Inflammation and bacteriophages affect DNA inversion states and functionality of the gut microbiota

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- 28 Summary
- 29 Reversible genomic DNA-inversions control expression of numerous bacterial molecules in the human
- 30 gut, but how this relates to disease remains uncertain. By analyzing metagenomic samples from six
- 31 human Inflammatory Bowel Disease (IBD) cohorts combined with mice experimentation, we identified

32 multiple invertible regions in which a particular orientation was correlated with disease. These include 33 the promoter of the anti-inflammatory polysaccharide-A (PSA) of Bacteroides fragilis, which is mostly 34 oriented 'OFF' during inflammation but switches to the 'ON' orientation when inflammation is resolved. We further detected increased abundances of B. fragilis associated bacteriophages in 35 patients with the PSA 'OFF' orientation. Isolation and analysis of a B. fragilis associated bacteriophage 36 37 revealed that it induced the PSA 'OFF' switch, thereby altering the bacterial induced immune modulation. Altogether, we reveal large-scale dynamic and reversible bacterial phase variations driven 38 39 both by bacteriophages and the host inflammatory state signifying bacterial functional plasticity and 40 suggesting potential clinical interventions.

41

42 Keywords

43 Phase variation, gut microbiome, bacteriophages, inflammatory bowel diseases, Crohn's disease,

- 44 ulcerative colitis, *Bacteroides*, immunomodulation
- 45

46 Introduction

47 Phase variation is the process by which bacteria undergo frequent and reversible alterations in specific 48 loci of their genome¹⁻⁴. In Bacteroidales, the dominant order of bacteria in the human gut, phase variation is highly prevalent and is largely mediated by inversions of DNA segments between inverted 49 50 repeats. These inversions often involve promoter regions dictating transcription initiation of genes or operons functioning as 'ON'\'OFF' switches⁵. In addition, DNA inversions can occur so that new genes 51 52 are brought from an inactive to a transcriptionally active site by re-orientation or recombination of 53 genomic shufflons and thus altering the expressed protein^{6–8}. Analysis of the orientations of bacterial 54 invertible regions in various host disease states can provide new insights into bacterial adaptation and functional contributions to the disease pathogenesis or its resolution. Phase variation in the gut 55 Bacteroidales often modulates production of components presented on the bacterial surface⁹ 56 57 dictating which surface molecules interact, for example, with neighboring microbes or with the host. As such, phase variation confers altered functional phenotypes and bacterial functional plasticity. 58

59 *Bacteroides fragilis*, a common resident of the human gut, modulates its surface by the phase variable 60 expression of its capsular polysaccharides (PS, denoted PSA-PSH). The biosynthesis loci of seven of its 61 eight polysaccharides have invertible promoters that are orientated either 'ON' or 'OFF' in respect to 62 the downstream PS biosynthesis operon⁴. Studies have shown that the *B. fragilis* polysaccharide A 63 (PSA) modulates the host immune system by inducing regulatory T cells (Tregs) and secretion of the 64 anti-inflammatory cytokine interleukin (IL)-10^{10,11}. Moreover, PSA was shown to confer protection 65 against experimental colitis^{10,12–14}, and thus is regarded as an anti-inflammatory polysaccharide. 66 Ulcerative colitis (UC) and Crohn's disease (CD) are multifactorial inflammatory bowel diseases (IBD),
67 characterized by a compromised mucosal barrier, inappropriate immune activation, and
68 mislocalization of the gut microbiota¹⁵⁻¹⁸. Genetic, immunological, and environmental factors all
69 contribute to the development and progression of IBD. The gut microbiota is a major environmental
70 factor in IBD, and as such, IBD has emerged as one of the most studied microbiota-linked diseases. A
71 mechanistic analysis of bacterial functions and potential functional alterations will allow us to better
72 understand the role of the gut microbiota in IBD.

73 Here we present an analysis of invertible DNA orientations in the gut microbiota of IBD patients from 74 multiple cohorts across the globe, focusing on Bacteroidales species. Our combined analysis of IBD 75 patient metagenomes and experimental mouse models reveals alterations in multiple DNA invertible 76 sites during gut inflammation, with the potential to modulate the host immune system. Importantly, 77 we show that filtered fecal extracts of IBD patients alter the orientation of the PSA promoter in B. fragilis populations. We show that bacteriophages are correlated with the PSA 'OFF' state and we 78 79 show that a specific lytic bacteriophage of *B. fragilis* increases the PSA promoter 'OFF' population with 80 concurrent decline of host colonic Treg cells. These findings reveal a dynamic interplay between gut 81 inflammation, bacteriophage, and bacterial phase variation, with potential implications for the 82 diagnosis and treatment of IBD.

83

84 Results

85 Multiple Bacteroidales invertible DNA regions have altered orientations in association with IBD

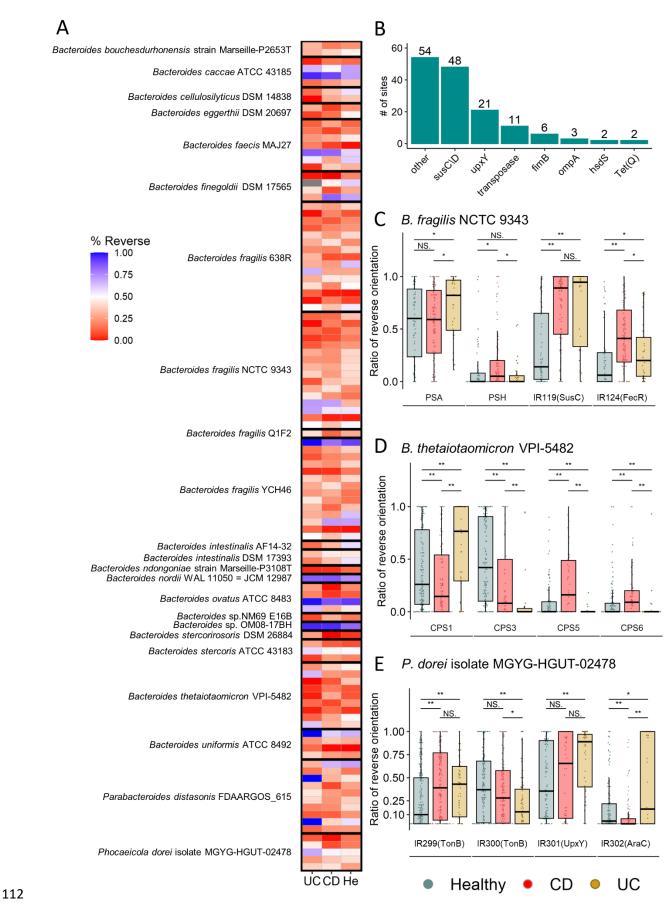
As a means to determine if Bacteroidales phase variable molecules may be differentially produced in 86 87 IBD patients compared to controls, we used the PhaseFinder⁹ software to identify and quantify DNA inversions in the gut metagenomes of cohorts of IBD patients and control subjects [Table 1]. To do 88 89 this, we first analyzed 39 sequenced genomes representing different human associated strains (36 90 species) from the Bacteroidales order and identified 311 invertible regions in these genomes. Analysis 91 of these regions in human gut metagenomes identified a total of 147 statistically significant DNA 92 inversions associated with the disease from 25 of the reference bacterial genomes. These DNA 93 inversions were located in both invertible promoters and intragenic regions of diverse genes, spanning 94 from regulatory genes to outer surface molecules. Table S1 details the locations of the inverted 95 repeats (IR) sequences and genes flanking the phase variable regions [Figure 1A]. The invertible regions whose orientations differed most significantly between IBD patients and controls were within 96 or in proximity to SusC/SusD-like outer membrane transport systems¹⁹ and capsular polysaccharides 97 (PS) promoters [Figure 1B]. Four of the five invertible capsular polysaccharide promoters of 98

99 Bacteroides thetaiotaomicron were differentially oriented between the groups, and three of the seven 100 invertible PS promoters of B. fragilis were differentially oriented, with the anti-inflammatory PSA 101 promoter being the most distinct between healthy and UC patients. The PSA promoter showed a 102 higher percentage (71%) of reverse oriented reads (compared to its reference genome sequence) in 103 IBD patients, compared to 56.2% in the healthy controls [Figure 1C, 1D]. To note, In the reference genome of *B. fragilis* NCTC9343 the promoter of PSA is in its 'ON' orientation, hence, the reverse 104 105 orientation, found in IBD patients, represents the PSA promoter's 'OFF' orientation. We further 106 identified differential promoter orientations in healthy and IBD cohorts for PULs and polysaccharides promoters of *Phocaeicola dorei*, a bacteria shown to be present in healthy subjects^{20,21} and also 107 correlated with disease activity in UC²² [Figure 1E]. 108

