# Synergy and oxygen adaptation for development of next-generation probiotics

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The human gut microbiota has gained interest as an environmental factor that may contribute to health or disease<sup>1</sup>. The development of next-generation probiotics is a promising strategy to modulate the gut microbiota and improve human health; however, several key candidate next-generation probiotics are strictly anaerobic<sup>2</sup> and may require synergy with other bacteria for optimal growth. Faecalibacterium prausnitzii is a highly prevalent and abundant human gut bacterium associated with human health, but it has not yet been developed into probiotic formulations<sup>2</sup>. Here we describe the co-isolation of F. prausnitzii and Desulfovibrio piger, a sulfate-reducing bacterium, and their cross-feeding for growth and butyrate production. To produce a next-generation probiotic formulation, we adapted F. prausnitzii to tolerate oxygen exposure, and, in proof-of-concept studies, we demonstrate that the symbiotic product is tolerated by mice and humans (ClinicalTrials.gov identifier: NCT03728868) and is detected in the human gut in a subset of study participants. Our study describes a technology for the production of next-generation probiotics based on the adaptation of strictly anaerobic bacteria to tolerate oxygen exposures without a reduction in potential beneficial properties. Our technology may be used for the development of other strictly anaerobic strains as next-generation probiotics.

The adult human gut microbiota consists of at least as many bacterial cells as our total number of somatic and germ cells<sup>3</sup> and their collective genomes (microbiome) contain more than 500-fold more genes than our human genome<sup>4</sup>. Comparative metagenomics has revealed that, compared with the microbiome of patients with type 2 diabetes<sup>5-7</sup>, hyperlipidaemia<sup>8</sup> and inflammatory bowel disease<sup>9,10</sup>, a healthy microbiome is frequently associated with an increased microbial diversity and an increased abundance of butyrate-producing bacteria, such as *Faecalibacterium prausnitzii*. In particular, *F. prausnitzii* is a keystone species whose abundance varies with age and lifestyle, and is relatively depleted in the gut microbiota of people living in the Western world<sup>11</sup>.

Human gut microorganisms do not act in isolation but form complex ecological interactions that are important for intestinal homeostasis. One key attribute of the gut microbiota is the fermentation of carbohydrates to short-chain fatty acids (SCFAs), including butyrate, which is associated with several host benefits<sup>12</sup>. Fermentation is the major energy-generating process utilized by gut microorganisms, and the removal of fermentation electron sink by-products such as lactate and hydrogen is essential to maintain fermentative processes<sup>13</sup>. Accordingly, hydrogen scavengers such as methanogens and sulfate-reducing bacteria are important for establishing gut metabolic networks<sup>14</sup>. Here we report the isolation of a novel strain of *F. prausnitzii* in co-culture with a novel strain of the sulfate reducer *Desulfovibrio piger*. We describe the development of a technology for the production of *F. prausnitzii* as a next-generation probiotic and we assess its safety for human consumption.

To preserve microorganism-microorganism interactions and isolate bacteria that are able to serve as an electron sink and remove lactate, we plated faecal material from a healthy individual directly on agar plates of Postgate's medium (PGM) in anaerobic conditions (Methods). Under these conditions, we isolated a strain of *F. prausnitzii* (DSM32186) that grew in PGM as co-culture with a strain of *D. piger* (DSM 32187) (Fig. 1a,b). *D. piger* are obligate anaerobic, non-fermenting, Gram-negative bacilli<sup>15</sup> and prevalent sulfate reducers in the human gut<sup>16</sup>, do not occur in isolation outside the intestine, and are thus considered gut-specific commensals<sup>17</sup>.

To confirm the identity of the isolates, we sequenced their genomes, and observed that *D. piger* DSM 32187 clustered with other sequenced *D. piger* strains (Fig. 1c), whereas *F. prausnitzii* DSM 32186 clustered with *F. prausnitzii* phylogroup group II, including strain A2-165 (Fig. 1d). The genomic analyses showed that both isolates formed specific clades in the phylogenetic tree, indicating that they represented previously uncharacterized strains. Since A2-165 has anti-inflammatory

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**Fig. 1** | **Co-isolation and cross-feeding of** *F. prausnitzii* **and** *D. piger* **in vitro. a**, Co-culture of *F. prausnitzii* DSM 32186 and *D. piger* DSM 32187 on PGM plates without supplementation of glucose or acetate. **b**, Gram staining of colonies from isolation of *F. prausnitzii* DSM 32186 and *D. piger* DSM 32187. Arrows indicate *F. prausnitzii* (long fusiform rods) (1) and *D. piger* (short rods) (2). Scale bar, 10 μm. **c**, Dendrogram illustrating the relationship between *D. piger* DSM 32187 and related genomes. **d**, Dendrogram illustrating the relationship between *F. prausnitzii* DSM 32186 and related genomes. **e**, The number of colony-forming units of *F. prausnitzii* DSM 32186 in monoculture and in co-culture with *D. piger* DSM 32187 under anaerobic conditions in mPGM (PGM containing 25 mM of glucose) for 24 h. *P* = 0.0003. **f**, Metabolite profiles of *F. prausnitzii* DSM 32186 and *D. piger* DSM 32187 cultivated as monocultures or co-culture under anaerobic conditions in mPGM medium for 24 h. Glucose:

properties<sup>18</sup> and can interact at the mucosal interface<sup>19</sup>, we verified the probiotic potential of DSM 32186 by assessing its immunomodulatory properties compared with A2-165. We observed similar reductions of interleukin-1 $\beta$  (IL-1 $\beta$ )-induced secretion of IL-8 when supernatants from the different *F. prausnitzii* strains were applied to Caco-2 cells (Extended Data Fig. 1), confirming the relatedness to A2-165 at the phenotypic level.

We hypothesized that the co-isolation of F. prausnitzii and D. piger in PGM and their putative symbiotic relationship resulted from complementary metabolic requirements. To verify this hypothesis, we co-cultured the two strains in a modified PGM medium that contained glucose to support F. prausnitzii, and observed that the growth of F. prausnitzii was significantly increased in co-culture compared with monoculture in the same medium (Fig. 1e). Analysis of metabolites in conditioned medium after 24 h of growth revealed that, as expected, monocultures of D. piger consumed lactate and produced acetate without consuming glucose, whereas monocultures of F. prausnitzii produced very small amounts of lactate (Fig. 1f). However, co-cultures of F. prausnitzii with D. piger promoted fermentation of glucose and production of lactate and butyrate (Fig. 1f). F. prausnitzii produces butyrate through the butyryl-coenzyme A (CoA):acetate CoA-transferase pathway and accordingly, acetate did not accumulate in the medium in co-cultures (Fig. 1f), as acetate is required for butyrate production<sup>20,21</sup>. Thus, our findings suggest that D. piger functioned as an electron sink in the co-culture in PGM as it consumed lactate; D. piger generated

P = 0.0000031 (F. prausnitzii + D. piger versus D. piger), P = 0.0000038 (F. prausnitzii + D. piger versus F. prausnitzii); lactate: P = 0.0000001 (F. prausnitzii + D. piger versus D. piger), P = 0.0000005 (F. prausnitzii versus D. piger), P = 0.0000004 (F. prausnitzii + D. piger versus F. prausnitzii); acetate: P = 0.0000004 (F. prausnitzii + D. piger versus D. piger), P = 0.0000003 (F. prausnitzii versus D. piger); butyrate: P = 0.000001(F. prausnitzii + D. piger versus D. piger), P = 0.0000003 (F. prausnitzii versus D. piger); butyrate: P = 0.000001(F. prausnitzii + D. piger versus D. piger), P = 0.0000031 (F. prausnitzii + D. piger versus F. prausnitzii). 'mM change' on the y axis indicates the difference in concentration from the inoculated medium at baseline.**g**, Schematic of the suggested cross-feeding between F. prausnitzii and D. piger as co-culture in mPGM. n = 3 independent experiments, \*\*\*P < 0.001 determined by two-tailed t-test (**e**) or one-way ANOVA (**f**). Data are mean ± s.e.m.

acetate that was used by *F. prausnitzii* for growth and butyrate production (Fig. 1g).

Product development for next-generation probiotics is challenging, owing to the oxygen sensitivity of human gut bacteria. This process also requires the optimization of growth conditions to obtain sufficient biomass yields, as well as novel strategies to preserve the viability of the final product<sup>2</sup>. We used the co-culture of *F. prausnitzii* with *D. piger* to increase growth yields in fermentations as shown in Fig. 1e. However, as *F. prausnitzii* is extremely sensitive to oxygen in ambient air<sup>21</sup>, no colonies were recovered when *F. prausnitzii* DSM 32186 was exposed to air for 20 min (Fig. 2a). By contrast, *D. piger* is relatively oxygen-tolerant under the same conditions (Extended Data Fig. 2).

As shown previously, the shelf life of formulations containing *F. prausnitzii* can be increased by using antioxidants such as cysteine, although with limited applicability for industrial-scale production, as viability is lost after a 24 h exposure to ambient air<sup>22</sup>. To improve *F. prausnitzii* oxygen tolerance we used an adaption strategy using an m-SHIRM bioreactor<sup>23</sup>, in which DSM 32186 was exposed to oxidized conditions for ten consecutive subculture steps, with decreasing concentrations of cysteine and increasing anodic potential (Fig. 2b,c). At each step, a sample from the previous step was inoculated on yeast extract casitone fatty acid glucose (YCFAG) growth medium anaerobically. Visual inspection of plates revealed distinct colony morphotypes at the sixth and tenth subcultures (Extended Data Fig. 3), and five colony morphotypes were selected for characterization of oxygen



**Fig. 2** | **Development of oxygen tolerance in** *F. prausnitzii* **by stepwise adaptation. a**, Oxygen tolerance of *F. prausnitzii* DSM 32186 in YCFAG medium after exposure to ambient air for 20 min compared with control plates incubated in anaerobiosis. **b**, Schematic presentation of the modified simulated human redox intestinal model (m-SHIRM) bioreactor. **c**, The oxidative adaptation

strategy used to develop oxygen-tolerant strains of *F. prausnitzii*. **d**, Oxygen tolerance of the oxygen-adapted *F. prausnitzii* DSM 32379 developed from the parental strain DSM 32186. Oxygen exposure performed as in Fig. 2a. Numbers to the right of agar plates in **a**, **d** indicate dilution.

tolerance after taxonomic confirmation as *F. prausnitzii* by 16S rRNA gene sequencing. Increased oxygen tolerance was clearly observed for two morphotypes (Extended Data Fig. 4a) – DSM 32378 (Extended Data Fig. 4b) and DSM 32379 (Fig. 2d) – and occurred without the loss of butyrate production capacity (Extended Data Fig. 4c). DSM 32379 had the highest increase of oxygen tolerance (Extended Data Fig. 4a) and was thus further selected for analysis of synergistic growth with *D. piger* DSM 32187, which was also not affected (Extended Data Fig. 5).

