Microbial enterotypes beyond genus level: Bacteroides species as a predictive biomarker for weight change upon controlled intervention with arabinoxylan oligosaccharides in overweight subjects

Christensen, Lars; Sørensen, Claudia Vodstrup; Wøhlk, Frederikke U; Kjølbæk, Louise; Astrup, Arne; Sanz, Yolanda; Hjorth, Mads Fiiil; Benítez-Páez, Alfonso

Published in:
Gut Microbes

DOI:
10.1080/19490976.2020.1847627

Publication date:
2020

Document version
Publisher's PDF, also known as Version of record

Document license:
CC BY-NC

Citation for published version (APA):
Microbial enterotypes beyond genus level: *Bacteroides* species as a predictive biomarker for weight change upon controlled intervention with arabinoxylan oligosaccharides in overweight subjects

Lars Christensen, Claudia V. Sørensen, Frederikke U. Wøhlk, Louise Kjølbæk, Arne Astrup, Yolanda Sanz, Mads F. Hjorth & Alfonso Benítez-Páez

To cite this article: Lars Christensen, Claudia V. Sørensen, Frederikke U. Wøhlk, Louise Kjølbæk, Arne Astrup, Yolanda Sanz, Mads F. Hjorth & Alfonso Benítez-Páez (2020) Microbial enterotypes beyond genus level: *Bacteroides* species as a predictive biomarker for weight change upon controlled intervention with arabinoxylan oligosaccharides in overweight subjects, Gut Microbes, 12:1, 1847627, DOI: 10.1080/19490976.2020.1847627

To link to this article: https://doi.org/10.1080/19490976.2020.1847627
Microbial enterotypes beyond genus level: Bacteroides species as a predictive biomarker for weight change upon controlled intervention with arabinoxylan oligosaccharides in overweight subjects

Lars Christensen, Claudia V. Sørensen, Frederikke U. Wøhlk, Louise Kjølbæk, Arne Astrup, Yolanda Sanz, Mads F. Hjorth, and Alfonso Benítez-Páez

Department of Nutrition, Exercise and Sports, Faculty of Science, University of Copenhagen, Copenhagen, Denmark; Microbial Ecology, Nutrition & Health Research Unit, Institute of Agrochemistry and Food Technology, Spanish National Research Council (IATA-CSIC), Valencia, Spain; Host-Microbe Interactions in Metabolic Health Laboratory, Príncipe Felipe Research Centre (CIPF), Valencia, Spain

ABSTRACT
Recent studies indicate that microbial enterotypes may influence the beneficial effects of wholegrain enriched diets including bodyweight regulation. In a 4-week intervention trial, overweight subjects were randomized to consume either arabinoxylan-oligosaccharides (AXOS) (10.4 g/d) from wheat bran or polyunsaturated fatty acids (PUFA) (3.6 g/d). In the present study, we have stratified the subjects participating in the intervention (n = 29) according to the baseline Prevotella-to-Bacteroides (P/B) ratios through a post-hoc analysis and applied a linear mixed model analysis to identify the influence of this P/B ratio on the differences in weight changes in the intervention arms. Following AXOS consumption (n = 15), the high P/B group showed no bodyweight changes (−0.14 kg [95% CI: −0.67; 0.38], p = .59), while the low P/B group gained 0.65 kg (95% CI: 0.16; 1.14, p = .009). Consequently, a difference of −0.79 kg was found between P/B groups (95% CI: −1.51; −0.08, p = .03). No differences were found between P/B groups following PUFA consumption (0.61 kg, 95% CI: −0.13; 1.35, p = .10). Among the Bacteroides species, B. cellulosilyticus relative abundance exhibited the highest positive rank correlation (Kendall’s tau = 0.51, FDR p = .070) with 4-week weight change on AXOS, and such association was further supported by using supervised classification methods (Random Forest). We outlined several carbohydrate-active enzyme (CAZy) genes involved in xylan-binding and degradation to be enriched in B. cellulosilyticus genomes, as well as multiple accessory genes, suggesting a supreme AXOS-derived glycan scavenging role of such species. This post-hoc analysis, ensuring species and strain demarcation at the human gut microbiota, permitted to uncover the predictive role of Bacteroides species over P/B enterotype in weight gain during a fiber-based intervention. The results of this pilot trial pave the way for future assessments on fiber fermentation outputs from Bacteroides species affecting lipid metabolism in the host and with direct impact on adiposity, thus helping to design personalized interventions.

Introduction
As the prevalence of overweight and obesity has reached epidemic proportions globally over the past few decades, the search for causes and management approaches continues. Multiple dietary interventions have been tested on weight control; however, the efficacy of a specific diet over another has not been established. The limited evidence for the most effective diet has given rise to conclude that there is no “one diet fits all.” Thus, the conventional view that different people will respond similarly to a specific diet might be too simplistic and instead it is more likely that the success of a diet might be predicted based on specific individual characteristics, including the gut microbiota.

Identification of predictive traits for the anticipation of diet-based effects on weight loss is a matter of study, and microbial enterotypes have been suggested as promising biomarkers for such an aim. The Prevotella and Bacteroides enterotypes are characterized by different functionalities, where the Prevotella species are consistently associated with fiber-enriched diets due to their genetic ability to process complex carbohydrates of plant-origin. In support, Kovatcheva et al. found that subjects with a high P/B ratio specifically improved their enzymatic capacity for fiber digestion...
and glucose metabolism, when consuming a whole grain-rich diet. In four recent post-hoc analyses of studies conducted in Denmark, we have linked Prevotella abundance in the human gut microbiota to weight loss, when consuming whole grain and fiber-rich diet ad libitum. Specifically, the whole-grain fiber, arabinoxylan, is largely consumed as these are highly abundant in rye bread, a staple food item among Danish participants. On the other hand, Bacteroides is commonly associated with a "Western diet" low in fiber, and high in fat and refined sugars. However, the remarkable glycolytic potential of some Bacteroides species hinders the complete association of such microbes with fat-enriched diets and adiposity in humans. In our previous analyses, these subjects dominated by Bacteroides species have little weight control success when consuming diets rich in fiber and whole grain.