109

110 Table 1: Cohorts of IBD patients and control subjects included in DNA inversion analysis.

	N (Samples included in the analysis)	CD	UC	Non- IBD	Country	Notes	
IBDMDB	1283	574	349	360	United States	Longitudinal	ref ²³
HMP (3 phases)	320			320	United States		ref ²⁴
MetaHit	122	4	21	97	Denmark and Spain		ref ²⁵
1000IBD	331	205	126		the Netherlands		ref ²⁶
GeversD_2014	50	36		14	United States and Canada		ref ²⁷
LewisJD_2015	303	303			United States and Canada	Children with Crohn's Disease Longitudinal, treated	ref ²⁸
SUM	2409	1122	496	791			



114 Figure 1: *Bacteroides* species exhibit phase variation in health and disease.

A. Selected significantly differentially oriented invertible DNA regions (inverted repeats (IR) segments, see Table S1) (Wilcoxon rank sum test, FDR p<0.05) in at least one comparison between Healthy, CD (Crohn's Disease) and UC (Ulcerative Colitis). Blue indicates the Forward orientation and red represents the Reverse orientation in comparison to the reference genome. B. Prevalence of functional genes in proximity to invertible DNA regions significantly different between healthy individuals and IBD patients. C. Differentially oriented invertible DNA regions, in *Bacteroides fragilis* NCTC 9343. PSA: Polysaccharide A, PSH: Polysaccharide H. D. Differentially oriented invertible DNA regions in *Bacteroides thetaiotaomicron* VPI-5482. CPS: Capsular Polysaccharide. E. Differentially oriented invertible DNA regions in *Phocaeicola dorei* MGYG-HGUT-02478. (Wilcoxon rank sum test, *p < 0.05; **p < 0.01)

122 Differential promoter orientation states are induced by inflammation in a dynamic and reversible

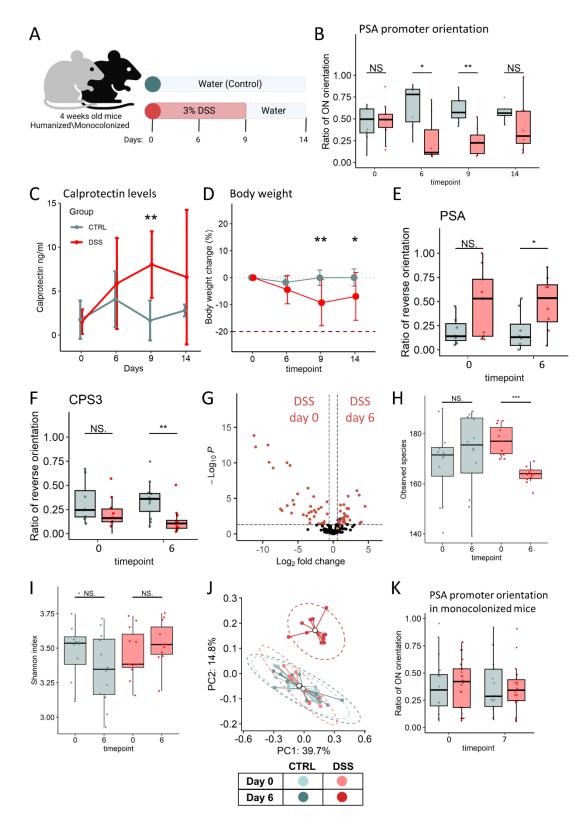
123 manner

To assess the dynamics of the *B. fragilis* PSA promoter orientation under inflammatory conditions, we 124 designed a longitudinal experimental mouse model during which we analyzed the PSA promoter 125 126 orientation over time. Germ-free (GF) mice were colonized with a healthy human microbiota, which was spiked with *B. fragilis* NCTC 9343, termed "humanized" mice. Experimental colitis was induced by 127 adding 3% Dextran sodium sulfate (DSS) to the drinking water²⁹ [Figure 2A] for 9 days after which DSS 128 129 was replaced with water until day 14, and as a result the inflammation was reduced. Inflammation 130 was confirmed by the levels of Calprotectin in the stool [Figure 2C], a commonly used biomarker for inflammation, and with mouse weight loss [Figure 2D]. Stool was collected before, during and after 131 132 DSS treatment to analyze orientations of specific invertible DNA regions, using quantitative PCR (qPCR). The *B. fragilis* PSA promoter orientation varied correlating with the inflammatory state [Figure 133 **2B**]. At the beginning of the experiment, \sim 45% of the population had the promoter in the 'ON' 134 135 orientation [Figure 2B]. Nine days after DSS was introduced, these percentages declined to 24%. By 136 day 14, the bacterial population returned to 40% 'ON', similar to the beginning of the experiment, and 137 to the control group, which did not receive DSS (mean of 58% of the *B. fragilis* population 'ON').

We further performed metagenomics analysis of these mice to study alterations in bacterial composition and to apply the PhaseFinder⁹ algorithm for extensive phase variation analysis. This analysis revealed phase variation in multiple bacteria and genomic regions, including the PSA promoter of *B. fragilis* and the CPS3 promoter of *B. thetaiotaomicron*, overlapping with the results of the human databases analysis **[Figure 2E, 2F, Supp. Table 2]**.

143 Next, we identified alterations in bacterial composition of the DSS treated mice, whereas the control 144 mice were stable throughout. Bacterial richness (alpha-diversity, observed species) declined on day 6 145 under inflammatory conditions [**Figure 2H**], while evenness remained constant [**Figure 2I**]. Beta-146 diversity (Bray-Curtis distance) was altered upon DSS treatment and each mouse had a different 147 bacterial composition five days after removal of the DSS [**Figure 2J**]. Inflamed mice showed a decrease 148 in bacterial abundances of *Blautia* species genera and *Eubacterium ventriosum*, while showing an 149 increase in *Barnesiella intestinihominis* and *Alistipes dispar* [**Figure 2G**, **Supp. table 2 and 3**]. The

- 150 relative abundances of *B. fragilis* and *B. thetaiotaomicron*, which exhibited differential orientations of
- 151 invertible DNA regions, increased in inflamed mice, although to a lesser extent [Figure 2G].
- 152 To assess the role of inflammation on the orientation of the *B. fragilis* PSA promoter in the absence of
- a complex microbiota, we repeated the experiment using gnotobiotic mice mono-colonized with *B*.
- 154 *fragilis* NCTC 9343. The PSA promoter orientation remained stable in the monocolonized mice over
- the course of the experiment, suggesting a role of the microbiota in the relative 'OFF' orientation of
- this promoter during inflammation. [Figure 2K].



158

159 Figure 2: Relative orientation of the PSA promoter of *B. fragilis* from the population is affected by inflamed state of the gut.