Therefore, as a result of oxygen tolerance and co-culture with *D. piger*, we were able to produce *F. prausnitzii* in sufficient amounts for administration to humans: oxygen-tolerant DSM 32379 could be freeze-dried, and met the 2-weeks adequate stability criteria at -20 °C to be developed into capsules with limited loss of viability (log<sub>10</sub>(colony-forming units (CFU) g<sup>-1</sup>) = 9.6 versus 9.5 before and after two weeks storage, respectively). By contrast, the parental strain DSM 32186 yielded lower biomass (log<sub>10</sub>(CFU g<sup>-1</sup>) = 8.5) and underwent a 97% loss of viability.

To describe possible molecular mechanisms leading to increased oxygen tolerance, we performed genome sequencing of DSM 32379, which revealed 15 variants in 10 loci affecting 23 nucleotides (0.0007% of the total genome). These variants occurred in genes with known and unknown functions (Extended Data Table 1), but since we were unable to genetically modify DSM 32186 using molecular biology approaches, we could not verify their role for development of oxygen tolerance and thus the molecular mechanisms remain unknown. However, oxygen tolerance in DSM 32379 did not alter immune-modulatory properties (Extended Data Fig. 1) and DSM 32379 retained the ability to exploit a riboflavin-dependent extracellular electron shuttle (Extended Data Fig. 6) that we previously characterized in *F. prausnitzii* A2-165 (ref. 19). These results indicate that oxygen tolerance in DSM 32379 did not alter cellular physiology, metabolism and the potential to interact with the host at the mucosal interface, and this variant was selected for the production of an investigational product.

We next assessed the safety of the combined product by gavaging Swiss Webster male and female mice with a bacterial suspension containing *F. prausnitzii* DSM 32379 and *D. piger* DSM 32187. The mice received 10<sup>10</sup> CFU per strain and dose, 5 times during the first week and then twice a week for 3 weeks, and we observed no adverse responses. The caecal levels of *F. prausnitzii* and *D. piger* were assessed by quantitative PCR (qPCR) but we did not observe increased levels for either species at the end of the study, perhaps owing to the mode and frequency of the administration and the colonic localization of *F. prausnitzii*, and/or host specificity.

To investigate tolerability of the bacteria, we recruited 50 healthy men and women aged 20-40 years for a randomized placebo-controlled study for supplementation of low  $(1 \times 10^8 - 5 \times 10^8 \text{ CFU per capsule})$ or high  $(1 \times 10^9 - 5 \times 10^9 \text{ CFU} \text{ per capsule})$  doses of *F. prausnitzii* DSM 32379 and D. piger for 8 weeks compared with placebo (Supplementary Table 1). The groups had matching clinical features with the exceptions of age (higher in the low-dose group compared with placebo), alanine transaminase levels (lower in the low-dose group compared with placebo) and alkaline phosphatase levels (lower in the high-dose group compared with placebo). The investigational product was well tolerated, regardless of dose. No study participant discontinued the study owing to an adverse event (Supplementary Table 2) and there was no increased frequency of adverse events or gastrointestinal symptoms in the treatment groups (Supplementary Tables 3 and 4). There were no clinically relevant or statistically significant group-to-group differences in change between baseline and eight weeks in any blood biochemistry secondary end points (including renal function, blood cell count, liver enzymes, markers of inflammation, haemoglobin, glycosylated haemoglobin or fasting blood glucose; Supplementary Tables 5 and 6).

We performed whole-genome metagenomic sequencing to evaluate possible effects on the human gut microbiota. There were no group-to-group differences in overall composition at baseline or at the end of the administration (Extended Data Fig. 7a,b), and no change was observed in any of the groups compared with baseline (Extended Data Fig. 7c-e). However, the number of sequencing reads for D. piger assessed at species level increased in the participants receiving the high dose (P < 0.01) (Fig. 3a), whereas reads for species-level F. prausnitzii did not change (Fig. 3b). We used genome capture to specifically quantify the strains and observed that both parental F. prausnitzii DSM 32186 and D. piger DSM 32187 were highly prevalent at baseline (43 out of 43 and 35 out of 43, respectively). In line with the species-level results, the proportions of D. piger DSM 32187 increased in the high-dose group (P = 0.051; Fig. 3c), and particularly in those with low relative abundance at baseline (less than 0.05%, P = 0.042; Extended Data Fig. 8), although remaining within the range observed for the placebo group (Fig. 3c) and



Fig. 3 | Abundance of *D. piger* and *F. prausnitzii* in healthy volunteers after administration of *D. piger* DSM 32187 and *F. prausnitzii* DSM 32379 for eight weeks. a,b, Total faecal counts of *D. piger* (P = 0.033) (high dose) (a) and *F. prausnitzii* (b) in metagenomic data before and after administration of the investigational product. c,d, The relative abundance of *D. piger* DSM 32187 (c) and *F. prausnitzii* DSM 32186 (d) in metagenomic data before and after administration. n = 13 (placebo), 16 (low dose) and 14 (high dose); \*\*P < 0.01, two-sided Wilcoxon signed-rank test. Data are mean ± s.e.m.

for healthy Swedes sampled multiple times during one year<sup>16</sup>. We also found that the proportions of *F. prausnitzii* DSM 32186 did not change (Fig. 3d). Consistent with the lack of compositional shifts, the levels of faecal SCFAs did not change (Supplementary Table 7) and—despite the increase in *D. piger*—there was no change in faecal hydrogen sulfide levels (Extended Data Fig. 9). These results suggest that our probiotic formulation is safe for both the host (that is, lack of adverse events and gastrointestinal symptoms) and the gut microbiota (that is, lack of compositional and metabolic shifts).

The total species-level abundance of *F. prausnitzii* ranged between 3.4 and 25.9% (mean 13.2%), which was similar to the range observed for healthy individuals of similar age from the USA, as well as older healthy individuals from Sweden and the UK<sup>16</sup>, and higher than the species-level abundance in a recent large meta-analysis including 7,907 faecal metagenomes<sup>11</sup> (mean  $6.5 \pm 7.6\%$ ). Thus, further increase of *F. prausnitzii* was probably limited by saturation of the niche. However, as we observed an increase for *D. piger* DSM 32187, on the basis of the model in Fig. 1g, we hypothesized that there was an effect on the abundance of other butyrate producers, such as those that require extracellular acetate for butyrate production similar to *F. prausnitzii*<sup>20</sup>. We quantified terminal genes for butyrate production and observed a significant positive correlation for the change in butyrate production

potential and the change in *D. piger* DSM 32187 at the end of the administration compared with baseline in all individuals (Spearman's rho = 0.48, P = 0.001) and in individuals who received a low or a high dose (Spearman's rho = 0.49, P = 0.006), but not in the placebo group (Spearman rho = 0.39, P = 0.185). These results are in line with a recent study showing co-occurrence of *Desulfovibrio* with different butyrate producers, such as *Faecalibacterium*, *Roseburia*, *Oscillospira* and *Coprococcus*<sup>24</sup>, and suggest that our probiotic formulation might support the overall butyrate production potential in complex communities within the human gut. These results also stress the potential importance of baseline and/or specific gut microbiota configurations for microbiota-based treatment strategies<sup>25-28</sup>.

Finally, we attempted to detect F. prausnitzii DSM 32379 in faecal samples, qPCR assays targeting one or more of the genetic variants were not sufficiently discriminating, and genome capture methods could not be used to differentiate the oxygen-tolerant variant DSM 32379 from the parental DSM 32186, as these methods require less than 96% whole-genome similarity to identify unique strains<sup>29</sup>, and DSM 32379 is 99.9993% identical to DSM 32186. Thus, the counts of F. prausnitzii DSM 32186 detected by genome capture at the end of the administration probably represent the sum of the endogenous DSM 32186 and of the oxygen-tolerant DSM 32379 administered with the probiotic formulation. To track the possible presence of DSM 32379 in faecal samples, we detected the specific genetic variants in the metagenomic data (Methods). We observed few marker variants (for example, variant 7) in some participants at baseline or in the placebo group, in line with the observed genetic plasticity of F. prausnitzii<sup>10</sup>, and we found additional variants and/or several combinations at the end of the administration in a subset of the study participants in the low-dose and high-dose groups (Supplementary Table 8). The low detection of DSM 32379 in the faecal metagenomes might result from the high genomic identity between DSM 32379 and the parental strain and the consequent insufficient coverage in the metagenomic data, and might be influenced by the high levels of DSM 32186 at baseline indicating a saturated niche in the intestinal lumen. However, as F. prausnitzii is also present at the mucosal interface<sup>19</sup>, faecal sampling might not reflect the counts of DSM 32379 close to the mucosa, where the oxygen-tolerant DSM 32379 might have a competitive advantage. Therefore, we hypothesize that our next-generation probiotic might be able to increase F. prausnitzii in patient groups with lower abundance of this bacterium (such as those with type 2 diabetes) and in individuals with intestinal inflammation (such as inflammatory bowel disease), as supported by the observation that administration of F. prausnitzii A2-165 improves colitis and is able to partially restore the microbiota in mice<sup>9</sup>.

Our study has some limitations. We have not explored transient or personalized gut microbiota responses to the administered formulation owing to limited longitudinal data. Furthermore, we could not determine the molecular mechanisms leading to increased oxygen tolerance in *F. prausnitzii*. Nevertheless, we have developed an approach based on the syntrophic interaction between *F. prausnitzii* and *D. piger* isolated in this study, that leads to increased growth of *F. prausnitzii* and butyrate production in vitro and might influence butyrate production potential in vivo in the human gut.

