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**RESEARCH ARTICLE** 

# Gut-derived *Flavonifractor* species variants are differentially enriched during *in vitro* incubation with quercetin

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## Abstract

Flavonoids are a common component of the human diet with widely reported health-promoting properties. The gut microbiota transforms these compounds affecting the overall metabolic outcome of flavonoid consumption. Flavonoid-degrading bacteria are often studied in pure and mixed cultures but the multiple interactions between guercetin-degraders and the rest of the community have been overlooked. In this study, a comparative metataxonomic analysis of fecal communities supplemented with the flavonoid quercetin led us to identify a potential competitive exclusion interaction between two sequence variants related to the flavonoid-degrading species, Flavonifractor plautii, that belong to the same genus but different species. During incubation of fecal slurries with guercetin, the relative abundance of these two variants was inversely correlated; one variant, ASV\_65f4, increased in relative abundance in half of the libraries and the other variant, ASV\_a45d, in the other half. This pattern was also observed with 6 additional fecal samples that were transplanted into germ-free mice fed two different diets. Mouse's diet did not change the pattern of dominance of either variant, and initial relative abundances did not predict which one ended up dominating. Potential distinct metabolic capabilities of these two Flavonifractor-related species were evidenced, as only one variant, ASV\_65f4, became consistently enriched in complex communities supplemented with acetate but without quercetin. Genomic comparison analysis of the close relatives of each variant revealed that ASV 65f4 may be an efficient utilizer of ethanolamine which is formed from the phospholipid phosphatidylethanolamine that is abundant in the gut and feces. Other discordant features between ASV\_65f4- and ASV\_a45drelated groups may be the presence of flagellar and galactose-utilization genes, respectively. Overall, we showed that the Flavonifractor genus harbors variants that present a pattern of negative co-occurrence and that may have different metabolic and morphological traits, whether these differences affect the dynamic of quercetin degradation warrants further investigation.

#### Introduction

Flavonoids are 3-ring phenolic compounds produced by the secondary metabolism of plants. They are found in fruits and vegetables and their regular consumption is associated with health benefits [1,2]. Among these, quercetin is one of the most abundant in the human diet. It exerts effects on the immune, digestive, endocrine, nervous, and cardiovascular systems [3]. Some gut bacteria can cleave the central ring in the flavonoid skeleton by a process known as C-ring fission which generates smaller phenolic products. In the case of quercetin, phloroglucinol and 3,4-dihydroxyphenylacetic acid (DOPAC) are formed [4]. It is not clear to what extent do the health effects of flavonoids depend on their transformation to biologically active compounds by the gut microbiota. Vissiennon and collaborators showed that the anxiolytic activity of quercetin is induced by DOPAC and not by the parent compound, evidencing a case in which the microbial metabolite exerts the beneficial effect [5]. DOPAC has also antiproliferative activity in colon cancer cells [6] and anti-platelet aggregation activity [7]. Additionally, the well-recognized quercetin-degraders, *F. plautii* (formerly *Clostridium orbiscindens*) and *Eubacterium ramulus*, are also butyrate-producers, a short-chain fatty acid that is the preferred source of energy of colonocytes and essential for colon health [8].

Flavonoid-degrading bacteria reside in the colon where more than 10<sup>13</sup> bacterial cells inhabit [9]. Anaerobic *in vitro* incubation of fecal material with dietary substrates provide a valuable experimental paradigm for studying metabolism of gut microbial communities under controlled conditions. This approach has revealed the metabolites that are formed during the transformation of quercetin [10,11] and the effects of this flavonoid on microbial communities [12,13]. The use of individual fecal samples from 56 elderly subjects also revealed the importance of some bacterial families for the transformation of quercetin [14]. However, insights obtained at the family-level are of limited value since it has been shown that even small genetic differences between bacterial strains can have a profound impact on the host's physiology [15,16]. Thus, studies at the strain-level are needed for the understanding of the biotransformation of flavonoids.

In this study, microbial community dynamics from different subjects were analyzed individually by *in vitro* incubations of feces with quercetin. Through this approach, we identified variants related to flavonoid degraders that became enriched upon incubation with quercetin and that were consistently observed across 15 healthy subjects. We used a genomic comparison analysis of close relatives of these variants to infer genetic differences between them. Potential metabolic and morphological differences were detected between these variants, thus, we propose that their role in the gut microbiome is differentially affected by carbon sources and interactions with other members of the community and may have distinct roles in the degradation of the flavonoid.

#### Materials and methods

#### Sample collection and processing

Stool samples were obtained from a previous study [17]. Samples were collected from subjects participating in the Wisconsin Longitudinal Study (WLS) between November 2014 and February 2015. Briefly, participants collected stool samples directly in sterile containers, then samples were kept at ~4°C until arrival to the processing laboratory within 48 hours of collection. Upon arrival, sterile straws were filled with the fecal material and stored at -80° C as previously described [18]. The use of WLS fecal microbiota was approved by the Institutional Review Board at the University of Wisconsin-Madison. Consent from participants was obtained via a process involving both verbal and written components by trained interviewers, and records

were archived both digitally and physically at UW-Madison. This effort did not include the collection of samples from participants in vulnerable populations or from minors.