A. Illustration of murine model of inflammation. Mice monocolonized with *B. fragilis* NCTC 9343 and mice colonized with a human microbiota
 spiked with *B. fragilis* NCTC 9343 - "Humanized", were exposed to 3% Dextran sodium sulfate (DSS) (Day=0 in the illustration) at four weeks
 of age; B. Ratio of *B. fragilis* PSA's promoter ON orientation measured by qPCR in different days of the experiment. Data represent the
 median (line in box), IQR (box), and minimum/maximum (whiskers). (Wilcoxon rank sum test, *p < 0.05; **p < 0.01). Blue: Control group,
 Red: DSS treated mice. C. Calprotectin level (ng/ml) measured in different days of the experiment. Lines represent
 Blue: Control group, Red: DSS treated mice. D. The body weight change of mice measured in different days of the experiment. Lines represent
 the standard deviations. Blue: Control group, Red: DSS treated mice. E. Ratio of *B. fragilis* PSA's promoter reverse orientation measured by
 the PhaseFinder tool, in different days of the experiment. Data represent the median (line in box), IQR (box), and minimum/maximum

168 (whiskers). (Wilcoxon rank sum test, *p <0.05; **p <0.01). Blue: Control group, Red: DSS treated mice. F. Ratio of B. thetaiotaomicron 169 CPS3's promoter reverse orientation measured by the PhaseFinder tool in different days of the experiment. Data represent the median (line 170 in box), IQR (box), and minimum/maximum (whiskers). (Wilcoxon rank sum test, *p < 0.05; **p < 0.01). Blue: Control group, Red: DSS treated 171 mice. G. Differential bacterial abundance between DSS treated mice in timepoint 0 and timepoint 6 detected by the Maaslin2 algorithm. 172 Red dots indicate differentially abundant bacteria that were determined by adjusted P value < 0.05 and log₂ fold change >1 and <-1, 173 respectively. Yellow dot indicates B. fragilis, and blue dot indicates Bacteroides thetaiotaomicron. H. Alpha diversity (observed species) 174 175 176 177 between groups and timepoints. Data represent the median (line in box), IQR (box), and minimum/maximum (whiskers). (t test, *p < 0.05; **p < 0.01, ***p<0.001). Blue: Control group, Red: DSS treated mice. I. Alpha diversity (Shannon index) between groups and timepoints. Data represent the median (line in box), IQR (box), and minimum/maximum (whiskers). (t test, *p < 0.05; **p < 0.01, ***p<0.001). Blue: Control group, Red: DSS treated mice. J. PCoA on Bray–Curtis dissimilarity distances between groups and timepoints. Each point represents 178 179 a single sample, colored according to group and timepoints: light blue: Control at timepoint 0, blue: control at timepoint 6, light red: DSS treated at timepoint 0, red: DSS treated at timepoint 6. The mean (centroid) of samples in each group is indicated with a blank circle. Ellipses 180 represent 0.95 confidence interval of each group. K. Ratio of B. fragilis PSA's promoter ON orientation measured by qPCR in different days 181 in monocolonized mice. Data represent the median (line in box), IQR (box), and minimum/maximum (whiskers). (Wilcoxon rank sum test, 182 *p <0 .05; **p < 0.01). Blue: Control group, Red: DSS treated mice.

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- 184

185 The inflammatory milieu triggers DNA inversions in *B. fragilis*

186 We next sought to examine environmental factors of inflammation that result in a decreased 187 percentage of the *B. fragilis* population with the PSA promoter orientated ON. To do so, we exposed B. fragilis NCTC 9343 to fecal filtrates from IBD patients. CD and UC patients were recruited from the 188 189 Rambam Health Care Campus (RHCC). Fecal samples were collected before and after Infliximab (HR) 190 or Humira (HuR) therapy, both are antibodies targeted against tumor necrosis factor- α (TNF- α), an 191 inflammatory cytokine increased in IBD patients. B. fragilis NCTC 9343 was cultured in fecal filtrates 192 until reaching mid-log phase, and subsequently DNA was extracted for qPCR analysis [Figure 3A]. B. 193 fragilis exposed to fecal filtrates of patients before treatment, during inflammation, showed higher 194 ratios of the population with the PSA promoter oriented 'OFF', while B. fragilis exposed to fecal 195 filtrates after treatment showed higher ratios of the PSA promoter 'ON' orientation [Figure 3B]. This 196 observation was in line with the fecal Calprotectin concentrations, which were reversely correlated 197 with PSA promoter 'ON' orientation [Figure 3C]. These results demonstrated that the population of 198 bacteria with the PSA promoter in each orientation vary in the inflamed and non-inflamed gut, with a 199 higher percentage of the population in the 'OFF' orientation under inflammatory conditions, and a 200 shift towards the 'ON' orientation following reduction in inflammation [Figure 3B, 3C]. This change 201 could be due to alterations of the inversion under these conditions or due to selection of a preferred 202 promoter state.

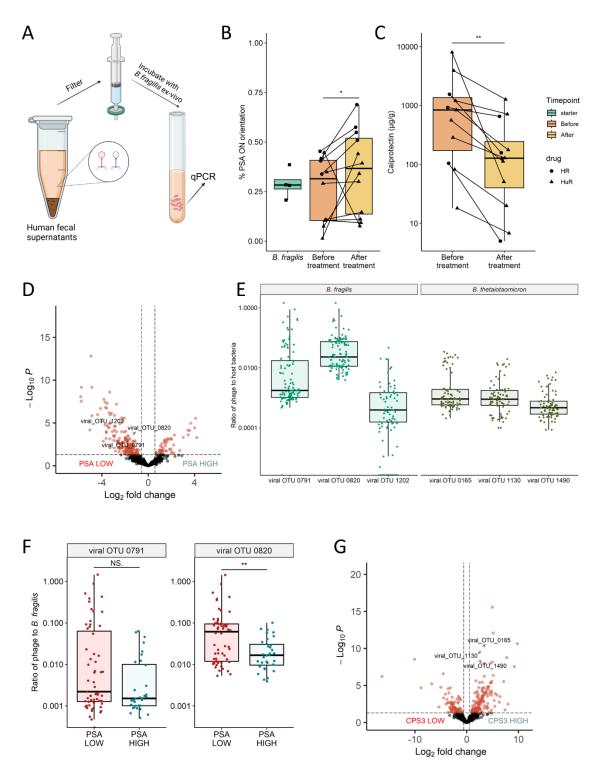
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204 Investigating viral associations to orientation of the polysaccharide A promoter of *B. fragilis*

The fecal filtrates contain a mixture of bacterial and host metabolites, cytokines, antibodies, viruses, bacteriophages, and other components. Bacteriophages have been observed to induce phase variation in bacterial cells, leading to the switching 'OFF' of specific polysaccharides loci or increased

expression of alternative polysaccharides with possible protective effects³⁰. Moreover, they have been 208 shown to be associated with intestinal inflammation and IBD in several studies^{31,32}, including 209 Nishiyama et al.³³ who characterized temperate bacteriophages and their bacterial hosts in the 210 211 IBDMDB metagenomics database. Here, using phage sequences from IBDMDB database, and 212 compared the relative abundances of these phages between samples that displayed lower (<40%) or 213 higher (>60%) ratios of the PSA promoter 'ON' orientation. Differential abundance analysis revealed that more bacteriophages were correlated with the PSA 'OFF' orientation (Figure 3D, Supp. Table 3), 214 three of which were predicted to infect *B. fragilis*³³. To assess whether the relative abundances of the 215 216 bacteriophages were accompanied with lower relative abundances of *B. fragilis*, we compared phage 217 to host for each *B. fragilis* associated bacteriophage. The two viral OTUs with the highest phage to 218 host ratios in patients, OTUs 0791 and 0820, were also correlated with low ratios of the PSA promoter 219 'ON' orientation (i.e., with the PSA promoter 'OFF' orientation) [Figure 3E, 3F]. Intriguingly, viral OTUs 0791 and 0820 were found to be more abundant in active CD and UC³³. 220

221 We conducted the same analysis comparing samples with high to low 'ON' orientation ratios of the 222 CPS3 promoter of *B. thetaiotaomicron*. Although there were differences in the virome compositions 223 between these groups, no B. thetaiotaomicron associated bacteriophages were correlated with the 'OFF' orientation of the CPS3 promoter (i.e., the orientation, which we identified as associated with 224 225 the disease) [Figure 3G, Supp. Table 3]. We found three B. thetaiotaomicron associated viral OTUs -226 0165, 1130, and 1490, slightly associated with the 'ON' orientation of the CPS3 promoter (the 227 orientation that we identified as associated with healthy controls) [Figure 3G]. In addition, these 228 bacteriophages displayed low phage to host ratios [Figure 3E]. To note, these OTUs were not 229 previously associated with disease³³.



230

Figure 3: Evidence of viral association to B. fragilis Polysaccharide A's promoter genomic orientation.