# Conclusion

Targeting the gut microbiota holds great potential for improving human health, and metagenomics studies in the past two decades have identified a broad range of bacteria that might be candidates for development of next-generation probiotics<sup>2</sup>. However, as 70% of the bacterial species detected in metagenomics surveys lacks cultured representatives<sup>30</sup>, few potential candidates have been assessed in human studies. For example, *Akkermansia muciniphila*<sup>31</sup> and *Anaerobutyricum soehngenii*<sup>25</sup> as single species or in combination with spore-forming bacteria<sup>32</sup> have been found to be safe for human consumption and

preliminary data show that they have positive effects on glucose metabolism in mice and humans<sup>25,31,32</sup>.

Major challenges for the development of human gut bacteria as next-generation probiotics are fastidious growth (that is, requirements for specific nutrients or conditions) and sensitivity to oxygen. Indeed, examples of human isolates selected as next-generation probiotics so far include *Bacteroides* and *Clostridium* strains<sup>2</sup> (such as *Bacteroides fragilis* and *Clostridium butyricum*) that have relatively high oxygen tolerance among gut anaerobic bacteria<sup>33,34</sup>. Gut bacteria with inherent oxygen tolerance may develop increased oxygen tolerance upon direct exposure to oxygen, as shown by Meehan et al., who isolated oxygen-enabled variants of *B. fragilis*<sup>34</sup>. This approach cannot be applied to extremely oxygen-sensitive bacteria such as *F. prausnitzii*, which, however, can be targeted using the approach described here.

To our knowledge, strictly anaerobic bacteria such as *F. prausnitzii* had not been described in live formulations for human consumption. Since the abundance of *F. prausnitzii* is reduced in patients with hyper-lipidaemia<sup>8</sup>, prediabetes and type 2 diabetes<sup>5,6</sup>, non-alcoholic fatty liver disease<sup>35</sup> and inflammatory bowel disease<sup>9</sup>, the production of *F. prausnitzii* as next-generation probioticis of great interest. Our strategy based on the exploitation of existing synergies between gut micro-organisms and improved oxygen tolerance shows how *F. prausnitzii* could be developed as a next-generation probiotic for human consumption. This technology may be used for the development of other extremely oxygen-sensitive bacteria as next-generation probiotics to target patient populations with reduced abundances of these bacteria.

## **Online content**

Any methods, additional references, Nature Portfolio reporting summaries, source data, extended data, supplementary information, acknowledgements, peer review information; details of author contributions and competing interests; and statements of data and code availability are available at https://doi.org/10.1038/s41586-023-06378-w.

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# Methods

# Co-isolation and cultivation of F. prausnitzii and D. piger

Ten micrograms of fresh faecal sample from a healthy male donor, 36 years of age, who had not received antibiotics in the previous 6 months, was inoculated directly on PGM agar plates and incubated anaerobically  $(5\% H_2, 10\% CO_2 \text{ and } N_2 \text{ as ground gas})$  at 37 °C in a Coy chamber (Coy Laboratory Products). PGM is a growth medium widely used for the isolation of sulfate-reducing bacteria.

Classical microbiological techniques were used to obtain pure cultures. After consecutive subcultures, random colonies were selected and subjected to Gram staining. Presumptive cell types of *F. prausnitzii* and *D. piger* were observed. After repeated sub-culturing on YCFAG and PGM media, which support growth of *F. prausnitzii* and *D. piger*, respectively, pure cultures of *F. prausnitzii* and *D. piger* were obtained and the isolates were identified by full length 16S rRNA gene sequencing. The isolates were deposited under the Budapest Treaty to Leibniz Institute DSMZ-German Collection of Microorganisms and Cell Cultures GmbH and were listed in the collection as *F. prausnitzii* DSM 32186 and *D. piger* DSM 32187.

*F. prausnitzii* strain DSM 32186, was routinely maintained under strictly anaerobic conditions in a Coy anaerobic chamber. The routine culture medium was YCFAG, containing: 2.5 g l<sup>-1</sup> yeast extract, 10 g l<sup>-1</sup> casitone, 4.5 g l<sup>-1</sup> glucose, 0.9 g l<sup>-1</sup> sodium chloride, 0.45 g l<sup>-1</sup> dipotassium phosphate, 0.45 g l<sup>-1</sup> potassium dihydrogen phosphate, 1.32 g l<sup>-1</sup> ammonium sulfate, 4 g l<sup>-1</sup> sodium bicarbonate, 1 g l<sup>-1</sup> cysteine, 0.001 g l<sup>-1</sup> resazurin, 0.01 g l<sup>-1</sup> hemin, 100 µg l<sup>-1</sup> biotin, 100 µg l<sup>-1</sup> cobalamin, 300 µg l<sup>-1</sup> *p*-aminobenzoic acid, 500 µg l<sup>-1</sup> folic acid and 1,500 µg l<sup>-1</sup> pyridoxamine. All components were added aseptically while the tubes were flushed with CO<sub>2</sub>. The media was autoclaved at 100 kPa at 121 °C for 15 min. Finally, thiamine and riboflavin were added through a 0.22-µm filter to final concentrations of 0.05 µg ml<sup>-1</sup>. The final concentrations of SCFAs in the medium were 33 mM acetate, 9 mM propionate and 1 mM each of isobutyrate, isovalerate and valerate.

D. piger DSM 32187 was maintained in PGM. PGM contains:  $0.5 \text{ g } \text{I}^{-1}$  dipotassium phosphate,  $1 \text{ g } \text{I}^{-1}$  ammonium chloride:  $3.5 \text{ g } \text{I}^{-1}$  sodium lactate,  $1 \text{ g } \text{I}^{-1}$  yeast extract,  $0.1 \text{ g } \text{I}^{-1}$  ascorbate,  $0.5 \text{ g } \text{I}^{-1}$  cysteine,  $1 \text{ g } \text{I}^{-1}$  sodium chloride,  $10 \text{ g } \text{I}^{-1}$  peptone,  $1 \text{ g } \text{I}^{-1}$  sodium sulfate,  $1 \text{ g } \text{I}^{-1}$  calcium chloride,  $2 \text{ g } \text{I}^{-1}$  magnesium sulfate,  $0.5 \text{ g } \text{I}^{-1}$  ferrous sulfate,  $0.5 \text{ g } \text{I}^{-1}$  heptahydrate. Sodium sulfate, magnesium sulfate heptahydrate and calcium chloride were autoclaved separately while ferrous sulfate heptahydrate was filter-sterilized with a 0.22-µm filter and added after autoclaving and mixing of all components. The final pH of the medium was adjusted to  $7.2 \pm 0.2$ .

For co-culture experiments, modified PGM medium (mPGM) was prepared by adding 25 mM of glucose to PGM.

# Oxygen adaptation strategy

To increase oxygen tolerance in F. prausnitzii DSM 32186, a custommade bioreactor (m-SHIRM) was used (Fig. 2b). In an anaerobic Coy chamber, an inoculum was prepared by inoculating a single bacterial colony in 7 ml of YCFAG. After 16 h of incubation at 37 °C (optical density at 600 nm (OD<sub>600</sub>)  $\approx$  0.7), 2.5 ml of this pre-culture was inoculated into the anodic chamber of m-SHIRM bioreactor containing 250 ml of YCFAG. The applied electrical oxidizing potentials were maintained via external voltage on a graphite anode (8.5 cm × 0.25 cm × 2.5 cm) via a potentiostat (CHI, 660C). The m-SHIRM bioreactor was maintained at 37 °C and purged for 15 min with nitrogen gas before inoculation. After 24 h (OD<sub>600</sub>  $\approx$  0.7) 2.5 ml of the bacterial culture was re-inoculated into another m-SHIRM bioreactor with the same growth conditions, except for shifts in anodic potential and cysteine/cystine concentrations. This procedure was repeated ten times with increasing anodic potential and decreasing cysteine/cystine ratio (as graphically outlined in Fig. 2c).

# Selection of oxygen-adapted variants of F. prausnitzii DSM 32186

During the subculture steps presented in Fig. 2c, aliquots of 100  $\mu$ l were collected and serially diluted in 900  $\mu$ l of phosphate buffer saline (PBS). Aliquots of 50  $\mu$ l from each dilution were inoculated on YCFAG and incubated anaerobically for 72 h. After incubation, viable counts were assessed. Based on differential colony morphotype, colonies were picked (Extended Data Fig. 3) and preserved as glycerol stocks (YCFAG containing 20% glycerol) at -80 °C. The oxygen-adapted variants were checked for purity via Gram staining.

## Assessment of oxygen tolerance

Oxygen tolerance of *F. prausnitzii* DSM 32186 and its variants was assessed in YCFAG, and in PGM medium for *D. piger* DSM 32187. Strains were precultured anaerobically in broth medium for 14 h. After cultivation, tenfold serial dilutions were prepared anaerobically and 100 µl of each dilution were inoculated on two sets of each YCFAG or PGM agar medium. Plates incubated under anaerobic conditions served as control of viability for plates exposed to ambient air for 20 min, which were used to determine oxygen tolerance. Oxygen diffusion was confirmed by the oxidation of the resazurin dye present in YCFAG medium. After exposure to ambient air, plates were incubated anaerobically in a Coy chamber for 72 h before the CFUs were counted.

# Quantification of bacterial metabolites

Glucose, SCFA and lactate were measured by high-performance liquid chromatography (HPLC) with refractive index detection. Twenty micro-litres of cultured broth centrifuged and filter-sterilized was injected on a Reprogel H 9  $\mu$ m column (250 × 4.6 mm) with a guard column. Jasco AS-2507 plus auto-injector Samples were cooled at 4 °C and 0.0025 M sulfuric acid was used as eluent at a flow rate of 400  $\mu$ l min<sup>-1</sup> with a UltiMate 3000 pump from Dionex. Peaks were detected with Bischoff 8020 RI detector.

## Extracellular electron transfer with riboflavin

As previously described, *F. prausnitzii* can exploit riboflavin for extracellular electron transfer to the anode in a microbial fuel cell<sup>19</sup>. YCFAG agar plates were inoculated with *F. prausnitzii* DSM 32186 and DSM 32379 from frozen glycerol stocks kept at -80 °C and incubated anaerobically (5% H<sub>2</sub>, 10% CO<sub>2</sub> and N<sub>2</sub>) at 37 °C in a Coy chamber (Coy Laboratory Products). Single colonies were inoculated in 6 ml YCFAG broth and incubated overnight anaerobically, at 37 °C. When cultures reached an OD<sub>600</sub> of -0.9, cells were harvested by centrifugation at 4,000 rpm for 20 min. The cell pellet was resuspended in 200 µl of anolyte and injected in the anode chamber. Cells were incubated for 5 min before challenging with riboflavin 200 µM as electron mediator.