#### In vitro incubations of human fecal samples with quercetin

Human fecal samples were used for *in vitro* incubations with quercetin. Samples from 9 subjects kept in frozen straws were aliquoted (~50 mg) on dry ice, weighted, and resuspended at 0.5 mg ml<sup>-1</sup> final concentration with heavy vortexing in anaerobic 7N minimal medium supplemented with 20 mM sodium acetate (filter-sterilized through a 0.22-m pore diameter) [19]. Quercetin dihydrate, 97% w/w (Alfa Aesar) concentration was 0.125 mg ml<sup>-1</sup> (0.4 mM) in the corresponding medium. Controls consisted of the same medium plus fecal sample. Treatments with quercetin had three replicates and controls one replicate. Anaerobic bottles were kept statically at 37° C. When quercetin disappearance was evident (visual inspection of the insoluble yellow color on the bottom of test tube), 10% of the culture was transferred to another anaerobic bottle with the same medium. Sample processing was done in an anaerobic chamber under an atmosphere of nitrogen (75%), carbon dioxide (20%), and hydrogen (5%). Sampling was done at the end of the first and second incubation time once quercetin degradation was completed across all samples (72 h of incubation). In a second experiment, combinations of fecal matter from different subjects were tested. Two fecal samples used in the previous in vitro incubation experiment (from subjects #3 and #4) were selected based on their enrichment of one or the other Flavonifractor-related variant (ASV 65f4 or ASV a45d). Three enrichments of these fecal samples were done as follows (#3/#4): 0/0.1, 0.1/0.1, 0.1/0 mg ml<sup>-1</sup>. Incubations were done under anaerobic conditions using 7N minimal medium supplemented with 20 mM sodium acetate with and without quercetin using three replicates. Sampling was done at time 0 and 72 h post-inoculation.

#### *In vitro* incubations with fecal samples from Human Microbiota-Associated Mice (HMAM) under different diets

Experiments involving mice were performed using protocols approved by the University of Wisconsin-Madison Animal Care and Use Committee. Six female C57BL/6 (B6) germ-free mice were gavaged with ~200  $\mu$ l of fecal slurry which was prepared under anaerobic conditions in Hungate tubes using a 1 cm piece of straw containing the frozen fecal material and 5 ml mega media [20]. Germ-free mice were obtained from Taconic Farms (Germantown, NJ) and bred at the University of Wisconsin-Madison Gnotobiotic Facility using standard procedures. Mice were maintained on a chow diet for 2 weeks after inoculation with human fecal samples, then switched to a diet high in fiber (Teklad 2018S) for two weeks, and to a low fiber diet (Teklad TD.97184) for two additional weeks. Three fecal pellets were collected for each mouse after each experimental diet (high and low in fiber) and used separately as inoculum for *in vitro* incubations. Fecal pellets were weighted and then resuspended at 0.15 mg ml<sup>-1</sup> final concentration with vigorous vortexing in anaerobic 7N minimal medium plus acetate and quercetin as described above. Sample processing and incubation were also done under anaerobic conditions at 37° C statically. Sampling was done at 0 and 7 days of incubation (only one incubation time was done).

#### HPLC analyses of quercetin and metabolites

Samples were processed as previously described [19]. Briefly, 200  $\mu$ l samples were mixed with 1000  $\mu$ l HPLC-grade methanol plus 20  $\mu$ M genistein as internal standard, the suspension was bead beaten (2 min), heated (56°C for 20 min) and spun (10 min at 18, 000 g). Then 1 ml of the supernatant was mixed with 200  $\mu$ l of 10 mM ammonium formate/0.5 M EDTA buffer (pH

3.5). Separations were performed on a Kinetex 5  $\mu$ m EVO C18, 100 Å, 250 × 4.6 mm column (Phenomenex, Torrance, CA, USA). Injection volumes were 10  $\mu$ L. The flow rate was 1 ml min<sup>-1</sup>. Run time was 59 min run. The mobile phase was a binary gradient of (A) 10 mM ammonium formate and 0.3 mM ethylenediaminetetraacetic acid in water adjusted to pH 3.5 using concentrated HCl and (B) methanol. The gradient was: 5% B for 5 min, increased to 30% B over 30 min, increased to 95% B over 10 min, remained constant at 95% B for 5 min, decreased to 5% B over 2 min, and then re-equilibrated at 5% B for 7 min. A Dionex UltiMate 3000 HPLC equipped with an LPG-3400 quaternary pump, a WPS-3000 analytical autosampler, and a DAD-3000 diode array detector was used. Chromatograms at 280 nm absorbance were analyzed.

#### **DNA** preparation

A 300  $\mu$ L aliquot of each culture was mixed with a solution containing 500  $\mu$ l of 200 mM Tris (pH 8.0), 200 mM NaCl, 20 mM EDTA, 200  $\mu$ l of 20% SDS, 500  $\mu$ l of phenol:chloroform:isoamyl alcohol (25:24:1, pH 7.9) and 1.2 mg of 0.1-mm diameter zirconia/silica beads (BioSpec-Products). The suspension was bead beaten (3 min), spun at 8,000 rpm (5 min), and then top layer was transferred to a 15 ml tube for immediate column purification with 2.5 vol of NTl buffer, 3 washes with NT3 and final elution with 25  $\mu$ l of elution buffer (Clontech, Machery-Nagel 740609.250). DNA was quantified by the Qubit dsDNA HS assay.