231 232 233 234 235 236 237 238 A. Experimental design of culturing B. fragilis in patient's fecal filtrates. B. Ratio of the ON orientation of the PSA promoter of B. fragilis, measured by qPCR, after ex-vivo exposure to fecal filtrates of CD patients before and after treatment with anti-TNF (either Infliximab (HR) or Humira (HuR)). Data represent the median (line in box), IQR (box), and minimum/maximum (whiskers). (One-sided Wilcoxon rank sum test, *p <0.05). green: B. fragilis not exposed to fecal filtrates, orange: B. fragilis exposed to fecal filtrates of patients before anti-TNF treatment. yellow: B. fragilis exposed to fecal filtrates of patients after treatment. Dots represent individual experiments; lines connect experiments from the same patient; Shapes are determined by the patients' treatments, circle: HR, triangle: HuR. C. Calprotectin levels (µg/g) measured in patients' feces. Data represent the median (line in box), IQR (box), and minimum/maximum (whiskers). (One-sided 239 Wilcoxon rank sum test, *p <0.05). Dots represent samples; lines connect samples from the same patient; Shapes are determined by the 240 patients' treatments, circle: HR, triangle: HuR. D. Differential viral taxonomic units' abundance, (from the IBDMDB cohort, count table from 241 Nishiyama et al. (2020).), between samples with low ON orientation of the PSA promoter (<40%) and high ON orientation (>60%), in the 242 IBDMDB cohort count table. Differentially abundant viral taxonomic units were detected by the DeSeq2 algorithm (Wald test, p < 0.01). Red 243 dots indicate differentially abundant bacteria that were determined by P value < 0.01 and fold change >1.5 and <-1.5, respectively. E. Phage 244 to host ratios of viral OTUs detected in Figure 3D and 3F. F. Phage to host ratios of viral OTUs detected in Figure 3D against samples' levels

of PSA's promoter ON orientation analyzed from the IBDMDB cohort, based on the count table from Nishiyama et al. (2020). G. Differential
 viral taxonomic units' abundance, (from the IBDMDB cohort, count table from Nishiyama et al. (2020).), between samples with low ON
 orientation of the CPS3 promoter (<40%) and high ON orientation (>60%), in the IBDMDB cohort. Differentially abundant viral taxonomic
 units were detected by the DeSeq2 algorithm (Wald test, p < 0.01). Red dots indicate differentially abundant bacteria that were determined
 by P value < 0.01 and fold change >1.5 and <-1.5, respectively.

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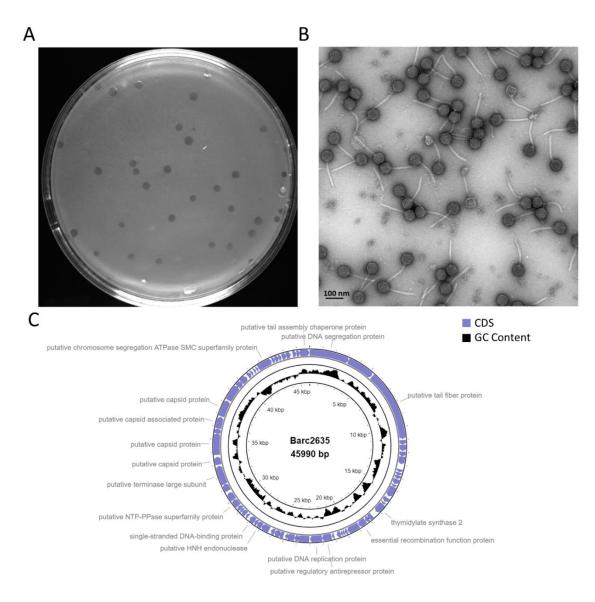
251 Bacteriophage exposure drives phase variation and reduction in Treg cells population

252 Since a higher abundance of bacteriophages were correlated with the PSA promoter in the 'OFF' orientation, we sought to study whether encounter with bacteriophage can alter the orientation of 253 254 this promoter in *B. fragilis*. We started by isolating a bacteriophage from sewage that we designated 255 bacteriophage Barc2635 that makes plaques on a lawn of *B. fragilis* NCTC934 [Supp Figure 1A]. We sequenced the phage genome (GenBank accession: MN078104) and characterized its morphology by 256 electron microscopy [Supp. Figure 1B]. Barc2635 is a double-stranded DNA lytic bacteriophage of 257 258 45990 bp with a GC content of 38.9%, containing 67 putative CDS belonging to the Siphoviridae family and the Caudovirales order [Supp. Figure 1C]. Interestingly, increased abundance of bacteriophages 259 from the *Caudovirales* order were found to be correlated with IBD patients (UC and CD)³⁴. We 260 analyzed the sequence similarities of Barc2635, with the *B. fragilis* associated bacteriophages 261 identified in the IBDMDB³³ and found that Barc2635 is most similar to a cluster of bacteriophages, 262 including viral OTUs 0791 and 0820 which were associated with active disease³³ [Figure 4A]. 263

264 To test whether this bacteriophage causes changes in relative orientations of the PSA promoter in populations of *B. fragilis*, we monocolonized GF mice with *B. fragilis* NCTC 9343 in the presence or 265 266 absence of bacteriophage Barc2635 and analyzed genomic-wide DNA inversion states [Figure 4B]. In the presence of Barc2635, B. fragilis exhibited prolonged alterations in the orientations of invertible 267 regions affecting outer surface components such as polysaccharide utilization loci (PULs), ABC 268 269 transporters and capsular polysaccharides, including PSA [Supp. Table 4]. In response to 270 bacteriophage, a higher percentage of the population had the PSA promoter in the 'OFF' state [Supp. 271 Figure 2A], with a concomitant increase in the percentage of the population with the PSF promoter 272 orientated 'ON' [Supp. Figure 2B]. Throughout the experiment (42 days), Barc2635 and B. fragilis coexisted in gnotobiotic mice, with mild fluctuations in their abundances [Supp. Figure 2C]. Ten days 273 274 after the initial colonization, we quantified expression of the first gene of the PSA locus, $upaY^{35}$. upaY275 expression requires that the PSA promoter be oriented 'ON', and that no inhibitory UpxZ products 276 from other loci are produced³⁶. Figure 4C shows a significant reduction in upaY expression in mice 277 containing Barc2635 in comparison to mice with bacteria alone. To directly measure the levels of PSA on the surface of the *B. fragilis* population, we used specific antibodies and monitored surface PSA by 278 279 flow cytometry. The percentage of bacterial cells expressing PSA from mice with bacteriophage 280 Barc2635 was significantly lower in comparison to bacterial cells from mice without the bacteriophage

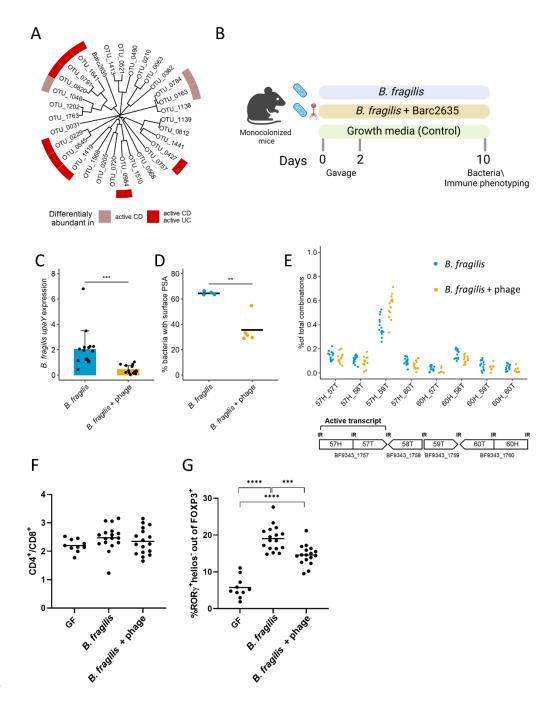
[Figure 4D], in agreement with the *upaY* expression levels. In both groups of mice (i.e., *B. fragilis* alone
and *B. fragilis* with Barc2635), the CFU levels of *B. fragilis* were comparable, with a 10^{0.5} difference
[Supp. Figure 2D], and no phages were detected in the *B. fragilis* monocolonized group (i.e., without
bacteriophage inoculation) [Supp. Figure 2E].

In a previous study, we demonstrated that phase variation of specificity proteins for a Type I 285 286 restriction-modification system (R-M) of *B. fragilis* results in altered transcription of some capsular 287 polysaccharides with potential altered immunomodulatory functionality of these bacteria⁷. Since the Type I R-M systems are known to provide protection against bacteriophage^{37–40}, we used long-reads 288 sequencing to quantify the orientations of the genes encoding the Type I R-M specificity proteins upon 289 290 exposure to Barc2635. Our results demonstrate different patterns of specificity gene combination in 291 the expression locus in *B. fragilis* isolated from mice inoculated with the phage compared to those not 292 exposed to phage [Figure 4E].



