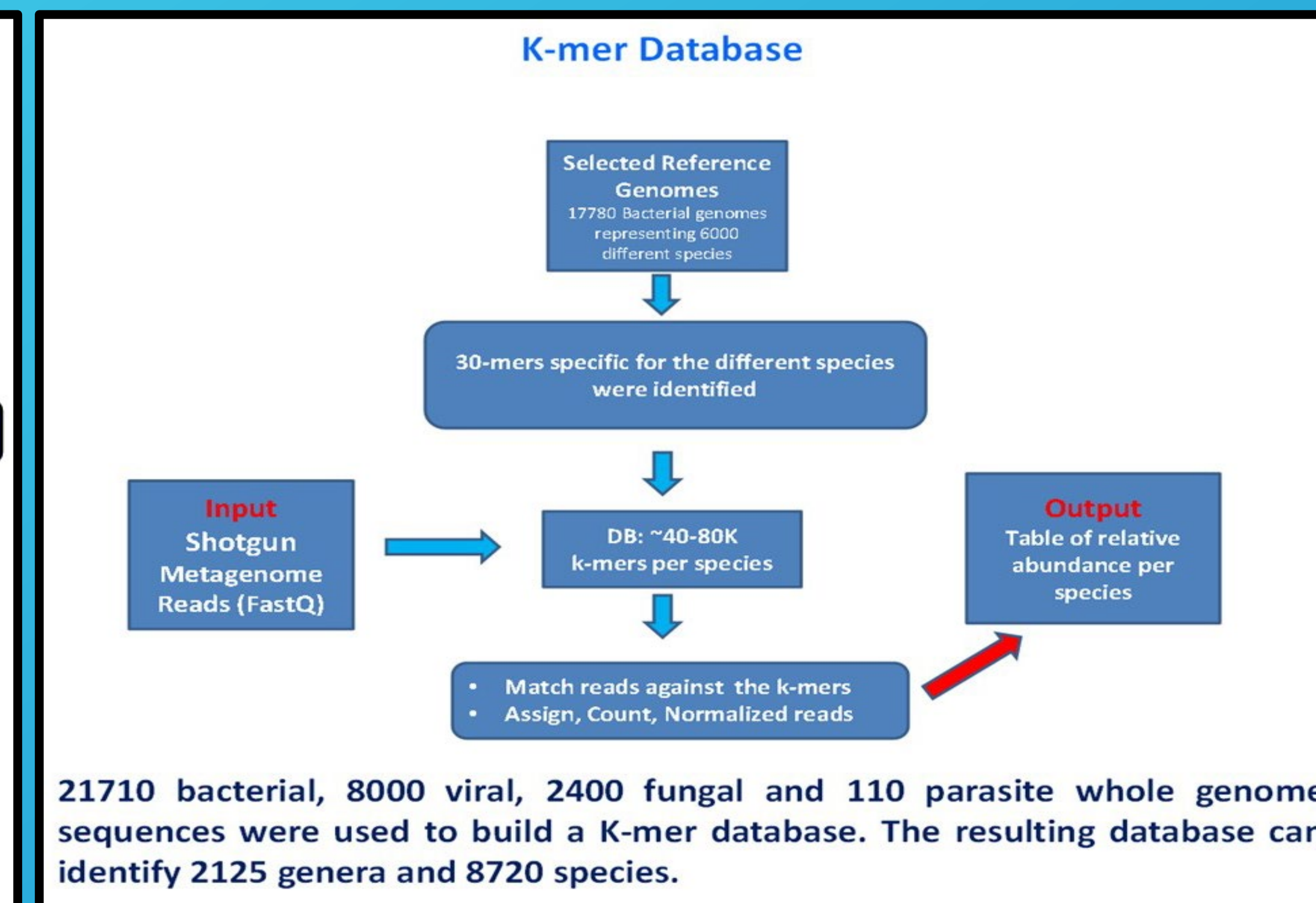
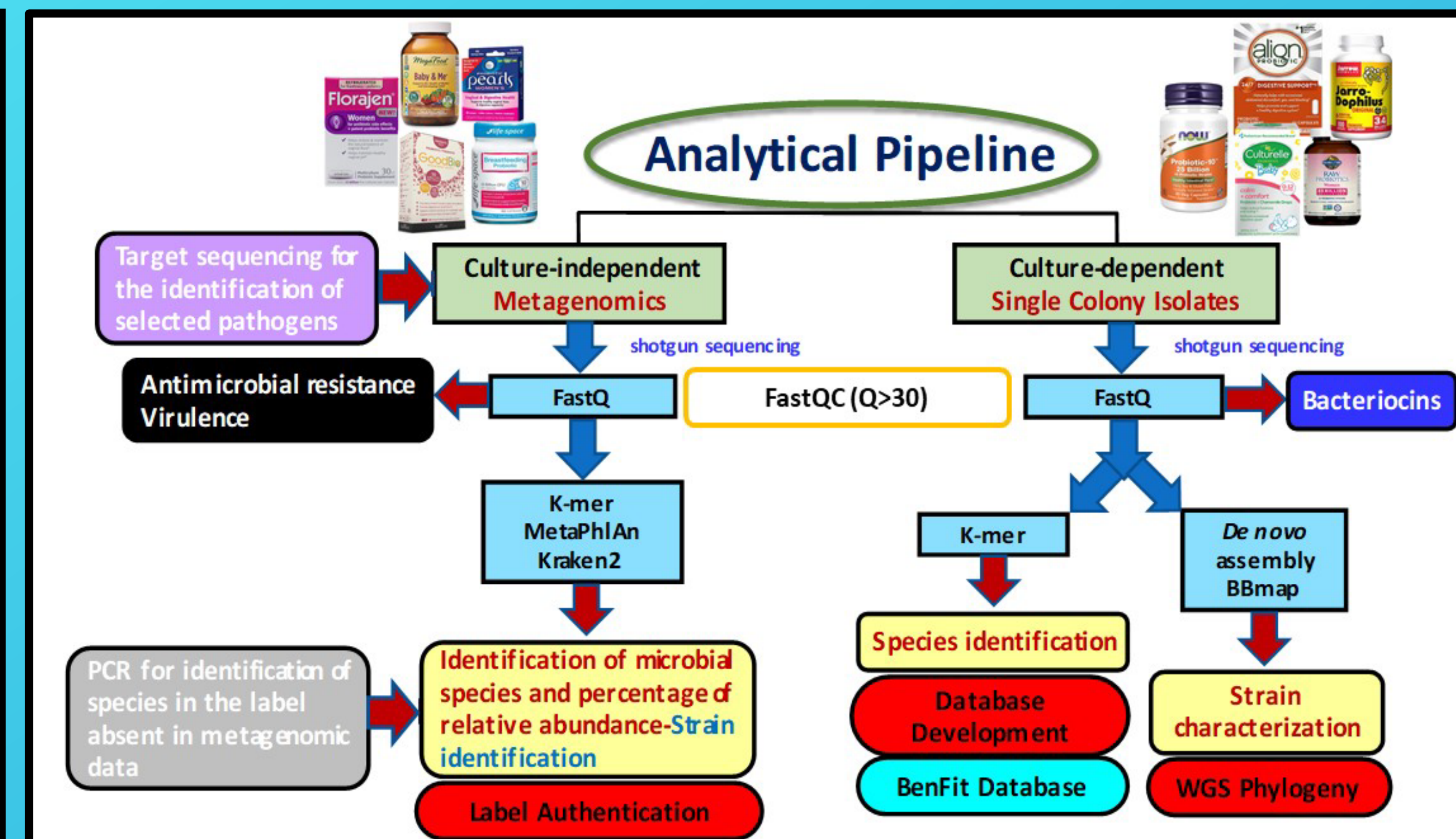