#### 16S rRNA gene V4 amplification and sequencing

PCR was performed using primers 515F and 806R for the variable 4 (V4) region of the bacterial 16S rRNA gene [21]. PCR reactions contained 1 ng  $\mu$ l<sup>-1</sup> DNA, 10  $\mu$ M each primer, 12.5  $\mu$ l 2X Hot-Start ReadyMix (KAPA Biosystems, Wilmington, MA, USA), and water to 25  $\mu$ l. PCR program was 95°C for 3 min, then 30 cycles of 95°C for 30 s, 55°C for 30 s, and 72°C for 30 s, the final step was 72°C for 5 min. PCR products were purified by gel extraction from a 1.5% low-melt agarose gel using a Zymoclean Gel DNA Recovery Kit (Zymo Research, Irvine, CA). Samples were quantified using the Qubit dsDNA HS assay (Invitrogen, Carlsbad, CA, USA) and equimolar concentrations pooled. The pool was sequenced with the MiSeq 2x250 v2 kit (Illumina, San Diego, CA, USA). All DNA sequences generated in this study are deposited in the NCBI Short Read Archive under BioProject Accession Number: PRJNA595821 and PRJNA596889.

#### 16S rRNA sequence analysis

Sequences obtained from the Illumina MiSeq were filtered for quality control including chimera removal using DADA2 pipeline implemented in Qiime2 Core 2018.11 (https://giime2. org). The first 10 nucleotides were trimmed, and reads were truncated to 220 bases. DADA2 generates high-resolution tables of amplicon sequence variants (ASVs) which represent biological sequences in the sample differing by as little as one nucleotide [22]. Taxonomy was assigned to ASVs using the feature-classifier classify-sklearn. The abundance of the resulting taxonomy assignments of ASVs was analyzed using STAMP 2.1.3 (statistical analysis of taxonomic and functional profiles) [23], with statistical comparisons between groups (e.x. control vs. quercetin treatment) performed by two-sided Welch's t-test within 95% confidence interval. A subset of 6 ASVs whose abundance increased in quercetin treatments was further analyzed using SILVA ACT (Alignment, Classification and Tree Service) [24], and 10 closest neighbors were downloaded from this analysis. ASVs that lack neighbors with a defined taxonomy at the genus level in SILVA ACT were subjected to BLASTn (https://blast.ncbi.nlm.nih. gov/) using the Whole-genome shotgun contigs (WGS) database for Clostridia (taxid:186801), 16s rRNA partial sequences from the most similar genomes with a defined taxonomy at the genus level were used for the phylogenetic analysis. This group of sequences was aligned using

ClustalW and analyzed in MEGA 6.06 [25], the alignment file was used to construct a phylogenetic tree using the UPGMA method and a Distance Matrix for estimating evolutionary divergence between sequences [25–27]. Complete ids for ASV enriched in quercetin treatments and accession numbers for reference sequences are listed in Fig 1 (only the first 4 letters of each ASV are going to be mentioned throughout the text). Correlations (Spearman's rs and Bonferroni correction) and Principal component analysis (PCA) were done using PAST 3.23 (PAleontological Statistics) [28].

#### Selection of Flavonifractor variants-related genomes used in this study

Twenty genome assemblies for the genus *Flavonifractor* were downloaded from the NCBI genomes database in October 2019 (https://www.ncbi.nlm.nih.gov). Accession numbers and information about completeness is presented in S1 Table. To determine the species relationship of the genomes, the Average Nucleotide Identity (ANI) was calculated using the online tool JSpeciesWS (http://jspecies.ribohost.com/jspeciesws/) [30] which performs pairwise comparisons between two genomes calculating and indicating if a pair of genomes belong to the same species and/or genus based on their percentage of identity. After this analysis (S2 Table), we selected 8 genomes: 4 that represent the general features of the species *F. plautii* which is the closest relative of ASV\_65f4, and 4 genomes which represent the general features of the genus *Flavonifractor*, including the ones most closely related to ASV\_a45d (*Flavonifractor* sp. strains An4 and An82) (S1 and S2 Figs show the phylogenetic relatedness of *F. plautii* and *Flavonifractor* sp. strains, respectively).

#### Genome comparative analysis

Annotation of functions was done using GhostKOALA (KEGG Orthology And Links Annotation, https://www.kegg.jp/ghostkoala/), an automatic annotation and mapping service using the database 'genus\_prokaryotes' [31]. Then prediction of orthologous gene clusters was done using OrthoVenn2 (https://orthovenn2.bioinfotoolkits.net/home) [32]. We applied Ortho-Venn2 clustering to identify gene clusters enriched in the groups most related to variant ASV\_65f4 or ASV\_a45d. Completeness of pathways was screened using the KEGG Mapper Reconstruction tool (https://www.genome.jp/kegg/tool/map\_pathway.html). Proteins similar to a flavonoid-degrading protein was searched using the Blast tool in OrthoVenn2, Phloretin hydrolase (OXE48401.1) was taken as a reference protein [33].