The custom-made two-chambered, microbial fuel cell was assembled as previously described with some modifications<sup>36</sup>. The bed volume of the cathode and anode chambers was 9 ml and the working volume was 6 ml. The two chambers were separated by a 1.8 cm diameter septum of CMI-7000S cation exchange membrane (Membranes International). Graphite plates of dimensions of 2 cm × 1 cm × 0.2 cm were used as cathode and anode. The distance between the two electrodes was 10 cm. The electrodes were connected to the external circuit with insulated copper wires and the circuit was closed via a fixed resistance of 150  $\Omega$ . The anode chamber contained 50 mM potassium phosphate buffer (pH 7.0) as anolyte and 0.1 M glucose. The cathode chamber contained 100 mM potassium phosphate buffer (pH 7.0) with 50 mM potassium ferricyanide as catholyte. The cell was maintained at 37 °C and the anode and cathode chambers were purged continuously with nitrogen gas and air, respectively. The data was recorded using a LabJack data acquisition system (LabJack Corporation) at an interval of 1 min.

## Immunomodulatory function in Caco-2 cells

Caco-2 from the European Collection of Cell Cultures (batch 18H036, Merck) were cultured in supplemented Dulbecco's modified Eagle's medium (DMEM) (PAA Laboratories) at 37 °C in a 5% CO2 incubator. Cells were incubated with different *F. prausnitzii* supernatant fractions cultured in LYBHI (1:25 and 1:10 in DMEM medium) and stimulated with (4 ng ml<sup>-1</sup> IL-1 $\beta$ ) for 6 h. IL-8 levels were determined in duplicate in cell supernatants using ELISA kit DuoSet (R&D systems). Cells were regularly tested for mycoplasma infections.

# Safety of the oral administration of *F. prausnitzii* and *D. piger* in mice

Male and female 8-week-old Swiss Webster mice were co-housed with 5 mice per cage at a temperature of  $20 \pm 1$  °C and an air humidity of 45-70% under specific pathogen-free conditions at a 12-h light:dark cycle (light from 07:00 to 19:00) and were fed an autoclaved chow diet (LabDiet) and water ad libitum. The mice were administered either a bacterial culture containing F. prausnitzii DSM 32379 and D. piger DSM 32187 or a medium/glycerol vehicle, five times during the first week and then twice a week for the following three weeks. Total genomic DNA was isolated from mouse caecal contents as previously described<sup>37</sup> and quantified by the Quant-iT PicoGreen dsDNA Assay Kit (Invitrogen). F. prausnitzii and D. piger were quantified by qPCR using primers Fpr-2F (GGAGGAAGAAGGTCTTCGG)/Fprau645-R (AATTCCGCCTACCTCTGC AC)<sup>38,39</sup> and DSV691-F (CCGTAGATATCTGGAGGAACATCAG)/DSV826-R (ACATCTAGCATCCATCGTTTACAGC)<sup>40</sup>. Clinical observations were made once a day. Clonic or tonic movements, stereotypic or abnormal behaviour were monitored. Body weight and food consumption were monitored. Haematological examinations performed included haematocrit, haemoglobin concentration, erythrocyte count, total and differential leukocyte count and platelet count. Clinical biochemistry examinations of blood samples performed included sodium, potassium, urea, total cholesterol, blood urea nitrogen, creatinine, total protein, total albumin, alanine aminotransferase, alkaline phosphatase, gamma glutamyl transpeptidase and bile acids. Histopathological examination was performed on stomach duodenum, small and large intestines (including Peyer's patches), liver, spleen, thymus and mesenteric lymph nodes. Clinical observations, body weight, food consumption, organ weight assessments and autopsies were performed without blinding. Blood haematology, clinical biochemistry and histopathology were assessed by blinded external personnel. No sample size calculation or randomization were performed. All animal procedures were approved by the Gothenburg Animal Ethics Committee (Dnr 5.8.18-16056/2019).

# Safety of the oral administration of *F. prausnitzii* and *D. piger* in young, healthy men and women

**Study design.** The study was a double-blind, randomized, placebocontrolled, single-centre trial of 10 weeks in healthy men and women 20 to 40 years of age. Eligible participants were randomly allocated to receive capsules once daily with a high ( $1 \times 10^9$  to  $5 \times 10^9$  CFU per bacterial strain; n = 18) or low dose ( $1 \times 10^8$  to  $5 \times 10^8$  CFU; n = 16) of *D. piger* and *F. prausnitzii* or placebo (n = 16) for 8 weeks, followed by a 2-week period without supplementation. In total, 16 (high dose), 16 (low dose) and 14 (placebo) participants completed the whole study. No study participant discontinued the study owing to an adverse event. Randomization was performed by the sponsor (Metabogen) using Sealed Envelope (2017, https://www.sealedenvelope.com/simple-randomiser/ v1/lists). Randomization was stratified according to sex. Information regarding study design, analysis and study objectives was published on Clinicaltrials.gov (NCT03728868) prior to study start. The study was approved by the Regional Ethics Review Board in Gothenburg.

**Participants.** Participating volunteers were recruited through advertising in social media (for example, on Facebook and Instagram) and

through posters in public areas (for example, in Universities, hospitals and gyms). Participants who met all inclusion criteria (20–40 years of age, signed informed consent, healthy without any known disease, willingness and able to participate at planned visits, phone interviews and to follow instructions, understand spoken and written Swedish), lacked all exclusion criteria (ongoing treatment with prescribed medication, intake of probiotic supplementation, treatment with antibiotics within the last three months, pregnancy, gastrointestinal tract symptoms during the last months that could affect study participation, current tobacco use, participation in other clinical studies), had normal blood biochemistry, blood pressure and heart rate, were invited to participate.

**Primary and secondary end points.** The primary outcome was tolerability and was tested using discontinuation (yes/no) due to investigational product during 8 weeks of treatment. Secondary end points including change (between baseline and 8 weeks) in Gastrointestinal Symptom Rating Scale (GSRS), fasting blood glucose, glycosylated haemoglobin (HbA1c), renal function (estimated glomerular filtration rate (eGFR) based on serum creatinine), red and white blood cell count, serum alanine transaminase (ALT), serum aspartate transaminase (AST), serum alkaline phosphatase (ALP), serum bilirubin, serum C-reactive protein (CRP), serum total protein, faeces SCFA levels (butyrate, acetate, lactate, proprionate, isovalerate, isobutyrate and succinate) were evaluated between baseline to week 4 and 8 (and after 10 weeks for SCFAs).

**Procedures.** Six visits to the study clinic (Geriatric Medicine, Sahlgenska University Hospital, Mölndal) were required during the study duration. Participants received information about the study both in writing and verbally. Eligible participants with no exclusion criteria provided a signed informed consent prior to any study procedures and enrolment. Heart rate and blood pressure were measured twice at the screening visit, using a Carescape V100 device (GE Healthcare). Body height, weight, and waist and hip circumferences were measured with a stadiometer as well as a scale and measuring tape. Venous blood was drawn from the cubital vein and used for blood biochemistry analyses. All blood biochemistry was analysed within 4 h after sampling at the Clinical Chemistry laboratory (Sahlgrenska University Hospital Mölndal). All women also completed a pregnancy test (urine human chorionic gonadotropin) which had to be negative for inclusion.

At the randomization visit, faecal samples were collected and GSRS was completed in order to collect information of any gastrointestinal symptoms the preceding week. All participants received a diary for recording daily doses taken and to make notes about any potential adverse events. During study visits three to five, faeces and blood samples as well as data from the GSRS questionnaire form were collected. Two weeks after treatment completion, a last study visit took place to collect data on gastrointestinal symptoms (GSRS) and to collect stool samples. The first 15 randomized subjects were contacted by telephone daily the first week to enquire about any potential adverse events. Thereafter, all participants were contacted by telephone once a week for inquiries about adverse events and to collect information about gastrointestinal symptoms (GSRS) the preceding week.

**Intervention.** The study product was provided as freeze-dried bacteria packed into capsules designed to disintegrate when reaching the small intestine. Identical capsules and excipient were used for the placebo and interventional product.

**Assessment of gastrointestinal symptoms.** Assessment of gastrointestinal symptoms the last week, was performed using the GSRS questionnaire<sup>41</sup>. GSRS contains 15 items in total and was analysed as a total score ranging from 0 to 45. Values 0–9 correspond to none to minimal gastrointestinal issues, 10–19 correspond to minimal gastrointestinal issues, 20–29 correspond to moderate gastrointestinal issues, 30–39

correspond to moderate to severe gastrointestinal issues, and 40–45 correspond to severe gastrointestinal issues.