Therefore, we investigated the influence of enterotypes (inferred as the Prevotella-to-Bacteroides [P/B] ratio) in weight management of participants randomized to receive arabinoxylan oligosaccharides (AXOS) and polyunsaturated fatty acids (PUFA) for 4 weeks. We hypothesized that subjects with a higher P/B ratio (more abundant Prevotella content than Bacteroides) would improve body weight control on the AXOS supplemented diet (10.4 g/d) compared to the PUFA-enriched diet (3.6 g/d) that would serve as a negative control. Furthermore, as there is a large inter-individual variation in Bacteroides spp., with vastly different fermentation, and short-chain fatty acid (SCFA) potentials, we further hypothesized that few species with AXOS-degrading capacity specifically would predict body weight changes.

Results

P/B-ratio predicts weight change when consuming AXOS but not PUFA

From baseline fecal samples, 29 overweight participants were stratified by the median value of the Prevotella-to-Bacteroides (P/B) ratio (~0.81) into high P/B and low P/B groups. The baseline characteristics of the two P/B groups are presented in Table S1.

Following 4-week AXOS consumption (n = 15), the high P/B group was weight stable [−0.14 kg (95% CI: −0.67; 0.38, p = .59)], whereas the low P/B group had a weight gain of 0.65 kg (95% CI: 0.16; 1.14, p = .009). Consequently, a difference of −0.79 kg was found between P/B groups (95% CI: −1.51; −0.08, p = .030). To evaluate if the weight change was an enterotype-AXOS interaction effect, we used 4-week PUFA consumption as a negative control (n = 14), and found no difference in weight changes between the P/B groups (0.61 kg, 95% CI: −0.13; 1.35, p = .10). However, we observed different trends on PUFA than on AXOS; weight gain among high P/B subjects (0.41 kg, CI: −0.11; 0.94, p = .12) and weight maintenance among the low P/B subjects (−0.20 kg, CI: −0.72; 0.32, p = .45), but these were not significant (Figure 1). Accordingly, when comparing the weight changes on AXOS to PUFA between the P/B groups, a total difference of −1.41 kg was observed (95% CI: −2.44; −0.38, p = .007).

Following AXOS consumption, we found no differences in 4-week change for waist circumference, total energy intake, carbohydrate E%, or protein E% between P/B groups. However, a meaningful decrease in fat E% was observed in the high P/B

![Figure 1](image-url)
group (Table S2), but this did not explain changes in body weight (Kendall’s tau = 0.18, \(p = .342\)).

Lastly, to exclude a longitudinal effect of the enterotypes, we calculated fold change of the P/B ratio and correlated it with bodyweight change after 4-week AXOS consumption, and found no relation between the two (Kendall’s tau = –0.14, \(p = .49\)). AXOS produced a notable increase of Bifidobacterium species, but we found no evident correlation between its abundance and body weight changes at both time-points (Kendall’s tau = –0.01 and 0.32, \(p = 1.000\) and 0.102, respectively). Nonetheless, we did observe that changes in Bifidobacterium abundance was higher in low P/B subjects than in high P/B counterparts (414 ± 141 vs 963 ± 216 DNA reads, respectively, \(p = .039\)).

**Distinct Bacteroides species predicts body weight change when consuming AXOS**

Baseline P/B-ratio correlated with weight change after AXOS consumption (Kendall’s tau = –0.43, \(p = .029\)), but not after PUFA (Kendall’s tau = 0.34, \(p = .089\)) (Figure 2a-b). We then investigated whether the most prevalent Prevotella and Bacteroides species could further predict body weight following 4-week AXOS consumption (n = 15). We evaluated the abundance at the species-level, retrieved from shotgun DNA sequencing (see methods) for the 10 most abundant Bacteroides and Prevotella (metagenomic Operational Taxonomic Units) mOTUs in fecal samples (Table 1). The majority of the subjects harbored a high abundance of Bacteroides species, which is similar to previously characterized Westernized populations. Among the Bacteroides species, B. cellulosilyticus relative abundance exhibited the highest positive rank correlation with a 4-week weight change (Kendall’s tau = 0.51, \(p = .007\), FDR \(p = .070\)) (Figure 3a and Table 2). The importance of B. cellulosilyticus as a predictor variable for weight gain during AXOS intervention was further explored by executing supervised classification with the Random Forest algorithm. B. cellulosilyticus baseline abundance was found to be the most important predictor of body weight change among the top 10 Bacteroidetes species (INP = 2.00) and the P/B ratio (Figure 3b).

Lastly, we investigated whether fold changes of the 10 most abundant Bacteroides and Prevotella species differed between the low P/B and high P/B groups, but found no indications of differential effects for these species upon AXOS consumption.

**Baseline co-abundance analysis among the 30 most abundant species (all phyla)**

With B. cellulosilyticus pointed-out as a potential predictive biomarker of weight management on an AXOS-based diet, we wanted to identify additional and less evident predictors among other gut microbiota members. Therefore, a baseline co-abundance analysis using metagenomic data was applied to detect such species interacting positively or negatively with B. cellulosilyticus. B. cellulosilyticus was negatively correlated to two Clostridiales species; *Clostridium.sp. CAG.138* (Kendall’s tau = –0.54, FDR \(p = .04\)), and *Ruminococcus.sp.CAG.177*. (Kendall’s tau = –0.54, FDR \(p = .04\)), and was positively correlated with *Phascolarctobacterium.sp. (Kendall’s tau = 0.57, FDR \(p = .04\)).

