



Consistent Prebiotic Effects of Carrot RG-I on the Gut Microbiota of Four Human Adult Donors in the SHIME[®] Model despite Baseline Individual Variability

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Abstract: The human gut microbiome is currently recognized to play a vital role in human biology and development, with diet as a major modulator. Therefore, novel indigestible polysaccharides that confer a health benefit upon their fermentation by the microbiome are under investigation. Based on the recently demonstrated prebiotic potential of a carrot-derived pectin extract enriched for rhamnogalacturonan I (cRG-I), the current study aimed to assess the impact of cRG-I upon repeated administration using the M-SHIME technology (3 weeks at 3g cRG-I/d). Consistent effects across four simulated adult donors included enhanced levels of acetate (+21.1 mM), propionate (+17.6 mM), and to a lesser extent butyrate (+4.1 mM), coinciding with a marked increase of OTUs related to Bacteroides dorei and Prevotella species with versatile enzymatic potential likely allowing them to serve as primary degraders of cRG-I. These Bacteroidetes members are able to produce succinate, explaining the consistent increase of an OTU related to the succinate-converting Phascolarctobacterium faecium (+0.47 log₁₀(cells/mL)). While the *Bifidobacteriaceae* family remained unaffected, a specific OTU related to *Bifidobacterium longum* increased significantly upon cRG-I treatment (+1.32 log₁₀(cells/mL)). Additional monoculture experiments suggested that Bifidobacterium species are unable to ferment cRG-I structures as such and that B. longum probably feeds on arabinan and galactan side chains of cRG-I, released by aforementioned Bacteroidetes members. Overall, this study confirms the prebiotic potential of cRG-I and additionally highlights the marked consistency of the microbial changes observed across simulated subjects, suggesting the involvement of a specialized consortium in cRG-I fermentation by the human gut microbiome.

Keywords: pectin; rhamnogalacturonan I; *Bifidobacteriaceae; Bacteroides dorei;* acetate; propionate; in vitro

1. Introduction

Over the past decades, it became clear that the human gut microbiome constitutes an overlooked system that makes a significant contribution to human biology and development [1]. Observational studies applying metabolomics and metagenomics have largely broadened our understanding on how the human gut microbiota is associated with, among other things, obesity-related diseases [2], liver diseases [3], inflammatory bowel disease (IBD) [4], and colorectal cancer [5]. A key function of the gut microbiome consists in the fermentation of carbohydrates in the colon, resulting among other things in the production of short-chain fatty acids (SCFA) [6], mainly including acetate, propionate, and butyrate, which have each been related to particular health benefits as reviewed elsewhere [7–10].



Article

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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/). Among the hundreds of gut microbes, *Bacteroides* species display diverse and versatile glycan metabolising capabilities, allowing them to ferment extremely complex glycans [11–14], with other members such as *Bifidobacterium* species growing on the polysaccharide degradation products and metabolites [15]. In contrast to the beneficial effect of fiber fermentation, fermentation of amino acids results in the formation of potentially detrimental compounds (e.g., phenols, cresol, and hydrogen sulfide), contributing to IBD or colon cancer [16]. Due to the purported role of dietary fiber and plant-based foods to inhibit such detrimental effects, there is a good rationale for developing functional foods that improve gut health via their impact on the gut microbiome [1].

Besides probiotics and polyphenols, prebiotic carbohydrates that are defined as substrates that are selectively utilized by beneficial host microorganisms [17] are widely studied for their health-promoting properties. While fructans such as fructo-oligosaccharides [18] and inulin [19] have well-established prebiotic effects, novel classes of prebiotics include, amongst others, human milk oligosaccharides [20], arabinoxylans [21], and a specific class of pectin-derived polysaccharides such as rhamnogalacturonan-1 (RG-I) [22-24]. The backbone of RG-I consists of repeated units of the disaccharide $[-4)-\alpha$ -D-galacturonic acid-(1,2)-α-L-rhamnose-(1] with sidechains comprising mainly D-galactose (~galactans), L-arabinose (~arabinans), and D-xylose (~xylans) branching off the rhamnose residues [23]. These sidechains, varying in composition and length, offer RG-I a structural complexity that requires the concerted action of different enzymes provided by a microbial consortium to be fermented [25]. The development and demonstration of functionality of a particular source of RG-I relevant for the current paper, i.e., carrot-derived RG-I (cRG-I), was recently reviewed by McKay et al. [26]. A clear immunostimulatory activity could be attributed to cRG-I both in vitro and in vivo, while in vitro studies demonstrated its capacity to modulate the human gut microbiota [27].

The lack of access to the in vivo site of activity combined with SCFA being rapidly absorbed [28] makes it very difficult to draw meaningful conclusions on SCFA production in vivo unless complex techniques such as a stable-isotope dilution method are applied [29]. The use of in vitro models has been recognized as an established solution to overcome this issue [30]. These models range from fecal batch incubation strategies [27,31] to pH-controlled reactor systems [32–35], each having their distinct benefits and potential drawbacks. An important aspect to take into account in gut microbiome research is the currently well-established considerable inter-individual differences among donors [36], which can greatly impact the results of dietary interventions [37] or in vitro outcomes of fiber fermentation [31]. In vitro studies should thus ideally include several test donors.

This study aimed to investigate the impact of repeated administration of cRG-I on the luminal and mucosal gut microbiota, while addressing potential interindividual differences among subjects. This complements the data of an earlier study where cRG-I treatment was evaluated over 2 days in batch fermentations [27]. cRG-I has earlier been shown to display immune modulation properties in vitro and to stimulate the innate immune response in healthy human subjects [26]. The data described in this paper thus support that cRG-I exerts a dual mode of action by impacting both the host immune system and gut microbiota.