Blood biochemistry. All blood biochemistry analyses were performed at the Swedac accredited (accreditation number 1240) clinical chemistry laboratory at the Sahlgrenska University Hospital. Blood glucose was measured using Glucose HK on a Cobas 6000 instrument (Roche Diagnostics Scandinavia). The coefficient of variance (CV) was 3% at concentrations of 5 and 15 mM. HbA1c was measured using HPLC (Mono S, Tricorn 50/50 GL (CDP), MonoBeads Column (GE Healthcare)). The separated haemoglobin fractions were measured using an UV-detector and absorbance quantified at 417 nm. The CV was 2% at concentrations 42 mmol per mol, 63 mmol per mol and 94 mmol per mol. Erythrocyte sedimentation rate was measured using the Starrsed ST Instrument. Mechatronics (Triolab). Erythrocyte count (CV: 3% at 2, 4 and  $5 \times 10^{12} l^{-1}$ ) was measured using anti coagulated venous blood with K2-EDTA and measurement of the absorption of light. The instrument used was the ADVIA 2120i (Siemens Medical Solutions Diagnostics). Leukocyte count was measured using anti coagulated venous blood with K2-EDTA and measurement of the absorption of light, using the ADVIA 2120i instrument (Siemens Medical Diagnostics AB), with a CV of 7% at concentrations  $3 \times 10^9 l^{-1}$  to  $16 \times 10^9 l^{-1}$ . Thrombocyte count was measured using anti coagulated venous blood with K2-EDTA and measurement of the absorption of light, with a CV of 9% at 80, 200 and  $500 \times 10^9 l^{-1}$ , analysed on a ADVIA 2120i instrument. ALT catalyses the reaction between L-alanine and 2-oxoglutarate. Further reaction between the produced pyruvate and NADH generates a measure of NADH oxidation, which was directly proportional to the ALT activity, which was measured via the decrease in absorbance. The CV was 6% at 1 µkat l<sup>-1</sup> and 4% at 4 µkat l<sup>-1</sup> and the instrument used was the Cobas 6000. AST catalyses L-aspartate and 2-oxoglutatrate to oxaloacetate and L-glutamate. The reaction between oxaloacetate and NADH generates a measure of NADH oxidation, which was directly proportional to the AST activity, which was measured via the decrease in absorbance. The CV was 5% at 1  $\mu$ kat l<sup>-1</sup> and 3% at 3  $\mu$ kat l<sup>-1</sup> and the instrument used was the Cobas 6000. ALP was analysed using a colorimetric assay using Cobas 6000 with a CV of 4% at 7 µkat l<sup>-1</sup>. Serum total bilirubin was measured using a colometric assay on a Cobas system (Roche Diagnostics Scandinavia), with a CV of 5% at concentrations 20 and 130 µM. Serum creatinine was measured using CREP2 on a Cobas 6000 instrument, with a CV of 4% at concentrations 85 and 400 uM. The estimated glomerular filtration rate (eGFR) was calculated using the Lund-Malmö formula based on serum creatinine, age and sex<sup>42</sup>. Total protein was measured using on a Cobas 6000 with a CV of 3% at concentrations 50 and 75 g  $l^{-1}$ .

Faecal SCFAs. Faecal concentrations of the SCFAs acetate, propionate and butyrate, as well as succinate and lactate, were determined using gas chromatography-mass spectrometry (Agilent Technologies) as previously described<sup>43</sup>. In brief, 100 mg of frozen faecal material was transferred to a 16 × 125 mm tube fitted with a screw cap, and a volume of 100 µl of internal standard stock solution ([1-<sup>13</sup>C]acetate, [<sup>2</sup>H6]propionate 1 M, [<sup>13</sup>C4]butyrate 0.5 M, [1-<sup>13</sup>C1] isobutyrate and [1-13C] isovalerate 0.1 M) was added. Prior to extraction, samples were freeze-dried overnight. After acidification with 50 µl of 37% HCl, the organic acids were extracted twice in 2 ml of diethyl ether. A 500 µl aliquot of the extracted sample was mixed with 50 µl of N-tert-butyldimethylsilyl-N-methyltrifluoracetamide (Sigma) at 20 °C. One microlitre of the derived material was injected into a gas chromatograph (Agilent Technologies 7890 A) coupled to a mass spectrometer detector (Agilent Technologies 5975 C). Temperature was increased in a linear gradient consisting of initial temperature of 65 °C for 6 min, increase to 260 °C at 15 °C min<sup>-1</sup>, and increase to and held at 280 °C for 5 min. The injector and transfer line temperatures were 250 °C. Quantitation was completed in ion-monitoring acquisition mode by comparison to labelled internal standards, with the m/z ratios 117 (acetic acid), 131 (propionic acid), 145 (butyric acid), 146 (isobutyric acid), 159 (isovaleric acid), 121 ( $[^{2}H2,1^{-13}C]$ acetate), 136 ( $[^{2}H5]$ propionate), 146 ( $[1^{-13}C1]$ isobutyrate), 149 ( $[^{13}C4]$  butyrate), 160 ( $[1^{-13}C]$ isovalerate).

**Statistical analyses.** Statistical power was calculated based on anticipated differences in the proportions of study subjects discontinuing due to adverse events. With a discontinuation rate of 0.50 versus 0.05 due to investigational product in the two treatment groups versus placebo group (randomized in 2:1, 32 versus 16 subjects), respectively, with an alpha level of 0.05, using the two-sided Fisher's exact test, a power of 88% was achieved.

All analyses were done both in the intention to treat and in the per protocol populations. Comparison of continuous variables between treatment groups (low and high dose) and placebo was performed with Fisher's non-parametric permutation test and the Fisher's exact test (lowest one-sided P value multiplied by 2) was used for dichotomous variables. The primary outcome was tolerability and was tested using discontinuation (yes/no) due to investigational product during 8 weeks of treatment. The potential differences in the secondary end point variables, were evaluated by relative change adjusted for placebo and compared with the Fisher's non-parametric permutation test, which also generated the confidence interval for the mean difference. All analyses were performed on complete cases-that is, no imputations were used. Statistical significance was considered for P values below 0.05 and all statistics were performed with SAS Software version 9.4 (SAS Institute). Confidence intervals form primary outcomes were calculated using the Newcombe hybrid score interval<sup>44</sup>. Permutation-based confidence intervals (Supplementary Tables 5-8) were calculated using a user-written SAS macro<sup>45,46</sup> (https://github.com/imbhe/PermTestCl).

## Measurement of faecal hydrogen sulfide

Hydrogen sulfide was quantified as previously described<sup>47</sup>. All reagents and buffers were degassed by purging with nitrogen. Faecal samples were cut and aliquoted (-150 mg) on dry ice and kept frozen in 2-ml airtight propylene tubes. Samples were then transferred to anaerobic chamber (COY) and diluted in phosphate buffered saline. Diluted faecal slurries were treated with a zinc acetate solution before addition of reagent solution consisting of *N*,*N*-dimethyl-*p*-phenylenediamine sulfate. The tubes were immediately closed, vortexed, and maintained at room temperature for 20 min and absorbance was measures at a wavelength of 670 nm. Hydrogen sulfide was measured in faecal samples of 40 individuals (placebo, n = 12; low dose, n = 16; high dose, n = 12) who had stools both at baseline and at the end of the administration; no sufficient material was available for 1 individual in the placebo and 2 in the high-dose groups.

# DNA extraction from faecal samples and shotgun metagenomic sequencing

Stool samples were collected by the participants at home and stored at room temperature until delivery to the clinic, where samples were stored at -80 °C. The maximum time between sampling and delivery to the clinic was 24 h. Total genomic DNA was isolated from 100-150 mg of faecal material using a modification of the IHMS DNA extraction protocol Q<sup>48</sup>. Samples were extracted in Lysing Matrix E tubes (MP Biomedicals) containing ASL buffer (Qiagen), vortexed for 2 min and lysed by two cycles of heating at 90 °C for 10 min followed by two bursts of bead beating at 5.5 m s<sup>-1</sup> for 60 s in a FastPrep-24 Instrument (MP Biomedicals). After each bead-beating burst, samples were placed on ice for 5 min. Supernatants were collected after each cycle by centrifugation at 4 °C. Supernatants from the two centrifugations steps were pooled and a 600-µl aliquot from each sample was purified using the QIA amp DNA Mini kit (QIAGEN) in the QIAcube (QIAGEN) instrument using the procedure for human DNA analysis. Samples were eluted in 200 µl of AE buffer (10 mM Tris·Cl; 0.5 mM EDTA; pH 9.0). Libraries for shotgun metagenomic sequencing were prepared by a PCR-free method; library

preparation and sequencing were performed at Novogene (China) on a NovaSeq instrument (Illumina) with 150-bp paired-end reads and at least 6G data per sample.

## DNA extraction from bacterial cultures for genome sequencing

Total genomic DNA was extracted from microbial biomass harvested after an overnight growth or at the stationary phase. Biomass obtained from liquid cultures was collected by centrifugation for 10 min at 4,500 rpm at 4 °C, and washed once with PBS to remove carry-over contaminants.

DNA for Illumina short-reads sequencing was extracted using the NucleoSpin Soil kit (740780.50, Macherey-Nagel) as described by the manufacturer in the presence of SL2 lysis buffer and Sx enhancer. Cells were lysed by 2 rounds of bead beating at 5.5 m s<sup>-1</sup> for 60 s in a FastPrep-24 Instrument (MP Biomedicals), with incubation on ice for 5 min in between the two bead-beating bursts. DNA quality was evaluated using Tapestation 4200 with Genomic DNA ScreenTape and reagents (Agilent), and quantification was made using the Quant-iT dsDNA BR Assay Kit (ThermoFisher Scientific). Libraries for sequencing were prepared using Covaris S220 Focused-ultrasonicator (Covaris), fragmented to average 550-bp insert size, and the TruSeq DNA PCR-free Library Preparation kit (20015963 and 20015949, Illumina). Libraries were quantified using Quant-iT dsDNA HS Assay Kit (ThermoFisher Scientific) and sequenced on an Illumina Miseq instrument using MiSeq Reagent Kit v3, 600 cycles.

Large amounts of high-quality DNA for Nanopore long-reads sequencing were obtained with a modified version of the Marmur procedure<sup>49</sup>. Cells were suspended in Tris-EDTA buffer (20 mM Tris HCl pH 8, 2 mM EDTA) and lysed with lysozyme (20 mg ml<sup>-1</sup>) and SDS (2% w/v) in the presence of proteinase K. The extracted total DNA was purified by repeated extraction in phenol:chloroform:isoamyl alcohol (25:24:1 v/v) and chloroform: isoamyl alcohol (24:1 v/v), followed by precipitation in cold ethanol (99.5% v/v) and spooling of the DNA on a glass rod. The DNA was washed with ethanol 70% (v/v), dried at room temperature and resuspended in water overnight at 4 °C. DNA integrity and concentration were evaluated using Tapestation 4150 with Genomic DNA ScreenTape and reagents (Agilent) and Qubit 3.0 Fluorometer and Qubit dsDNA BR assay kit (ThermoFisher Scientific). Isolated DNA was prepared using Rapid barcoding kit (SQK-RBK004) following the manufacturer's instructions (ONT) and sequenced on a ONT's MinION device on a R9.4.1 flow cell (FLO-MIN106D). Base-calling was performed using ONT's guppy v. 4.2.2.