There was no association between B. cellulosilyticus and P. copri; however, when introducing the strain-level information of P. copri defined as clades A, B, C, and D according to Tett and coworkers, we did find meaningful correlations. All four clades were detected in this westernized, overweight population, and the average proportions were for Clade A = 53.4%, B = 39%, C = 7.2%, and D = 0.4%. Clade B was positively associated with B. cellulosilyticus (Kendall’s tau = 0.61, adjusted \(p = .0066\)), while Clades A, C, and D all were inversely associated with B. cellulosilyticus (adjusted \(p \leq 0.037\)) (Figure 4a-d).

**Absolute quantification to confirm B. cellulosilyticus presence when consuming AXOS**

The qPCR-based approach to measure the presence of B. cellulosilyticus in baseline fecal DNA indicated that samples of subjects who controlled weight tended to have a lower abundance of this Bacteroides species (log\(_{10}\) rpoB molecules/ng DNA = 2.14 ± 0.81) when compared to samples derived from subjects who gained weight (3.46 ± 1.03) (\(p = .166\)). This difference was more evident in the samples after a 4-week intervention, where B. cellulosilyticus abundance increased 1.42-fold in the low P/B and weight-gain group (4.88 ± 0.76) whereas remained stable in the high P/B group (2.42 ± 0.82) (\(p = .23\)). Globally, the qPCR data fitted
well with the *B. cellulosilyticus* mOTU relative abundance in the entire set of samples at both time-points (Kendall’s tau = 0.54, \( p < .001 \)), but data correlation was higher at baseline (Kendall’s tau = 0.76, \( p < .001 \)). Three samples in each P/B group produced null detection of *B. cellulosilyticus*, but we cannot completely discard its presence in those given the limit of detection of our qPCR approach (~600 molecules rpoB per ng DNA). The \( \log_{10} \) average presence of *B. cellulosilyticus* among the three subjects with the largest weight gains (1.4, 2.0, and 2.0 kg) was \( 5.77 \pm 0.26 \) rpoB molecules/ng DNA.

**Figure 2.** Body weight changes from weeks 0 to 4 versus baseline \( \log_{10} \)-transformed P/B ratio for healthy, overweight subjects consuming either (a) AXOS (\( n = 15 \)) or (b) PUFA (\( n = 14 \)). Kendall correlation coefficient (tau) and \( p \)-value is shown. Vertical dashed gray lines at \( x = -0.81 \) (P/B median) separate the enterotype groups; Low P/B and High P/B. Linear regression line is depicted in red and respective confidence interval (95%) is drawn in gray. AXOS, arabinoxylan oligosaccharides; BW, body weight; P/B, *Prevotella*-to-*Bacteroides*; PUFA, polyunsaturated fatty acids.
Table 1. Top 10 most abundant Bacteroidetes mOTUs at baseline from overweight subjects (n = 15).

<table>
<thead>
<tr>
<th></th>
<th></th>
<th></th>
<th></th>
<th></th>
<th></th>
</tr>
</thead>
<tbody>
<tr>
<td>1</td>
<td>Bacteroides dorei/vulgatus</td>
<td>ref_mOTU_v2_0898</td>
<td>5.16%</td>
<td>1.56%</td>
<td>7.78%</td>
</tr>
<tr>
<td>2</td>
<td>Bacteroides uniformis</td>
<td>ref_mOTU_v2_0899</td>
<td>5.14%</td>
<td>3.18%</td>
<td>5.35%</td>
</tr>
<tr>
<td>3</td>
<td>Bacteroides fragilis/avatus</td>
<td>ref_mOTU_v2_1073</td>
<td>0.35%</td>
<td>0.07%</td>
<td>0.93%</td>
</tr>
<tr>
<td>4</td>
<td>Bacteroides xylanisolvens</td>
<td>ref_mOTU_v2_1072</td>
<td>0.32%</td>
<td>0.28%</td>
<td>0.35%</td>
</tr>
<tr>
<td>5</td>
<td>Bacteroides caccae</td>
<td>ref_mOTU_v2_1382</td>
<td>0.28%</td>
<td>0.28%</td>
<td>0.34%</td>
</tr>
<tr>
<td>6</td>
<td>Prevotella copri</td>
<td>ref_mOTU_v2_4448</td>
<td>0.12%</td>
<td>0.28%</td>
<td>0.54%</td>
</tr>
<tr>
<td>7</td>
<td>Bacteroides cellulosilyticus</td>
<td>ref_mOTU_v2_0692</td>
<td>0.03%</td>
<td>0.01%</td>
<td>0.16%</td>
</tr>
<tr>
<td>8</td>
<td>Bacteroides stercoris</td>
<td>ref_mOTU_v2_0275</td>
<td>0.03%</td>
<td>0.01%</td>
<td>0.05%</td>
</tr>
<tr>
<td>9</td>
<td>Bacteroides eggertii</td>
<td>ref_mOTU_v2_1410</td>
<td>0.01%</td>
<td>0.00%</td>
<td>0.01%</td>
</tr>
<tr>
<td>10</td>
<td>Bacteroides massiliensis</td>
<td>ref_mOTU_v2_0455</td>
<td>0.01%</td>
<td>0.00%</td>
<td>0.00%</td>
</tr>
</tbody>
</table>

[^1] Data expressed as median with interquartile distribution (Q1-Q3). R.A relative abundance.