## Introduction

Many dietary products available to the consumer, such as dietary supplements, contain live microorganisms purported to confer a human health benefit. There are reports of label discrepancies of commercial probiotics where species are often misclassified or absent and contamination by microorganisms not listed on the label. The goal of this study is to provide a better understanding of the quality of probiotic products, the accuracy of their label, and the ability to identify potential contaminants and low-level constituents using Whole Genome Sequencing (WGS) metagenomics. In this study, DNA was purified from 123 probiotic products and metagenomic sequencing was performed using the Illumina MiSeq platform. The generated sequences were used to identify microbial constituents with unique species-specific signatures based on a novel in-house K-mer database. In parallel, using a culture-dependent approach, the microbial contents of the products were grown for single colony isolation followed by WGS to create a genome sequence database of beneficial microbes. Additionally, Resistance Gene Identifier and Virulence Finder bioinformatic tools were used to identify the presence of antibiotic resistance and virulence factor genes. A challenge in the metagenomic approach is the detection of microbes present in low numbers (constituents, contaminants, and pathogens) in the presence of high numbers of intentionally added species like *Lactobacillus* and *Bifidobacterium*. To circumvent this problem two approaches were evaluated: the use of specific phages and/or purified bacteriophage lysins to reduce the product's indigenous microorganisms to improve the detection of low-level microbial constituents and using target-amplicon sequencing. These studies will lead to a better understanding of the content of live microbial supplements available to the consumers and provide an analytical pathway to detect harmful pathogens present in low amounts.

## Materials and Methods



### NCBI Bioproject- PRJNA336518

Database

To date

- Total number of Biosamples: 729
- From 33 bacterial species

Figure 1. Microbial contents within dietary supplements and cultured foods were analyzed using a culture-independent, metagenomics-based approach. Shotgun genomic sequence data was used to identify microbial constituents in various products with unique species-specific signatures, based on a novel K-mer database. In parallel, using a culture-dependent approach, the microbial contents of the dietary products were grown for isolation under different temperature and atmospheric conditions (i.e., anaerobic, microaerophilic, capnophilic, and aerobic) to allow for the growth of a broad spectrum of microbial species.

