



Complementary Food Ingredients Alter Infant Gut Microbiome Composition and Metabolism In Vitro

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Abstract: We examined the prebiotic potential of 32 food ingredients on the developing infant microbiome using an in vitro gastroileal digestion and colonic fermentation model. There were significant changes in the concentrations of short-chain fatty-acid metabolites, confirming the potential of the tested ingredients to stimulate bacterial metabolism. The 16S rRNA gene sequencing for a subset of the ingredients revealed significant increases in the relative abundances of the lactateand acetate-producing Bifidobacteriaceae, Enterococcaceae, and Lactobacillaceae, and lactate- and acetate-utilizing Prevotellaceae, Lachnospiraceae, and Veillonellaceae. Selective changes in specific bacterial groups were observed. Infant whole-milk powder and an oat flour enhanced Bifidobacteriaceae and lactic acid bacteria. A New Zealand-origin spinach powder enhanced Prevotellaceae and Lachnospiraceae, while fruit and vegetable powders increased a mixed consortium of beneficial gut microbiota. All food ingredients demonstrated a consistent decrease in Clostridium perfringens, with this organism being increased in the carbohydrate-free water control. While further studies are required, this study demonstrates that the selected food ingredients can modulate the infant gut microbiome composition and metabolism in vitro. This approach provides an opportunity to design nutrient-rich complementary foods that fulfil infants' growth needs and support the maturation of the infant gut microbiome.

Keywords: infant complementary foods; baby foods; gut microbiome; infant complementary feeding; infant solid foods; short-chain fatty acids; SCFAs

1. Introduction

The trajectory of microbiome development in the first 1000 days of the child's life [1,2] has long-term implications in terms of the individual's immune and metabolic health [3]. A dysbiosis in the early-life gut and the interlinked alterations in the immune signaling have been associated with childhood immune-mediated disorders such as type 1 diabetes, juvenile asthma, and allergies [4,5].

Early feeding patterns, such as breast milk and/or formula and the duration of breastfeeding are some of the key factors in regulating gut bacterial colonization and composition and the associated immunological maturation of the growing infant [1,4]. Bifidobacteriaceae are the most abundant group in the gut of both breast-fed and formula-fed infants [2,6,7]. Seen in lesser abundance are bacterial families such as Bacteroidaceae, Lachnospiraceae, Veillenollaceae, Clostridiaceae, Lactobacillaceae, Enterococcaceae, and Streptococcaceae [2,6,7]. Formula-fed infants show a greater diversity in their gut bacteria with a higher abundance of families from the Firmicutes phylum [7,8]. Lactate producers such as Bifidobacteriaceae, Lactobacillaceae, Enterococcaceae have been shown to protect infants against antibiotic- and enteropathogen-induced diarrhea [9], inflammatory responses [10], and atopic dermatitis [11]. Bifidobacteria possess the



Article

Citation: Parkar, S.G.; Rosendale, D.I.; Stoklosinski, H.M.; Jobsis, C.M.H.; Hedderley, D.I.; Gopal, P. Complementary Food Ingredients Alter Infant Gut Microbiome Composition and Metabolism In Vitro. *Microorganisms* **2021**, *9*, 2089. https://doi.org/10.3390/ microorganisms9102089

Academic Editor: Julio Villena

Received: 15 August 2021 Accepted: 30 September 2021 Published: 3 October 2021

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Copyright: © 2021 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). metabolic capacity to degrade and utilize gut epithelial mucin and the structurally analogous human milk oligosaccharides [12,13]. Consequently, Bifidobacteriaceae have evolved to occupy prime niches in the infant gut [12,13] and may persist into adulthood [14,15]. A founder–colonizer species of the infant gut, *B. bifidum* lays the foundation for the subsequent colonization by diverse microbiota. This is enabled by sharing carbohydrate resources with other bifidobacteria, as well as intermediary metabolites such as lactate and acetate with butyrate- and propionate-producing bacteria such as *Eubacterium hallii* [12,16]. *B. bifidum* strains have also been associated with beneficial effects on gut functionality such as intestinal homeostasis, modulation of gut immunity, and anti-inflammatory protection [17,18]. Similarly, other bifidobacteria and lactic acid bacteria (LAB) have also been found to be autochthonous and remain gut-associated throughout the host's lifespan, conferring beneficial effects on the host [14,19].

The transition from the milk-based infant diet to a mixed diet, where milk is complemented with plant-based foods, meat, and dairy, is recommended to start at around 6 months of age [1]. The period, up until 24 months of age, is a critical window of opportunity for shaping the structure of the developing infant's gut microbiota [1]. Exposure to new foods triggers developmental maturation of the gut, and it presents novel, nondigestible carbohydrates to the microbes in the colon of the growing infant. Nondigestible carbohydrates have a major impact on the proliferation of gut bacteria such as *Bacteroides* and *Faecalibacterium* (the most abundant genera in Bacteroidetes and Firmicutes phyla, respectively, in the adult gut), and the concomitant reduction in enterobacteria, bifidobacteria, and clostridia that predominate in the infant gut [3,5,20]. The cessation from milk as the primary food and the transition to solid foods play an important role in the acquisition and proliferation of new bacteria and lay the foundation for a stable and adult-type microbial population. Foods that influence this early colonization may, thus, permanently shape gut microbiota composition, maturation of the gut and immune system, and even long-term health effects [1,5,21].

A variety of foods are being gradually introduced to growing infants as they adapt to the family's dietary patterns. These early foods generally include cheese, meat, eggs, fruits, vegetables, and cereals, which are customized to local availability and family preferences [1,22,23]. As the food transits the growing child's gastrointestinal tract, the fibers (and other phytochemicals such as polyphenols) that are resistant to host digestion reach the colon partially or fully undigested. The founding bacteria of the child, including bifidobacteria and LAB, adapt to the newly introduced dietary components, including fiber, which is broken down to generate lactate, an organic acid, and acetate, a short-chain fatty acid (SCFA) [4,5,14,24]. These microbial acid metabolites play an important role in the maturation of gut and gut ecology, including the development of syntrophic microbiota, by providing substrates to enhance the growth of secondary consortium that can deconstruct more complex carbohydrates to generate SCFAs such as propionate and butyrate. Lactate and the SCFAs also regulate microbial homeostasis by maintaining an acidic milieu that inhibits colonization by pathogens [25,26]. The SCFAs, mainly acetate, propionate, and butyrate, are also important for host health, with butyrate being particularly important as an energy source for colonocytes and for strengthening of gut barrier function [26,27]. Butyrate is generated mainly by Lachnospiraceae and Ruminococcaceae, either by breaking down polysaccharides or by utilizing the lactate produced by lactic acid bacteria and the acetate, an early metabolite of microbial metabolism of glycans [26]. The gut microbiome, especially when highly diverse and abundant in beneficial members of Bifidobacterium, Bacteroides, Lachnospiraceae, and Ruminococcaceae, can aid in the prevention of gut disorders, as well as autoimmune and allergic disease, during childhood and later in life [4,5,28,29].

Prebiotics are recognized as some of the most promising dietary supplements, with numerous health benefits in both children and adults. One of the most studied prebiotics in pediatric nutrition (infant formulae) is a mixture of short-chain galactooligosaccharide and long-chain fructooligosaccharide in a ratio of 9:1 [30]. Solid foods supplemented with galacto- and fructooligosaccharides were found to enhance gut bifidobacteria when

fed in a 6 week intervention study involving 4–6 month old infants who were about to start consuming solid foods [31]. Inulin is another well-characterized prebiotic that has been shown to beneficially affect the gut microbiome of children [32,33] and is often used as a supplement in many food products formulated for children. Looking beyond galactooligosaccharides and fructans, exposure of the early-life gut microbiome to a wide array of nondigestible carbohydrates with varied physicochemical complexities helps to further enhance the plasticity of the microbiome [1,21]. Before progression to family foods, and to complement breast and/or formula feeding, infants are given suitable homemade or commercial ready-to-serve foods. Infant complementary foods comprise plant-based, dairy, and meat products and aim to meet the nutritional needs of infants [34–37].

Plant-based foods are a rich source of structurally varied carbohydrates, with varying capacities to alter gut microbial composition [1,38–40]. While different fractions of plant-derived carbohydrates are recognized to play an important role in shaping the infant gut microbiome, few studies have examined the microbiome-modulating role of whole foods or ingredients that may be used in the formulation of infant foods. We hypothesized that food ingredients (predigested in an upper gut model) will differentially modulate colonic microbiota from infants in a simulated hind gut model. In this study, we selected a range of commercially available plant-based food ingredients, along with whole-milk powders, and evaluated their ability to modulate infant gut microbiota using a batch fermentation model of the colon. We examined these ingredients for their fermentative capacity by following the changes in the metabolites generated by microbial breakdown of the substrates over 24 h, and we further studied a subset of the selected food ingredients in terms of changes in substrate-driven microbiome structure.

2. Materials and Methods

A schematic workflow of the experimental protocol used in this study is shown in Figure 1.

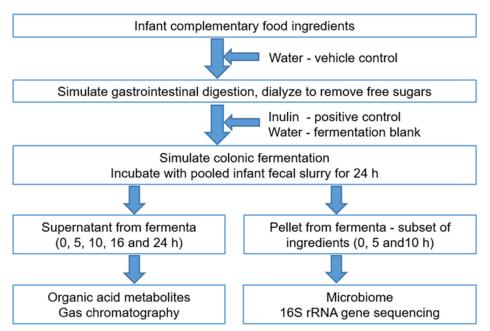


Figure 1. An outline of the experimental protocol and analyses.