294 Supplemental Figure 1: Characterization of Bacteriophage Barc2635

- 295 295 296 A. A representative transmission electron microscopy of Barc2635. B. Barc2635 plaques on a lawn B. fragilis NCTC 9343. C. Genome
- structure, GC content, and putative annotations of Barc2635. CDS: coding sequence.
- 297
- 298 The PSA of B. *fragilis* induces regulatory T cells (Tregs, CD4⁺Foxp3⁺Rorg⁺) in the colonic lamina propria of mice⁴¹⁻⁴⁴. To monitor the effect of intestinal Barc2635 during *B. fragilis* colonization on the 299 300 CD4⁺Foxp3⁺Rorg⁺ Tregs population, we extracted cells from the colonic lamina propria and 301 immunophenotyped them by flow cytometry. We found that in the presence of Barc2635, the 302 CD4⁺Foxp3⁺Rorg⁺ Tregs population is decreased in concert with the decrease in the *upaY* transcription, 303 coinciding with less surface production of the immunomodulatory PSA [Figure 4F, Figure 4G]. These
- 304 data link phage to alterations in bacterial functionality with concomitant effects on host physiology.

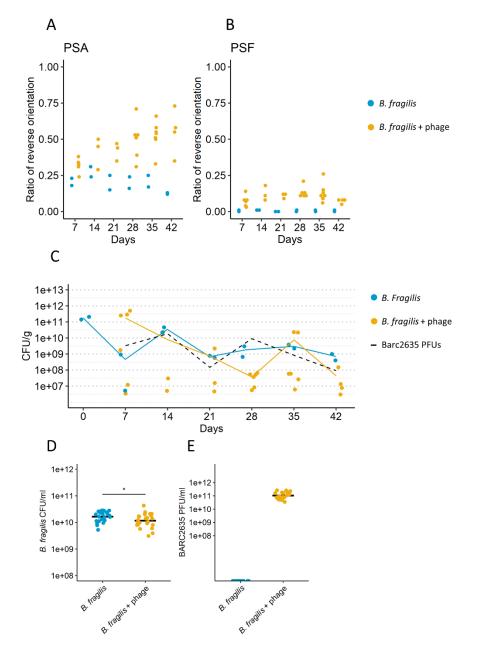


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306 Figure 4: Phage exposure alters expression of the PSA locus and PSA surface

307 A. Phylogenetic tree based on the whole genome of viral OTUs identified as bacteriophages against B. fragilis as well as bacteriophage 308 Barc2635. MAFFT was used to perform multiple sequence alignment. The average-linkage method was used to construct the phylogenetic 309 tree with 1000 bootstrap replicates. Colors denote association between the viral OTUs abundances in Nishiyama et al. (2020), IBDMDB 310 cohort, with active Crohn's disease (light red) or with both active Ulcerative colitis and active Crohn's disease (red). B. Experimental design 311 of in vivo experiments. C. Expression levels of upaY in ceca of mice monocolonized with B. fragilis vs. mice monocolonized and infected with 312 the Barc2635 bacteriophage. Levels are shown as 2^(-ACT) with rpsL as a reference gene. Each dot represents a mouse. ****P<0.0001, 313 Mann-Whitney test. D. PSA presence on the surface of B. fragilis exposed to the Barc2635 bacteriophage, detected by anti-PSA antibodies. 314 315 Bacteria were analyzed by flow cytometry for the expression of PSA, using Rabbit anti PSA antibodies. Each dot represents a mouse. E. Percent of the bacterial population with each of the phase-variable Type-I R-M specificity gene combinations at the expression locus. Each 316 dot represents a mouse. IR: inverted repeat. F. CD4 to CD8 ratio out of CD45 TCRB live cells in colon. Single cells were isolated from colon 317 lamina propria. Immune cells were analyzed by flow cytometry. Each dot represents a mouse. G. RORy helios percentages out of FOXP3-318 cells in colon. Single cells were isolated from colon lamina propria. Immune cells were analyzed by flow cytometry. Each dot represents a 319 mouse. ***P<0.001, ****P<0.0001, one-way analysis of variance (ANOVA).

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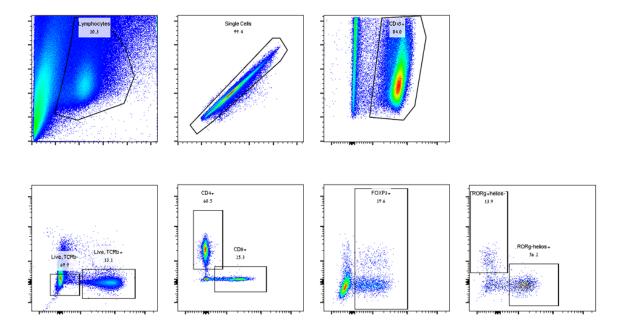


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Supplemental Figure 2

323 324 325 326 A. Ratio of *B. fragilis* PSA promoter reverse orientation in mice fecal samples measured by the PhaseFinder tool, on different days of the experiment. Blue: B. fragilis, yellow: B. fragilis + Barc2635. B. Ratio of B. fragilis PSF promoter reverse orientation in mice fecal samples 327 328 measured by the PhaseFinder tool, on different days of the experiment. Blue: B. fragilis, yellow: B. fragilis + Barc2635. C. CFUs of B. fragilis in fecal samples of mice monocolonized with B. fragilis (blue) or colonized with B. fragilis + phage (yellow); PFUs of Barc2635 in fecal samples 329 of mice colonized with B. fragilis + phage (dashed black line). D. CFUs of B. fragilis in fecal samples of mice monocolonized with B. fragilis 330 (blue) or colonized with B. fragilis + phage (yellow) (Wilcoxon rank sum test, *p < 0.05). E. PFUs of Barc2635 in fecal samples of mice 331 monocolonized with B. fragilis (blue) or colonized with B. fragilis + phage (yellow). 332

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338 Supplemental Figure 3 – gating strategy

339 Representative flow cytometry plots demonstrating the gating strategy for the staining panel.

340

341 Discussion

342 Phase variations, prevalent in host-associated species, especially in the abundant gut Bacteroidales order⁹, contribute to bacterial fitness in changing ecosystems, such as the human gut. Reversible DNA 343 344 inversions lead to phase variable synthesis of numerous molecules (e.g. surface, regulatory, and other 345 molecules), and as such, confer functional plasticity. Our study reveals that phase variable states of 346 certain molecules correlate with gut inflammation, with potential implications on host physiology. By 347 analyzing six different public databases of IBD patients (CD and UC) and controlled mice experiments, 348 we identify multiple invertible genomic regions that map to 25 different Bacteroidales strains. 349 Notably, we find that both intergenic regions (e.g. promoters) and intragenic regions (e.g. genomic 350 shufflons) exhibit altered genomic phase variable states in gut inflammatory conditions - both 351 affecting gene expression.

The most prevalent genomic regions that demonstrated differential orientations of invertible regions were in susC/susD homologs and polysaccharide (PS) promoters - both with immunomodulatory potential. An epitope of SusC-like proteins, part of the starch-utilization system in *Bacteroidetes*, was recently shown to elicit T cell responses in IBD patients and healthy controls⁴⁵, suggesting that operons that include SusC homologs might confer immunomodulatory properties to the bacteria, and phase variation in such genes might alter bacteria-host interactions. Among the phase-variable PSs, the anti-

inflammatory polysaccharide A (PSA) promoter of *B. fragilis* showed a higher percentage of reverse
oriented reads in IBD patients compared to healthy controls, indicating that the 'OFF' orientation was
more prevalent in IBD patients, potentially limiting the protective, anti-inflammatory, effects of PSA.
These results align with a previous study⁴⁶ that focused on the PSA promoter of *B. fragilis* in IBD
patients using PCR digestion of biopsy samples.

We further find that some DNA inversion states, like the PSA promoter of *B. fragilis*, are dynamic and can respond to changes in their local environment, specifically during inflammation. Our analysis focused on the bacterial population level, and therefore the DNA inversions could either occur in individual bacterial cells in response to inflammation, or as a selection process on the bacterial population level, where those with the promoter OFF orientation are enriched under inflammatory conditions.