## Shotgun Metagenomics a "One-Stop-Shop Results"

- A convenience sample of 143 live microbial supplements, currently sold in the US market, were evaluated by WGS.
  - WGS failed for 17 products
  - Microbial components identified as proprietary blend in 3 products
- From the 123 products that generated data:
  - Label compliance for 80 products (65%)
  - Label discrepancies found for 43 products (35%):
    - 19 products: Species identified in the metagenomics data not listed on the label (16%)
    - 9 products: Species on the label not identified using shotgun metagenomics (7%)
    - 15 products: Both (12%)

### Label Authentication:

- Relative abundance > 1%
- Relative abundance 0.1-1%
- Relative abundance < 0.1

Species List-Product Label	Number of Reads	% Relative Abundance
Total Number of Reads	3,441,517	
no_id	2,539,633	
<i>Lactobacillus acidophilus</i>	379,995	46.84
<i>Lactobacillus plantarum</i>	221,152	35.03
<i>Bifidobacterium animalis</i>	280,448	16.72
<i>Bifidobacterium longum</i>	18,251	1.13
<i>Bifidobacterium breve</i>	112	0.006
<i>Lactobacillus gasseri</i>	11	0.001
<i>Bifidobacterium bifidum</i>	4	0
<i>Lactobacillus salivarius</i>	0	0

\**B. infantis* is a subspecies of *B. longum*

### Identification of Species at Strain Level

Strain Level Characterization of Species from Metagenomics Reads

More than 99.9987% similar!!!

Species	% of relative abundance
<i>Bifidobacterium animalis</i> subsp. <i>lactis</i>	92.45
<i>Lactobacillus acidophilus</i>	0.55
<i>Lactobacillus casei/paracasei</i>	0.64
<i>Lactobacillus salivarius</i>	0.31

### Potential Use of Specific Phages or Bacteriocins to Increase Sensitivity of Detection of Low-Level Constituents and Contaminants

Pre-Treatment of the Product with Specific Phages or Bacteriocins to Reduce Predominant Species

For select pathogens: *E. coli*, *Salmonella*, *Listeria*, *Cronobacter*, others

### Improved Sensitivity of Detection of *E. coli* After Infection of *L. plantarum* with Phage B-1 for 3 Hours

<i>E. coli</i> CFU	Number of reads	pos
10 <sup>7</sup>	50012	22433
10 <sup>6</sup>	8650	2767
10 <sup>5</sup>	88	11

## Conclusions

- An enhanced database will improve species taxonomy, strain identification, and ultimately product development
- Whole Genome Metagenomic sequencing offers high potential for use in post-market surveillance and labeling verification
- Bacteriophages and bacteriocins could potentially be used to improve detection of labeled low-level constituents and contaminants

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This project was supported in part by the Office of Dietary Supplement Programs, CFSAN, FDA.

### Identification of Antibiotic Resistance Genes (ARG)

Product	AMR Gene	Drug Class	Resistance Mechanism	AMR Gene Family	% Length of Reference Sequence	Chromosome/Plasmid
Product 1	<i>lincC</i>	lincosamide antibiotic	antibiotic target protection	ABC-F ATP-binding cassette ribosomal protection protein	100	chromosome
Product 9	<i>lincD</i>	lincosamide antibiotic	antibiotic efflux	ATP-binding cassette (ABC) antibiotic efflux pump	100	chromosome
Product 9	<i>lincA</i>	lincosamide antibiotic	antibiotic inactivation	lincosamide nucleotidyltransferase (LNU)	100	plasmid

### Identification of Virulence Factors Genes

Product	Virulence Factor Gene	Virulence Factor	Species Identification
Product 4	<i>bslA</i>	hydrophobin BslA (VF0419)	<i>Bacillus subtilis</i>
Product 10	<i>acm</i>	collagen adhesin precursor Acm (VF0419)	<i>Enterococcus faecium</i>
Product 10	<i>sgrA</i>	cell wall anchored protein SgrA (VF0540)	<i>Enterococcus faecium</i>

Figure 4. Antibiotic resistance was identified from metagenomic data and isolates using the Antibiotic Resistance Gene (ARG) Identifier bioinformatic tool. Virulence factors were identified with the Virulence Finder (VF) Database tool. Analysis of whole genome sequences derived from single colony isolates (SCI) with this tools identified the bacterial species harboring the ARG and VF traits.

Figure 3. Size genome for *Bifidobacterium animalis* subsp. *lactis* is 1.94 Mb. Core genome total length of 1,364,751 bp that include 1,263 core genes. In products where different strains of the same species are present that are highly similar, strain-specific biomarkers based on SNP analysis can be used for identification.