2.1. Food Ingredients

Thirty-two different food ingredients were selected from commercial sources and tested for their ability to modulate infant gut microbiota. They were classified as per the United States Department of Agriculture [41] into milk, fruit (blackcurrant, Boysenberry, blueberry, kiwifruit, apple, feijoa, and passionfruit), vegetables (carrot, pea, pumpkin, spinach, sweetcorn, sweet potato, and tomato), flavor agents (honey and kaffir lime leaf),

and different forms of cereal grain (oats) (Table 1). Orafti[®] Synergy1 (ORAFTI Active Food Ingredients, Tienen, Belgium, hereafter referred to as inulin) was included as a positive control. This inulin is a 1:1 mixture of short-chain oligofructans and long-chain fructans that vary in their degrees of polymerization, i.e., <10 and 2–60, respectively. All the ingredients used were procured in dried powder formats.

Table 1. List of ingredients subjected to in vitro gastroileal digestion and colonic fermentation. The fermenta were analyzed for organic acid metabolites at 0, 5, 10, 16, and 24 h of fermentation. The fermenta from a subset of ingredients (marked with an asterisk) were also analyzed for microbiota composition using 16S rRNA gene sequencing at 0, 5, and 10 h of fermentation.

Ingredient	Brief Description	Source
Instant whole milk	Ingredients: whole milk (cow's), skim milk (cow's), lactose, lecithin, vitamins A and D3	Miraka Limited, Taupo, New Zealand
Whole milk	Ingredients: whole milk (cow's), skim milk (cow's), lactose	Miraka Limited, Taupo, New Zealand
Blackcurrant *	Freshly harvested blackcurrants, destrigged, freeze dried, milled	Sujon, Gibb Holdings (Nelson) Ltd., Nelson, New Zealand
Boysenberry *	Freshly harvested Boysenberries, freeze dried, milled	Sujon, Gibb Holdings (Nelson) Ltd., Nelson, New Zealand
Blueberry	Freshly harvested blueberries, freeze dried, milled	Sujon, Gibb Holdings (Nelson) Ltd., Nelson, New Zealand
Gold-fleshed kiwifruit *	Fruit freeze-dried, milled	Fresh As, Auckland, New Zealand
Apple *	'Braeburn' apple, freeze-dried, milled; ascorbic acid added as preservative	Fresh As, Auckland, New Zealand
Feijoa	Fresh feijoa, freeze-dried, milled	Fresh As, Auckland, New Zealand
Passionfruit	Deseeded passionfruit pulp, freeze-dried, milled	Fresh As, Auckland, New Zealand
Carrot *	Fresh carrot, freeze-dried, milled	Fresh As, Auckland, New Zealand
Spinach*	NZ-grown spinach, freeze-dried, milled	Fresh As, Auckland, New Zealand
Kaffir lime leaf	Kaffir lime leaves, freeze-dried, milled	Fresh As, Auckland, New Zealand
Blueberry, premium *	Whole blueberries, freeze-dried, milled	NutraDry, Hendra, Australia
Green-fleshed kiwifruit *	Fruit puree, freeze-dried, milled	NutraDry, Hendra, Australia
Organic apple	Fruit puree, freeze-dried, milled	NutraDry, Hendra, Australia
Carrot juice, high beta-carotene *	100% carrot juice (minus fiber), freeze-dried, milled	NutraDry, Hendra, Australia
Spinach leaf *	Whole spinach leaves, pureed, freeze-dried, milled	NutraDry, Hendra, Australia
Sweet potato *	Whole orange-fleshed sweet potato, pureed, freeze-dried, milled	NutraDry, Hendra, Australia
Sweetcorn	Mature super sweet sweetcorn kernels, pureed, drum-dried, milled	Cedenco Foods New Zealand Ltd., Gisborne, New Zealand
Pea *	Peas pureed, drum-dried, milled	Cedenco Foods New Zealand Ltd., Gisborne, New Zealand
Pumpkin *	Pumpkin peeled, pureed, drum-dried, milled	Cedenco Foods New Zealand Ltd., Gisborne, New Zealand
Tomato *	Tomatoes pureed, concentrated, mixed with starch carrier, drum-dried and milled	Cedenco Foods New Zealand Ltd., Gisborne, New Zealand
Oat flour, F00151 *	Milled oat flour	Harraways, Dunedin, New Zealand
Oat flour, F00005	Finely milled oat flour	Harraways, Dunedin, New Zealand
Oat flour, Export	Low moisture and water activity	Harraways, Dunedin, New Zealand
Rolled oats	Starting material for oat flour	Harraways, Dunedin, New Zealand
Oatmeal	Coarser particles than oat flour	Harraways, Dunedin, New Zealand
Oat bran	Coarse particles, higher source of fiber than oats	Harraways, Dunedin, New Zealand
Oat milk	Dehydrated oat milk	Harraways, Dunedin, New Zealand
PromOat [®] Beta Glucan	Fine oat powder with 35% β-glucan	Tate & Lyle ANZ Pty Ltd., Auckland, New Zealand
Honey	70% honeydew honey, 30% maltodextrin	G & S Foods, Canvastown, New Zealand
Mānuka honey	70% mānuka honey, 30% maltodextrin	G & S Foods, Canvastown, New Zealand

2.2. In Vitro Simulated Gastroileal Digestion

As outlined in Figure 1, food ingredients were digested in vitro using previously published protocols [42]. Each food ingredient (n = 32) was weighed in triplicate (25 g) and hydrated in 46 mL of sterile de-ionized water. Three replicates of sterile deionized water (25 mL) were included as the vehicle control. The hydrated food ingredients and the water control were incubated with acidified 10% pepsin (P7000, >250 units/mL, Sigma-Aldrich, St. Louis, MO, USA) with slow constant stirring (130 rpm) at 37 °C for 30 min. The reaction mixture was buffered to pH 6.0 with 0.1 M maleate buffer and incubated with 0.05 mL of amyloglucosidase (E-AMGDF, Megazyme, Bray, Ireland) and 1.25 mL of 2.5% pancreatin (P7545; 8 × USP specifications, Sigma, St. Louis, MO, USA) at 37 °C for 120 min in a final volume of 27.5 mL. In a simulation of intestinal passive absorption of small molecules such as glucose, the reaction mixture (representing the digesta) was dialyzed using a 1000 Da molecular weight cutoff Spectra/Por® CE membrane (Thermo Fisher Scientific, Auckland, New Zealand) with at least six changes of cold deionized water over 24 h. Additionally, three extra replicates of water were similarly prepared, and inulin (2.5 g) was added to the predigested water in a final volume of 27.5 mL. Inulin is resistant to host digestive enzymes [32] and is, therefore, not expected to change after digestion. Hence, inulin was added after the digestion and dialysis steps to avoid the loss of small-molecular-weight fructooligosaccharides during dialysis.

2.3. Preparation of Fecal Inoculum

Fresh feces were obtained from 14 healthy infants (aged between 5 and 12 months) with informed consent from their primary care givers. Approval #16/NTA/154, dated 7 October 2016, was obtained from the Health and Disability Ethics Committees, Ministry of Health, New Zealand. Relevant details of the infant donors who donated feces as a source of gut microbiota are provided as a supplementary table (Table S1).

The nappy liners containing fresh feces were transferred to gastight bags containing one AnaeropouchTM (Mitsubishi Gas Chemical Company Inc., Tokyo, Japan) and transported in an insulated lunch bag containing an icepack to the laboratory. The feces were processed within 1 h of defecation into a 25% v/v fecal slurry by homogenizing with chilled sterile pre-reduced glycerol in phosphate-buffered saline with 0.05% w/v cysteine, and aliquots were stored at -80 °C. All processing of feces was carried out anaerobically under an atmosphere of CO₂:H₂:N₂ at 5:5:90 in a Coy anaerobic chamber (Coy Laboratory Products Inc., Grass Lake, MI, USA). Two hours before the fermentation, one aliquot of each of 14 fecal slurries was removed from -80 °C, thawed in the anaerobic chamber, and pooled in equal proportions for immediate use as the inoculum.

2.4. Simulated Colonic Fermentation

First, 3 mL of a $10 \times$ sterile pre-reduced carbohydrate-free basal medium, prepared as described previously [42], was added to each digesta (resulting from gastroileal digestion, as described in Section 2.3). The pooled fecal slurry was then added to the reaction mixture at a final concentration of 1% v/v. The final concentration of the food ingredients and inulin was 2.5 g in a final fermentation volume of 30 mL.

In addition to the water control, a fermentation blank, containing sterile deionized water with no digesta but incubated with fecal slurry, was included in triplicate. Thus, one set of 32 food ingredients, inulin, water, and the fermentation blank were fermented with freshly prepared pooled fecal inoculum at 37 °C for up to 24 h on each of three separate days (Figure 1). The fermentation blank was included to examine changes in microbiota-generated acid metabolites, as an indication of fermentative changes with "undigested" water. Two 1 mL aliquots were collected from the fermentation mixture at 0, 5, 10, 16, and 24 h, immediately centrifuged at $13,000 \times g$ for 5 min at 4 °C, and the pellets and supernatants were separated and stored at -80 °C until further processing. The supernatants were used for analysis of organic acids, while the pellets were used for extraction of DNA and subsequent microbiome compositional analysis.