Distinctive genetic traits on B. cellulosilyticus genomes

The searching for carbohydrate-active enzyme (CAZy) genes within polysaccharide utilization loci (PULs) present in more than 100 Bacteroides genomes (Table S3) permitted to evaluate the abundance of 212 CAZy families and accessory genes. Functional enrichment analysis indicated that 10 CAZy families are more prevalent and abundant in B. cellulosilyticus genomes (Table 3). These include CBM-containing enzymes associated with xylan binding (CBM13 and CBM22) and GHS mainly dedicated to xylanase and arabinofuranosidase activities (GH5, GH8, GH10, GH43, and GH79). Two PLs were also detected to be enriched in B. cellulosilyticus genomes and they were linked to glycosaminoglycan degradation (e.g., chondroitin-(sulfate) lyase, hyaluronate lyase, and heparin-sulfate lyase).

The functional assessment on the entire genomes using the Pfam annotation system permitted to assess the abundance of more than 3000 Pfam domains. The statistical test to determine the probable enrichment of such protein domains on B. cellulosilyticus genomes recovered 87 domain associations, and 54 of which had reliable functional annotations (Table 4). This analysis corroborated some previous observations during the CAZy gene survey. Thus, several domains associated with different GH and PL enzymes listed in Table 3, and related to xylan and glycosaminoglycan degradation were also retrieved (e.g., GH10, GH79, GH43, PL8) (Table 4). Moreover, we also observed that other domains linked to xylan binding and degradation were enriched in B. cellulosilyticus genomes (e.g., Glyco_hydro_30, CBM_6, Glyco_hydro_3, Bac_rhamnosid). Nevertheless, the glycan metabolism domains enriched in B. cellulosilyticus in comparison with other Bacteroides species is also accompanied by a higher abundance of polysaccharide degradation functions as well as of sensor and kinase subunits of several two-component systems specialized on carbohydrate uptake. Moreover, we detected an enrichment of some peptidase domains (Peptidase C25, Peptidase_M6 and Peptidase_C39), and domains of secreted proteins involved in adhesion (VCBS, fn3, Fn3-like), and flagella- and pilin-independent gliding motility (SprA_N and PorP_SprF).

Associating B. cellulosilyticus with metabolic changes when consuming AXOS

We investigated whether baseline B. cellulosilyticus relative abundance correlated with changes in fecal SCFA concentrations, as an indication of its influence on host health and/or bacterial cross-feeding; however, B. cellulosilyticus did not correlate with changes of SCFA concentrations. Lastly, when correlating this species with clinical parameters, we found a correlation between changes in total serum cholesterol concentrations (n = 14, Kendall’s tau = 0.44, p = 0.028), but this correlation was not significant after correction for multiple testing (Table S4).

Discussion

We demonstrate that a 4-week intake of AXOS resulted in a bodyweight change difference of 0.79 kg when comparing the low- and high-P/B groups, which
was driven by a significant 0.65 kg weight gain for the low P/B group. Distinct body weight trajectories may partially be explained by the differences in fat E% intake detected in both low- and high-P/B groups, but a direct correlation between fat intake and body weight change was not intuited. Beyond the genus-level P/B groups, we revealed that baseline *B. cellulosilyticus* abundance predicted weight gain with better precision than the P/B ratio. Besides body weight, we found indications of *B. cellulosilyticus* would affect host metabolism, as changes in total serum cholesterol levels could be associated to some extent with this *Bacteroides* species. Differential *Bifidobacterium* abundances
**Figure 4.** Correlations at baseline between log10-transformed *B. cellulosilyticus* with the four clades of the *Prevotella copri* complex (all log10-transformed): (a) Clade A, (b) Clade B, (c) Clade C, and (d) Clade D for subjects randomized to AXOS (n = 15). Kendall correlation coefficients and adjusted p-values (FDR) are shown. Linear regression line is depicted in red and respective confidence interval (95%) is drawn in gray.

**Table 2.** Baseline Bacteroidetes mOTU correlations with body weight change on the AXOS-enriched diet (n = 15).

<table>
<thead>
<tr>
<th>Abundant Bacteroidetes mOTUs</th>
<th>Kendall’s tau</th>
<th>p-value</th>
<th>FDR adjusted p-value</th>
</tr>
</thead>
<tbody>
<tr>
<td><em>Bacteroides cellulosilyticus</em></td>
<td>0.51</td>
<td>0.007**</td>
<td>0.070</td>
</tr>
<tr>
<td><em>Bacteroides fragilis/ovatus</em></td>
<td>0.44</td>
<td>0.022*</td>
<td>0.112</td>
</tr>
<tr>
<td><em>Bacteroides caccae</em></td>
<td>0.40</td>
<td>0.037*</td>
<td>0.123</td>
</tr>
<tr>
<td><em>Bacteroides eggerthii</em></td>
<td>0.38</td>
<td>0.051</td>
<td>0.128</td>
</tr>
<tr>
<td><em>Bacteroides dorei/vulgatus</em></td>
<td>0.28</td>
<td>0.136</td>
<td>0.272</td>
</tr>
<tr>
<td><em>Bacteroides massiliensis</em></td>
<td>−0.23</td>
<td>0.244</td>
<td>0.406</td>
</tr>
<tr>
<td><em>Bacteroides stercoris</em></td>
<td>0.11</td>
<td>0.584</td>
<td>0.649</td>
</tr>
<tr>
<td><em>Bacteroides xylanisolvens</em></td>
<td>−0.14</td>
<td>0.487</td>
<td>0.609</td>
</tr>
<tr>
<td><em>Prevotella copri</em></td>
<td>−0.17</td>
<td>0.371</td>
<td>0.530</td>
</tr>
<tr>
<td><em>Bacteroides uniformis</em></td>
<td>0.08</td>
<td>0.691</td>
<td>0.691</td>
</tr>
</tbody>
</table>

*significant Kendall correlation (p < 0.05), ** significant Kendall correlation (p < 0.001). FDR, False detection rate.
at the end-point between high and low P/B groups may be explained by competition for substrate between Prevotella and Bifidobacterium spp., as they are consistently found to be inversely correlated across different populations. However, we do not discard some indirect role of these species in microbiota-mediated body weight change as well, being feasible since cross-feeding interactions where Bifidobacterium species take part are well known.