2. Materials and Methods

2.1. Chemicals

All chemicals were obtained from Sigma (Bornem, Belgium) unless otherwise stated. cRG-I (same substrate as tested in [27]) was supplied by Nutrileads (Wageningen, The Netherlands). The extract is highly enriched (80%) in the RG-I domain of pectin. Details on extraction method and extract characterization have been published in [26]. The monosaccharide composition of cRG-I is (% mol/mol): rhamnose, 14.3; arabinose, 34.8; galactose, 19.6; fucose, 0.8; glucose, 4.3; mannose, 0.9; xylose, 0.7; galacturonic acid, 25.

2.2. Mucosal Simulator of the Human Intestinal Microbial Ecosystem (M-SHIME®)

The computer-controlled, automated SHIME® technology (ProDigest, University of Ghent, Ghent, Belgium) was used to conduct the current study. In terms of reactor design, the classical M-SHIME[®] setup was modified to allow parallel comparison of fermentation by four fecal samples, leading to a quad-M-SHIME setting, i.e., four parallel units, each comprising three sequential reactors (Figure 1A). The first reactor was a combined stomach/small intestinal reactor (ST/SI), while the other reactors simulated the proximal colon (PC) and distal colon (DC), respectively. In contrast to the ST/SI reactor that was operated according to a fill-and-draw principle, the PC and DC reactors had a fixed volume of 500 and 800 mL, respectively. The pH of the PC and DC was controlled within fixed intervals (at 5.7-5.9 and 6.6-6.9, respectively) via the addition of 0.5M NaOH and 0.5M HCl. Besides a luminal phase, each colonic reactor also contained 60 mucin-coated microcosms (AnoxKaldnes K1carrier, AnoxKaldnes AB, Lund, Sweden) prepared according to Van den Abbeele et al. [38] to allow simulation of the mucosal microbiota. 50% of the mucin beads were renewed three times per week (i.e., on Monday, Wednesday, and Friday) by opening the reactors as described recently [39]. All reactors were airtight, continuously agitated (300 rpm), and temperature controlled (37 $^{\circ}$ C). Anaerobiosis was maintained by flushing the headspace of all reactors once per day with nitrogen gas (Parker Balston Nitrogen Generator UHPN2-1100, CompAir Geveke, Vilvoorde, Belgium).



A. Reactor configuration

Figure 1. (A) Reactor configuration and (B) timeline together with performed analysis of quad-M-SHIME experiment during which the potential prebiotic effect of cRGI was investigated for four human adult donors (1, 2, 3, and 4). bCFA = branched-chain fatty acids, cRG-I = carrot-derived Rhamnogalacturonan I, DC = distal colon, PC = proximal colon, SCFA = short-chain fatty acids, quad-M-SHIME = Mucosal Simulator of the Human Intestinal Microbial Ecosystem with four parallel units. ST-SI = stomach-small Intestine.

> The experiment consisted of a stabilization (Day -14 to 0), control (Day 0 to 14), and cRG-I treatment period (Day 14 to 35) (Figure 1B). At day -14, the PC and DC reactors of each of the four units were filled with 500/800mL SHIME nutritional medium (ProDigest, Belgium) and inoculated with a fecal slurry (5% v/v) of one of the four donors under investigation (Donor 1 (f, 29), 2 (m, 27), 3 (f, 32), or 4 (f, 33)), prepared according to Moens et al. [40]. All donors were healthy with a normal BMI and did not use antibiotics during the last 6 months prior to this study. Each arm received three feeding cycles per day of 140 mL of SHIME nutritional medium. During the simulation of the small

intestine, 60 mL of bile/pancreatic fluid (oxgall (6 g/L), sodium bicarbonate (12.5 g/L), and porcine pancreatin (0.9 g/L)) was added to the reactor. The content of the reactor was then pumped to PC and to the DC. Excess liquid was removed from the DC reactor to the waste vessel. While the SHIME[®] was operated according to its standard parameters during the stabilization and control period (Day -14 to 0 and Day 0 to 14), cRG-I was added at 7.14 g/L in the nutritional medium between Days 14 to 35. Upon repeated administration (three times per day) and upon dilution with bile/pancreatic juice during each feeding cycle (140/200 ratio), this would thus result in a theoretical maximal concentration of 5 g/L in the PC and DC region.

To ensure proper operation of the SHIME model and avoid potential issues with stability over time, quality control was performed according to in-house procedures. Briefly, this involved a weekly verification of the accuracy of pumped volumes via a mock feeding cycle (allowing to verify the accuracy of pumped nutritional medium and bile/pancreatic fluid) together with a weekly check of the pH value inside the reactors via an external pH probe (Senseline pH meter F410 (ProSense, Oosterhout, The Netherlands).

2.3. Microbial Activity Analysis

The SHIME software (ProDigest, Ghent University, Ghent, Belgium) allowed for the online monitoring of base (0.5M NaOH) and acid (0.5 M HCl) consumption that was required to control the pH within the desired interval (5.7–5.9 for PC and 6.6–6.9 for DC). Therefore, a first indication on microbial activity was obtained via calculating the 'base–acid consumption' (mL/day). Short-chain fatty acid (SCFA; acetate, propionate, and butyrate) and branched-chain fatty acids levels (bCFA: sum of isobutyrate, isovalerate, and isocaproate) were measured using the GC-FID method described by De Weirdt et al. [41]. This method involves the extraction of SCFA from samples with diethyl ether after the addition of 2-methyl hexanoic acid as an internal standard. Finally, ammonium was quantified via steam distillation, followed by titrimetric determination with HCl [42].