2.5. Analysis of Organic Acid Metabolites

The concentrations of the organic acids, formate, acetate, propionate, isobutyrate, butyrate, isovalerate, valerate, hexanoate, heptanoate, lactate, and succinate, were quantified using gas chromatography as described previously [43], and data were measured as μ mol/mL fermenta.

2.6. Characterization of Microbial DNA

DNA was extracted from 0, 5, and 10 h fermenta of the substrates, i.e., water, inulin, and a subset of the food ingredients, employing the Qiagen DNeasy PowerLyzer PowerSoil Kit (Bio-Strategy Ltd., Auckland, New Zealand), with some modification. Briefly, the bacterial pellets were shaken in the PowerBead tubes at 55 m/s for 60 s using a FastPrep-24TM 5G (MP Biomedicals, Solon, OH, USA) and cooled on ice for 5 min before further processing according to the manufacturer's instructions. The extracted DNA was stored at -80 °C until use, and its quantity and quality were measured using Qiagen QIAxpert (Bio-Strategy Ltd., Auckland, New Zealand).

The V3–V4 region of the 16S rRNA gene was sequenced using an Illumina MiSeq 2×250 base paired-end run [44]. The sequence data were analyzed using Quantitative Insights Into Microbial Ecology 2 (QIIME 2, v 2018.8) [45] using the DADA2 method for denoising and inferring the amplicon sequence variants (ASVs) [46]. The taxonomical identity of the ASVs was assigned using Greengenes database (v.13.8, with 99% sequence similarity) trained on the naïve Bayes classifier [47]. Diversity analysis was performed with unfiltered ASVs, with rarefaction at 21,000 reads using the QIIME2 pipeline. Microbial α diversity examining variety and abundance of species within a sample was measured using Shannon index, richness, evenness, and phylogenetic diversity. Microbial β -diversity to examine similarities/differences in microbial communities between samples was measured in terms of Bray-Curtis index (dissimilarities in microbial abundance), unweighted uniFrac (measures community membership, as it records absence and presence of different ASVs), and weighted uniFrac (measures community structure, by accounting for the relative abundance of each ASV). Microbiota data ordination was done using a principal coordinates analysis (PCoA) plot based on the weighted uniFrac metric within the QIIME2 workflow and visualized as EMPeror plot [45].

2.7. Statistical Analyses

For the organic acid data, analysis of variance was used, with substrate (i.e., food ingredients, inulin or water control, and fermentation blank) and time as factors, and the replicate as a block (random). The data were log-transformed to stabilize the variance. Multiple comparisons between substrate means were performed using Tukey's honestly significant difference (HSD).

The ASV dataset was filtered to include reads which were present at >0.05% relative abundance in at least one sample prior to differential abundance analysis using DESeq2 [48]. Combining DESeq2 with likelihood ratio tests and a nested factorial structure allowed testing for differences between the treatments at each timepoint, and then between the averages for each timepoint. The *p*-values were adjusted for false discovery rate.

The significant changes in terms of microbial α -diversity measures were calculated using the Kruskal–Wallis test. The significances in the β -diversity measures were calculated using the one-way permutational multivariate analysis of variance (PERMANOVA) pseudo-F method [45]. Differences were considered significant at *p* < 0.05.

Spearman's rank correlation test was used to analyze correlations between organic acid concentrations and microbiome composition. Spearman's correlations (r) significant at a false discovery rate-adjusted p < 0.05 are quoted.

3. Results

The organic acid profile was generated after 0, 5, 10, 16, and 24 h of fermentation of the food ingredients, inulin, water control, and the fermentation blank. Formate, acetate,

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propionate, lactate, and succinate were present in all samples (Table S2). They showed significant substrate, time, and substrate \times time interactions, with the biggest effects being changes over time, along with differences between the mean values of the various samples (Table S3). Many of the substrates showed significant changes in the organic acids at 0 h. During the course of the fermentation, formate concentrations were low and steady for most substrates, while the values started high and declined for oat flour (F00151). Early formate peaks were seen for kaffir lime leaf (5 h) and spinach leaf (10 h). Acetate increased over time with all the substrates, with the increases being higher for the two milk powders and spinach. Lactate, like acetate, increased over time with all substrates, with increases being high for three oat flours (F00005, F00151, and Export) and low for spinach, water, and the fermentation blank. Propionate also increased for all the substrates, but more so with spinach and kaffir lime leaf. Butyrate increased only in milk powders, spinach, kaffir lime leaf powder, water, and the fermentation blank. Valerate increases were seen only with spinach, kaffir lime leaf, water, and the fermentation blank. Hexanoate increased with the milk powders. Heptanoate concentrations were below the limit of detection (Table S4). Isobutyrate and isovalerate were detected only in the water control and the fermentation blank from 10 h through 24 h.

At the end of 10 h (Figure 2 and Table S2), there were no significant changes (p < 0.05) in valerate, heptanoate or the branched-chain fatty acids, isobutyrate and isovalerate. In case of the ingredients, formate concentrations were the lowest with instant whole milk and the highest with spinach powder. Lactate concentrations were lowest with spinach and highest with the export type of oat flour. Acetate concentrations at 10 h were lowest in passionfruit powder and highest in whole-milk powder. Propionate was lowest in carrot and highest in spinach. Butyrate remained at 1 µmol/mL fermenta for most of the ingredients and was increased ~3-fold with kaffir lime leaf, spinach, and whole milk powder, and ~4-fold with instant whole milk powder. The 10 h inulin fermenta were rich in lactate and acetate, while water and the fermentation blank acid profiles were similar—low in lactate and acetate, and high in formate and propionate.

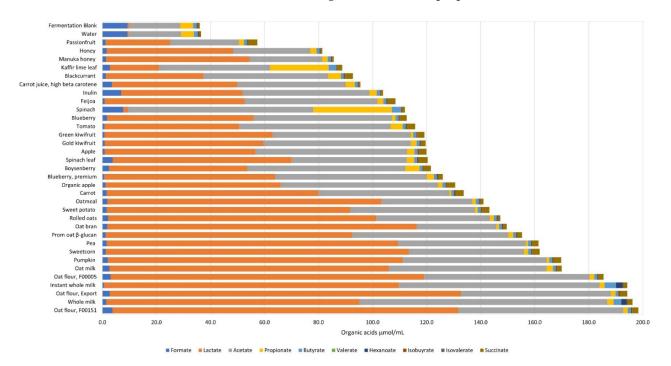


Figure 2. Average organic acid profiles of the 32 food ingredients, inulin (positive control), water, and the fermentation blank at 10 h fermentation with the pooled infant fecal slurry (n = 3). The statistical differences are given in Supplementary Tables S2 and S3.

The microbiome characterized for the 0, 5, and 10 h fermenta from a subset of ingredients, inulin, and water revealed that a total of 7,036,016 reads were obtained, with the minimum number of reads per sample being 21,766. In the case of the 0 h sample, which is representative of the pooled fecal inoculum, the four major phyla present were Firmicutes, Proteobacteria, Actinobacteria, and Bacteroidetes, with their relative abundances (RAs) being 40%, 24%, 20%, and 16% respectively (Table S5a). The most abundant families that were over 10% RA were Enterobacteriaceae, Bifidobacteriaceae, Bacteroidaceae, and Veillonellaceae (Table S5b). Differential abundance analysis of the changes in the microbiome at 5 and 10 h fermentation revealed substrate-related effects on the microbiome at the phylum, family, and species levels or the closest classifiable taxonomical level (Tables S6–S8, respectively). At 10 h, significant substrate-mediated effects (p < 0.005) were seen in Actinobacteria, Bacteroidetes and Cyanobacteria (Table S6). Spinach powder showed the least Actinobacteria (3% RA compared to 37% for instant milk powder) and highest Bacteroidetes (33% RA compared to 4% with tomato powder). Presence of plant-derived Cyanobacteria (resolved to an unclassified family of Streptophyta) [49] was increased to $\geq 1\%$ RA with blackcurrant and Boysenberry.

At 10 h, several significant differences (p < 0.005) were observed at the family level (Table S7 and Figure 3). The relative abundance of Bifidobacteriaceae was the highest at 37% with instant milk powder and was between 15–35% for all other ingredients, except spinach powder (3%). Comparatively, spinach leaf powder increased the RA of Bifidobacteriaceae to 22%. Prevotellaceae was increased to 24% RA with spinach powder, while it was 4% RA with spinach leaf powder, with the values being between 0% and 3% RA for the remaining substrates. Bacillaceae was at 8% RA with sweetcorn powder, 5% RA with spinach leaf powder, and between 0% and 1% RA for the remaining substrates. Enterococcaceae relative abundance was highest with instant milk powder (13% RA) and lowest with pumpkin powder (0.25% RA), and it was generally low with fruit, carrot, pea, tomato, and oat powders, and high with spinach leaf, sweetcorn, and sweet potato powders. The RA of Lactobacillaceae (Lactobacillales) was highest at 35% with pumpkin powder, with the values being over 20% RA with some vegetable powders (i.e., pea, pumpkin, carrot, carrot juice, sweet potato) and fruit powders (blackcurrant, Boysenberry, gold-fleshed kiwifruit), with spinach powder far lower than the rest (0.6% RA). Streptococcaceae (also from the order Lactobacillales) was increased to 7% RA with sweetcorn powder compared with the smaller changes seen with the other ingredients. Lachnospiraceae relative abundance was high with spinach powder (12%), and to a smaller extent with pumpkin, carrot, and pea powders, at 8%, 7%, and 5% RA, respectively. Small but significant changes in relative abundance (<6%) were seen with some ingredients for Clostridiaceae, Ruminococcaceae, Alcaligenaceae, Pseudomonadaceae, and unclassified families of Streptophyta, Clostridiales, and Rhizobiales. The fermentation positive control, inulin, induced large increases in the relative abundances of Bifidobacteriaceae (33%) and Lactobacillaceae (15%). Water, the vehicle control, increased the relative abundances of Clostridiaceae (15%), Lachnospiraceae (9%), Enterococcaceae (3%), and Alcaligenaceae (3%).