*B. cellulosilyticus* is a common species in the human gut and has been reported to colonize around 60% of the westerners, which is similar to our data [qPCR: 9/15; metagenomics (mOTU counts>100): 8/15]. *B. cellulosilyticus* has clearly defined xylan-degrading enzymes, grows especially well on wheat arabinoxylans, and even outcompetes other prevalent Bacteroides spp. in arabinoxylan-rich conditions. Our comparative analysis on CAZy gene content supports the previous experimental observations given that *B. cellulosilyticus* genome seems to be enriched in xylan binding and degrading enzymes, when compared to other common Bacteroides species present in the human gut, thus conferring it an advantage to uptake and metabolize this particular type of carbohydrates. Interestingly, Patnode et al. found that *B. ovatus* avoids arabinoxylan competition when co-residing with *B. cellulosilyticus* by shifting fermentation strategy during 10-day experiments, a metabolic flexibility not observed among other Bacteroides spp. However, this metabolic flexibility may be a temporary strategy, as *B. ovatus* has been shown to bloom after 10 days while abundances of *B. cellulosilyticus* drop concurrently with AXOS as substrate. This may partly be a consequence of reliance on arabinoxylans as substrate by *B. cellulosilyticus*, whereas *B. ovatus* and others may thrive equally well on a mixture of dietary fibers.

Additional to the potential advantage conferred by the higher number of CAZy genes deserved to arabinoxylan degradation, we observed that the *B. cellulosilyticus* genome is enriched in peptides and glycosaminoglycan degrading enzymes constituting a signal of O-glycan foraging from host gut mucins as previously inferred for this and other Bacteroides species. This could indicate that in absence of arabinoxylans or other complex carbohydrates from the host diet, *B. cellulosilyticus* would also compete with other mucin-degrading species. Mucin production in colon epithelial cells has been proven to depend on butyrate, one of the SCFAs released by gut microbiota. Therefore, this metabolic circuit seems to be pivotal in the evolutionary mutualistic relationship between the several gut microbes and the host.

However, butyrate production is mainly linked to Gram-positive bacteria from the Firmicutes phylum and alternative pathways have been stated in few species from the Bacteroidetes phylum. Consequently, an exacerbated mucin utilization by gut microbiota enriched in *B. cellulosilyticus* without positive feedback signals for its production (SCFAs, mainly butyrate and propionate) would weaken barrier function altering gut immune homeostasis, worsen endotoxemia, attenuate incretins production affecting satiety, and possibly impairing weight loss upon the dietary intervention. On the other hand, the presence of certain genes encoding protein
domains associated with gliding motility would also confer an advantage to *B. cellulosilyticus* during the scavenging for nutrients, reinforcing the idea of its extreme glycan predatory role. This surface motility mechanism is widely described in non-motile (pili- or flagella-based) oral microbiota pathogens such as *Porphyromonas gingivalis* and *Flavobacterium johnsoniae*, together with the above-mentioned circuits for arabinoxylans and mucin O-glycan degradation, could constitute an evolutionary adaptation to outperform the carbohydrate uptake. However, the existence of this particular motility mechanism in *B. cellulosilyticus* should be confirmed in *in vitro* experiments.

While there is a notable inter-individual variation in *Bacteroides* species abundance, *P. copri* is consistently found to be the most prevalent *Prevotella* species in the human gut. *P. copri* also shows a superior ability to utilize xylans, and may out-compete *Bacteroides* spp. with overlapping glycan
degrading capacity.\textsuperscript{38} In fact, intake of xylan-rich foods may be the main determinant of \textit{P. copri} positive effect on human metabolism,\textsuperscript{8,19} while a diet rich in fat seems to have the opposite effect.\textsuperscript{39} However, on AXOS, we found no weight-loss effect of high baseline abundance of \textit{P. copri}, which could be due to too few subjects studied or the recently discovered disparate genomic and metabolic capacity of \textit{P. copri} clades.\textsuperscript{19} Interestingly, clade C has been shown to grow well on arabinoxylans, in contrast to clade B, which lacks the enzymatic capacity.\textsuperscript{37} This may help to explain why clade B as the only \textit{P. copri} clade was strongly positively correlated with \textit{B. cellulosilyticus}, as there may not be substrate competition. This finding further points to the necessity of considering each clade in the \textit{P. copri} complex to understand the effect on host metabolism. Also, it is worth noting that the increased consumption of fat on the PUFA-enriched diet (in combination with lower fiber intake) tended to result in poorer weight regulation for the high P/B subjects than the low P/B subjects, as also observed in previous P/B-ratio studies.\textsuperscript{11,12}

We hypothesize this could be a consequence of a mismatch between substrate and \textit{P. copri} leading to, e.g., increased production of branch-chained amino acids and potentially insulin resistance.\textsuperscript{39}