2.4. Microbial Composition Analysis

DNA was extracted from pelleted bacterial cells derived from a 1 mL sample as described by Boon et al. [43] with modifications implemented by Duysburgh et al. [44]. Samples were collected on the final day of the control and treatment periods. Microbial community profiling via 16S-rDNA targeted Illumina sequencing (LGC Genomics GmbH, Berlin, Germany) was performed as described recently [27]. As described in [45,46], the sequencing analysis was adapted from the MiSeq protocol for read assembly and cleanup using the mothur software (v. 1.39.5) according to following procedures. First, reads were assembled into contigs, followed by alignment-based quality filtering via alignment to the mothur-reconstructed SILVA SEED alignment (v. 123). Upon removing chimeras, taxonomy was assigned via a naïve Bayesian classifier [47] and RDP release 14 [48]. Finally, contigs were clustered into OTUs at 97% sequence similarity. Across samples, the total number of raw reads was on average 75,210 (minimum = 22,312; maximum = 144,386), while the final number of combined reads was on average 35,116 (minimum 10484; maximum 66,947). Rarefaction curves were made with the software Past 4.03 [49] to confirm that the sequencing depth allowed to grasp the microbial diversity of samples of the four investigated regions (lumen and mucus of simulated proximal and distal colon). For each OTU, representative sequences were selected as the most abundant sequence within that OTU. The obtained results were presented as proportional values (accounting for the total amount of sequences within each sample) at different taxonomic entities (phylum, family, and OTU level). The proportional phylogenetic information was combined with an accurate quantification of the total amount of cells via flow cytometry to obtain a quantification of each of the aforementioned three taxonomic levels. Flow cytometry was performed as described by Van den Abbeele et al. [27]. Briefly, upon dilution in Dulbecco's Phosphate-buffered Saline (DPBS) (Sigma-Aldrich, Bornem, Belgium) and staining with 0.01 mM SYTO24 (Life Technologies Europe, Merelbeke, Belgium), samples were analyzed

on a BD Facsverse (BDBiosciences, Erembodegem, Belgium) and analyzed using FlowJo, version 10.5.2. The strength of combining sequencing data with cell counts is that samples with different cell densities can be compared more optimally [50]. It should be noted that the data obtained after multiplying sequencing data (%) with cell numbers derived from flow cytometry (cells/mL) result in an amount of a given taxonomic group (cells/mL).

This should be considered as an estimated amount given that the output of the sequencing analysis in reads is also only providing an estimated abundance since one microbial cell can have multiple copies of the 16S rRNA gene and the number of copies can also differ between microbial species.

2.5. Bifidobacteria Growth Experiments on cRG-I

An additional experiment was performed to assess the potential growth of 20 *Bifidobacterium* strains on cRG-I (Table S2). For this purpose, the various strains were grown on LMG medium 144 agar (composition (g/L): special peptone (23), soluble starch (1), NaCl (5), cysteine hydrochloride (0.3), glucose (5), agar (15)) containing glucose (positive control), without glucose (negative control), or with cRG-I (0.5% w/v) instead of glucose (n = 2). Per plate, $2 \times 50 \mu$ L of cell suspension was inoculated. Inocula were prepared by suspending cells from 48 h old cultures from the second or third generation on LMG medium 144 in saline (0.85% w/v). Results were read after 72 h of incubation at 37 °C under anaerobic conditions. Growth on cRG-I was scored after visual comparison to the positive and negative controls by one and the same researcher.

2.6. Statistics

For exploratory data analysis, principal component analysis (PCA) was performed for both metabolic (acidification, acetate, propionate, butyrate, bCFA, and ammonium) and compositional data (10 most abundant families as detected via 16S rDNA-targeted Illumina sequencing across all samples, i.e., *Bifidobacteriaceae*, *Bacteroidaceae*, *Prevotellaceae*, *Acidaminococcaceae*, *Lachnospiraceae*, *Ruminococcaceae*, *Veillonellaceae*, *Desulfovibrionaceae*, *Synergistaceae*, and *Akkermansiaceae*) via the online tool http://biit.cs.ut.ee/clustvis/ (accession date: 06/05/2021) [51]. The averages of each of the four donors were calculated for each readout, after which paired two-sided t-tests were performed to identify significant effects valid across donors. As there were, respectively, two and four comparisons for metabolic (=within PC and DC) and compositional endpoints (=within PC and DC, both for lumen and mucus), multiplicity was corrected using the Benjamini–Hochberg false discovery rate (FDR, with FDR = 0.10 for metabolic markers and FDR = 0.20 for 16S-targeted Illumina data) [52]. All calculations were carried out in Excel, while figures were prepared in the GraphPad Prism v9.1.1 software.

3. Results

3.1. cRG-I Consistently Stimulated Microbial Activity in the Simulated Proximal and Distal Colon of Four Human Adults Tested in the Quad-M-SHIME

To gain insight into overall changes of microbial activity upon cRG-I treatment, the data were presented in two ways: (i) PCAs (Figure 2) and (ii) longitudinal SCFA levels as normalized versus the control period (Figures 3 and S1). Additionally, non-normalized data are presented as supplementary information (Figure S2).

First, the PCAs based on the metabolic data explained a great part of the overall variation, i.e., 95.6% and 89.3% for the PC and DC, respectively. This observation stressed that both PCAs provide optimal insight in the factors underlying variation. A first factor included the interindividual differences among the four donors tested. Already at baseline, the samples of donors 1/2 and donors 3/4 located together, due to the higher butyrate production by the microbiota of donors 1/2, as opposed to higher propionate production by the microbiota of donors 3/4 (Figure S2).