#### Results

# Taxa enriched during *in vitro* fecal incubations with quercetin belong to the Ruminococcaceae and Lachnospiraceae families

Microbial communities were monitored in two successive *in vitro* incubations of human fecal samples with and without quercetin. In all quercetin treatments, the main metabolite produced was DOPAC (S3 Table). Using STAMP statistical analysis, it was revealed that two groups of bacteria were significantly enriched in quercetin treatments; these were unidentified members of the Ruminococcaceae and Lachnospiraceae families (S3 Fig). We then determined significant differences in abundance profiles of individual Amplicon Sequence Variant (ASVs). Six ASVs were identified as being enriched in one or more libraries when comparing quercetin treatments *vs* controls (S4 Table), four belonged to the Ruminococcaceae family and two to the Lachnospiraceae. This group of sequences was subjected to a more detailed phylogenetic analysis which revealed that the closest relatives were members of the genera *Eubacterium* (Lachnospiraceae), *Flavonifractor* (Ruminococcaceae) and *Intestinimonas* (Ruminococcaceae)



Fig 1. Phylogenetic analysis of taxa enriched in the presence of quercetin. The phylogenetic tree shows six ASVs (black dots) whose abundance increased in the presence of quercetin; distances in the tree were inferred using the UPGMA method [27]. The optimal tree with the sum of branch length = 2.18101115 is shown. The

percentage of replicate trees in which the associated taxa clustered together in the bootstrap test (100 replicates) are shown next to the branches [29]. The tree is drawn to scale, with branch lengths in the same units as those of the evolutionary distances used to infer the phylogenetic tree. The scale bar refers to evolutionary distances in substitutions per site. The evolutionary distances were computed using the Maximum Composite Likelihood method [26] and are in the units of the number of base substitutions per site. The analysis involved 44 nucleotide sequences. All positions containing gaps and missing data were eliminated. There were a total of 225 positions in the final dataset. Evolutionary analyses were conducted in MEGA6 [25].

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(Fig 1). As a result of this phylogenetic analysis, we identified ASVs that were 100% identical to *F. plautii* (ASV\_65f4) and *E. ramulus* (ASV\_c588) (S5 Table). These ASVs were the ones that increased in abundance the most when quercetin was present compared to the controls, together with another one related to the *Flavonifractor* genus (ASV\_a45d) (Fig 2). Although ASVs related to *Eubacterium* and *Intestinimonas* genera were enriched significantly in 1 or 2 libraries, *Flavonifractor*-related ASVs were found to be more ubiquitous after quercetin incubation, with at least one variant significantly enriched in every library (S4 Table). It should be noted that one of these *Flavonifractor*-related variants, ASV\_65f4, showed also a significant increase when no quercetin was present in the medium (S4A Fig), indicating that this ASV is favored by the culture conditions used. Nevertheless, its relative abundance increased significantly more when quercetin was present (S4B Fig). This behavior did not change when higher concentrations of fecal matter were tested (1 and 10 mg/ml). The other *Flavonifractor* variant, ASV\_a45d, showed no enrichment in media with no quercetin.

## Amplicon Sequence Variants (ASV) related to *Flavonifractor* were negatively correlated in *in vitro* incubations with fecal samples

A correlation analysis across the 9 libraries of the abundances of the ASVs enriched in guercetin treatments showed a strong negative correlation between ASV 65f4 and ASV a45d (Fig 3A and S5 Fig), both of these ASVs were related to the genus *Flavonifractor* (Fig 1); this negative correlation was not present in incubations without quercetin. This pattern was investigated in a second experiment using human microbiota-associated mice (HMAM). Germ-free mice were inoculated with fecal samples from six human subjects different from the previous ones and after a period of acclimatization to the diet, fecal pellets were retrieved and used for in vitro incubations with quercetin. Both ASVs, ASV 65f4 and ASV a45d, were present in all 6 subjects, and after quercetin treatment, a negative correlation between these two ASVs was again evident (Fig 3B). Which ASV dominated during incubation with quercetin could not be explained by their initial abundances (S6 Fig). Even though ASV a45d was lower in abundance than ASV\_65f4 (undetectable in most cases), it dominated in half of the libraries after quercetin treatment. Additionally, mice were fed two different diets (high and low in fiber) which affected the composition of the microbial community as shown in a principal component analysis (PCA) (Fig 4A). Nevertheless, this disturbance did not affect the pattern of dominance of ASV\_65f4 over ASV\_a45d or vice versa, previously observed (Fig 3B). PCA analysis showed that component 2 was explained by diet at 0 days of incubation (Fig 4A) and by the enrichment of the Flavonifractor-related variants (ASV\_65F4 or ASV\_a45d) at day 7 (Fig 4B). E. ramulus-related ASVs (ASV\_c588 and ASV\_ace8) were not present in these libraries, and only one Intestinomonas-related ASV was present (ASV\_f8d4), which increased in relative abundance during incubation with quercetin.

# Fecal sample combinations showed the dominance of ASV\_65f4 over ASV\_a45d

After replicating the biological phenomenon between ASV\_65f4 and ASV\_a45d using fecal samples from different subjects, we aimed to study this pattern in cocultures. Unfortunately,



**Fig 2.** Bar plots for the relative abundances of the 6 Amplicon Sequence Variants (ASV) enriched in quercetin. Human subjects are labeled as Subject #1, #2, #3, #4, #5, #6, #7, #8, #9 in bar plots, for better visualization intercalated libraries are highlighted in gray. Each library has 6 bars, 3 corresponds to replicates from first incubation and 3 from second incubation (Subject #3 had only 2 replicates for second incubation).

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only ASV\_65f4 was isolated in pure culture while ASV\_a45d could not be isolated. Thus, an experiment combining fecal samples that were previously enriched in ASV\_65f4 or ASV\_a45d was carried out (combination of fecal samples from subjects #3 and #4 previously enriched in ASV\_65f4 and ASV\_a45d, respectively, Fig 3A). In this experiment, we expected that if the combination of fecal matters did not affect the *Flavonifractor*-related variants, we should observe a reduction in their relative abundance corresponding only to the dilution factor. This means that when samples #3 and #4 were combined, the relative abundances of ASV\_65f4 and



**Fig 3. Relative abundances of ASV\_65f4 and ASV\_a45d are negatively correlated.** Relative abundance of ASV\_65f4 and ASV\_a45d in human (A) and human microbiota-associated mice fecal samples (B). ASV\_65f4 is represented in gray and ASV\_a45d in black. In the bottom panel, libraries from HMAM mice fed a diet high in fiber are shown in solid color and mice fed a diet low in fiber are shown with a line pattern. Error bars correspond to 3 incubations done with fecal matter from the same donor individually sampled. For human samples (n = 9), relative abundances obtained for the second incubation are shown and for HMAM mice (n = 6), relative abundances obtained after 7 days of incubation with quercetin are shown.

