described in this report are only a preliminary step toward accomplishing this goal. The fundamental laboratory research, applying PCR and array-based high throughput verification of all major food-borne pathogen biomarkers, is an ongoing project in our laboratory.

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REFERENCES

- 1. **Anonymous.** 2002. Isolation and enumeration of *Enterobacter sakazakii* from dehydrated powdered infant formula. U.S. Food and Drug Administration, Rockville, MD. http://www.cfsan.fda.gov/comm/mmesakaz.html.
- 2. **Anonymous.** 2004. *Enterobacter sakazakii* and other microorganisms in powdered infant formula: meeting report, MRA series 6. FAO/WHO, Geneva, Switzerland.
- 3. **Anonymous.** 2006. *Enterobacter sakazakii* and *Salmonella* in powdered infant formula. Second Risk Assessment Workshop, 16 to 20 January 2006. FAO/ WHO, Rome, Italy.
- 4. **Anonymous.** 2006. Milk and milk products—detection of *Enterobacter sakazakii.* Technical specification ISO/TS 22964. ISO/TS 22964:2006(E) and IDF/RM 210:2006(E), 1st ed. International Organization for Standardization, Geneva, Switzerland.
- 5. **Beuchat, L. R., et al.** 2009. *Cronobacter sakazakii* in foods and factors affecting its survival, growth, and inactivation. Int. J. Food Microbiol. **136:**204–213.
- 6. **Bowen, A. B., and C. R. Braden.** 2006. Invasive *Enterobacter sakazakii* disease in infants. Emerg. Infect. Dis. **12:**1185–1189.
- 7. **Call, D. R.** 2005. Challenges and opportunities for pathogen detection using DNA microarrays. Crit. Rev. Microbiol. **31:**91–99.
- 8. **Caubilla-Barron, J., and S. Forsythe.** 2007. Dry stress and survival time of *Enterobacter sakazakii* and other *Enterobacteriaceae* in dehydrated infant formula. J. Food Prot. **13:**467–472.
- 9. **Chaudhuri, S., et al.** 2010. Contribution of chitinases to *Listeria monocytogenes* pathogenesis. Appl. Environ. Microbiol. **76:**7302–7305.
- 10. **Choi, Y. J., C. B. Miguez, and B. H. Lee.** 2004. Characterization and heterologous gene expression of a novel esterase from *Lactobacillus casei* CL96. Appl. Environ. Microbiol. **70:**3213–3221.
- 11. **Clarridge, J. E., III.** 2004. Impact of 16S rRNA gene sequence analysis for identification of bacteria on clinical microbiology and infectious diseases. Clin. Microbiol. Rev. **17:**840–862.
- 12. **Drancourt, M., et al.** 2000. 16S ribosomal DNA sequence analysis of a large collection of environmental and clinical unidentifiable bacterial isolates. J. Clin. Microbiol. **38:**3623–3630.
- 13. **Drudy, D., et al.** 2006. Characterization of a collection of *Enterobacter sakazakii* isolates from environmental and food sources. Int. J. Food Microbiol. **110:**127–134.
- 14. **Farmer, J. J., III., M. A. Asbury, F. W. Hickman, and D. J. Brenner.** 1980. The *Enterobacteriaceae* Study Group (U. S. A.)—*Enterobacter sakazakii*: a new species of "*Enterobacteriaceae*" isolated from clinical specimens. Int. J. Syst. Bacteriol. **30:**569–584.