Figure 2. Principal component analysis (PCA) based on microbial metabolic activity in the proximal (**A**) and distal (**B**) colon during the control and treatment with cRG-I, as tested for four human adult donors 1, 2, 3, and 4 in the quad-M-SHIME. The PCA is based on the average values for each donor and for each experimental week (5 weeks: 2 control weeks (C1/C2) and 3 treatment weeks (TR1/TR2/TR3)). The following data were included: acidification, acetate, propionate, butyrate, ammonium, and bCFA. Arrows indicate the evolution of samples along the duration of the experiment. bCFA = branched-chain fatty acids, cRG-I = carrot-derived Rhamnogalacturonan I.



Figure 3. Effect of fermentation of cRG-I on SCFA production in the simulated proximal and distal colon during both the control (Days 0–14) and treatment period (Days 14–35) of the quad-M-SHIME for Donors 1 (panels **A** and **C**) and 3 (panels **B** and **D**). Data are expressed as normalized values versus the average of the control period. Donor A and C results are representative of those obtained for Donors B and D, respectively (see Supplementary Figure S1). Arrows indicate the start of the cRG-I reatment. cRG-I = carrot-derived Rhamnogalacturonan I, DC = distal colon, PC = proximal colon. The absolute values on which the normalized concentrations are based are shown in Figure S2 panels A/C/E/G.

A second key factor driving differences in the dataset was cRG-I treatment. While in both PCAs, samples of the two control weeks (C1/C2) positioned together, cRG-I treatment induced a marked shift along the PC2 axis (Figure 2A) and along both PC1/PC2 axes for the simulated PC and DC, respectively (Figure 2B). This was confirmed by the marked increase of normalized SCFA production from the first day of cRG-I treatment onwards (Day 14), for each of the four donors tested (Figure 3). The treatment effect of cRG-I became more pronounced during the first treatment week, after which it remained relatively stable. When averaging the values obtained during the final control and final treatment week (during which a steady-state was reached as visualized in Figure 3) across each of the four donors tested, cRG-I significantly increased acidification in both simulated colon regions (Figure 4A) due to the marked increase of both acetate (Figure 4), propionate (Figure 4C), and butyrate production (Figure 4D). Further, cRG-I significantly decreased bCFA levels in both PC and DC (Figure 4E).



Figure 4. Effect of fermentation of cRG-I on microbial activity in the simulated proximal and distal colon of the quad-M-SHIME during both the control (Days 9–14) and treatment period (Days 30–35). Average (\pm SEM) acidification (base-acid consumption in mL/d; (**A**), acetate (**B**), propionate (**C**), butyrate (**D**), bCFA (**E**), and ammonium-N levels (**F**) across four human adult donors tested (*n* = 4). Statistically significant differences between samples collected during the final control and treatment week are indicated by * (*p* < 0.05). bCFA = branched-chain fatty acids, cRG-I = carrot-derived Rhamnogalacturonan I, DC = distal colon, PC = proximal colon.

3.2. cRG-I Consistently Modulated Luminal and Mucosal Microbiota Composition in the Simulated Proximal and Distal Colon of Four Human Adults as Tested in the Quad-M-SHIME

To gain insight into microbial composition changes upon cRG-I treatment, luminal microbiota composition was first presented at phylum level, both as proportional (Figure 5A) and absolute levels (Figure 5B). This revealed that cRG-I largely increased the total number of microbial cells, in both PC and DC of all donors tested, suggesting that proportional numbers would obscure the true impact of cRG-I on microbial composition. Indeed, while *Actinobacteria*, e.g., increased in absolute numbers in the PC of Donor 1, the proportion of *Actinobacteria* in this environment decreased. Therefore, analysis of the luminal microbiota at lower taxonomic levels (family and OTU) was performed based on absolute data. In contrast, mucosal microbiota analysis was performed based on proportional data



(Figure 5C) as flow cytometry analysis (as described in this paper) does not allow for accurate quantification of microbial cells in mucin-adhered microbiota [27].

Figure 5. Effect of cRG-I on microbial composition (phylum level) in the lumen (log cells/mL as estimated via multiplying total cell counts (cells/mL) with 16S rRNA gene profiling (%)) (**A**,**B**) and mucus (%) (**C**) of the simulated proximal and distal colon of the quad-M-SHIME at the end of the control (C: Day 14) and treatment period (TR: Day 35). Average absolute (cells/mL as estimated via multiplying total cell counts (cells/mL) with 16S rRNA gene profiling (%)) (**A**) and proportional (%) (**B**,**C**) levels of different phyla are shown for each of the four human adult donors tested (*n* = 3 for donor 1, 2, 3, and 4; samples collected during the last control and treatment week). cRG-I = carrot-derived Rhamnogalacturonan I, DC = distal colon, PC = proximal colon.

Like for metabolites, PCAs based on microbiota composition explained a large part of the variation in the dataset, i.e., 67.1% and 58.7% for the luminal and mucosal microbiota, respectively (Figure 6A,B). A key factor, both in the lumen and mucus, was the difference between PC and DC microbiota. Further, interindividual differences among the four donors followed from a consistent positioning of samples of a given donor along PC1, i.e., samples of donors, 1, 2, 3, and 4 clustered from left to right along PC1. The samples of donors 1/2 located together, due to the higher levels of *Bifidobacteriaceae* (~40%) and *Lachnospiraceae* (~25%), while samples of donors 3/4 clustered together given the high proportion of *Veilonellaceae* (~60%) (Table S1).