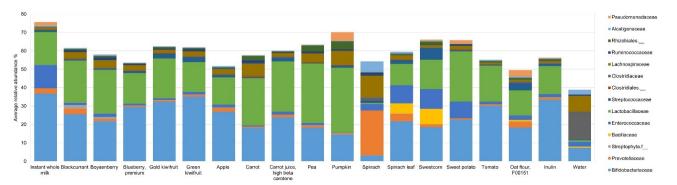


Figure 3. Average relative abundances (%) of bacterial families that differed significantly (p < 0.005) with food ingredients, inulin (positive control), and water at 10 h of fermentation.

While acknowledging a loss of resolution in ascribing genus- and species-level data with 16S rRNA gene sequencing [50], we studied the microbiome changes at the species level at 10 h and observed some significant changes, as shown in Table S8. In the case of Bifidobacteriaceae, significant changes were seen in *Bifidobacterium* spp. (p < 0.05), B. bifidum (p < 0.005), B. adolescentis (p < 0.005), and B. longum (p < 0.05). B. bifidum was increased highest by green-fleshed kiwifruit powder (12% RA) followed by tomato powder (10% RA). B. longum was at similar relative abundances for most ingredients, the greatest for instant milk and green-fleshed kiwifruit powders (14% RA), and the lowest for spinach powder (2% RA). An unclassified *Bifidobacterium* species was significantly higher (p = 0.01) for green-fleshed kiwifruit (13% RA) and spinach leaf powders (14% RA, in contrast to spinach powder, which was the lowest at 1% RA), while all the other ingredients were between 4% and 12% RA. Of the changes in the Bacteroidetes phylum, the most remarkable effect was the 30% RA in *Prevotella copri* with spinach powder (p < 0.005). Other changes where the RA of the species was at least 5% with at least one substrate were Bacteroides spp. (p < 0.05) and B. ovatus (p < 0.04). These species were at lower RA with instant whole milk, blueberry, carrot juice, sweet potato, and tomato powders. Carrot (in contrast to carrot juice, high β-carotene at 3% RA), apple, and oat flour, F00151 powder, among others, were stimulatory of Bacteroides spp. (9%, 7%, and 7% RA, respectively). The changes in Firmicutes were driven mainly by alteration in the classes Bacilli (Bacillus spp. And LAB) and Clostridia (families Clostridiaceae, Lachnospiraceae, Ruminococcaceae, and Veillonellaceae). Bacillus spp. Were less than 1% RA for all substrates, except sweetcorn and spinach leaf powders at 12% and 7% RA, respectively. Of the LAB, all the substrates, except spinach powder and water, increased at least one of the following genera by over 5% RA: Enterococcus spp., Enterococcus sp., Lactobacillus spp., Lactobacillus zeae, and Weissella spp. (all at p < 0.005) and Lactobacillus reuteri (p < 0.05). Some significant differences included the 9% RA in Enterococcus spp. And 5% RA in Lactobacillus reuteri with instant milk powder. The fruit powders (blackcurrant, Boysenberry, gold-fleshed and green-fleshed kiwifruit, and apple), vegetable powders (carrot juice, pea, and tomato) and inulin increased only L. reuteri as compared to the other LAB. The increase was greatest with carrot juice powder (19% RA) and lowest with inulin (7% RA). Carrot juice and pea powders caused a similar trend, except that L. reuteri values were 16% and 19%, respectively. Two different groups of LAB were increased to >5% RA with instant milk and sweet potato powders (Enterococcus spp. and L. reuteri), blueberry powder, and oat flour, F00151 (L. reuteri and Weissella spp.), carrot and pumpkin powders (Lactobacillus spp. and L. reuteri), and sweetcorn powder (Enterococcus sp. and L. reuteri). Spinach leaf powder modulated four different LAB groups to >5% RA, namely, Enterococcus spp., one unclassified Enterococcus sp., L. reuteri, and *Weissella* spp. Notable ingredient-driven effects on Clostridia with significant changes \geq 5% RA in any one putative species were observed. The major changes in Lachnospiraceae were with spinach powder, which caused a bloom in at least two unidentified Lachnospiraceae species, and pumpkin powder, which increased Blautia spp. (5% RA). Compared with the other substrates, water increased Clostridium perfringens to 16% RA, and this was suppressed to <0.5% RA by all ingredients, except spinach powder (2% RA). Water also modulated Phascolarctobacterium spp. to 6% RA. Smaller but significant modulations (1% to 2% RA) in *Ruminococcus gnavus* and *Phascolarctobacterium* spp. were seen with most substrates. Another genus from Veillonellaceae, i.e., *Veillonella* spp., was also modulated (p < 0.05) by the substrates, with >5% RA being seen with the fruit powders, carrot juice powder, spinach powder, tomato powder, and water. Other small but significant (p < 0.005) increases were with two Proteobacteria, an unclassified group from Rhizobiales, and Sutterella spp. (7% RA by spinach powder).

The Spearman's correlation coefficient for the 10 h organic acid and microbiome abundances revealed that *Bifidobacterium longum* correlated with formate (r = -0.731), *Veillonella* spp. with lactate (r = -0.774) and propionate (r = 0.819), and unclassified Acetobacteraceae species with propionate (r = -0.766). In the cases where both the acid and the organism were found in only one substrate, i.e., milk powder, a Spearman's r

of 1 was calculated. These were for *Pediococcus* with hexanoate and *Pseudomonas fragi* with hexanoate.

The changes in the microbiome after fermentation were examined at 5 and 10 h (separately) in terms of microbial diversity. There were no significant changes in terms of the within-community α -diversity at 5 or 10 h (data not presented). There were, however, significant changes (p < 0.005) in the β -diversity at both 5 and 10 h, with both nonphylogenetic (Bray–Curtis dissimilarity index) and phylogenetic (weighted and unweighted UniFrac) metrics. The EMPeror plot demonstrating the separation of the communities using the weighted uniFrac distances, which is a measure of the structure of the microbial community at 10 h of fermentation, is depicted in Figure 4. The taxa that most influenced the separation of the microbial communities between the different substrates were *Enterobacteriaceae*, *Lactobacillus* spp., *Enterococcus* spp., and *Bifidobacterium* spp. Community structure clusters (weighted UniFrac) were most clearly visualized for spinach and spinach leaf powders and water control.

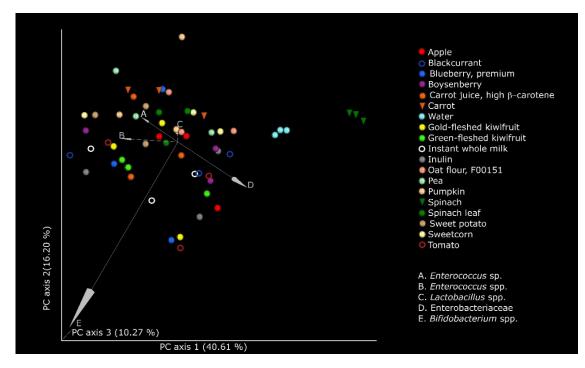


Figure 4. Principal coordinates analysis (PCoA) plots based on weighted UniFrac distances demonstrating significant shifts in the microbiome structure at 10 h of fermentation of the food ingredients, inulin (positive control), and water. Each sample was anaerobically fermented in triplicate, in the presence of pooled infant fecal slurry. The axes represent the dimensions explaining the greatest proportion of variances in the communities. The statistical significance (p < 0.005) was computed using permutational multivariate analysis of variance (PERMANOVA).

4. Discussion

Thirty-two food ingredients were taken in equal quantities and investigated for their ability to modulate the gut microbiome of the growing infant using simulated in vitro models of gastroileal digestion, intestinal absorption, and colonic fermentation. Examining the changes in microbial organic acid metabolites and microbial composition, we inferred the fermentative potential of these ingredients with the infant gut microbiome.

Similar in vitro models have previously been used to study the fermentative capacity of foods and ingredients with infant gut microbiome and validated using clinically proven prebiotics, including fructo- and galactooligosaccharides as positive controls [32,51]. In our study, water was included as a control to confirm the potential effect of the digestive enzymes that may escape digestion and dialysis, thereby reaching the colonic fermentation stage. Infants up to the age of 9 months harbor very low numbers of groups such as the

butyrate-producing Lachnospiraceae and Ruminococcaceae that are more indicative of microbial diversity and adaptation to different foods [2,4,52]. Therefore, to have a baseline that includes different microbiota that may potentially be modulated in this study, fecal bacteria obtained from infants 5–12 months of age were pooled to generate an inoculum with a diverse representation of bacteria that might be encountered by the infant. Thus, limitations of an in vitro system (vs. a clinical trial) and a fixed and sparse microbial baseline (vs. acquisition of new microbes) were mitigated by using appropriate standards and a pooled microbial inoculum, respectively.