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Fig 4. Principal Component Analysis (PCA) plot of the libraries from *in vitro* incubations with fecal samples from Human Microbiota-Associated Mice (HMAM). (A) PCA plot of the HMAM samples at 0 days of incubation. Libraries from HMAM mice fed a high fiber diet are shown in gray and libraries from HMAM mice fed a low fiber diet in black. (B) PCA plot of the HMAM samples at 7 days of incubation. Libraries that were enriched in ASV\_65f4 are shown in gray and libraries enriched in ASV\_645f4 are shown in gray and libraries enriched in ASV\_45d are shown in black. Each symbol represents a library (n = 6, 3 replicates), different shapes represent libraries from a different subject: #10, star (\*); #11, diamond ( $\blacklozenge$ ); #12, dot ( $\bullet$ ); #13, inv. triangle ( $\checkmark$ ); #14, triangle ( $\bigstar$ ); and #15, square ( $\blacksquare$ ).

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ASV\_a45d should reach 50% of the one reached when fecal samples are not combined. However, it was observed that when samples #3 and 4# were combined (50:50), ASV\_65f4 dominated reaching a relative abundance compared to the one reached when fecal samples #3 and #4 were not mixed. Meanwhile, the relative abundance of ASV\_a45d was severely affected by the combination of fecal samples reaching a relative abundance below 1% (Fig 5).

#### Dominance of ASV\_a45d or ASV\_65f4 was associated with genera Desulfovibrio and Phascolarctobacterium

The microbial community profiles were analyzed in search of organisms whose relative abundance was lower or higher when ASV\_a45d dominated over ASV\_65f4 or vice-versa across all experiments. Besides, we only considered those species whose relative abundance increased



**Fig 5. Relative abundance of ASV\_65f4 and ASV\_a45d in** *in vitro* **incubations with fecal sample combinations.** Fecal samples from subjects #3 and #4 were combined (50:50) or not (100:0 and 0:100). *In vitro* incubations with the fecal samples from subject #3 (enriched in ASV\_65f4) are shown in gray (right) and from subject #4 (enriched in ASV\_a45d) are shown in black (left).

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during incubation because these species may have a higher probability of being actively interacting with other members of the community. It was observed that when ASV\_a45d dominated after incubation with quercetin, the relative abundance of *Desulfovibrio* was significantly higher (p<0.05 in all 3 experiments) (S7A Fig). When present, *Desulfovibrio* sp. increased in relative abundance in the medium supplemented with acetate. Meanwhile, when ASV\_65f4 was dominant, the relative abundance of the genus *Phascolarctobacterium* was significantly higher (p<0.05 in all 3 experiments) (S7B Fig). This genus increased in relative abundance during incubation as well.

## Flagellar, ethanolamine, and galactose utilization genes were differentially enriched in the genomes related to ASV\_65f4 and ASV\_a45d

As mentioned, variants ASV\_65f4 and ASV\_a45d belong to different species of the genus Flavonifractor. The closest relative of ASV\_65f4 was F. plautii (100% identical), while ASV\_a45d was more closely related to Flavonifractor sp. strains An4 and An82 (98,6% identical), isolated by Medvecky and collaborators from the chicken cecum [34]. Since there are whole-genome assemblies available for these strains we performed a comparative genomic analysis to predict gene functional differences between the taxonomic groups related to each variant. Specifically, we analyzed orthologous genes enriched in the group more closely related to ASV\_65f4 (Table 1 and S6 Table) and more closely related to ASV\_a45d (Table 2 and S7 Table). The ASV 65f4-related group was enriched in several genes involved in ethanolamine utilization (Table 1 and S6 Table). A closer examination revealed that both groups had ethanolamine utilization genes, but ASV\_65f4-related group had these genes enriched, thus to establish the relevance of this enrichment, we reconstructed the operons for ethanolamine and propanediol utilization for both groups of genomes (propanediol catabolic pathway has homolog proteins to the ethanolamine catabolic pathway that can be misannotated by automatic servers). The reconstruction of these operons revealed that two ethanolamine operons (Eut operon 1 and 2) were presented in the ASV\_65f4-related group, while the ASV\_a45d-related group only had

Cluster	Count	Name	p-value
Cluster 1	11	ethanolamine catabolic process	6.00E-07
Cluster 2	4	ornithine metabolic process	0.00028198
Cluster 3	3	polyhedral organelle	0.00255864
Cluster 4	5	bacterial-type flagellum-dependent swarming motility	2.33E-08
Cluster 5	5	chemotaxis	4.62E-07
Cluster 6	4	protein secretion	3.91E-06
Cluster 7	4	bacterial-type flagellum-dependent cell motility	1.14E-05

 Table 1. Gene clusters enriched in the genomes more closely related to ASV\_65f4.
 ASV\_65f4.
 related group includes *F. plautii* YL31, *F. plautii* 2789STDY5834932, *F. plautii* ATCC 29863, and *F. plautii* An248.