A key factor driving differences in microbial composition was cRG-I treatment. Upon initiation of cRG-I treatment, a marked shift along PC2 was observed for the luminal samples, in both PC and DC, indicating a consistent treatment effect of cRG-I on the luminal microbiota in the PC and DC regions (Figure 6A). The treatment effect of cRG-I on the luminal microbiota was confirmed to be consistent among the four donors tested, both at family (Table 1) and at OTU levels (Table 2), as illustrated by several statistically significant increases across donors (despite the noise caused by interpersonal differences in microbiome composition). A first statistically supported finding was that while overall

Bifidobacteriaceae levels were not impacted, cRG-I strongly increased a specific OTU10 related to B. longum, seemingly at the expense of OTU8 related to B. bifidum. Further, there was a significant increase of Bacteroidetes upon cRG-I treatment, which was mainly driven by the marked increase of *Bacteroidaceae* and *Prevotellaceae* both in the PC and DC. At the OTU level, this could be explained by the significant increase of an OTU2 related to Prevotella sp. and an OTU6 related to Bacteroides dorei. In contrast, the levels of an OTU17 related to Bacteroides massiliensis decreased in the DC. Within the Firmicutes phylum, cRG-I significantly increased proximal levels of Acidaminococcaceae (~OTU11 related to Phascolarctobacterium faecium), Lachnospiraceae (~OTU9 related to Lachnoclostridium sp.), and Ruminococcaceae, while also increasing distal levels of Erysipelotrichaceae and Lachnospiraceae (~OTU5 related to Clostridium clostridioforme/bolteae). Finally, in the DC, cRG-I significantly increased Xanthomonadaceae, while decreasing Ruminococcaceae and Synergistaceae.

In contrast to the lumen, treatment effects on the mucosal microbiota were less pronounced (Figure 6B). Nevertheless, significant changes in the mucosal microbiota were in line with those observed in the lumen. At the OTU level, cRG-I increased OTU10 related to *B. longum* and OTU2 related to *Prevotella* sp. both in the PC and DC. This was at the expense of OTU8 (related to *B. bifidum*) in both simulated colon regions and at the expense of OTU5 (related to Clostridium clostridioforme/bolteae) in the PC.

3.3. Bifidobacterium Strains Are Unable to Ferment cRG-I as Such

To assess the potential contribution of *Bifidobacterium* sp. to cRG-I fermentation, a growth experiment on solid medium was performed with single strains (Table S2). Upon 72 h incubation with glucose, all 20 strains (belonging to 10 species) were able to grow, while no growth was observed in absence of glucose. When cRG-I was provided as a sole carbon source, none of the strains showed clear growth (three strains revealed unclear growth). This supports that Bifidobacterium strains are unable to ferment cRG-I as such.



Figure 6. Principal component analysis (PCA) based on luminal (A) or mucosal (B) microbial composition in the proximal and distal colon of the quad-M-SHIME at the end of the control (C: Day 14) and treatment period (TR: Day 35). The PCA is based on data of the 10 most abundant families as detected via 16S-targeted Illumina sequencing across all samples. Arrows indicate the chronological evolution of samples along the experiment. cRG-I = carrot-derived Rhamnogalacturonan I, DC = distal colon, PC = proximal colon.

B. Mucus

Table 1. Effect of cRG-I on microbial composition at family level in the lumen (log cells/mL as estimated via multiplying total cell counts (cells/mL) with 16S rRNA gene profiling (%)) and mucus (%) of the simulated proximal (PC) and distal colon (DC) of the quad-M-SHIME. Values presented are the averages of the differences at the end of the treatment period (Day 35) versus those at the end of the control period (Day 14) across the four human adult donors tested (n = 4). As a result, positive or negative values indicate families that are increased or decreased, respectively, upon cRG-I treatment. Statistical differences are indicated in bold.

| D1. 1 | E | Lumen | | Mucus | | |
|-----------------|---------------------|-------|-------|--------|--------|--|
| Phylum | Family | РС | DC | PC | DC | |
| | Atopobiaceae | 0.43 | 0.30 | 0.11% | 0.02% | |
| A (* 1 (* | Bifidobacteriaceae | 0.30 | 0.02 | -6.00% | 3.98% | |
| Actinobacteria | Coriobacteriaceae | 0.23 | -0.02 | 2.16% | -0.41% | |
| | Eggerthellaceae | 0.00 | -0.17 | 0.00% | -0.02% | |
| | Bacteroidaceae | 0.61 | 0.33 | 3.99% | -2.81% | |
| | Barnesiellaceae | 0.00 | 0.27 | 0.00% | 0.05% | |
| | Marinifilaceae | 0.00 | 0.01 | 0.00% | 0.01% | |
| Bacteroidetes | Muribaculaceae | 0.00 | -0.01 | 0.00% | 0.02% | |
| | Prevotellaceae | 0.52 | 0.69 | 7.55% | 1.85% | |
| | Rikenellaceae | -0.02 | 0.07 | -0.07% | -0.30% | |
| | Tannerellaceae | 0.38 | -0.10 | -0.12% | -0.03% | |
| | Acidaminococcaceae | 0.47 | 0.39 | 0.46% | 0.16% | |
| | Christensenellaceae | 0.00 | 0.44 | 0.01% | 0.21% | |
| | Clostridiaceae | 0.00 | 0.00 | -0.01% | -1.00% | |
| | Erysipelotrichaceae | 0.16 | 0.68 | 0.22% | 0.18% | |
| Firmicutes | Family XIII | 0.00 | 0.01 | 0.00% | -0.03% | |
| Firmicutes | Lachnospiraceae | 0.24 | 0.19 | -3.83% | 0.96% | |
| | Lactobacillaceae | 0.00 | 0.03 | -0.15% | 0.02% | |
| | Ruminococcaceae | 0.43 | -0.21 | 0.08% | -1.15% | |
| | Staphylococcaceae | 0.03 | 0.19 | 0.01% | 0.07% | |
| | Veillonellaceae | -0.08 | -0.13 | -7.19% | 1.41% | |
| | Burkholderiaceae | 0.18 | 0.12 | -0.36% | -0.36% | |
| | Desulfovibrionaceae | -0.28 | -0.06 | -0.60% | -0.75% | |
| Proteobacteria | Enterobacteriaceae | 0.06 | 0.25 | 0.32% | -0.27% | |
| 1 IOLEODACLEITA | Pseudomonadaceae | 0.00 | 0.00 | -0.01% | 0.00% | |
| | uncultured | 0.00 | 0.64 | 0.00% | 0.20% | |
| | Xanthomonadaceae | 0.39 | 0.42 | 0.04% | 0.00% | |
| Synergistetes | Synergistaceae | 0.54 | -0.09 | 3.36% | -0.22% | |
| Verrucomicrobia | Akkermansiaceae | 0.00 | -0.09 | 0.00% | -0.01% | |