Intriguingly, the preferential 'OFF' orientation of the PSA promoter of B. fragilis did not occur to the 369 370 same extent in inflamed monocolonized mice as it did in both the inflamed mice colonized with a 371 human microbiota and when bacteria are grown in patients' fecal filtrates. These results suggest that 372 environmental factors in humanized mice and patients are necessary for this effect. Our analysis of 373 phage OTUs in the IBDMDB cohorts revealed enrichment of *B. fragilis* associated viral OTUs in samples 374 where the PSA promoter was present in the 'OFF' orientation. In addition, exposure of B. fragilis to 375 Barc2635 resulted in the PSA promoter 'OFF' orientation, suggesting a role for gut bacteriophages in 376 bacterial phase variation.

Type I restriction-modification (R-M) systems provide protection against bacteriophages by identifying and restricting foreign DNA. We previously characterized a phase variable Type I R-M system of *B. fragilis* that regulates distinct transcriptional programs affecting polysaccharide synthesis. Along with the effects on the PSA promoter orientation, infection with Barc2635 also triggered genomic inversion of this Type I R-M system towards inhibition of PSA synthesis^{7,36}.

The anti-inflammatory effects of PSA are mediated by upregulation of Tregs and subsequent induction 382 of IL-10 secretion^{12,13}. We found that the Treg cells populations decreased in *B. fragilis* monocolonized 383 mice infected with Barc2635, suggesting that the PSA 'OFF' trigger of Barc2635 has implications on 384 385 the host immune system¹¹. Applying the same analysis to *B. thetaiotaomicron*'s CPS3, we observed bacteriophages that are more abundant in samples with a higher ratio of CPS3 'ON' oriented 386 387 promoters, however, the bacteriophage to host ratios per sample were too low to conclude that B. 388 thetaiotaomicron bacteriophages lead to populations with altered CPS3 synthesis. Altogether, we 389 demonstrate differential orientations of invertible regions in IBD and elucidate the bacteriophages as 390 a potential trigger. These phase variations result in bacterial functional plasticity affecting the host 391 immune system. Bacteriophages are an example of an environmental factor that can alter phase 392 variable states. However, within the inflamed gut there are numerous factors that can potentially alter 393 phase variable states. These include the microbiome^{33,47–50} (e.g. neighboring bacteria and viruses), the gut metabolome⁴⁷, an altered immune system⁵¹ and physical alterations in the intestine such as 394 abnormal pH concentrations⁵², osmotic^{53,54} and oxidative stress^{55,56}. For example, Tropini et al.⁵⁷ 395 showed that PEG induced osmotic perturbation resulted in an increased ratio of CPS4 to CPS5 in B. 396 397 thetaiotaomicron.

This study demonstrates that alterations in invertible genomic regions, and consequently molecular phase variations in gut bacteria, during IBD, can potentially influence the host immune system and inflammatory state. These phase variations can occur in response to changes in gut environmental factors during inflammation, including, but not limited to bacteriophages. Future studies integrating bacterial DNA inversions and phase variation analyses may illuminate the role of bacterial functional plasticity in additional physiological states, possibly resulting from different environmental factors, which may drive alterations in microbe-host interactions.

405 Limitations of the Study:

406 The six databases analyzed in this study included adults and children, healthy controls and inflamed 407 patients (before and after treatment) and longitudinal samples. The impact of each of these factors, 408 and the impact of diet and lifestyle, merit further research. The PhaseFinder⁹ algorithm that we 409 applied identifies DNA inversions in short reads. As such, our analysis does not include other phase 410 variation mechanisms like duplications or insertions. Also, analysis of short reads of metagenomics sequencing data might overlook inversions resulting from long structural genomic alterations^{3,7,58}. 411 412 Furthermore, metagenomic sequencing data averages the whole bacterial population of samples, 413 implying a dilution factor for low abundant bacteria. Moreover, genomic inversion sites might 414 interfere with genome sequence assemblies, leading to incomplete genomes, and thus could be 415 overlooked when applying tools that search inversions in reference genomes. This study used an identified and isolated lytic bacteriophage for B. fragilis, further studies are required to elucidate the 416 417 functional effects of IBD associated lytic and temperate bacteriophages. With these limitations 418 notwithstanding, our study highlights the importance of considering bacterial phase variation in the 419 context of IBD and its potential impact on inflammation and on altered microbe-host interactions.

420 Methods

421 <u>Mice</u>

422 All mouse work was in accordance with protocols approved by the local IACUC committee under 423 approval numbers: IL-151-10-21 and IL-105-06-21.

424 Males, 4-5 weeks-old Germ-Free (GF) C57BL/6 or Swiss Webster mice from the Technion colony were

425 used. Mice were housed and maintained in a GF care facility and were provided with food and water

- 426 *ad libitum*; they were exposed to a 12:12 h light-dark cycle at room temperature.
- 427 Humanized mice were created by oral gavage of GF C57BL/6 mice with human feces from a single
- 428 healthy human donor, spiked with *B. fragilis* NCTC 9343.
- 429 Monocolonized mice were created by oral gavage of GF C57BL/6 mice with *B. fragilis* NCTC 9343.
- 430
- 431 For the prolonged experiments of Barc2635 and *B. fragilis* co-existence in gnotobiotic mice, female
- 432 Swiss Webster GF mice were administered with *B. fragilis* NCTC 9343 and bacteriophage Barc2635, or

433 *B. fragilis* only. All administrations were performed by oral gavage. On day 49 mice were sacrificed for

- 434 bacteria and immune phenotyping.
- 435
- 436 For phage immunomodulation studies, GF mice were gavaged twice (on day 0 and on day 2) with B.
- 437 *fragilis* NCTC 9343 and bacteriophage Barc2635, *B. fragilis* only, or growth media as control. On day
- 438 10 mice were sacrificed for bacteria and immune phenotyping.
- 439

440 DSS model

441 For acute DSS-induced colitis, humanized mice were treated with 3% Dextran sodium sulfate in their

442 drinking water for 9 days followed by 5 days recovery before sacrificing. The control animals were 443 administered distilled water.

Fecal samples were obtained on days 0, 6, 9 and 14 (before DSS treatment, during and afterdiscontinuing DSS treatments), for further analyses.

446

447 Mice Inflammation measurement

448 Fecal supernatants were prepared after suspension in 1:10 sterile PBS and centrifugation at 4,500xg

for 15 minutes. Enzyme-linked immunosorbent assay (ELISA) to measure calprotectin concentrations

450 was performed using Mouse S100A8/S100A9 Heterodimer kit according to the manufacturer protocol

- 451 [R&D systems].
- 452 Mice weights were assessed using an electronic scale at the same daytime.

453

454 <u>qPCR and primers</u>

455 DNA was extracted from fecal samples using ZymoBIOMICS DNA Miniprep Kit [Zymo research]. The 'ON'/'OFF' orientation of the PSA promoter in the extracted DNA samples was determined by 456 457 quantitative polymerase chain reaction (qPCR) using SYBR® Green mix [Thermo Fisher Scientific]. Two 458 sets of primers were designed to target the PSA locus. One set was used as a proxy to the number of bacteria in the samples and targeted UpaY, the first gene immediately downstream to the promoter 459 460 region. The second set of primers targeted the promoter region and would only produce a product when the orientation is 'ON'. The ratio of 'ON'/'OFF' PSA orientation in the samples was calculated 461 462 using the $2-\Delta\Delta CT$ method calculated against the PSA locked 'ON' results (100% 'ON' orientation).

463

464 *upaY* gene expression was determined by RT-qPCR. RNA was extracted from fecal samples using
465 zymoBIOMICS RNA miniprep kit [Zymo research]. Reverse transcription of RNA to cDNA was
466 performed using the qScript cDNA Synthesis Kit [Quantabio]. *upaY* mRNA levels were determined by
467 qPCR using SYBR® Green mix [Thermo Fisher Scientific] with primers against *rpsL* as a reference gene.
468 The 2-ΔΔCT method was employed for the specificity fold change tests.

469 Primers:

B_Frag_upaY_F	CGCTCGGACAAAGAAGGACC
B_Frag_upaY_R	ACTTCTACCCTACGACGACGA
B_Frag_PSA_M	GGTGTTCCAAAAGACGAACGT
B_Frag_PSA_F	TGTGTAAATGATAGGAGGCTAGGG
rpsL_F	CCGAACTCTGCAATGCGTAA
rpsL_R	CGCGAACCAGTACGATTGAG

470

471 <u>Mice feces sequencing</u>

DNA samples underwent quality control by Qubit fluorescence analysis to determine concentration of
DNA for downstream analysis (ThermoFisher, Cat. Q32850). Libraries were prepared using the Illumina
Tagmentation DNA prep streamlined library preparation protocol according to manufacturer's
instructions with a minimum of 50 ng of DNA starting mass and 8 cycles of PCR enrichment, ending
with a fragment size of 550 bp. IDT for Illumina DNA/RNA UD indexes and Nextera DNA CD indexes
were used (Illumina IDT, Cat. 20027213; Illumina Nextera, Cat. 20018708).