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Eut operon 1 (Fig 6). Eut operons 1 and 2 located in different parts of the genome and their proteins were highly similar but not identical. Predicted proteins involved in the formation of flagella, flagellar proteins that interact with chemotaxis proteins, components of the flagellar motor that determine the direction of flagellar rotation, and the secretion of flagellar proteins were only present in ASV\_65f4-related group and *Flavonifractor* sp. strain An306 (Table 1 and S6 Table). The core set of flagellar genes (26 genes) [35] was identified in the 4 genomes belonging to ASV\_65f4-related group, except for one of the genes that encode for a rod protein, FlgB, which was not found in *F. plautii* strain 2789STDY5834932. Meanwhile, the group more closely related to ASV\_a45d was enriched in genes involved in galactose metabolism (Table 2 and S7 Table). These 4 genomes had all genes required for the degradation of galactose to alpha-D-glucose 1-phosphate.

#### Predicted phloretin hydrolase is present in both groups of genomes

Phloretin hydrolase gene (*phy*) is a well-characterized gene involved in the degradation of flavonoids. We found that both groups of genomes possess a protein similar to the reference Phloretin hydrolase (Table 3). Predicted Phy proteins of strains An4, An10, An82, and An306 were 90–95% identical to the reference Phy from *F. plautii* YL31.

#### Discussion

Quercetin is present in most fruits and its degradation produces biological active metabolites with effects on the host. Extending our knowledge of quercetin-degrading communities is important for predicting the health outcomes of flavonoid consumption. We used an *in vitro* fecal incubation system to directly evaluate the effect of the microbiota on the flavonoid. To limit the enrichment of non-quercetin degraders in these incubations, a medium low in carbon sources was used (20 mM of acetate). Under these conditions, mostly *Flavonifractor*-related sequences were enriched across libraries, specifically variants ASV\_65f4 and ASV\_a45d. These ASVs belong to different species, with 96.4% of nucleotide identity in their

Table 2. Gene clusters enriched in the genomes more closely related to ASV\_a45d. ASV\_a45d-related group includes *Flavonifractor* sp. An4, *Flavonifractor* sp. An10, *Flavonifractor* sp. An306.

Cluster	Count	Name	p-value
Cluster 1	4	Mo-molybdopterin cofactor biosynthetic process*	8.54E-07
Cluster 2	3	riboflavin biosynthetic process*	0.00044437
Cluster 3	2	galactose metabolic process	0.00249661

\* The complete pathways of Riboflavin and Mo-molybdopterin cofactor biosynthetic processes were not present.

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**Fig 6. Representative BMC Loci for** *Flavonifractor* **spp..** The ethanolamine utilization operons (Eut operon 1 and 2) and 1,2-propanediol utilization operon (Pdu operon). Genes are drawn on the *F. plautii* YL31 genome using Benchling [Biology Software] (2019). Eut operon 1 is 12,247 bp, Pdu operon is 22,527 bp, and Eut operon 2 is 18,769 bp. Abbreviations are as follows: AlcDH, Alcohol dehydrogenase; AldDH, Aldehyde dehydrogenase; PTAC, phosphotransacetylase; BMC, bacterial microcompartment; PdtaS, two-component system, sensor histidine kinase; PdtaR, two-component system, response regulator. Genes are color-coded according to their annotation: light blue, BMC-containing proteins; red, aldehyde dehydrogenase; green, alcohol dehydrogenase; solid pink, PduL-type phosphotransacylase; light purple, re-activating proteins; dark blue, signature enzymes (ethanolamine ammonia lyase subunits and propanediol dehydrates subunits); brown, regulatory element including two-component signaling elements; yellow, transporter; gray, other Eut or Pdu proteins. Circles show the presence (filled circle) or absence (white circle) of proteins in the strains depicted in the phylogenetic tree. The UPGMA phylogenetic tree involved 8 nucleotide sequences: *F. plautii* 2789STDY5834932 (STDY5834932), *F. plautii* An248 (An248), *F. plautii* ATCC 29863 (ATCC29863), *F. plautii* YL31 (YL31), *Flavonifractor* sp. An306 (An306), *Flavonifractor* sp. An82 (An82), *Flavonifractor* sp. An4 (An4), and *Flavonifractor* sp. An10 (An10). All positions containing gaps and missing data were eliminated. There were a total of 1008 positions in the final dataset. <u>S8 Table</u> contains all accession numbers for each protein in each strain. Pdu operon was reconstructed by its similarity with the one in *Salmonella enterica* subsp. *enterica* srovar Typhimurium str. LT2 (S9 Table).

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Description	Score	eValue	Identities	Positives	Gaps
lcl ATCC_29863 EHM54196.1	550	0	100	100	0
lcl 2789STDY5834932 CUQ29647.1	550	0	100	100	0
lcl YL31 ANU42335.1	550	0	100	100	0
lcl An248 OUO83512.1	547	0	99	99	0
lcl An10 OUQ80369.1	507	0	91	95	0
lcl An82 OUN23291.1	473	2.00E-169	85	91	0
lcl An306 OUO41926.1	472	4.00E-169	86	90	0
lcl An4 OUO11830.1	469	4.00E-168	83	90	0

Table 3. Blast results for Phloretin Hydrolase (Phy) for Flavonifractor spp.