Table 2. Effect of cRG-I on microbial composition (25 most abundant OTUs across all samples) in the lumen (log cells/mL as estimated via multiplying total cell counts (cells/mL) with 16S rRNA gene profiling (%)) and mucus (%) of the simulated proximal (PC) and distal colon (DC) of the quad-M-SHIME. Values presented are the averages of the differences at the end of the treatment period (Day 35) versus those at the end of the control period (Day 14) across the four human adult donors tested (n = 4). As a result, positive values indicate that a given OTU is increased upon cRG-I treatment. Statistical differences are indicated in bold.

| Phylum | Family | ΟΤυ | Related Species | Lumen | | Mucus | |
|----------------|--------------------|---------------------------|---|---|---|---|--|
| | | | | PC | DC | PC | DC |
| Actinobacteria | Bifidobacteriaceae | 1 8 10 | Bifidobacterium adolescentis Bifidobacterium bifidum Bifidobacterium longum | 0.26 0.56 1.32 | -0.01 - 0.84 1.05 | -1.03% - 9.28% 4.13% | 6.64% 5.96% 3.23% |
| | Coriobacteriaceae | 12 | Collinsella aerofaciens | 0.23 | -0.02 | 2.16% | -0.41% |
| Bacteroidetes | Bacteroidaceae | 6 16 28 17 13 | Bacteroides dorei Bacteroides ovatus Bacteroides fragilis Bacteroides massiliensis Bacteroides intestinalis | 0.83 -0.38 -0.58 -0.25 -0.19 | 0.73 0.03 -0.80 - 0.57 0.02 | 5.22% -0.22% -0.29% -1.12% -0.17% | $\begin{array}{c} -0.14\% \\ 0.04\% \\ -2.09\% \\ -1.25\% \\ 0.20\% \end{array}$ |
| | Prevotellaceae | 2 | Prevotella sp. | 0.52 | 0.69 | 7.55% | 1.85% |

| Phylum | Family | OTU | | Lumen | | Mucus | |
|-----------------|--------------------|-----|--|-------|-------|--------|--------|
| | | | Related Species - | РС | DC | PC | DC |
| Firmicutes | Acidaminococcaceae | 11 | Phascolarctobacterium faecium | 0.47 | 0.39 | 0.46% | 0.16% |
| | Clostridiaceae | 32 | Clostridium butyricum | 0.00 | 0.00 | -0.01% | -0.98% |
| | Lachnospiraceae | 5 | Clostridium clostridioforme/bolteae | 0.04 | 0.15 | -3.74% | 2.27% |
| | | 9 | Lachnoclostridium sp. | 0.57 | 0.16 | -2.16% | -0.09% |
| | | 14 | Eubacterium contortum | 0.00 | 0.04 | 0.00% | -1.44% |
| | | 25 | Clostridium sp. | 0.34 | 0.32 | 0.10% | 0.11% |
| | Ruminococcaceae | 19 | Gemmiger formicilis | 0.36 | -0.05 | 0.06% | -0.74% |
| | | 42 | Faecalibacterium prausnitzii | 0.00 | 0.00 | 0.00% | -0.10% |
| | Veillonellaceae | 3 | Megamonas funiformis | 0.05 | -0.01 | -1.70% | 0.52% |
| | | 4 | Megamonas funiformis | 0.06 | 0.01 | -0.26% | 1.21% |
| | | 18 | Megasphaera sp. | -0.05 | -0.13 | -1.78% | -0.02% |
| | | 26 | Anaeroglobus geminatus | -0.01 | -0.24 | -1.49% | -0.21% |
| Proteobacteria | Pseudomonadaceae | 15 | Pseudomonas aeruginosa | 0.31 | -0.06 | 0.04% | -1.88% |
| Synergistetes | Synergistaceae | 7 | Cloacibacillus sp. | 0.54 | -0.09 | 3.36% | 0.04% |
| Verrucomicrobia | Akkermansiaceae | 20 | Akkermansia muciniphila | 0.00 | -0.09 | 0.00% | -0.01% |

Table 2. Cont.