## **Bioinformatics methods**

**Genome analyses.** The genomes of *F. prausnitzii* DSM 32186 and DSM 32379 and *D. piger* DSM 32187, were obtained by hybrid assembly of Nanopore and Illumina reads. The Unicycler pipeline v0.4.8 in hybrid mode used to obtain de novo assemblies. All dependencies for Unicycler were installed in a conda environment. The dependency programs include SPAdes v3.13.0, racon v1.4.1, bowtie2 v2.3.5.1, and pilon v1.23. The hybrid assemblies were annotated using Prokka v1.14.5 (https://github.com/tseemann/prokka).

To infer evolutionary relationships, the *F. prausnitzii* and *D. piger* genomes were aligned with publicly available high-quality genomes of the same species and/or representative sequences of previously known clades, their near neighbours and outgroups respectively using progressiveMauve<sup>50</sup>. Multiple alignments were used to reconstruct phylogenies of both strains in MEGA X<sup>51</sup>. Evolutionary distances were calculated using the maximum composite likelihood method and are in the units of number of base substitutions per site<sup>52</sup>.

Whole-genome metagenomics analyses and genome capture. Illumina reads were quality filtered and trimmed using fastq\_quality\_trimmer from the fastX toolkit (https://github.com/lianos/fastx-toolkit/); human reads were removed by mapping the high-quality reads against the human genome (hg19) using Bowtie2 (ref. 53) (v2.4.4). After removal of low-quality (quality score <20) and human reads, we obtained high-quality paired-end microbial reads with and average depth of 45 million for each faecal sample.

For genome capture, high-quality microbial reads were mapped using Kraken 2 (ref. 54) (v2.1.2) with default settings against a custom database designed by adding the closed genomes of the novel strains *F. prausnitzii* DSM 32186 and *D. piger* DSM 32187 to the RefSeq database (release 107). Estimations of strain abundances were obtained using Bracken<sup>55</sup> (v2.6.2) for reads with minimum length of 100 bp.

The overall composition of the gut microbiota was assessed for the abundance of species using principal coordinates analysis on Bray-Curtis dissimilarity. Differences in composition were tested by a permutational multivariate ANOVA using the *adonis2* function with 10,000 permutations in the vegan package in R (https://github.com/ vegandevs/vegan/).

Gene counts in the metagenomic data were estimated using MEDUSA<sup>56</sup> with a gene catalogue containing 15,186,403 non-redundant microbial genes<sup>6</sup>. The butyrate production potential was quantified based on five genes (*but, buk 4hbt* and *atoA/D*) coding for the terminal enzymes in the four intestinal butyrate-producing pathways<sup>57</sup>. Profile hidden Markov models were used to screen those genes in the gene catalogue, as previously described<sup>6</sup>.

Genetic variants were detected for the oxygen-tolerant *F. prausnitzii* DSM 32379 by mapping the raw reads against the assembled genome of the parental strain DSM 32186 using snippy v4.4.5 in default setting (https://github.com/tseemann/snippy). To detect the genetic variants in the faecal metagenomes, we obtained *F. prausnitzii* reads mapping to DSM 32379 in each sample using bowtie2 v2.3.5.1, and then performed variant calling against the parental genome DSM 32186 using snippy v4.4.5. *F. prausnitzii* DSM 32379 was considered as possibly detected in a sample only if: (1) genetic variants of DSM 32379 were only detected at the end of the administration; (2) the genetic variants covering the related genomic regions had an abundance of at least 10% of all reads; and (3) in case of detection at baseline, multiple variants must be detected at the end of the administration with an increase in all of their frequencies in that faecal sample (Supplementary Table 1).

## **Statistics**

Statistical analyses were conducted using GraphPad Prism v\_8.4.3. Two-sided Student's *t*-tests were used to compare two groups and one-way ANOVA with Tukey's multiple comparison were used to compare three groups.

Non-parametric tests were used to compare the abundance of species and strains in the faecal microbiomes. Wilcoxon signed-rank tests were used to compare abundances at the end of the administration compared to baseline in matching samples from an individual. Kruskal–Wallis tests were used to compare three groups.

## **Reporting summary**

Further information on research design is available in the Nature Portfolio Reporting Summary linked to this article.

# **Data availability**

Supplementary information on data availability is linked to the online version of the paper. Genome assemblies and raw metagenomic sequence data have been deposited in the EMBL-EBI European Nucleotide Archive (ENA) under accession number PRJEB62463. Processed sequence data required for reanalysis are available at GitHub (https:// zenodo.org/record/8019851). Processed pseudonymized per-subject metadata are provided in Supplementary Tables 2–8. Data from the mouse safety study are available in Supplementary Table 9. For questions on the clinical cohort, contact M.L. Bacterial strains are proprietary to Metabogen AB and should be requested from them.

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Author contributions M.T.K. isolated, characterized and adapted the bacterial strains, developed the process, and developed and produced the formulation. C.D. and M.P. performed bioinformatic analyses. V.T. processed samples for microbiota analyses and interpreted results with C.D. and M.P. J.D.K. characterized the immunomodulatory properties of *F. prausnitzii*. D.S. performed the human study. R.C. performed the mouse study. M.L. designed and led the human intervention study. V.T., M.L. and F.B. supervised the project and contributed equally. M.T.K. and F.B. conceptualized and designed the study and wrote the first draft of the paper. All authors analysed data and commented on the manuscript.

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**Competing interests** M.T.K. is employed in part by Metabogen AB and F.B. is founder of Metabogen AB. Metabogen AB has contributed with economic support and product for the human intervention, but was not involved in analyses of the data. F.B. receives research funding from Biogaia AB and is on the scientific advisory board of Bactolife A/S. The other authors declare no competing interests.

#### Additional information

Supplementary information The online version contains supplementary material available at https://doi.org/10.1038/s41586-023-06378-w.

**Correspondence and requests for materials** should be addressed to Fredrik Bäckhed. **Peer review information** *Nature* thanks Ruth Ley, Daniel Tancredi and the other, anonymous, reviewer(s) for their contribution to the peer review of this work.

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Extended Data Fig. 1 | Anti-inflammatory properties of parental *F. prausnitzii* DSM 32186 and oxygen tolerant DSM 32379. Modulation of IL-1 $\beta$ -induced IL-8 secretion by Caco-2 cells in contact with *F. prausnitzii* supernatants (strain A2-165 (DSM 17677) included as reference). Cells were exposed to bacterial supernatant with or without 4 ng/mL IL-1 $\beta$  for 6 hr. The horizontal axis group labels indicate dilution of filtered medium from the *F. prausnitzii* culture. p = 0.025 (DSM 32186 *vs.* A2-165, 1/25), p = 0.0000089 (LYBHI *vs.* A2-165, 1/25), p = 0.00013 (LYBHI *vs.* DSM32186, 1/25), p = 0.000013 (LYBHI *vs.* DSM32379, 1/25), p = 0.0000028 (LYBHI *vs.* A2-165, 1/10), p = 0.000013 (LYBHI *vs.* DSM32186, 1/10), p = 0.0000039 (LYBHI *vs.* DSM32379, 1/10). *n* = 3, \*\*\*p < 0.001, \*p < 0.05 as determined by One-way ANOVA. The results were repeated in two independent experiments. Data are presented as mean ± s.e.m.



**Extended Data Fig. 2 | Oxygen tolerance profile of** *D. piger* DSM 32187 **isolated as co-culture with** *F. prausnitzii* DSM 32186. Serial dilutions were inoculated on PGM plates that were exposed to ambient air for 20 min, and compared with control plates incubated in a Coy anaerobic chamber. Numbers beside agar plates indicate dilution.



**Extended Data Fig. 3** | **Morphotype of the oxygen adapted** *F. prausnitzii* **DSM 32379**. Morphotype of *F. prausnitzii* DSM 32379 (arrow b) isolated from m-SHIRM bioreactor during the 10<sup>th</sup> subculture step. The parental strain *F. prausnitzii* DSM 32186 is shown as reference (arrow a).



**Extended Data Fig. 4** | **Oxygen tolerance and fermentation profiles of** *F. prausnitzii* **oxygen tolerant variants. a**, Quantification of oxygen tolerance of parental strain and oxygen adapted variants in YCFAG. **b**, Oxygen tolerance of the oxygen adapted *F. prausnitzii* DSM 32378. Serial dilutions (shown on top) were inoculated on YCFAG plates and exposed to ambient air for 20 min, and compared with control plates incubated in anaerobiosis. **c**, Metabolite profile of parental DSM 32186 and oxygen adapted variants cultured in YCFAG medium. mM change on the y-axis indicates difference from inoculated medium at baseline.





**a**, Colony forming units of parental *F. prausnitzii* DSM 32186 and oxygen tolerant DSM 32379 in mono-culture or co-culture with *D. piger* DSM 32187 in modified Postgate's medium (i.e., Postgate's medium containing 25 mM of glucose; mPGM) after 24 h of growth. p = 0.00000073 (DSM 32186), p = 0.00000022 (DSM 32379). **b**, Metabolite profiles of *F. prausnitzii* DSM 32379 and *D. piger* DSM 32187 as mono-cultures or co-culture in mPGM after 24 h of growth. Glucose: p = 0.0000008 (*F. prausnitzii* + *D. piger vs. D. piger*), p = 0.0000012 (*F. prausnitzii* + *D. piger vs. F. prausnitzii*); lactate: p = 0.000000001



D. piger DSM 32187

■ F. prausnitzii DSM 32379

D. piger DSM 32187 + F. prausnitzii DSM 32379

(F. prausnitzii + D. piger vs. D. piger), p = 0.000000013 (F. prausnitzii vs. D. piger), p = 0.00018 (F. prausnitzii + D. piger vs. F. prausnitzii); acetate: p = 0.000005 (F. prausnitzii + D. piger vs. D. piger), p = 0.000015 (F. prausnitzii vs. D. piger), p = 0.012 (F. prausnitzii + D. piger vs. F. prausnitzii); butyrate: p = 0.0000007 (F. prausnitzii + D. piger vs. D. piger), p = 0.0000007 (F. prausnitzii + D. piger vs. D. piger), p = 0.0000007 (F. prausnitzii + D. piger vs. F. prausnitzii); mM change on the y-axis indicates difference from inoculated medium at baseline. <math>n = 3 independent experiments. \*\*\*p < 0.001, \*p < 0.05 as determined by two-tailed t-test (a) or one-way ANOVA (b) Data are presented as mean ± s.e.m.