Food ingredients selected were powders of different fruits, vegetables, varieties of oats, and milk, which are all often components of infant foods [1,34]. Powdered food ingredients have a stable shelf-life compared to fresh foods, are more consistent in terms of composition, are easier to transport, and are often used in baby food formulation. Commercially available sources were chosen to allow future use in the formulation of new infant complementary food with reproducibility of results. A standardized amount (2.5 g/30 mL) was chosen rather than a normalization with respect to the fiber content of such powders, as bioactives other than fiber are now being recognized as modulators of the gut microbiome. These bioactives include polyphenols that are present within the plant cell structures and potentially reach the colon [53,54].

The presence of organic acids in the baseline fermenta of many of the samples is indicative of the organic acids that were present in the substrate or generated during digestion, but not dialyzed out, despite their low molecular weight. While the fermenta were collected within 0.5 h, we do not consider that the fecal microbial metabolism was sufficiently activated to generate microbial acids. The increase in lactate (and acetate) to varying degrees throughout the fermentation may be attributed to the fact that most plant-based foods contain oligosaccharides that are rapidly metabolized. The exceptions, including spinach powder and lime leaf powder, which both showed increases in propionate and acetate, and to a smaller extent butyrate, indicated a syntrophic metabolism that comes into play when the early acid metabolites are further utilized by specialist bacteria. In the case of spinach powder, the early increase in succinate (at 5 h) depleted with the increase in propionate at 10 h. The smaller early rise in butyrate that built up over the course of the fermentation again indicates the increase in butyrogenic clostridia [26,55]. The accompanying increase in formate is a recognized mechanism to generate more acetate via mutualistic cross-feeding of hydrogen-utilizing acetogens, which then generate butyrate [56]. Most other ingredients caused lactate and acetate production to varying degrees, which is an indication of the microbial utilization of the carbohydrates that are still available in this closed system. The comparatively low propionate and butyrate production with infant fecal microbiota as compared to adult fecal microbiota indicates the immaturity of the microbiome and its inability to utilize carbohydrates efficiently [4,5,39,42]. In addition to the development stage of the infant microbiome, the fermentation rates and metabolic profiles of the different foods are influenced by the food components, especially the amounts and the physicochemical nature of the carbohydrates [21,57]. Indeed, fermentation is higher for linear polysaccharides (inulin, β -glucan, resistant starch) than for carbohydrates with sidechains such as arabinoxylans. This is consistent with the high lactate and acetate for the milk powders and certain vegetable powders (pea, pumpkin, sweet corn, and sweet potato, but not carrot, spinach, and tomato), as well as the oats.

For the first-pass step of fermentation followed by SCFA analysis, the variety of ingredients included different products from the same starting material, to determine the extent of variability that similar foods show in terms of their microbial stimulatory capacity. The variation in the SCFA profile indicates that the nature and the processing of the food are important factors. While honey is not usually recommended in foods for infants until the age of 1 year [58], we included it in this in vitro study to gather information on its prebiotic properties [43,59]. Most of the honey sugars were anticipated to be absorbed; the increase in microbial SCFAs indicates that the prebiotic mono- and oligosaccharides known to be present in honey may have been available to the fecal bacteria.

A subset of the ingredients that were anticipated to be more commonly used in infant foods was further analyzed for changes in microbiome composition. The timepoints of 5 and 10 h are close to the mean gastrointestinal transit time of 8.5 h (for 1–3 months old) to 10 h (for 1–2 years old) [60]. The inoculum obtained from infants may be considered representative of an in vivo system, while the batch fermentation employed in this study is a closed system precluding the replenishment of substrates or removal of bacterial metabolites and wastes. Furthermore, since pH was controlled only by buffering capacity of the bacterial fermentation medium, later timepoints may have confounding influences due to altered pH affecting microbial growth [61]. For these reasons, changes in the microbiome and its metabolites were compared within each timepoint. Acquisition was not simulated in this study, and this study, therefore, examines the ability of the ingredientinoculum interactions to stimulate bacteria that are already present, but in very low relative abundances. The zero-hour composition analysis ascertained the presence of a diverse species of bacteria much like the adult gut microbiome. This implies an opportunity for the diverse bacteria to utilize the carbohydrate resources within ingredients to result in populational shifts in the microbiota. Indeed, changes in the community structure (weighted uniFrac) were driven by the different substrates.

Instant milk powder, which is often a component of infant complementary foods, is a source of lactose and milk oligosaccharides, both of which stimulate bifidobacteria, particularly *B. longum* subsp. *longum* in vitro [21,62]. Consistent with these in vitro results, when 7-90 day old infants were fed exclusively a cow's milk-based formula or breast milk, an increase in bifidobacteria was observed at 3 weeks of feeding in both cases, although there was no difference in the concentration of SCFAs [63]. Interestingly only one, but not all the products tested behaved in a similar manner with respect to the effect on abundance of *Bifidobacterium* spp. This may have been due to differences in the composition of different products. Bifidobacterium spp. and B. longum were increased with the infant milk powder in this study. This suggests potential benefits due to its ability to persist in the gut beyond infancy and to metabolize a variety of dietary carbohydrates that are introduced during the complementary feeding [15,64]. Thus, higher bifidobacteria and LAB, and the associated lactate and acetate generation indicate microbial ecology driven by prebiotic components in the instant milk powder [62]. The greater lactate and acetate seen with foods such as sweet potato, sweetcorn, pea, and pumpkin powders, as well as oat flour, may be a consequence of the higher bifidobacteria, enterococci, and lactobacilli. This indicates a presence of easily metabolizable carbohydrates with fewer complexities or sidechains [65,66]. Carrots and fruits such as kiwifruit, apple, blackcurrant, and other berries are known to contain pectin-rich cell-wall polysaccharides [67,68]. Pectins enable the growth of a more diverse microbial consortium, led by the early blooms of bifidobacteria, lactobacilli, and streptococci [21,39,40,69]. The resultant lactate and/or acetate may have facilitated the growth of a second line of bacteria, e.g., Lachnospiraceae. While the increases in Firmicutes were not sufficient to cause large increases in butyrate, a prebiotic environment may be generated that supports beneficial propionigenic and butyrogenic commensals [6,70]. Spinach and tomato have a cell wall mainly composed of cellulose, hemicellulose, and lignin, and these components are known to be comparatively slowly fermentable by human gut bacteria [71,72]. This explains the lower lactate and acetate, and higher propionate and butyrate for these substrates, as some members utilize the easily accessible sugars, while other members further metabolize the primary endproducts. Spinach cell-wall components also show phenolic cross-linkages, which makes it particularly recalcitrant to microbial breakdown [71]. This has a beneficial role, as the undigested fiber is moved further to the normally carbohydrate-poor distal colon for further microbial utilization. The high P. copri seen here with spinach powder is known to drive an increase mostly in succinate [26,73]. The further conversion of succinate to propionate and butyrate by cross-feeders such as Faecalibacterium prausnitzii and Phascolarctobacterium spp. [74,75] was not clearly evident in this study owing to the microbial composition of

the immature inoculum, with its lower Firmicutes relative abundance, compensated for by Proteobacteria and Actinobacteria.

The differential effects on the microbiome changes caused by powders sourced from similar cultivars, such as carrots and spinach, may be explained by the different processing conditions. Thus, the type of food processing and consequent impact on food structure and composition (fiber, polyphenol content) may potentially influence microbiome composition [54,57,76,77]. This may explain the increase in *Bacteroides* spp. and Lachnospiraceae with the fiber-rich carrot powder made from whole carrots, but not the fiber-free carrot juice powder which was high in β -carotene. Similarly, spinach powder sourced from New Zealand *Spinacia oleracea* enhanced propionate (and butyrate), with the largest increase in *P. copri*. This propionigenic effect was not observed with spinach leaf powder, which had a similar macronutrient composition but "was sourced from imported spinach" according to the manufacturer's product description.

Exposure of infants and toddlers to a variety of foods helps to build a more versatile gut microbiome. This study, along with other studies, demonstrates that foods differentially modulate infant gut microbiota [39,51]. Blending different food groups may help to improve the food palatability [78], as well as the nutritive content and variety [79], and generate combinations that provide age-specific support to the developing infant's gut microbiome [28,52].

The inulin (positive control) was a commercial mixture of low- and high-molecularweight oligofructans and was added to aliquots of dialyzed water digesta to avoid removal by the 1000 Da molecular weight cutoff dialysis membrane. The strong bifidogenic effect of inulin, as expected [32], validated our in vitro gut model. The water control was essentially a mixture of undialyzed digestive enzymes fermented with infant fecal bacteria in a peptone-rich broth. It served as a vehicle control in this study, but also mimicked a gut environment that was devoid of carbohydrate, but rich in proteins. The increase in *C. perfringens*, along with smaller increases in other Firmicutes families and *Bacteroides* spp., supports a metabolomic profile rich in propionate, butyrate, and branched-chain fatty acids such as isobutyrate and isovalerate, characteristic of the degradation of glycoproteins or proteins that reach the distal gut [26,80]. The ingredients were able to suppress *C. perfringens* [81], a potential pathogen, and this may be attributed to the increase in other beneficial bacteria. Spinach powder, which increased isobutyrate and isovalerate, still suppressed *C. perfringens*, while favoring the butyrate-producing Lachnospiraceae.