- 15. **Fitzgerald, C., R. Sherwood, L. L. Gheesling, F. W. Brenner, and P. I. Fields.** 2003. Molecular analysis of the rfb O antigen gene cluster of *Salmonella enterica* serogroup O:6,14 and development of a serogroup-specific PCR assay. Appl. Environ. Microbiol. **69:**6099–6105.
- 16. **Fratamico, P. M., et al.** 2010. *Escherichia coli* serogroup O2 and O28ac O-antigen gene cluster sequences and detection of pathogenic *E. coli* O2 and O28ac by PCR. Can. J. Microbiol. **56:**308–316.
- 17. **Friedemann, M.** 2007. *Enterobacter sakazakii* in food and beverages (other than infant formula and milk powder). Int. J. Food Microbiol. **116:**1–10.
- 18. **Guerra, M. M., F. Bernardo, and J. McLauchlin.** 2002. Amplified fragment length polymorphism (AFLP) analysis of *Listeria monocytogenes*. Syst. Appl. Microbiol. **25:**456–461.
- 19. **Healy, B., et al.** 2009. Microarray-based comparative genomic indexing of the *Cronobacter* genus (*Enterobacter sakazakii*). Int. J. Food Microbiol. **136:**159– 164.
- 20. **Ho, J. A., and H. W. Hsu.** 2003. Procedures for preparing *Escherichia coli* O157:H7 immunoliposome and its application in liposome immunoassay. Anal. Chem. **75:**4330–4334.
- 21. **Iijima, Y., N. T. Asako, M. Aihara, and K. Hayashi.** 2004. Improvement in the detection rate of diarrhoeagenic bacteria in human stool specimens by a rapid real-time PCR assay. J. Med. Microbiol. **53:**617–622.
- 22. **Iversen, C., et al.** 2007. Identification of "*Cronobacter*" spp. (*Enterobacter sakazakii*). J. Clin. Microbiol. **45:**3814–3816.
- 23. **Iversen, C., et al.** 2007. The taxonomy of *Enterobacter sakazakii*: proposal of a new genus *Cronobacter gen*. nov. and descriptions of *Cronobacter sakazakii* comb. nov., *Cronobacter sakazakii* subsp. *Sakazakii* comb. nov., *Cronobacter sakazakii* subsp. *malonaticus* subsp. nov., *Cronobacter turicensis* sp. nov., *Cronobacter muytjensii* sp. nov., *Cronobacter dublinensis* sp. nov. and *Cronobacter* genomospecies 1. BMC Evol. Biol. **7:**64.
- 24. **Iversen, C., et al.** 2008. *Cronobacter* gen. nov., a new genus to accommodate the biogroups of *Enterobacter sakazakii*, and proposal of *Cronobacter sakazakii gen. nov.*, *comb. nov.*, *Cronobacter malonaticus* sp. nov., *Cronobacter turicensis* sp. nov., *Cronobacter muytjensii* sp. nov., *Cronobacter dublinensis* sp. nov., *Cronobacter* genomospecies 1, and of three subspecies, *Cronobacter dublinensis* subsp. *dublinensis* subsp. nov., *Cronobacter dublinensis* subsp. *lausannensis* subsp. nov. and *Cronobacter dublinensis* subsp. *lactaridi* subsp. nov. Int. J. Syst. Evol. Microbiol. **58:**1442–1447.
- 25. **Johler, S., R. Stephan, I. Hartmann, K. A. Kuehner, and A. Lehner.** 2010. Genes involved in yellow pigmentation of *Cronobacter sakazakii* ES5 and