Given that the bodyweight changes may be partly due to fermentation end-products of AXOS released distally in the gastrointestinal tract, future studies should investigate potential links between \textit{B. cellulosilyticus} and fecal SCFA. Acetate is the most highly produced SCFA in response to arabinoxylan fermentation\textsuperscript{38} and exclusively produced by \textit{B. cellulosilyticus} upon arabinogalactan fermentation.\textsuperscript{40} While \textit{P. copri} is a well-known acetate producer,\textsuperscript{41} we hypothesize that \textit{B. cellulosilyticus} may not crossfeed SCFAs in a similar fashion, and thereby not contribute to create a healthy microbial community. In support, \textit{B. cellulosilyticus} was negatively associated with \textit{Clostridiales spp.}, which may be a consequence of little acetate cross-feeding.\textsuperscript{42} Furthermore, we found that \textit{B. cellulosilyticus} tended to correlate with a change in total cholesterol concentrations. We do not discard this could be due to increased production of acetate in the upper gastrointestinal tract, where \textit{B. cellulosilyticus} also thrives\textsuperscript{43} and followed by increased uptake in the liver (instead of cross-feeding) resulting in increased synthesis of cholesterol. However, such a hypothesis also needs further investigation in future studies. Interestingly, Chung et al. recently found a significant positive correlation between the relative abundance of \textit{Prevotella spp.} and fecal SCFA concentrations following AXOS consumption, which was not seen for \textit{Bacteroides spp.}\textsuperscript{44}

A strength of this study is first and foremost the high dose of the specific whole-grain fiber, AXOS (compared to our previous post-hoc analyses with whole grain-rich diets\textsuperscript{9–12}), which allow us to (further) validate the differential effects of whole-grain fiber on body weight regulation between the enterotypes,\textsuperscript{9–12} and secondly the introduction of deep-level sequencing that improves our understanding of AXOS-degrading gut microbes at species and strain level. However, it is a limitation that these species-level analyses include gut microbes from only 15 subjects, and thus the novel findings need to be validated in a larger sample in combination with metabolome analyses to further explore causing factors.

In conclusion, AXOS consumption promoted weight gain among subjects with a low \textit{Prevotella-tobacteroides} ratio, and \textit{B. cellulosilyticus} has been pointed out as the main predictor of the body weight gain during the intervention. This analysis paves the way for future investigations aiming at elucidating the underlying metabolic cross-talk between these species and other microbes inhabiting the human gut under AXOS administration, and how that metabolic exchange influence negatively on adiposity. Furthermore, we believe that these results underline the need to investigate enterotypes beyond the genus level and in combination with specific dietary fibers to further understand the role in human metabolism and obesity management, and to design more personalized interventions.

\textbf{Methods}

\textbf{Study design}

The assessment is a sub-study nested within a randomized cross-over trial.\textsuperscript{18} The study included two diet periods (AXOS and PUFA). To ensure body weight maintenance, the study participants had consultations (by physically present and by phone) with a dietician every week where body weight (non-fasting)
and diet were evaluated. Dietary advising compliance by participants in the intervention was evaluated and results are published elsewhere. The present work focuses on the first period of the cross-over design, as findings from the original study found participants to be responders of the AXOS intervention only in the first period, but not in the second period. The participants on the AXOS intervention in the first period had a change in their microbiota composition (responders), whereas participants on the AXOS intervention in the second period did not experience this change (non-responders). This was suggested to be a consequence of a potential carry-over effect from the PUFA intervention in period 1. The study was registered at clinicaltrial.gov: NCT02215343 and approved by the Danish Ethical Committee. All study procedures were carried out in accordance with the Helsinki Declaration and the Danish Protection Agency. Written informed consent was obtained before the study start.

**Study participants**

Eligibility criteria were nonsmoking men and women between 18 and 60 years with a BMI of 25–40 kg/m². Furthermore, participants should have a waist circumference of ≥94 cm for men and ≥80 cm for women and in addition it was required that they should have at least one criteria for metabolic syndrome; elevated fasting plasma glucose (≥5.6 mmol/L), elevated triglycerides (≥1.7 mmol/L) lowered high-density lipoprotein (HDL) (men: <1.03 mmol/L, women: <1.29 mmol/L), or elevated blood pressure (BP) (systolic BP ≥130 mmHg or diastolic BP ≥85 mmHg).

**Intervention**

The evaluated dietary supplements were wheat bran extract, rich in AXOS (10.4 g/d) and PUFA (3.6 g/d). For the AXOS intervention, the goal was to reach a high-fiber diet consisting of approximately 30 g fiber/day, of which 10.4 g was obtained from the AXOS supplementation. AXOS was provided as a powder (5 g/d) and biscuits (4 biscuits/d). The powder was instructed to be consumed in the morning and in the evening and should be dissolved in water. For the PUFA intervention, the goal was to reach approximately 10 energy percentage (E%) PUFA/day, whereas the participants were guided to decrease their intake of saturated fatty acids. PUFA was provided as fish oil capsules (1.32 g/d of docosahexaenoic acid (DHA) and 1.86 g/d of eicosapentaenoic acid (EPA)).

**Clinical evaluation**

The anthropometric measurements were conducted in a fasting state and all participants had to void their bladder before the start. Bodyweight was measured using a calibrated digital scale (Lindells, Malmo, Sweden) to the nearest 0.1 kg with the participants wearing underwear, and height was measured without shoes to the nearest 0.5 cm using a wall-mounted stadiometer (Hultafors). BMI was calculated as weight in kilograms divided by height in meters squared (kg/m²), and waist circumference was measured twice with a non-elastic tape measure on the skin with a precision of 0.5 cm, from which an average was calculated. As described in detail previously, lipid and glucose markers were analyzed from fasting blood samples, and also resting energy expenditure (REE) by the ventilated hood and breath hydrogen were measured among others.