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16S rRNA variable region V4 [36]. The variant ASV\_65f4 was 100% identical to the known quercetin degrader *F. plautii*, which will explain its enrichment in the treatments. Meanwhile, the variant ASV\_a45d was 98.6% identical to *Flavonifractor* sp. An4 and An82 [34]. The genomes of these species have a predicted phloretin hydrolase gene which catalyzes the hydrolytic C-C cleavage of phloretin, a flavonoid structurally similar to quercetin [33], generating phloroglucinol and 3-(4-hydroxyphenyl) propionic acid as biodegradation products. The enzyme is well characterized for another quercetin-degrader, *E. ramulus* [37]. This indicates that strains An4 and An82 may harbor the enzymatic machinery necessary for the cleavage of the C-ring in quercetin as well, as *F. plautii* and *E. ramulus* do [38,39]. In addition to the genome evidence of its close relatives, ASV\_a45d was enriched in quercetin treatments with DOPAC production, even in the absence of other known quercetin degraders. Altogether this evidence suggests that ASV\_a45d variant represents also a quercetin degrader.

ASVs related to *E. ramulus* were detected in 4 out of 9 human fecal samples and none of the mice samples. However, *E. ramulus*-related ASVs were significantly increased by quercetin treatment only in one sample. *E. ramulus* was enriched in a previous study that supplemented with quercetin the diet of healthy volunteers under a flavonoid-free intervention [40]. But under the culture conditions of this study, ASVs related to *Flavonifractor* were more prevalent. It is possible that the use of acetate instead of glucose gave an advantage to *Flavonifractor* sp., since it has been observed by us and other authors that *E. ramulus* needs glucose for the cometabolization of quercetin [4,19]. Another genus related to two of the ASVs enriched by quercetin treatments was *Intestinimonas*. Despite the relatedness of this bacterium with *Flavonifractor* sp., the ability to degrade quercetin was not detected in *Intestinimonas butyriciproducens* [41]. However, it is not known whether this bacterium can use metabolites derived from quercetin degradation, like phloroglucinol. In some of our incubations, the genus *Coprococcus*, which is reported to use phloroglucinol [42], increased in relative abundance but did not reach significance.

Correlations of co-existing taxa can be useful for identifying potential ecological interactions between species [43]. An interesting pattern of negative correlation was observed for *Flavonifractor*-related variants, ASV\_65f4 and ASV\_a45d. This may indicate a potential antagonistic interaction between these two species. Antagonism is more prevalent among phylogenetically and metabolically similar species. A study that screened 2,211 competing bacterial pairs from 8 different environments found that antagonism increased significantly between closely related strains and between strains that had a greater overlap in the capacity to grow on the 31 carbon sources screened through the Biolog assay [44]. Since both ASVs from our study are phylogenetically related and both may have the capacity to degrade quercetin, this could explain the observed pattern of dominance of one or the other but not both. In competition assays, it is often the species that starts at high initial abundance the one that dominates [45]. In our experiments, initial relative abundances did not predict which variant will dominate. Despite being less abundant at the initial point of incubation, ASV\_a45d dominated over ASV\_65f4 in half of the libraries after incubation with quercetin. However, when two fecal samples previously enriched in one or the other variant were combined, ASV\_65f4 was always the strongest competitor and the dominant variant. Therefore, this evidence suggests that other processes besides initial relative abundances might be responsible for the dominance of the weaker competitor, ASV\_a45d. Thus, through a comparative analysis of the genomes of close relatives, we sought functional capabilities that may allow one to thrive over the other.

Flavonifractor species clusters exhibited important differences in functional capacities. One clear difference that might help explain why only ASV\_65f4 increased in relative abundance in incubations supplemented with acetate but no quercetin was the observation that ASV 65f4-related group had an enrichment of operons related to ethanolamine utilization. As far as we know, Flavonifractor sp. does not use acetate as a sole carbon source, thus, it might use ethanolamine under these culture conditions since the precursor of ethanolamine, phosphatidylethanolamine, is present in feces. Chen and Innis (2004) estimate that around 7 mg of phosphatidylethanolamine is excreted per day in the feces of healthy children [46]. Ethanolamine can be used as carbon, nitrogen, and energy source by different bacteria [47]. The reconstruction of the catabolic operon of this substrate in *Flavonifractor* spp. genomes revealed two ethanolamine operons (Eut operon 1 and 2), most similar to the reported EUT2 operon, which instead of the EutD phosphotransacetylase (PTAC) it encodes a homolog to the PduL PTAC, and in place of the EutR regulatory enzyme, it has a two-component regulatory system consisting of a signal transduction histidine kinase and a response regulator [48]. Although both operons encode the essential proteins for ethanolamine utilization: EutBC protein, which is an ethanolamine ammonia lyase that converts ethanolamine into acetaldehyde and ammonia, the reactivating enzyme EutA that acts on EutBC, the aldehyde dehydrogenase (AldDH) EutE for converting acetaldehyde to acetyl-CoA that enters the tricarboxylic acid cycle and other processes, and the PduL PTAC homolog for the formation of acetate; Eut operon 2 had more *eut* genes that encode for structural proteins for the microcompartment [49]. The catabolic process of ethanolamine occurs in microcompartments called metabolosomes, which are protein-based organelle-like structures that protect the cell from the potentially toxic effects of volatile intermediates; in the case of ethanolamine, acetaldehyde is this toxic intermediate. It is possible that harboring both operons (Eut operon 1 and 2) makes the group more closely related to ASV\_65f4 more efficient for ethanolamine catabolism. The presence of ethanolamine catabolism in these strains might also give an advantage under nutrient scarcity in the gastrointestinal tract since this compound is abundant in this environment thanks to the action of phosphodiesterases on the phosphatidylethanolamine on bacterial and mammalian cell membranes which are constantly washed away in the mucus [50].