5. Conclusions

Our results show that powdered food ingredients displayed varied abilities to stimulate microbial metabolism, evidenced by the generation of beneficial SCFAs. The foods also enhanced desirable bacteria such as *Bifidobacterium*, *Bacteroides*, *Prevotella*, LAB, and Lachnospiraceae. Different foods were shown to selectively enhance specific groups; for example, infant whole-milk powder and oat flour, F00151, enhanced Bifidobacteriaceae and LAB, and spinach powder enhanced Prevotellaceae and Lachnospiraceae, while fruit and vegetable powders modulated a mixed consortium of beneficial bacteria. In addition, all the food ingredients were consistent in inhibiting the opportunistic pathobiont, *C. perfringens*, which was high only in the carbohydrate-free water control. More studies examining these food ingredients and their appropriate dosages should be undertaken to understand how different ingredients interact with the infant microbiome. This will help us to design nutrient-rich foods suited to the developmental stage of the infant.

Supplementary Materials: The following are available online at https://www.mdpi.com/article/ 10.3390/microorganisms9102089/s1: Table S1. Details of the infants donating the feces; Table S2. Organic acid concentrations during the course of fermentation; Table S3. Analysis of variance in the organic acid measurements; Table S4. Limits of detection of organic acid analysis; Table S5. Percent relative abundance of microbial phyla at 0 h at phylum level (**a**), family level (**b**), and species level (**c**); Table S6. Percent relative abundance of microbial phyla 5 and 10 h after fermentation; Table S7. Percent relative abundance of microbial families 5 and 10 h after fermentation; Table S8. Percent relative abundance of microbial species 5 and 10 h after fermentation.

Author Contributions: Conceptualization, P.G., S.G.P. and D.I.R.; methodology, S.G.P., D.I.R., H.M.S. and C.M.H.J.; formal analysis, S.G.P. and D.I.H.; data curation, S.G.P., H.M.S. and C.M.H.J.; writing—original draft preparation, S.G.P.; project administration, S.G.P.; funding acquisition, P.G. All authors have read and agreed to the published version of the manuscript.

Funding: This research was funded by the New Zealand Ministry of Business, Innovation, and Employment through the Foods for Health at Different Life Stages program, contract C11X1312.

Institutional Review Board Statement: The study was conducted according to the guidelines of the Declaration of Helsinki, and approved by the Health and Disability Ethics Committees of the Ministry of Health, New Zealand (protocol code #16/NTA/154, approved on 7 October 2016).

Informed Consent Statement: Written informed consent has been obtained from the primary caregivers of all the subjects to publish this paper.

Data Availability Statement: The 16S rRNA gene sequence data and metadata were deposited into the SRA database with links to the BioProject accession number PRJNA669972 (https://www.ncbi.nlm.nih.gov/bioproject/).

Acknowledgments: We acknowledge Hannah Dinnan and Sheridan Martell for collection of fecal samples from the donors, as well as Lee Huffman and Irene Ho for procuring and providing the food ingredients. We acknowledge Simon Bulman for expert review of the manuscript.

Conflicts of Interest: The authors declare no conflict of interest.

References

- 1. Laursen, M.F.; Bahl, M.I.; Michaelsen, K.F.; Licht, T.R. First foods and gut microbes. Front. Microbiol. 2017, 8, 356. [CrossRef]
- Koenig, J.E.; Spor, A.; Scalfone, N.; Fricker, A.D.; Stombaugh, J.; Knight, R.; Angenent, L.T.; Ley, R.E. Succession of microbial consortia in the developing infant gut microbiome. *Proc. Natl. Acad. Sci. USA* 2011, 108, 4578–4585. [CrossRef] [PubMed]
- 3. Koleva, P.T.; Bridgman, S.L.; Kozyrskyj, A.L. The infant gut microbiome: Evidence for obesity risk and dietary intervention. *Nutrients* **2015**, *7*, 2237–2260. [CrossRef]
- Milani, C.; Duranti, S.; Bottacini, F.; Casey, E.; Turroni, F.; Mahony, J.; Belzer, C.; Palacio, S.D.; Montes, S.A.; Mancabelli, L.; et al. The first microbial colonizers of the human gut: Composition, activities, and health implications of the infant gut microbiota. *Microbiol. Mol. Biol. Rev.* 2017, *81*, e00036-17. [CrossRef] [PubMed]
- 5. Tamburini, S.; Shen, N.; Wu, H.C.; Clemente, J.C. The microbiome in early life: Implications for health outcomes. *Nat. Med.* 2016, 22, 713–722. [CrossRef]
- 6. Solís, G.; Reyes-Gavilan, C.D.L.; Fernández, N.; Margolles, A.; Gueimonde, M. Establishment and development of lactic acid bacteria and bifidobacteria microbiota in breast-milk and the infant gut. *Anaerobe* **2010**, *16*, 307–310. [CrossRef]
- Tannock, G.W.; Lawley, B.; Munro, K.; Pathmanathan, S.G.; Zhou, S.J.; Makrides, M.; Gibson, R.A.; Sullivan, T.; Prosser, C.G.; Lowry, D.; et al. Comparison of the compositions of the stool microbiotas of infants fed goat milk formula, cow milk-based formula, or breast milk. *Appl. Environ. Microbiol.* 2013, *79*, 3040–3048. [CrossRef]
- Harmsen, H.J.M.; Wildeboer-Veloo, A.C.M.; Raangs, G.C.; Wagendorp, A.A.; Klijn, N.; Bindels, J.G.; Welling, G.W. Analysis of intestinal flora development in breast-fed and formula-fed infants by using molecular identification and detection methods. *J. Pediatric Gastroenterol. Nutr.* 2000, 30, 61–67. [CrossRef] [PubMed]
- 9. Hove, H.; Nørgaard, H.; Mortensen, P.B. Lactic acid bacteria and the human gastrointestinal tract. *Eur. J. Clin. Nutr.* **1999**, *53*, 339–350. [CrossRef]
- 10. Wang, S.; Hibberd, M.L.; Pettersson, S.; Lee, Y.K. Enterococcus faecalis from healthy infants modulates inflammation through MAPK signaling pathways. *PLoS ONE* **2014**, *9*, e97523. [CrossRef]
- Murphy, R.; Morgan, X.; Wang, X.; Wickens, K.; Purdie, G.; Fitzharris, P.; Otal, A.; Lawley, B.; Stanley, T.; Barthow, C.; et al. Eczema-protective probiotic alters infant gut microbiome functional capacity but not composition: Sub-sample analysis from a RCT. *Benef. Microbes* 2019, 10, 5–17. [CrossRef]
- Gotoh, A.; Katoh, T.; Sakanaka, M.; Ling, Y.; Yamada, C.; Asakuma, S.; Urashima, T.; Tomabechi, Y.; Katayama-Ikegami, A.; Kurihara, S.; et al. Sharing of human milk oligosaccharides degradants within bifidobacterial communities in faecal cultures supplemented with Bifidobacterium bifidum. *Sci. Rep.* 2018, *8*, 1–14. [CrossRef]
- 13. Turroni, F.; Duranti, S.; Milani, C.; Lugli, G.A.; Van Sinderen, D.; Ventura, M. *Bifidobacterium bifidum*: A key member of the early human gut microbiota. *Microorganisms* **2019**, *7*, 544. [CrossRef]
- 14. Reuter, G. The *Lactobacillus* and *Bifidobacterium microflora* of the human intestine: Composition and succession. *Curr. Issues Intest. Microbiol.* **2001**, *2*, 43–53.