**Extended Data Fig. 6** | **Riboflavin-mediated extracellular electron shuttling of parental** *F. prausnitzii* **DSM 32186 and oxygen tolerant DSM 32379.** After energising the resting cells with glucose (100 mM), both parental *F. prausnitzii* DSM 32186 and oxygen tolerant DSM 32379 generated measurable current waves when riboflavin was spiked (200 μM), as previously described for A2-165<sup>19</sup>.



Extended Data Fig. 7 | Analysis of overall fecal microbiota composition in the healthy volunteers after administration of *D. piger* DSM 32187 and *F. prausnitzii* DSM 32379 for 8 weeks. Principal coordinate analysis for the Bray-Curtis dissimilarity calculated based on species abundances for: **a**, fecal samples at baseline ( $r^2 = 0.018$ ; p = 1; adonis); **b**, fecal samples at the end of the administration ( $r^2 = 0.040$ ; p = 0.660; adonis); **c**, fecal samples from the placebo group at baseline (v2) and at the end of the administration (v5) ( $r^2 = 0.009$ ; p = 0.997; adonis); **d**, fecal samples from the low dose group at baseline (v2) and at the end of the administration (v5) ( $r^2 = 0.014$ ; p = 0.971; adonis); **e**, fecal samples from the high dose group at baseline (v2) and at the end of the administration (v5) ( $r^2 = 0.001$ ; p = 0.996; adonis). Differences in composition were tested by a permutational multivariate ANOVA using the adonis2 function with 10,000 permutations in the vegan package in R (https://github.com/vegandevs/vegan/). Adjustments for multiple comparisons were made. The dots in the plots indicate fecal samples the 43 individuals with metagenomic data: placebo, n = 13; low dose, n = 16; high dose, n = 14. The analyses show no difference in microbiota composition among the groups at baseline or at the end of the administration (panels **a** and **b**, respectively), and no difference at the end of the administration compared to baseline in any of the groups (panels **c**, **d** and **e**).



**Extended Data Fig. 8** Genome capture for the abundance of *F. prausnitzii* **DSM 32186 and** *D. piger* **DSM 32187 in fecal samples from the high dose group.** Change in relative abundance in samples with high baseline *D. piger* DSM 32187 (> 0.05% of total microbiota; *n* = 4, p = 0.875, two-sided Wilcoxon signed-rank test) and low baseline *D. piger* DSM 32187 (< 0.05% of total



microbiota; n = 10, p = 0.042, Wilcoxon signed-rank test). v2, fecal samples at baseline; v5, fecal sample at the end of the administration. For box plots the middle line is the median, the lower and upper hinges are the first and third quartiles, the whiskers extend from the hinge to the largest and smallest value no further than  $1.5 \times$  the inter-quartile range (IQR).



**Extended Data Fig. 9** | **Measurement of hydrogen sulfide in fecal samples.** Hydrogen sulfide was measured in fecal samples at baseline as well as at the end of the administration (40 individuals: placebo, n = 12; low dose, n = 16; high dose, n = 12; no sufficient material available for 1 individual in the placebo and 2 in the high dose groups). Two-sided Wilcoxon signed-rank test was performed. Data are presented as mean  $\pm$  s.e.m.

# Extended Data Table 1 | Genetic variants present in the genome of the oxygen tolerant F. prausnitzii DSM 32379

| Variant | TYPE     | REF     | ALT     | FTYPE            | EFFECT     | GENE PRODUCT  |
|---------|----------|---------|---------|------------------|------------|---|
| 269716  | del*     | CA      | С       | CDS <sup>†</sup> | frameshift | Glycosyl transferase  |
| 302576  | del      | CG      | С       | CDS              | frameshift | 2,3,4,5-tetrahydropyridine-2,6-dicarboxylate<br>N-acetyltransferase |
| 493109  | snp‡     | G       | А       | CDS              | missense   | GlutaminetRNA ligase  |
| 1307926 | del      | TGAGCA  | т       | CDS              | frameshift | Restriction endonuclease subunit S                                  |
| 1519029 | del      | AT      | А       | CDS              | frameshift | Hypothetical protein  |
| 1540117 | del      | AC      | А       | CDS              | frameshift | Tyrosine-protein kinase CpsD  |
| 1605900 | snp      | С       | т       | CDS              | missense   | Methionyl-tRNA formyltransferase                                    |
| 1719735 | snp      | G       | т       | CDS              | stop       | Na/Pi cotransporter family protein                                  |
| 2465746 | snp      | G       | А       |                  |            |   |
| 2350517 | complex§ | AGACGCT | GGATGCC | CDS              | Unknown    | DUF4366"  |
| 2350538 | snp      | А       | G       | CDS              | Unknown    | DUF4366   |
| 2350544 | snp      | A       | G       | CDS              | Unknown    | DUF4366   |
| 2350556 | snp      | т       | G       | CDS              | Unknown    | DUF4366   |
| 2350565 | complex  | TAA     | CAG     | CDS              | Unknown    | DUF4366   |
| 2350589 | complex  | CAAG    | GAAA    | CDS              | Unknown    | DUF4366   |

\*del, deletion

<sup>†</sup>CDS, coding sequence

<sup>\*</sup>SNP, single nucleotide polymorphism

<sup>§</sup>complex, combination of mutation types, eg deletion & single base substitution

<sup>1</sup>DUF, domain of unknown function

# nature research

Corresponding author(s): Fredrik Bäckhed

Last updated by author(s): May 22, 2023

# **Reporting Summary**

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# **Statistics**

| For         | all st      | atistical analyses, confirm that the following items are present in the figure legend, table legend, main text, or Methods section.   |
|-------------|-------------|---|
| n/a         | Cor         | nfirmed   |
|             | $\boxtimes$ | The exact sample size (n) for each experimental group/condition, given as a discrete number and unit of measurement   |
|             | $\boxtimes$ | A statement on whether measurements were taken from distinct samples or whether the same sample was measured repeatedly   |
|             | $\boxtimes$ | The statistical test(s) used AND whether they are one- or two-sided<br>Only common tests should be described solely by name; describe more complex techniques in the Methods section.   |
|             | $\boxtimes$ | A description of all covariates tested  |
| $\boxtimes$ |             | A description of any assumptions or corrections, such as tests of normality and adjustment for multiple comparisons   |
|             | $\boxtimes$ | A full description of the statistical parameters including central tendency (e.g. means) or other basic estimates (e.g. regression coefficient)<br>AND variation (e.g. standard deviation) or associated estimates of uncertainty (e.g. confidence intervals) |
|             | $\boxtimes$ | For null hypothesis testing, the test statistic (e.g. F, t, r) with confidence intervals, effect sizes, degrees of freedom and P value noted Give P values as exact values whenever suitable.   |
| $\boxtimes$ |             | For Bayesian analysis, information on the choice of priors and Markov chain Monte Carlo settings  |
| $\boxtimes$ |             | For hierarchical and complex designs, identification of the appropriate level for tests and full reporting of outcomes  |
| $\boxtimes$ |             | Estimates of effect sizes (e.g. Cohen's d, Pearson's r), indicating how they were calculated  |
|             |             | Our web collection on statistics for biologists contains articles on many of the points above.  |
|             |             |   |

# Software and code

| Data collection | No software was used for data collection   |
|-----------------|--|
| Data analysis   | GraphPad Prism 8.4.3.<br>Statistics on clinical data were performed with SAS Software version 9.4 (SAS Institute Inc., Cary, NC, USA). Confidence intervals form primary<br>outcomes were calculated using the Newcombe hybrid score interval. Permutation-based confidence intervals (Extended Data Table 5-8)<br>were calculated using a user-written SAS macro.<br>The Unicycler pipeline v0.4.8 in hybrid mode used to obtain de novo assemblies. All dependencies for Unicycler were installed in a conda<br>environment. The dependency programs include SPAdes v3.13.0, racon v1.4.1, bowtie2 v2.3.5.1, and pilon v1.23. The hybrid assemblies were<br>annotated using Prokka v1.14.5 (https://github.com/tseemann/prokka).<br>progressiveMauve and MEGAx were used to producer phylogenetic trees.<br>Genetic variants were detected using snippy v4.4.5 in default setting (https://github.com/tseemann/snippy).<br>For production of high quality reads fastX toolkit (https://github.com/lianos/fastx-toolkit/) and Bowtie253 (v2.4.4) were used.<br>For annotation and quantification of species in metagenome data Kraken 2 (v2.1.2) RefSeq database (release 107) and Bracken (v2.6.2) were<br>used.<br>Hidden markov models were used to screen microbial genes .<br>Vegan package in R (https://github.com/vegandevs/vegan/) was used for microbiota composition analysis. |

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All manuscripts must include a data availability statement. This statement should provide the following information, where applicable:

- Accession codes, unique identifiers, or web links for publicly available datasets
- A list of figures that have associated raw data
- A description of any restrictions on data availability

Supplementary information on data availability is linked to the online version of the paper at www.nature.com/nature. Genome assemblies and raw metagenomic sequence data have been deposited in the EMBL-EBI European Nucleotide Archive (ENA) under accession number PRJEB62463. Processed sequence data required for reanalysis of the results can be made available by the corresponding author upon request. Processed pseudonymized per-subject metadata are provided in Supplementary Tables 2–9. Source data can be made available by the corresponding author upon request. For questions on the clinical cohort contact M.L. Bacterial strains are proprietary of Metabogen AB and should be requested from them.