478 All libraries were diluted to 15 pM in 96-plex pools and validated on 100-cycle paired-ends read Miseq

479 V2 runs (Illumina, Cat. MS-102-2002), before shipping to the US at 4 nM for sequencing on the

480 Novaseq 6000 in S4 mode at 96-plex in a 300-cycle paired-end reads run, with an estimated read depth

481 of 30 Gbp per sample (Illumina, Cat. 20028312). Final loading concentration of 600 pM. All sequencing

- 482 runs were performed with a spike-in of 1% PhiX control library V3 (Illumina, Cat. FC-110-3001).
- 483

484 <u>Taxonomic profiling</u>

Community profiling was performed using metaphlan4 v4.0.0⁵⁹ with mpa database vJan21. For each sample, the forward reads were first aligned against the mpa database using bowtie2 v2.3.5.1⁶⁰ (flags --sam-no-hd --sam-no-sq --no-unal --very-sensitive). Next, the resulting sam file was analyzed by metaphlan4 with default parameters. In each analysis, species at abundance <=0.1% were ignored.

490

491 <u>Microbiome analysis</u>

492 Statistical analysis of sequenced data was initially performed using MicrobiomeAnalyst⁶¹ followed by 493 comprehensive analysis using R packages: Phyloseq⁶², Vegan⁶³ and DESeq2⁶⁴. Differences in microbial 494 taxa and functional modules were assessed by differential abundance analyses using DESeq2⁶⁴. Alpha 495 diversity indices (observed species and Shannon) were compared using the Kruskal–Wallis rank sum 496 test. Beta diversity distance matrices (Bray-Curtis) were compared using the vegan package's function 497 ADONIS, a multivariate ANOVA based on dissimilarity tests and visualized using PCoA. Results were 498 visualized using the ggplot2 R package⁶⁵.

499

500 Identification of DNA inversion sites

Representative Bacteroides species were selected from an in-house database of human-associated 501 502 microbial species. The database was constructed from 118K metagenomics assembled genomes 503 (MAGs) recovered from human-associated metagenomics samples. Taxonomy assignment was performed using gtdbtk v2.0.0 and GTDB release 207 with the classify_wf program and default 504 505 parameters⁶⁶. Overall, 36 Bacteroides species were identified of which 35 had species-level GTDB 506 taxonomy assignments. For each of these species, the representative genome from GTDB was used 507 for the PhaseFinder analysis. We have also included the genomes of two additional *B. fragilis* strains, 508 Phocaeicola dorei, and Parabacteroides distasonis. Overall, 40 genomes were included. Information 509 about the genomes is provided in Table S1.

PhaseFinder⁹ (v1.0) was used to identify invertible sites in the metagenomics samples. The default
 parameters of PhaseFinder were used. We filtered the results by removing identified sites with <20

512 reads supporting either the forward or reverse orientations combined from the paired-end method, 513 mean Pe ratio <1% across all samples, and sites within coding regions of rRNA products. To compare 514 DNA orientation patterns between CD and UC patients with those of healthy controls, we focused on 515 sites that displayed a difference of over 10% between at least one of the groups. The Wilcoxon rank 516 sum test was employed to conduct these comparisons, and the Benjamini-Hochberg method was 517 utilized to correct for multiple comparisons, with a false discovery rate (FDR) set at less than 0.1. Each 518 invertible region was manually curated to assess its coding regions, gene annotations, and their 519 putative functions. Briefly, genomic regions were visualized online using the NCBI Graphical Sequence 520 Viewer (version 3.47.0). Invertible regions with coding sequences (CDS) within them, were annotated 521 according to the CDS name(s). Invertible regions lacking CDS within them were searched for CDSs that 522 start in proximity to the invertible DNA sites (<200~bp). CDSs in the region (four upstream and four 523 downstream) were used to assess the functionality of the region. Regions containing or in proximity 524 to rRNA and tRNA genes were filtered from the comparisons as well as invertible regions with no CDSs 525 start in proximity to the inverted repeats.

526

527 Bacteriophage isolation

528 For isolation of bacteriophages, inflowing raw sewage for a waste-water treatment plant (WWTP) 529 from Barcelona (Spain) was filtered through low protein binding 0.22 µm pore size polyethersulfone (PES) membrane filters (Millex- GP, Millipore, Bedford, Massachusetts) to remove bacteria. Isolated 530 plaques were obtained by the double-agar layer technique⁶⁷. Briefly, tubes containing 2.5 ml of soft 531 532 BPRM-agar kept at 45°C were inoculated with 1 ml of an exponential growth phase culture 533 (OD600=0.3, corresponding to ca 2x10⁸ CFU / ml) of the host bacteria grown in BPRM broth and 1 ml534 of the filtered sewage sample. After gently mixing, the contents of each tube were poured onto a plate 535 of BRPM-agar and incubated inside GasPak (BBL) jars at 37°C. Plaques were clearly spotted after 18 h 536 of incubation.

537 For phage isolation, discrete well-isolated plaques were stabbed with a sterile needle and inoculated 538 in a tube containing 5 ml of BRPM broth. Then 1-ml of a culture of *B. fragilis* NCTC 9343in exponential 539 growth was inoculated into the tube, which was then incubated for 18h at 37 °C. After incubation, an 540 aliquot of the culture was treated with chloroform (1:10 (v;v)), vigorously mixed for 5 minutes and centrifuged at 16,000xg for 5 minutes⁶⁸. The supernatant containing the phage suspensions were 541 further filtered through low protein binding 0.22 µm pore size polyethersulfone (PES) membrane 542 543 filters (Millex-GP, Millipore, Bedford, Massachusetts), diluted and plated as indicated in the previous 544 paragraph to verify the uniformity of the plaques. Then, one well differentiated plaque was stabbed

and the whole operation repeated to obtain a high titer, over 1x10⁹ plaque forming units (PFU), phage
suspensions.

547

548 Phage genome sequencing

549 5hrs induction of phage DNA, phage particles were PEG-precipitated (6,000-12,000 MW, 8%), and

isolated by a CsCl gradient; 33 g, 41 g, 55 g in 50 ml TM buffer (50mM Tris-Cl pH8.0, 10mM MgCl2),

ultracentrifuged at 40,000 rpm for 1.5hrs, and dialyzed overnight in 100mM Tris ph7.5, 1M NaCl,

1mM EDTA 56. Genomic DNA was extracted using phenol-chloroform as described 57.

553 Illumina sequencing of Bacteroides phage Barc2635 was performed at the Biopolymers Facility,

Harvard Medical School, Department of Genetics, producing paired-end reads of 150 bp. Adapter

sequence removal and quality trimming was performed using BBDuk, part of the BBTools (v 37.50)

suite of programs. The reads were further screened against NCBI's UniVec_Core database (build

557 10.0) and the B. fragilis NCTC 9343 genome sequence using blastn and reads that returned a

significant hit to either were removed. The phage genome was assembled de novo using Velvet

1.2.10 under a k-value determined by Velvet Optimizer (v. 2.2.5). The genome was annotated using

an in-house customized version of Prokka v1.12, submitted to NCBI, and assigned GenBank accession

561 MN078104. Phage Genome map **[Supp. Figure 1C]** was visualized using the online tool Proksee

562 (https://proksee.ca/, accessed on 21 January 2023).

563 Viral OTUs multiple alignment

Alignments and phylogenetic tree of whole genomes of viral OTUs identified as bacteriophages against
 *B. fragilis*³³ as well as bacteriophage Barc2635 were generated using MAFFT online service (version 7).

566 Multiple sequence alignment was done using the default settings of the site. Phylogenetic tree was

567 constructed using the average-linkage method with 1000 bootstrap replicates and was visualized with

568 R package ggtree⁶⁹ (version 3.4.4).

569 MinION library preparation and sequencing

570 The specificity region of BF9343_1757–1760 was amplified by PCR from a population of bacteria 571 grown in vitro and in vivo from fecal content as described above. The primers annealed outside the 572 invertible region. The amplicons were purified by Wizard SV Gel and PCR Clean-Up System (Promega) 573 and measured by nanodrop.