**Gut microbiota**

DNA was obtained from subjects’ feces at baseline and after the intervention. Initially, gut microbiota was assessed by 16S rRNA gene amplicon sequencing as previously described. The taxonomy assignment was performed using the RDP Classifier v2.12. The baseline abundance (on rarefied data) at the genus level was obtained, and the *Prevotella/Bacteroides* (P/B) ratio was determined as a predictive trait for downstream analyses. To stratify subjects by the P/B ratio, we calculated log10-transformed P/B ratios and used the median value (−0.81) to divide subjects into either low (n = 15) or high (n = 14) P/B groups.

A more detailed analysis aiming at species identification was completed by using the metagenomic information derived for samples included in the study previously. Approximately 0.5 Tb raw data, delivered in respective paired-end fastq files, was used to identify operational taxonomic units (mOTUs) for taxonomy profiling of >7700 microbial species. The mOTUsv2.0 profiler was used with the
-g 1-c -l 100-y insert.scaled_count parameters to set a balance between high sensitivity and high precision configurations. From the full set of mOTUs detected, we selected the log-transformed baseline relative abundances of mOTUs with reliable classification as *Bacteroides* and *Prevotella* species (n = 10).

We additionally assessed the abundance of *Prevotella copri* clades by mapping the available metagenomic data of this subject cohort against the gene marker database generated by the Segata’s group previously. For reading mapping we used the *Usearch* v8.0.1623 algorithm with the following parameters: -usearch_local, -id 0.9, -strand both, -top_hit_only. Then, the relative abundance among *P. copri* clades was calculated.

Finally, the P/B ratios generated from the amplicon sequencing (genus level), the abundance of *Bacteroides* and *Prevotella* species obtained from shotgun sequencing as well as the distribution of *P. copri* clades were used as traits to perform predictions and associations with the weight gain/loss phenotypes (see ‘Statistical analyses’ section).

### Quantitative PCR

Absolute quantification of *Bacteroides cellulosilyticus* was carried out on the fecal DNA of participants. The reference sequence of the rpoB gene (NZ_CP012801.1) from *B. cellulosilyticus* was submitted to the Primer-Blast web server (https://www.ncbi.nlm.nih.gov/tools/primer-blast/) to retrieve specific primer pairs to amplify selectively this species-specific marker (included in the mOTUsv2 profiler). The comparison against the non-redundant NCBI database and the target organism [*B. cellulosilyticus*, taxid: 246,787] were fixed as checking parameters for primer prediction. As a result, we used the forward ATTTGTGGACGCTACTGTTATTCGT and reverse ACGAGCAGCGACTTGGGAATACG primers to specifically detect and quantify the presence of *B. cellulosilyticus*. The single-stranded DNA (ssDNA), fully covering the region to be amplified (109 nt) was obtained from Isogen Life Science B.V. (Utrecht, The Netherlands) where it was synthesized, PAGE-purified, quantified, and used for molecule titration during qPCR. The qPCR reactions were set in 96-well plates using the SYBR Green I Master Mix (Roche Lifesciences), 0.5 μM of forward primer, 0.25 μM of reverse primer, and 5 μL of the 1:10 diluted in nuclease-free water fecal DNA originally obtained for both amplicon and shotgun sequencing (final concentration in the qPCR reaction between 5 and 50 ng DNA). All samples were set in duplicate in the plate and amplified at once with standards in a LightCycler 480 II instrument (Roche Lifesciences) with the following cycling profile: initial incubation at 95°C for 5 min and 40 cycles of 10 s at 95°C, 20 s at 65°C, and 15 s at 72°C. Finally, the melting curve was set from 65°C to 97°C with a ramp rate of 0.11%/s. The absolute quantification was assessed with Ct values obtained for every sample and from titration curve (with duplicate measures) using the LightCycler® 480 Software v1.5 (Roche Lifesciences). The number of rpoB gene molecules was normalized against the total DNA concentration (ng/μL) present in the diluted DNA sample measured through high sensitive fluorometric methods such as Qubit 3.0 and the Qubit dsDNA HS Assay Kit (Thermo Fisher Scientific, Waltham, MA, USA).

### Bacteroides species genome functional assessment

Detection of distinctive genetic traits present in *B. cellulosilyticus* genomes, was based on surveying CAZy genes dedicated to carbohydrate metabolism in more than 100 *Bacteroides* genomes (Table S3). This information was used to explain why weight-loss could be influenced by the proportions of these species in the baseline gut microbiota of the subjects subjected to the AXOS intervention. Gene composition was evaluated in PULs obtained from available-annotated genomes (N = 109) (April 2020) of most representative *Bacteroides* species in humans retrieved from the PUL database (http://www.cazy.org/PULDB/). *B. caccae* (3 genomes), *B. cellulosilyticus* (3 genomes), *B. dorei* (10 genomes), *B. fragilis* (24 genomes), *B. ovatus* (16 genomes), *B. thetaiotaomicron* (14 genomes), *B. uniformis* (6 genomes), *B. vulgatus* (12 genomes), and *B. xylanisolvens* (21 genomes) were used in this functional assessment. The composition of predicted PULs present in each genome was parsed to extract CAZy families of glycoside hydrolases (GH), glycosyl-transferases (GT), polysaccharide lyases (PL), carbohydrate esterases (CE), carbohydrate-binding modules (CBM), and any auxiliary genes present in respective PULs. Inventory of PUL-associated CAZy genes was performed for all the genomes and comparison among
them was performed in a species-specific manner. Advanced functional analysis was performed by annotating the coding genes present in the Bacteroides genomes against the Pfam database through the WebMGA server.50

**Statistical analyses**

All statistical analyses were carried out with the use of R statistical software, version 3.6. The treatment effects on body weight between the enterotype groups were analyzed using linear-mixed models, which included a three-way interaction between treatment \* time \* P/B group. The difference between the intervention (AXOS) and control (PUFA) group was analyzed by pairwise comparison of the estimated mean differences between P/B groups. Linear-mixed models included age, sex, and baseline BMI as fixed effects, and subject as a random effect. Model-checking was validated by residuals and quantile-quantile probability plots. The results are reported as estimated mean change from baseline within P/B groups and differences in change between P/B groups and interventions with a 95% confidence interval (CI). The significance level was set at \( P < .05 \).