- 15. O'Callaghan, A.; Van Sinderen, D. *Bifidobacteria* and their role as members of the human gut microbiota. *Front. Microbiol.* **2016**, 7, 925. [CrossRef] [PubMed]
- 16. Bunesova, V.; Lacroix, C.; Schwab, C. Mucin cross-feeding of infant *Bifidobacteria* and *Eubacterium hallii*. *Microb. Ecol.* **2018**, 75, 228–238. [CrossRef] [PubMed]
- 17. Jing, W.; Liu, Q.; Wang, W. *Bifidobacterium bifidum* TMC3115 ameliorates milk protein allergy in by affecting gut microbiota: A randomized double-blind control trial. *J. Food Biochem.* **2020**, *44*, e13489. [CrossRef] [PubMed]
- Martín, R.; Bottacini, F.; Egan, M.; Chamignon, C.; Tondereau, V.; Moriez, R.; Knol, J.; Langella, P.; Eutamene, H.; Smokvina, T.; et al. The infant-derived *Bifidobacterium bifidum* strain CNCM I-4319 strengthens gut functionality. *Microorganisms* 2020, *8*, 1313. [CrossRef]
- Turroni, F.; Ventura, M.; Buttó, L.F.; Duranti, S.; O'Toole, P.; Motherway, M.O.; Van Sinderen, D. Molecular dialogue between the human gut microbiota and the host: A *Lactobacillus* and *Bifidobacterium* perspective. *Cell. Mol. Life Sci.* 2014, 71, 183–203. [CrossRef] [PubMed]
- 20. Fernandes, G.R.; Tap, J.; Bruls, T.; Batto, J.M.; Bertalan, M.; Borruel, N.; Casellas, F.; Fernandez, L.; Gautier, L.; Hansen, T.; et al. Enterotypes of the human gut microbiome. *Nat. Cell Biol.* **2011**, 473, 174–180. [CrossRef]
- 21. Verkhnyatskaya, S.; Ferrari, M.; de Vos, P.; Walvoort, M.T.C. Shaping the infant microbiome with non-digestible carbohydrates. *Front. Microbiol.* **2019**, *10*, 343. [CrossRef]
- 22. Yu, C.; Binns, C.W.; Lee, A.H. The early introduction of complementary (solid) foods: A prospective cohort study of infants in Chengdu, China. *Nutrients* 2019, *11*, 760. [CrossRef]
- 23. Kim, C.C.; Parkar, S.G.; Gopal, P.K. Developing infant gut microflora and complementary nutrition. J. R. Soc. N. Z. 2020, 50, 1–13. [CrossRef]
- 24. Scott, K.P.; Martin, J.C.; Duncan, S.; Flint, H.J. Prebiotic stimulation of human colonic butyrate-producing bacteria and *Bifidobacteria*, In Vitro. *FEMS Microbiol. Ecol.* **2013**, *87*, 30–40. [CrossRef]
- 25. Makras, L.; De Vuyst, L. The In Vitro inhibition of gram-negative pathogenic bacteria by *Bifidobacteria* is caused by the production of organic acids. *Int. Dairy J.* 2006, *16*, 1049–1057. [CrossRef]
- 26. Louis, P.; Flint, H.J. Formation of propionate and butyrate by the human colonic microbiota. *Environ. Microbiol.* **2017**, *19*, 29–41. [CrossRef] [PubMed]
- Zheng, L.; Kelly, C.J.; Battista, K.D.; Schaefer, R.; Lanis, J.M.; Alexeev, E.E.; Wang, R.X.; Onyiah, J.C.; Kominsky, D.J.; Colgan, S.P. Microbial-derived butyrate promotes epithelial barrier function through IL-10 receptor–dependent repression of claudin-2. *J. Immunol.* 2017, 199, 2976–2984. [CrossRef] [PubMed]
- Stewart, C.J.; Ajami, N.J.; O'Brien, J.L.; Hutchinson, D.S.; Smith, D.P.; Wong, M.C.; Ross, M.C.; Lloyd, R.E.; Doddapaneni, H.; Metcalf, G.A.; et al. Temporal development of the gut microbiome in early childhood from the TEDDY study. *Nat. Cell Biol.* 2018, 562, 583–588. [CrossRef]
- Sjögren, Y.M.; Tomicic, S.; Lundberg, A.; Böttcher, M.F.; Björkstén, B.; Sverremark-Ekström, E.; Jenmalm, M. Influence of early gut microbiota on the maturation of childhood mucosal and systemic immune responses. *Clin. Exp. Allergy* 2009, *39*, 1842–1851. [CrossRef]
- 30. Braegger, C.; Chmielewska, A.; Decsi, T.; Kolacek, S.; Mihatsch, W.; Moreno, L.; Pieścik, M.; Puntis, J.; Shamir, R.; Szajewska, H.; et al. Supplementation of infant formula with probiotics and/or prebiotics: A Systematic review and comment by the ESPGHAN committee on nutrition. *J. Pediatric Gastroenterol. Nutr.* **2011**, *52*, 238–250. [CrossRef]
- 31. Scholtens, P.; Alles, M.S.; Bindels, J.G.; van der Linde, E.G.M.; Tolboom, J.J.M.; Knol, J. Bifidogenic effects of solid weaning foods with added prebiotic oligosaccharides: A randomised controlled clinical trial. *J. Pediatric Gastroenterol. Nutr.* **2006**, 42, 553–559. [CrossRef]
- Stiverson, J.; Williams, T.; Chen, J.; Adams, S.; Hustead, D.; Price, P.; Guerrieri, J.; Deacon, J.; Yu, Z. Prebiotic oligosaccharides: Comparative evaluation using In Vitro cultures of infants' fecal microbiomes. *Appl. Environ. Microbiol.* 2014, 80, 7388–7397. [CrossRef]
- 33. Rivière, A.; Selak, M.; Lantin, D.; Leroy, F.; De Vuyst, L. Bifidobacteria and butyrate-producing colon bacteria: Importance and strategies for their stimulation in the human gut. *Front. Microbiol.* **2016**, *7*, 979. [CrossRef] [PubMed]
- Maalouf, J.; Cogswell, M.E.; Bates, M.; Yuan, K.; Scanlon, K.S.; Pehrsson, P.; Gunn, J.P.; Merritt, R.K. Sodium, sugar, and fat content of complementary infant and toddler foods sold in the United States, 2015. *Am. J. Clin. Nutr.* 2017, 105, 1443–1452. [CrossRef] [PubMed]
- 35. Gibson, R.; Ferguson, E.; Lehrfeld, J. Complementary foods for infant feeding in developing countries: Their nutrient adequacy and improvement. *Eur. J. Clin. Nutr.* **1998**, *52*, 764–770. [CrossRef] [PubMed]
- 36. Maslin, K.; Venter, C. Nutritional aspects of commercially prepared infant foods in developed countries: A narrative review. *Nutr. Res. Rev.* **2017**, *30*, 138–148. [CrossRef] [PubMed]
- 37. Moumin, N.A.; Green, T.J.; Golley, R.K.; Netting, M.J. Are the nutrient and textural properties of Australian commercial infant and toddler foods consistent with infant feeding advice? *Br. J. Nutr.* **2020**, *124*, 754–760. [CrossRef] [PubMed]
- 38. Jovanovic-Malinovska, R.; Kuzmanova, S.; Winkelhausen, E. Oligosaccharide profile in fruits and vegetables as sources of prebiotics and functional foods. *Int. J. Food Prop.* **2014**, *17*, 949–965. [CrossRef]