4. Discussion

Overall, the proper operation of the SHIME[®] model during the current study followed from the stability of metabolic markers throughout the two-week control period that preceded the treatment period (Figure 2). In absence of a parallel control, such stability was required to ascribe changes during the treatment period by cRG-I treatment. On the final day of the control period, there were marked interindividual differences among donors, both at metabolic (Figure 2) and community composition level (Figure 6). The microbiota of donors 1/2 was enriched with Bifidobacteriaceae/Lachnospiraceae (Table S1) and produced higher amounts of butyrate (Figure S2). While Bifidobacterium sp. do not produce butyrate as such, they stimulate butyrate production by, e.g., Lachnospiraceae members via cross-feeding mechanisms [53,54]. In contrast, the microbiota of donors 3/4 was enriched with Veillonellaceae (Table S1) and produced high amounts of propionate. Veillonella species are indeed known to convert lactate to acetate and propionate as main end-metabolites [55]. The four donors under investigation thus allowed addressing the hypothesis whether differences in initial microbiota composition affected the outcomes of cRG-I treatment. Remarkably, cRG-I consistently stimulated microbial activity across the four donors tested with increases in average levels of acetate (+21.1 mM), propionate (+17.6 mM), and to a lesser extent also butyrate (+4.1 mM) despite baseline interindividual variability. This finding is consistent with a recent in vitro batch fermentation study that demonstrated acetate and propionate as main end-metabolites upon fermentation of cRG-I [27]. We deliberately averaged the individual microbiota data to assess if we could identify overarching changes in the microbiota composition independently of the baseline starting point and found that this was indeed the case. The consistent modulation of microbial activity and composition thus suggests that cRG-I is fermented by a specific microbial consortium.

First, cRG-I consistently and strongly stimulated OTUs related to *B. dorei* and *Prevotella* sp. This specific increase of OTUs related to *B. dorei* and *Prevotella* sp. was also observed previously with the same compound [27]. Interestingly, when dosing pectin to in vitro fermenters, Chung et al. also identified a specific increase of *B. dorei* (detected as an OTU combined with *B. vulgatus*) amongst other members of a mixed microbiota [35]. The genera *Bacteroides* and *Prevotella* are indeed known as primary pectin degraders, possessing carbohydrate-active enzymes (CAZymes) within their polysaccharide utilization loci (PUL) [12,56]. Specifically for RG-I fermentation, *Bacteroides thetaiotaomicron* has been demonstrated to ferment RG-I via several PULs, releasing polysaccharide breakdown products in the culture medium, making them available for other microbes [25]. While several *Bacteroides* species might be capable of fermenting cRG-I, *B. dorei* seems the most

capable species in the presence of a competitive background microbiota. This is supported by the genetic potential of *B. dorei* containing over 50 predicted enzymes related to pectin degradation [57]. At metabolic level, as *Bacteroides* sp. are major producers of acetate and propionate [58], the marked increase of both metabolites upon cRG-I treatment further corroborated the involvement of *Bacteroides* sp. Besides the well-described health benefits of both SCFA as reviewed by Rivière et al. [7], the presence of *B. dorei* as such could contribute to other health benefits. Inhibition of atherosclerotic lesion formation, lower endotoxemia, and suppression of proinflammatory responses have been observed in atherosclerosis-prone mice upon co-administration of live *B. vulgatus* and *B. dorei* to mice [59].

Upon cRG-I fermentation by primary degraders, polysaccharide breakdown products likely become available for other microbial species. Microbial members benefiting from such polysaccharide breakdown products included Bifidobacterium longum of which a related OTU strongly increased upon cRG-I treatment ($+1.32 \log_{10}(\text{cells/mL})$). Even though the overall Bifidobacteriaceae family did not increase in this experiment, there was a clear stimulation of *B. longum* as previously observed in batch fermentations with cRG-I [27]. Additional growth experiments indicated that monocultures of *Bifidobacterium* species are unable to grow on cRG-I as a sole carbon source but are part of the bacterial consortium needed to ferment the complex cRG-I structure. This is in line with Chung et al., who did not identify any predicted enzymes concerned with pectin degradation in Bifidobacteriaceae sp. [57]. Moreover, this is also in agreement with the conclusion of Kelly et al. that the complexity of pectin is likely too high for Bifidobacteriaceae, rendering them dependent on the initial degradation of these large polymers by *Bacteroides* sp. [15]. The released oligo- and monosaccharides could further be then scavenged by Bifidobacteriaceae that indeed are capable of fermenting arabinans and galactans [60,61], both side chains of cRG-I [26]. While likely not being the primary degraders, the consistent increase of *Bifidobacteriaceae* species in this or preceding studies [27], along with the well-documented health effects of members of this family [15], support the health-promoting potential of cRG-I fermentation by the human gut microbiota.

Another microbial member that is likely part of the cRG-I fermenting consortium is *Phascolarctobacterium faecium* as an OTU related to this species increased consistently over the four donors tested (+0.47 log₁₀(cells/mL)). The stimulation of this species likely followed from the succinate production of aforementioned *Prevotella* sp. [62] or *Bacteroides* sp. [58], thus boosting *Phascolarctobacterium faecium*, an abundant colonizer [63] that is able to convert succinate into propionate [64]. Besides further contributing to health effects ascribed to propionate such as exerting anti-inflammatory effects, promoting satiety, lowering blood cholesterol, decreasing liver lipogenesis, and improving insulin sensitivity (as reviewed by Rivière et al. [7]), the presence of *Phascolarctobacterium faecium* has for instance also been linked to a positive mood [65], further supporting the health-promoting potential of cRG-I fermentation by the human gut microbiota.