**Bacteroidetes species associations with metabolic changes, and co-abundant species**

Non-parametric and rank-based correlations between baseline log10-transformed Bacteroides and Prevotella species (and P. copri clades) by metagenomics and weight changes, metabolic parameters (cholesterol, HOMA-IR, REE, and breath hydrogen), and fecal SCFA (acetate, butyrate, and propionate) changes, from weeks 0 to 4 were analyzed calculating Kendall’s tau coefficient. To determine bacteria that were co-abundant with B. cellulosilyticus at baseline, a co-abundance network analysis among the 30 most abundant species (all phyla) was performed using Kendall’s tau, as described previously.20 The False-Discovery Rate (FDR) was used to adjust for multiple comparisons in the correlation tests. To confirm the ability of B. cellulosilyticus to predict body weight change, we performed the randomForest::randomForest R v3.6 function with the baseline relative abundance of the 10 most abundant Bacteroides and Prevotella species, and P/B ratio, as variables to evaluate their importance (IncNodePurity value) for change in body weight after consuming AXOS for 4 weeks.

For qPCR analyses, a differential abundance of B. cellulosilyticus species at baseline was assessed by the Student’s \( t \) test with Welch’s correction on log10-transformed data of molecules per ng DNA derived from qPCR51.

Functional enrichment of CAZy and Pfam functions in B. cellulosilyticus genomes was evaluated using hypergeometric Fisher’s exact test with correction for multiple testing using the False-Discovery Rate (FDR) method. Genes and functions associated with B. cellulosilyticus were selected upon FDR \( \leq 0.05 \).

**Abbreviations**

<table>
<thead>
<tr>
<th>Abbreviation</th>
<th>Description</th>
</tr>
</thead>
<tbody>
<tr>
<td>AXOS</td>
<td>arabinoolyan oligosaccharides</td>
</tr>
<tr>
<td>BMI</td>
<td>body mass index</td>
</tr>
<tr>
<td>CAZy</td>
<td>carbohydrate-active enzymes</td>
</tr>
<tr>
<td>CBM</td>
<td>carbohydrate-binding module</td>
</tr>
<tr>
<td>CE</td>
<td>carbohydrate esterase</td>
</tr>
<tr>
<td>FDR</td>
<td>false discovery rate</td>
</tr>
<tr>
<td>GL</td>
<td>glycoside hydrolase</td>
</tr>
<tr>
<td>GT</td>
<td>glycosyl transferase</td>
</tr>
<tr>
<td>INP</td>
<td>IncNodePurity or Mean Decrease Gini</td>
</tr>
<tr>
<td>mOTU</td>
<td>metagenomic operational taxonomic unit</td>
</tr>
<tr>
<td>P/B</td>
<td>Prevotella-to-Bacteroides</td>
</tr>
<tr>
<td>Pfam</td>
<td>protein families database</td>
</tr>
<tr>
<td>PL</td>
<td>polysaccharide lyase</td>
</tr>
<tr>
<td>PUFA</td>
<td>polyunsaturated fatty acids</td>
</tr>
<tr>
<td>PUL</td>
<td>polysaccharide utilization loci</td>
</tr>
<tr>
<td>SCFA</td>
<td>short-chain fatty acid</td>
</tr>
</tbody>
</table>

**Disclosure of Potential Conflicts of Interest**

No, potential conflicts of interest were disclosed.

**Authors’ contribution**

LC, MFH, and ABP designed the study. CVS and FUW assisted in the data analysis. JK, YS, AA, and ABP produced and shared clinical and genomic data were used in this study. ABP performed genome-wide analysis and qPCR approach. LC, MFH, and ABP drafted the manuscript, and all the authors reviewed and approved the final version submitted to this journal.

**Disclosure statement**

MFH, LC, and AA are co-inventors on a pending provisional patent application for the use of biomarkers to predict responses to weight-loss diets. AA is a consultant or member of the advisory
boards of Groupe Ethique et Sante, France; Weight Watchers, United States; BioCare, Copenhagen; Novo Nordisk, Denmark; and Saniona, Denmark. MFH and AA are co-authors of the book Spis dig slank efter dit bloodsucker (Eat healthily according to your blood sugar), published by Politikens Forlag, Denmark, and of other books about personalized nutrition for weight loss. The remaining authors reported no conflict of interest.

**Funding**

The European Commission 7th Framework Programme through the MyNewGut project (Grant agreement No. 613979) supported this study by sharing genetic and clinical data used in here. The Miguel Servet CP19/00132 grant from the Spanish Institute of Health Carlos III (ISCIII) to ABP is fully acknowledged.

**ORCID**

Lars Christensen [http://orcid.org/0000-0003-2251-6713](http://orcid.org/0000-0003-2251-6713)

**Data availability**

The raw sequencing data used in this study is publicly available in the MG-RAST server upon accession number mgp84629 (for 16S rRNA gene amplicon sequencing) [51], and in the European Nucleotide Archive (ENA), upon accession number PRJEB25727 (for shotgun metagenome sequencing).

**References**

15. Benitez-Páez A, Gómez Del Pulgar EM, Sanz Y. The glycolytic versatility of Bacteroides uniformis CECT