574 Primers:

Type1RM_hsdS_F GACAATCGAGATGAAGAACAAC Type1RM_hsdS_R CCATAGGCGTATGATTTCCTG

575

576 DNA quantity was measured again using Qubit fluorometry (Thermo Fisher Scientific, Waltham, MA, 577 USA). Nanopore sequencing libraries were prepared from 200 fmol purified amplicons using Ligation 578 Sequencing Kit 1D (SQK-LSK109) and PCR-free Native Barcoding Expansion Kit (EXP-NBD104) (Oxford 579 Nanopore Technologies, Oxford, England). The barcoded libraries were loaded and sequenced on the 580 MinION device controlled by MinKNOW software (v.19.12.5) using MinION flow cells (FLO-MIN106D 581 R9.4.1, Oxford Nanopore Technologies, Oxford, England) after quality control runs. The raw data were 582 base called and demultiplexed by Guppy Basecalling Software (v. 3.3.3+fa743a6).

583 MinION data analysis

584 Adapters and barcodes sequences were removed from the reads using Porechop (v0.2.4, available from https://github.com/rrwick/Porechop). Reads were oriented using the 'Preparing Reads for 585 Stranded Mapping' protocol (Eccles, D.A. (2019). Protocols.io⁷⁰). We aligned the reads to the PCR 586 forward primer using LASTAL $(v.1060)^{71}$, and then reverse-complemented the reverse-oriented reads. 587 588 The reads were combined to an all forward oriented file and cropped to the first 1300 bases using 589 Trimmomatic (v.0.39)⁷². The reads were then split according to their alignment to the 1757-57 or 1757-60 5" half sequences using LASTAL. Reads were mapped to the full sequences with Minimap2 (v.2.17-590 r941)⁷³ using the –for-only and asm20 options. Mapped read counts were extracted from the 591 592 Minimap2 SAM output using SAMtools (v.1.7)⁷⁴.

593 MinION sequence data has been deposited in the NCBI sequence read archive (SRA) under the 594 BioProject accession number: PRJNA948162

595 <u>Fecal filtrates of patients</u>

Recruitment of IBD patients for this study was conducted at the Rambam Health Care Campus (RHCC).
The study was approved by the local institutional review boards with study numbers 0052-17 and
0075-09 in which all patients consented to be included in it. During therapy, patients were treated
either with Infliximab or Humira for at least two weeks.

Fecal samples were collected by patients at home prior to their clinic visit and collected from each at
the hospital. The samples were then stored at -80°C until they were shipped to the laboratory for
analysis.

- 603 Calprotectin levels were measured in each fecal sample using LIAISON Calprotectin (catalogue No.
- 604 318960) according to the manufacturer's instructions. The levels of calprotectin in the fecal samples
- 605 were used as a measure of disease activity in IBD patients.
- 606

607 In vitro assays with fecal filtrates from IBD patients

Bacteroides fragilis NCTC 9343 was grown in Brain heart infusion (BHIS) supplemented with 5 mg/l 608 609 hemin and 2.5 μ g/l vitamin K to OD₆₀₀~0.6 and centrifuged at 4,500xg for 5 minutes. Bacterial pellets 610 were washed twice with sterile PBS to remove BHIS components and then suspended with 1mL supplemented M9 minimal media. Patients' fecal samples were suspended in sterile PBS (1:5), 611 612 centrifuged at 4,500xg for 15 minutes, and supernatants were collected and filtered using the Medical Millex-VV Syringe Filter Unit, 0.22 µm, PVDF membrane. For the *in vitro* assay, *B. fragilis* was cultured 613 614 in patients' supernatants and diluted in M9 minimal media in a 1:25:25 ratio (bacteria: fecal 615 supernatants: media). Subsequently, 200µl of each culture was collected for DNA extraction at 616 OD₆₀₀~0.6.

- 617
- 618 M9 Medium was prepared as follows:
- 619 Per L:
- 620 1g NH₄Cl
- 621 6g Na2HPO₄
- 622 3g KH2PO4
- 623 0.5g NaCl
- 624 Supplements:
- 625 14.7mg CaCl₂.2H₂O (0.1ml 1M stock)
- 626 246mg MgSO₄.7H₂O (1ml 1M stock)
- 627 0.5% glucose (20ml 25%)
- 628 0.05% L-cysteine (10ml 5% stock)
- 629 5mg/ml Hemin (1ml 0.5% stock)
- 630 2.5mg/ml VitK₁ (0.5ml 0.5% stock)
- 631 2mg/ml FeSO₄.7H₂O (0.1ml 2% stock)
- 632 5ng/ml VitB12 (0.05ml 0.01% stock)
- 633
- 634 Gut lamina propria preparation

635 For lamina propria immunophenotyping, mice colons were removed by cutting the colon from the

636 cecum-colon junction to the anus. Fat tissue was carefully removed from colon tissue and further

637 proceeded for single cell suspension preparation using lamina propria dissociation kit (Miltenyi),

638 according to the manufacturer's protocol.

640

641 Flow cytometry

642 Cell preparations for flow cytometry analysis were performed in 5 ml tubes or U shape 96 wells plates. Single cells were washed with PBS and stained for live/dead staining using 1:1,000 in PBS, Zombie 643 fixable viability dye (Biolegend) for 10 minutes, at room temperature, and washed once with FACS 644 645 buffer, by centrifuge at 300xg for 5 minutes. For FcR blocking, cells were incubated with 0.5 µg 646 CD16/CD32 antibody for 10 minutes on ice and proceeded to further staining without a washing step. 647 Extracellular markers were stained with the relevant antibody panels for 30 minutes on ice and 648 washed twice with FACS buffer, by centrifuge at 300xg for 5 minutes. After the last wash, cells were 649 fixed with Foxp3 Fixation/Permeabilization working solution (Thermo) for 16 hours at 4 °C in the dark. For Intracellular staining, cells were permeabilized using 1X Foxp3 permeabilization buffer (Thermo) 650 651 according to the manufacturer protocol. For intracellular blocking, 2 µl of 2% rat serum (Stemcell 652 technologies) was added to each well for 15 minutes at room temperature and proceeded to further 653 staining without a washing step.

654 To quantify the percentage of *B. fragilis* from monocolonized mice with PSA on their surface, feces from monocolonized mice with *B. fragilis* with or without phage were suspended 1:10 in ice cold PBS 655 656 (mg/µl) and centrifuged at 300xg for 5 minutes, 4°C. Supernatants were separated from pellets and further centrifuged at 4,500xg for 5 minutes, 4°C. Bacterial pellets were resuspended in an ice cold 657 658 FACS buffer, 1:10 from initial PBS suspension. 100 µl of resuspended bacteria were incubated with 659 1:1,000 Rabbit anti B. fragilis PSA for 30 minutes at 4°C. Bacteria were washed twice using an ice cold 660 FACS buffer by centrifuge at 4,500xg for 5 minutes and then incubated with a donkey anti rabbit 661 fluorophore conjugated secondary antibody. After staining steps, the bacteria were washed twice with 662 an ice cold FACS buffer and finally resuspended in 500 µl ice cold PBS plus 1:1,000 Hoechst dye and 663 analyzed by flow cytometry using FSC and SSC thresholds of 1,000, and logarithmic scale. Gating 664 strategy is detailed in **Supplemental Figure 3**.

665

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692

693 Author contributions

694 SC HH RZ DKK TG IS and NGZ conceived and designed the project. SC HH RZ DKK and TG performed 695 and analyzed the experiments. SC, IS and NGZ planned the computational and analytical aspects; SC 696 and IS performed the computational analyses. MJC and LC contributed to the computational analysis 697 and interpretation of the results. SP and YC designed, lead, and executed the clinical study. KJ 698 contributed to the phage-bacteria-host study and to the bacteriophage morphological characterization. JJ isolated the bacteriophage. NM RN, and NBA helped with the experiments. SC HH 699 700 RZ TG IS LC and NGZ wrote the manuscript. SC RZ HH and DKK contributed equally to the study. All 701 authors read and approved the manuscript. NGZ conceived and planned the study, supervised it, 702 interpreted the experiments, and wrote the manuscript.

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- 705

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