Other microbial families that consistently increased across the four donors tested included *Erysipelotrichaceae* (DC), *Lachnospiraceae* (PC and DC), and *Ruminococcaceae* (PC). These changes correlated with the modest increases in butyrate levels that were observed upon cRG-I treatment, butyrate being indeed produced by members belonging to these families [58]. Overall, the consistency of the changes across these families further supports the contribution of a specialized consortium in cRG-I fermentation.

As mentioned above, the first cRG-I fecal fermentation experiment was conducted in a 2-day batch incubation model [27]. Interestingly, results obtained in the batch and quad-M-SHIME in vitro models with cRG-I were consistent at metabolic and compositional levels, resulting in high levels of acetate and propionate via the involvement of *Bacteroides dorei*, *Prevotella* sp., and *Bifidobacterium longum*-related OTUs. Both studies also indicated the involvement of succinate scavengers, i.e., *Phasolarctobacterium faecium* (quad-M-SHIME) and *Dialister succinatiphilus* (batch incubation). A difference between both models was that the batch incubation strategy allowed the observation of effects of cRG-I treatment on a

broader range of microbes. It was shown that cRG-I also stimulated other *Bacteroides* sp. beyond B. dorei, i.e., B. ovatus, B. plebeius, and B. xylanisolvens, while also boosting two F. prausnitzii OTUs and an OTU related to R. hominis that profoundly increased in mucus from 9.8% in the blank up to 64.3% upon cRG-I treatment (27). That the batch incubation strategy allowed to observe effects on a broader range of microbes is likely explained by the fact that in batch fermentations, in vivo-derived fecal microbiota in its maximal diversity is used as direct inoculum, an approach of which the biorelevance is supported by the minor spatial differences along the colon according to recent in vivo studies [66]. In contrast, long-term in vitro experiments involve a pre-growth of the in vivo-derived inoculum under fixed laboratory conditions for several days up to weeks (as in the current study). While this results in a stable microbiota at the start of the treatment, such pregrowth decreases the diversity by around 50%, mostly due to washout of *Clostridium* cluster IV and XIVa members (including F. prausnitzii and R. hominis) [67]. This likely explains why the treatment effects of cRG-I on F. prausnitzii and R. hominis observed in batch fermentations were not recapitulated in the quad-M-SHIME. While Clostridium cluster IV and XIVa members can be more optimally maintained in in vitro gut models by including a simulation of the mucosal environment, as was shown during 3-day experiments [38], frequent replacement of the mucosal beads results in loss of species-specific colonization of the mucus layer [39], likely due to limited cross-spreading between old and new mucin beads or due to physical opening of reactors to replace mucin beads. This was confirmed in the current study where despite inclusion of a mucosal microbiota simulation, no OTUs related to, e.g., R. hominis were detected in any of the donors at the start of the treatment (after 4 weeks of pre-growth), impairing the observation of treatment effects on such mucosal microbes. The washout of true mucosal microbes upon long pre-growth periods could potentially also explain why treatment effects on lumen and mucus were relatively similar during the current study. Despite such differences between both in vitro models, many findings were consistent and provided confidence in the robustness of (i) the observed impact of cRG-I on the human gut microbiota and (ii) the use of both types of in vitro gut models in gut microbiome research. While the added value of in vitro gastrointestinal models is currently well-recognized [68], it is acknowledged that they mimic only partly the complexity of the gut ecosystem. Nevertheless, confidence in both in vitro gut models is further provided by the observation of similar shifts in microbial community composition during a recent clinical trial in which RG-I was dosed at 0.3 or 1.5 g/day to the daily diet (manuscript in preparation).

Finally, a critical remark on the limitation of the applied experimental design is that the reference to which treatment effects were compared consisted of a preceding control period. Such longitudinal control is common in a SHIME setup [69–71], and the stability of in vitro communities upon applying a 2-week stabilization period has previously been demonstrated [67]. It would have been ideal to follow the stability of the microbial communities during the entire duration of the current study by means of incorporating four additional untreated parallel control arms. As the purpose of the present study was to assess the consistency of the impact of cRG-I on individual fecal samples, such a control would not optimally be performed with a single pooled fecal sample. It was therefore important to start with well-characterized and stable individual microbial communities.

5. Conclusions

Overall, this study confirms the potential of cRG-I to beneficially modulate the human gut microbiome with a marked consistency in SCFA production and microbial modulation across simulated human subjects displaying individual variability at baseline. High amounts of acetate and propionate were produced due to the involvement of a specialized consortium consisting of, amongst others, strains belonging to *Bacteroides dorei*, *Prevotella* sp., and *Bifidobacterium longum*. Due to its structural complexity, cRG-I corresponds to a unique polysaccharide demonstrating prebiotic properties supported by a concomitant effect on the host microbiota and immune system (26). As a next step, it will be necessary to link the changes in microbiota composition and metabolite production to a discrete health benefit in well-designed human trials and altogether verify the predictivity of the data generated in vitro in the described study.

Supplementary Materials: The following are available online at https://www.mdpi.com/article/10.3390/microorganisms9102142/s1, Figure S1. Effect of fermentation of cRG-I on SCFA production for donors 2 and 4, Figure S2. Effect of fermentation of cRG-I on absolute SCFA levels for donors 1, 2, 3 and 4, Table S1. Microbial composition in the lumen (%) of the simulated proximal and distal colon of the quad-M-SHIME, Table S2. Growth of single *Bifidobacterium* strains in LMG medium 144 with glucose (positive control), without carbon source (negative control), and with cRG-I (0.5% *w/v*).

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