Another difference was observed in the carbohydrate metabolism of ASV\_65f4- and ASV\_a45d-related groups. The complete pathway for galactose utilization was only observed in the ASV\_a45d-related group. Thus, these groups of strains might have an advantage under a diet based on dairy which is rich in lactose, a disaccharide formed from one molecule of glucose plus one of galactose. The two groups might harbor a morphological difference too. The presence of a complete core set of flagellar genes was observed mostly in the ASV\_65f4-related group. It has been reported that the *Flavonifractor* genus can be motile or non-motile [51]. The presence of flagella may contribute to the ability of *F. plautii* to occupy different niches and compete for resources.

The interactions of ASV\_65f4 and ASV\_a45d with other species in the microbial community might also explain the distinct enrichment of these bacteria if certain species favor one or the other variant. Identifying microbe-microbe co-occurrences is challenging because different samples might have a low number of shared species, obscuring the overall pattern of co-abundance that could identify interactions among groups. Despite this limitation, we were able to identify two genera that were associated with the dominance of ASV\_65f4 or ASV\_a45d. When ASV\_65f4 dominated, the relative abundance of a succinate-utilizing bacterium, *Phascolarctobacterium*, was significantly higher. Two species of this genus are reported to only utilize succinate as a carbon source [52,53]. Succinate is not a major fermentation product in human feces but saccharolytic bacteria that are abundant in the gastrointestinal tract and certain bacteria that use acetate as a carbon source can produce it and it is a substrate that bacteria can use preferentially to coexist with bacteria that can readily utilize other more abundant carbon sources [52]. The increase in abundance of *Phascolarctobacterium sp.* suggests that succinate became available, whether this is related to the presence of ASV\_65f4 needs further experimental evidence.

The relative abundance of *Desulfovibrio* sp. was significantly higher when ASV\_a45d, the weaker competitor, became dominant. This abundance correlation could be explained by either a direct interaction between *Desulfovibrio* sp. and ASV\_a45d or by an indirect effect, where *Desulfovibrio* sp. inhibits the stronger competitor, ASV\_65f4. Evidence for the last argument could be related to the above-mentioned ethanolamine catabolism. *Desulfovibrio* sp. is an acetate utilizing bacterium that produces hydrogen sulfide (H<sub>2</sub>S) [54]. This metabolite has been observed to be involved in the ethanolamine metabolism. Some microbes detoxify H<sub>2</sub>S by metabolizing it to tetrathionate [55,56], which can serve as an electron acceptor for ethanolamine catabolism [57]. Another mode of action could be the inhibition of phosphodiesterases by H<sub>2</sub>S [58], which are the enzymes that convert phosphatidylethanolamine to ethanolamine. If the other variant, ASV\_a45d, does not rely on ethanolamine for its carbon needs, this could explain why the presence of *Desulfovibrio* sp. only affects ASV\_65f4.

The observations of this study show that *Flavonifractor*-related variants have the potential to utilize different carbon sources, interact with different species, and have different morphological traits like motility. Thus, they might modulate differentially the effect of flavonoids on the host and the gut microbiome. Whether there is competition between *Flavonifractor*-related variants during flavonoid consumption warrants further investigation, as well as their metabolic capacity to degrade flavonoids, and the prevalence of these variants in other human populations.

#### Supporting information

**S1 Fig. Evolutionary relationships of** *F. plautii* strains. (DOCX)

**S2** Fig. Evolutionary relationships of *Flavonifractor* sp. strains. (DOCX)

**S3** Fig. Genus abundance profiles from *in vitro* incubations with human fecal samples. (DOCX)

S4 Fig. Proportion of sequences (%) for ASV\_65f4 in *in vitro* incubations with human fecal from subject #3.

(DOCX)

S5 Fig. Univariate correlations between levels of six fecal taxa (ASVs) enriched in the presence of quercetin *in vitro*. (DOCX) **S6** Fig. Initial relative abundances for ASV\_65f4 and ASV\_a45d. (DOCX)

**S7** Fig. Box plots for the relative abundances of the genera *Desulfovibrio* and *Phascolarcto-bacterium*.

(DOCX)

**S1 Table. Genomes used in this study.** (DOCX)

S2 Table. Average Nucleotide Identity (ANIm) and aligned percentage for 20 genomes belonging to *Flavonifractor* spp. (DOCX)

**S3 Table.** Concentration (mM) in culture of quercetin and metabolites. (DOCX)

S4 Table. Statistical significance of Amplicon Sequence Variants (ASVs) enriched in quercetin treatments.

(DOCX)

S5 Table. Estimates of evolutionary divergence between Amplicon Sequence Variants (ASVs) and reference sequences. (DOCX)

**S6** Table. Protein list for orthologous gene clusters enriched in ASV\_65f4-related genomes. (DOCX)

S7 Table. Protein list for orthologous gene clusters enriched in ASV\_a45d-related genomes.

(DOCX)

**S8** Table. Ids for Eut and Pdu proteins for *Flavonifractor* spp. (DOCX)

**S9** Table. Distance Matrix for Pdu operon in *F. plautii* YL31 with the one in *Salmonella enterica* subsp. *enterica* serovar Typhimurium str. LT2. (DOCX)

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