# Field-specific reporting

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# Life sciences study design

All studies must disclose on these points even when the disclosure is negative.

| Sample size     | Statistical power in the clinical trial "Tolerability and Risk of Adverse Events with a Probiotic Supplement: A Randomised and Placebo<br>Controlled Study in Healthy Individuals" was calculated based on anticipated differences in the proportions of study subjects discontinuing<br>due to adverse events. With a discontinuation rate of 0.50 vs. 0.05 due to investigational product in the two treatment groups vs. placebo<br>group (randomized in 2:1, 32 vs. 16 subjects), respectively, with an alpha level of 0.05, using the two-sided Fisher's exact test, a power of 88%<br>was achieved.<br>No sample size calculation was performed for mouse studies. |
|-----------------|--|
| Data exclusions | No data was excluded   |
| Replication     | In vitro studies were repeated at least in three independent experiments for the main figures.   |
| Randomization   | Study subjects were randomized to three arms: High dose investigational product (IP), Iow dose IP and placebo. Randomization was carried out using blocks with varying block size and was stratified by sex.   |
| Blinding        | Treatment allocation was blinded for the participants, care provider, investigator, and outcomes assessor. Blinding was maintained until study<br>end and completion of the clean file (final database) and statistical analysis plan.<br>In the mouse study clinical observations, body weight, food consumption, organ weight assessments, and<br>autopsies was performed without blinding. Blood haematology, clinical biochemistry and<br>histopathology was assessed by blinded external personnel.<br>For practical reasons, no blinding was performed in the in vitro studies   |

# Reporting for specific materials, systems and methods

We require information from authors about some types of materials, experimental systems and methods used in many studies. Here, indicate whether each material, system or method listed is relevant to your study. If you are not sure if a list item applies to your research, read the appropriate section before selecting a response.

## Materials & experimental systems

| Μ | let | hoc | s |
|---|-----|-----|---|
|---|-----|-----|---|



| n/a         | Involved in the study |
|-------------|-----------------------|
| $\times$    | ChIP-seq              |
| $\boxtimes$ | Flow cytometry        |

MRI-based neuroimaging 

# Eukaryotic cell lines

| Policy information about <u>cell lines</u>                  |   |
|---|---|
| Cell line source(s)   | CACO-2 from ATCC                        |
| Authentication  | The cell line was not authenticated.    |
| Mycoplasma contamination                                    | All cell lines were negative mycoplasma |
| Commonly misidentified lines<br>(See <u>ICLAC</u> register) | none                                    |

# Animals and other organisms

Policy information about studies involving animals; ARRIVE guidelines recommended for reporting animal research

| Laboratory animals      | Mice, Swiss Webster, 8 weeks, Male and females 8 weeks old Swiss Webster mice were co-housed with 5 mice/cage at a temperature of 20±1°C and an air humidity of 45-70% under specific pathogen-free conditions at a 12-h light/dark cycle (light from 7 am to 7 pm) and were fed an autoclaved chow diet (LabDiet, St. Louis, MO, USA) and water ad libitum. |
|-------------------------|--|
| Wild animals            | The study did not involve wild animals   |
| Field-collected samples | The study did not involve field-collected samples  |
| Ethics oversight        | Mouse experiments were approved by the Research Animal Ethics Committee in Gothenburg.   |

Note that full information on the approval of the study protocol must also be provided in the manuscript.

# Human research participants

Policy information about <u>studies involving human research participants</u>

| Population characteristics | In total, 50 healthy individuals (men and women) between 20 and 40 years old were included.   |  |  |
|----------------------------|---|--|--|
|                            |   |  |  |
| Recruitment                | Study subjects were recruited from the general population using advertisements in social networks, news papers and posters in public areas in Mölndal and Gothenburg. |  |  |
|                            | Only healthy individuals were included. Thus, the study participants are not necessarily representative for the general   |  |  |
|                            | population at the same ages. However, this issue cannot be fully avoided as phase 1 trials should be based on healthy   |  |  |
|                            | individuals in order to minimize risks of previously untested supplements or drugs. More importantly, the trial was a   |  |  |
|                            | randomized, placebo-controlled trial, and comparisons between individuals randomized to active treatment and placebo  |  |  |
|                            | should therefore not be affected by any inclusion bias.   |  |  |
|                            |   |  |  |
| Ethics oversight           | The study was approved by the Regional Ethics Review Board in Gothenburg.   |  |  |

Note that full information on the approval of the study protocol must also be provided in the manuscript.

# Clinical data

Policy information about <u>clinical studies</u>

All manuscripts should comply with the ICMJE guidelines for publication of clinical research and a completed CONSORT checklist must be included with all submissions.

| Clinical trial registration | NCT03728868  |
|-----------------------------|--|
| Study protocol              | The full trial protocol in Swedish (original) and English (certified translation) is available in the Supplementary Information.   |
| Data collection             | All recruitment was performed at the Geriatric Medicine Clinical Research Unit at the Sahlgrenska University Hospital in Mölndal.<br>Recruitment started on October 10th, 2018 and was completed by April 2nd, 2019. The study was completed (last study visit) on May 31st, 2019.   |
| Outcomes                    | The predefined primary outcome was tolerability of the oral intake of F. prausnitzii and D. piger, defined as study discontinuation due to adverse events under 8 weeks of treatment.  |
|                             | The predefined secondary outcomes were:<br>1. Gastrointestinal side effects, measured using the Gastrointestinal Symptom Rating Scale (GSRS).<br>Assessment of gastrointestinal symptoms the last week, was performed using the GSRS questionnaire. Gastrointestinal symptoms<br>were measured with GSRS, which includes 15 items combined into five symptom clusters measuring 1) reflux, 2) abdominal pain, 3)<br>indigestion, 4) diarrhea and 5) constipation. GSRS has a seven-point graded Likert-type scale, in which 1 represents absence of<br>troublesome symptoms and 7 represents very troublesome symptoms. The total score was derived from all subclasses, resulting in a<br>score between 0 and 45. |

## 2. Effects on inflammation - erythrocyte sedimentation rate (safety parameter).

Change in erythrocyte sedimentation rate before and after the 8-week treatment period was assessed. Erythrocyte sedimentation rate was measured using the Starrsed ST Instrument, Mechatronics.

### 3. Effects on inflammation - CRP (safety parameter).

Change in C-reactive protein (CRP) level in blood. Analysis of C-reactive protein (CRP) in serum was measured by agglutinate CRP with latex particles, which in turn was covered with anti-CRP-antibodies. The aggregates were measured using turbidimetry. The coefficient of variation was 7% at 20 mg/L and 4% at 80 mg/L and the instrument used was the Cobas 6000. Change in CRP before and after the 8-week treatment period was investigated.

#### 4. Effect on hematopoiesis - red blood cells (safety parameter).

Change in red blood cell count before and after the 8-week treatment period was examined. Erythrocyte count (CV: 3% at 2, 4, and 5 x1012/L) was measured using anti coagulated venous blood with K2-EDTA and measurement of the absorption of light. Instrument used to analyze was the ADVIA 2120i (Siemens Medical Solutions Diagnostics AB).

#### 5. Effect on hematopoiesis - white blood cells (safety parameter).

Change in white blood cells count before and after the 8-week treatment period was examined. Leukocyte count was measured using anti coagulated venous blood with K2-EDTA and measurement of the absorption of light, using the ADVIA 2120i instrument (Siemens Medical Diagnostics AB), with a CV of 7% at concentrations  $3 \times 10E9/L$  to  $16 \times 10E9/L$ 

#### 6. Effect on hematopoiesis - platelets (safety parameter).

Changes in platelets count before and after the 8-week treatment period was examined. Thrombocyte count (CV: 9% at 80, 200, and 500 x10E9/L) was measured using anti coagulated venous blood with K2-EDTA and measurement of the absorption of light. Instrument used to analyze was the ADVIA 2120i.

### 7. Effects on liver enzymes - ALAT (safety parameter).

Change in liver enzyme ALT (alanine transaminase) before and after the 8-week treatment period was examined. Alanine transaminase (ALT) catalyzes the reaction between L-Alanin and 2 oxoglutarat. Further reaction between the produced pyruvate and NADH generates a measure of NADH oxidation, which was directly proportional to the ALT activity, which was measured via the decrease in absorbance. The coefficient of variation was 6% at 1  $\mu$ kat/L and 4% at 4  $\mu$ kat/L and the instrument used was the Cobas 6000.

## 8. Effects on liver enzymes - AST (safety parameter).

Change in liver enzyme AST (aspartate transaminase) before and after the 8-week treatment period was examined. Aspartate transaminase (AST) catalyzes L-Aspartate and 2-oxoglutatrat to oxaloacetate and L-glutamat. Further reaction between oxaloacetate and NADH generates a measure of NADH oxidation, which was directly proportional to the AST activity, which was measured via the decrease in absorbance. The coefficient of variation was 5% at 1  $\mu$ kat/L and 3% at 3  $\mu$ kat/L and the instrument used was the Cobas 6000.

#### 9. Effects on liver enzymes - ALP (safety parameter).

Change in liver enzyme ASAT (Aspartate transaminase) before and after the 8-week treatment period was examined. ALP was analysed using a colorimetric assay using Cobas 6000 with a CV of 4% at 7  $\mu$ kat/L.

#### 10. Effects on serum bilirubin (safety parameter).

Serum total bilirubin was measured using a colometric assay on a Cobas system (Roche Diagnostics Scandinavia AB), with a CV of 5% at concentrations 20 and 130 µmol/l.

#### 11. Effects on the blood glucose.

Changes (in percent) in levels of fasting blood glucose and HbA1c before and after the 8 week treatment period. Blood glucose was measured on fresh blood, using Glucose HK (Roche) on a Cobas 6000 instrument. The CV was 3% at concentrations 5 och 15 mmol/L. HbA1c was measured using HPLC (Mono S™, Tricorn™ 50/50 GL (CDP), MonoBeads™ Column (GE Healthcare)). The separated hemoglobin fractions were measured using an UV-detector and absorbance quantified at 417 nm. The CV was 2% at concentrations 42 mmol/mol , 63 mmol/mol and 94 mmol/mol.

### 12. Effects on abundance of short-chain fatty acids.

Changes in short-chain fatty acids in stool from baseline to week 10 were measured using....

#### 13. Colonization with F. prausnitzii.

Colonization of the intestine with the total amount of F. prausnitzii bacteria, was measured in stool samples, using ......

#### 14. Effect on renal function(safety parameter).

Change in calculated eGFR (Glomerular Filtration Rate, based on serum creatinine) before baseline and after 8 weeks of treatment was investigated. Serum creatinine was measured using CREP2 (Roche/Cobas) on a Cobas 6000 equipment, with a CV of 4% at concentrations 85 and 400 µmol/L.

#### 15. Effect on serum total protein (safety parameter).

Change in serum total protein before baseline and after 8 weeks of treatment was investigated. Total protein was measured using Roche/Cobas on a Cobas 6000 with a CV of 3% at concentrations 50 and 75 g/L.