influence of pigmentation on persistence and growth under environmental stress. Appl. Environ. Microbiol. **76:**1053–1061.

- 26. **Kandhai, M. C., M. W. Reij, L. G. M. Gorris, O. Guillaume-Gentil, and M. van Schothorst.** 2004. Occurrence of *Enterobacter sakazakii* in food production environments and households. Lancet **363:**39–40.
- 27. **Kim, J. S., et al.** 2007. A novel multiplex PCR assay for rapid and simultaneous detection of five pathogenic bacteria: *Escherichia coli* O157:H7, *Salmonella*, *Staphylococcus aureus*, *Listeria monocytogenes*, and *Vibrio parahaemolyticus*. J. Food Prot. **70:**1656–1662.
- 28. **Kimura, B., et al.** 1999. Evaluation of TaqMan PCR assay for detecting *Salmonella* in raw meat and shrimp. J. Food Prot. **62:**329–335.
- 29. **Kucerova, E., et al.** 2010. Genome sequence of *Cronobacter sakazakii* BAA-894 and comparative genomic hybridization analysis with other Cronobacter species. PLoS One **5:**e9556.
- 30. **Kuhnert, P., B. M. Korczak, R. Stephan, H. Joosten, and C. Iversen.** 2009. Phylogeny and prediction of genetic similarity of *Cronobacter* and related taxa by multilocus sequence analysis (MLSA). Int. J. Food Microbiol. **136:** 152–158.
- 31. **LeCleir, G. R., A. Buchan, and J. T. Hollibaugh.** 2004. Chitinase gene sequences from diverse aquatic habitats reveal complex patterns of diversity. Appl. Environ. Microbiol. **70:**6977–6983.
- 32. **Leclercq, A., C. Wanegue, and P. Baylac.** 2002. Comparison of fecal coliform agar and violet red bile lactose agar for fecal coliform enumeration in foods. Appl. Environ. Microbiol. **68:**1631–1638.
- 33. **Lehner, A., T. Tasara, and R. Stephan.** 2004. 16S rRNA gene based analysis of *Enterobacter sakazakii* strains from different sources and development of a PCR assay for identification. BMC Microbiol. **4:**43.
- 34. **Liu, Y., et al.** 2006. PCR and oligonucleotide array for detection of *Enterobacter sakazakii* in infant formula. Mol. Cell. Probes **20:**11–17.
- 35. **Mackay, I. M.** 2004. Real-time PCR in the microbiology laboratory. Clin. Microbiol. Infect. **10:**190–212.
- 36. **Miled-Bennour, R., et al.** 2010. Genotypic and phenotypic characterisation

of a collection of *Cronobacter* (*Enterobacter sakazakii*) isolates. Int. J. Food Microbiol. **139:**116–125.

- 37. **Mohan Nair, M. K., and K. S. Venkitanarayanan.** 2006. Cloning and sequencing of the ompA gene of *Enterobacter sakazakii* and development of an ompA-targeted PCR for rapid detection of *Enterobacter sakazakii* in infant formula. Appl. Environ. Microbiol. **72:**2539–2546.
- 38. **Mullane, N., et al.** 2008. Molecular analysis of the *Enterobacter sakazakii* O-antigen gene locus. Appl. Environ. Microbiol. **74:**3783–3794.
- 39. **Muytjens, H. L., J. van der Ros-van de Repe, and H. A. M. van Druten.** 1984. Enzymatic profiles of *Enterobacter sakazakii* and related species with special reference to the alpha glucosidase reaction and reproducibility of the test system. J. Clin. Microbiol. **20:**684–686.
- 40. **Rehli, M., S. W. Krause, and R. Andreesen.** 1997. Molecular characterization of the gene for human cartilage gp-39(CHI3L1), a member of the chitinase protein family and marker for late stages of macrophage differentiation. Genomics **43:**221–225.
- 41. **Samuel, G., and P. Reeves.** 2003. Biosynthesis of O-antigens: genes and pathways involved in nucleotide sugar precursor synthesis and O-antigen assembly. Carbohydr. Res. **338:**2503–2519.
- 42. **Steele, M. L., et al.** 1997. Survey of Ontario bulk tank raw milk for foodborne pathogens. J. Food Prot. **60:**1341–1346.
- 43. **Thompson, J. D., D. G. Higgins, and T. J. Gibson.** 1994. CLUSTAL W: improving the sensitivity of progressive multiple sequence alignment through sequence weighting, position-specific gap penalties and weight matrix choice. Nucleic Acids Res. **22:**4673–4680.
- 44. **Yang, H., L. W. Qu, A. N. Wimbrow, X. P. Jiang, and Y. P. Sun.** 2007. Rapid detection of *Listeria monocytogenes* by nanoparticle-based immunomagnetic separation and real-time PCR. Int. J. Food Microbiol. **118:**132–138.
- 45. **Ye, Y.-W., Q.-P. Wu, W.-P. Guo, J.-M. Zhang, and X.-H. Dong.** 2007. Rapid detection for *Enterobacer sakazakii* based on species-specific PCR in powdered milks. Microbiology **34:**1192–1197.