- 39. Parkar, S.G.; Frost, J.K.T.; Rosendale, D.; Stoklosinski, H.M.; Jobsis, C.M.H.; Hedderley, D.I.; Gopal, P. The sugar composition of the fibre in selected plant foods modulates weaning infants' gut microbiome composition and fermentation metabolites in vitro. *Sci. Rep.* **2021**, *11*, 9292. [CrossRef]
- Larsen, N.; de Souza, C.B.; Krych, L.; Cahú, T.B.; Wiese, M.; Kot, W.; Hansen, K.M.; Blennow, A.; Venema, K.; Jespersen, L. Potential of pectins to beneficially modulate the gut microbiota depends on their structural properties. *Front. Microbiol.* 2019, 10, 223. [CrossRef]
- 41. USDA Food & Nutrition Service. Available online: https://www.fns.usda.gov/ (accessed on 8 February 2021).
- 42. Parkar, S.G.; Simmons, L.; Herath, T.D.; Phipps, J.E.; Trower, T.; Hedderley, D.; McGhie, T.K.; Blatchford, P.; Ansell, J.; Sutton, K.H.; et al. Evaluation of the prebiotic potential of five kiwifruit cultivars after simulated gastrointestinal digestion and fermentation with human *Faecal bacteria*. *Int. J. Food Sci. Technol.* **2017**, *53*, 1203–1210. [CrossRef]
- Parkar, S.; Jobsis, C.M.; Herath, T.D.; Stoklosinski, H.; van Klink, J.; Sansom, C.E.; Sims, I.M.; Hedderley, D. Metabolic and microbial responses to the complexation of manuka honey with α-cyclodextrin after simulated gastrointestinal digestion and fermentation. *J. Funct. Foods* 2017, *31*, 266–273. [CrossRef]
- Kozich, J.J.; Westcott, S.L.; Baxter, N.T.; Highlander, S.K.; Schloss, P.D. Development of a dual-index sequencing strategy and curation pipeline for analyzing amplicon sequence data on the MiSeq illumina sequencing platform. *Appl. Environ. Microbiol.* 2013, 79, 5112–5120. [CrossRef] [PubMed]
- Bolyen, E.; Rideout, J.R.; Dillon, M.R.; Bokulich, N.A.; Abnet, C.C.; Al-Ghalith, G.A.; Alexander, H.; Alm, E.J.; Arumugam, M.; Asnicar, F.; et al. Reproducible, interactive, scalable and extensible microbiome data science using QIIME 2. *Nat. Biotechnol.* 2019, 37, 852–857. [CrossRef] [PubMed]
- 46. Callahan, B.J.; McMurdie, P.J.; Rosen, M.J.; Han, A.W.; Johnson, A.J.A.; Holmes, S.P. DADA2: High-resolution sample inference from illumina amplicon data. *Nat. Methods* **2016**, *13*, 581–583. [CrossRef] [PubMed]
- 47. DeSantis, T.Z.; Hugenholtz, P.; Larsen, N.; Rojas, M.; Brodie, E.L.; Keller, K.; Huber, T.; Dalevi, D.; Hu, P.; Andersen, G.L. Greengenes, a chimera-checked 16S rRNA gene database and workbench compatible with ARB. *Appl. Environ. Microbiol.* **2006**, *72*, 5069–5072. [CrossRef] [PubMed]
- 48. Love, M.I.; Huber, W.; Anders, S. Moderated estimation of fold change and dispersion for RNA-seq data with DESeq2. *Genome Biol.* **2014**, *15*, 550. [CrossRef]
- 49. Ley, R.E.; Bäckhed, F.; Turnbaugh, P.; Lozupone, C.A.; Knight, R.D.; Gordon, J.I. Obesity alters gut microbial ecology. *Proc. Natl. Acad. Sci. USA* **2005**, *102*, 11070–11075. [CrossRef]
- 50. Pollock, J.; Glendinning, L.; Wisedchanwet, T.; Watson, M. The madness of microbiome: Attempting to find consensus "best practice" for 16s microbiome studies. *Appl. Environ. Microbiol.* **2018**, *84*. [CrossRef]
- 51. Flickinger, E.A.; Hatch, T.F.; Wofford, R.C.; Grieshop, C.M.; Murray, S.M.; Fahey, G.C. In Vitro fermentation properties of selected fructooligosaccharide-containing vegetables and In Vivo colonic microbial populations are affected by the diets of healthy human infants. *J. Nutr.* **2002**, *132*, 2188–2194. [CrossRef]
- 52. Korpela, K.; de Vos, W.M. Early life colonization of the human gut: Microbes matter everywhere. *Curr. Opin. Microbiol.* **2018**, 44, 70–78. [CrossRef]
- 53. Biesalski, H.K. Nutrition meets the microbiome: Micronutrients and the microbiota. *Ann. N. Y. Acad. Sci.* **2016**, 1372, 53–64. [CrossRef]
- 54. Tuohy, K.M.; Conterno, L.; Gasperotti, M.; Viola, R. Up-regulating the human intestinal microbiome using whole plant foods, polyphenols, and/or fiber. *J. Agric. Food Chem.* **2012**, *60*, 8776–8782. [CrossRef]
- 55. Louis, P.; Scott, K.P.; Duncan, S.H.; Flint, H.J. Understanding the effects of diet on bacterial metabolism in the large intestine. *J. Appl. Microbiol.* 2007, 102, 1197–1208. [CrossRef]
- 56. Gomez, J.A.L.; Mukhopadhya, I.; Duncan, S.; Louis, P.; Shaw, S.; Collie-Duguid, E.; Crost, E.; Juge, N.; Flint, H.J. Formate cross-feeding and cooperative metabolic interactions revealed by transcriptomics in co-cultures of acetogenic and amylolytic human colonic bacteria. *Environ. Microbiol.* **2019**, *21*, 259–271. [CrossRef]
- 57. Williams, B.A.; Grant, L.J.; Gidley, M.J.; Mikkelsen, D. Gut fermentation of dietary fibres: Physico-chemistry of plant cell walls and implications for health. *Int. J. Mol. Sci.* 2017, *18*, 2203. [CrossRef]
- 58. Shirai, N.; Homma, C.T.; Kon, C.; Imura, T.; Wada, Y. Japanese toddlers prefer the scent of soy sauce to that of honey with a sweet drink. *Food Qual. Prefer.* **2020**, *86*, 104024. [CrossRef]
- 59. Sanz, M.L.; Polemis, N.; Morales, V.; Corzo, N.; Drakoularakou, A.; Gibson, A.G.R.; Rastall, R.A. In Vitro investigation into the potential prebiotic activity of honey oligosaccharides. *J. Agric. Food Chem.* **2005**, *53*, 2914–2921. [CrossRef] [PubMed]
- 60. Weaver, L.T.; Steiner, H. The bowel habit of young children. Arch. Dis. Child. 1984, 59, 649–652. [CrossRef]
- 61. Palframan, R.J.; Gibson, G.R.; Rastall, R.A. Effect of pH and dose on the growth of gut bacteria on prebiotic carbohydrates In Vitro. *Anaerobe* **2002**, *8*, 287–292. [CrossRef] [PubMed]
- Jakobsen, L.M.A.; Sundekilde, U.K.; Andersen, H.J.; Nielsen, D.S.; Bertram, H.C. Lactose and bovine milk oligosaccharides synergistically stimulate *B. longum* subsp. *longum* growth in a simplified model of the infant gut microbiome. *J. Proteome Res.* 2019, *18*, 3086–3098. [CrossRef] [PubMed]
- Liu, Z.; Roy, N.C.; Guo, Y.; Jia, H.; Ryan, L.; Samuelsson, L.; Thomas, A.; Plowman, J.; Clerens, S.; Day, L.; et al. Human breast milk and infant formulas differentially modify the intestinal microbiota in human infants and host physiology in rats. *J. Nutr.* 2016, 146, 191–199. [CrossRef] [PubMed]

- 64. Oki, K.; Akiyama, T.; Matsuda, K.; Gawad, A.; Makino, H.; Ishikawa, E.; Oishi, K.; Kushiro, A.; Fujimoto, J. Long-term colonization exceeding six years from early infancy of *Bifidobacterium longum* subsp. longum in human gut. *BMC Microbiol.* **2018**, *18*, 209. [CrossRef]
- 65. Casterline, J.J.L.; Oles, A.C.J.; Ku, Y. In Vitro fermentation of various food fiber fractions. J. Agric. Food Chem. 1997, 45, 2463–2467. [CrossRef]
- 66. Jonathan, M.C.; van den Borne, J.J.G.C.; Van Wiechen, P.; Da Silva, C.S.; Schols, H.A.; Gruppen, H. In Vitro fermentation of 12 dietary fibres by faecal inoculum from pigs and humans. *Food Chem.* **2012**, *133*, 889–897. [CrossRef]
- 67. Lunn, J.; Buttriss, J.L. Carbohydrates and dietary fibre. Nutr. Bull. 2007, 32, 21–64. [CrossRef]
- 68. Gawkowska, D.; Cybulska, J.; Zdunek, A. Structure-related gelling of pectins and linking with other natural compounds: A review. *Polymers* **2018**, *10*, 762. [CrossRef]
- 69. Liu, Y.; Heath, A.-L.; Galland, B.; Rehrer, N.; Drummond, L.; Wu, X.-Y.; Bell, T.J.; Lawley, B.; Sims, I.M.; Tannock, G.W. Substrate use prioritization by a coculture of five species of gut bacteria fed mixtures of arabinoxylan, xyloglucan, β-glucan, and pectin. *Appl. Environ. Microbiol.* 2020, *86*, 86. [CrossRef]
- Falony, G.; Calmeyn, T.; Leroy, F.; De Vuyst, L. Coculture fermentations of *Bifidobacterium species* and *Bacteroides thetaiotaomicron* reveal a mechanistic insight into the prebiotic effect of inulin-type fructans. *Appl. Environ. Microbiol.* 2009, 75, 2312–2319. [CrossRef]
- 71. Fry, S.C. Phenolic components of the primary cell wall. Feruloylated disaccharides of d-galactose and l-arabinose from spinach polysaccharide. *Biochem. J.* **1982**, 203, 493–504. [CrossRef]
- 72. Dziedzic, K.; Górecka, D.; Szwengiel, A.; Michniewicz, J.; Drożdżyńska, A.; Walkowiak, J. Interactions between fecal bacteria, bile acids and components of tomato pomace. *Food Sci. Biotechnol.* **2019**, *28*, 649–655. [CrossRef]
- 73. Franke, T.; Deppenmeier, U. Physiology and central carbon metabolism of the gut bacterium *Prevotella copri*. *Mol. Microbiol.* **2018**, 109, 528–540. [CrossRef]
- 74. Yang, J.; Martínez, I.; Walter, J.; Keshavarzian, A.; Rose, D.J. In Vitro characterization of the impact of selected dietary fibers on fecal microbiota composition and short chain fatty acid production. *Anaerobe* **2013**, 23, 74–81. [CrossRef]
- 75. Reichardt, N.; Duncan, S.H.; Young, P.; Belenguer, A.; Leitch, C.; Scott, K.P.; Flint, H.J.; Louis, P. Phylogenetic distribution of three pathways for propionate production within the human gut microbiota. *ISME J.* **2014**, *8*, 1323–1335. [CrossRef] [PubMed]
- 76. Nordlund, E.; Aura, A.-M.; Mattila, I.; Kössö, T.; Rouau, X.; Poutanen, K. Formation of phenolic microbial metabolites and short-chain fatty acids from rye, wheat, and oat bran and their fractions in the metabolical in vitro colon model. *J. Agric. Food Chem.* **2012**, *60*, 8134–8145. [CrossRef] [PubMed]
- 77. Day, L.; Gomez, J.; Øiseth, S.K.; Gidley, M.J.; Williams, B.A. Faster fermentation of cooked carrot cell clusters compared to cell wall fragments In Vitro by porcine feces. *J. Agric. Food Chem.* **2012**, *60*, 3282–3290. [CrossRef] [PubMed]
- 78. Bakke, A.J.; Carney, E.M.; Higgins, M.; Moding, K.; Johnson, S.L.; Hayes, J.E. Blending dark green vegetables with fruits in commercially available infant foods makes them taste like fruit. *Appetite* **2020**, *150*, 104652. [CrossRef] [PubMed]
- 79. Moding, K.J.; Ferrante, M.J.; Bellows, L.; Bakke, A.J.; Hayes, J.; Johnson, S.L. Variety and content of commercial infant and toddler vegetable products manufactured and sold in the United States. *Am. J. Clin. Nutr.* **2018**, 107, 576–583. [CrossRef]
- 80. Wang, X.; Gibson, G.R.; Sailer, M.; Theis, S.; Rastall, R.A. Prebiotics inhibit proteolysis by gut bacteria in a host diet-dependent manner: A three-stage continuous in vitro gut model experiment. *Appl. Environ. Microbiol.* **2020**, *86*, e02730-19. [CrossRef]
- 81. Heredia, N.L.; Labbé, R.G. Clostridium perfringens. In *Guide to Foodborne Pathogens*; John Wiley and Sons: Hoboken, NJ, USA, 2013; pp. 82–90.