16	Endogenous murine microbiota member Faecalibaculum rodentium
17	and its human homolog protect from intestinal tumor growth
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19	Elena Zagato <sup>1§</sup> †, Chiara Pozzi <sup>2</sup> †, Alice Bertocchi <sup>2</sup> , Tiziana Schioppa <sup>3</sup> , Fabiana
20	Saccheri <sup>1</sup> , Silvia Guglietta <sup>1¶</sup> , Bruno Fosso <sup>4</sup> , Laura Melocchi <sup>5,6</sup> , Giulia Nizzoli <sup>7</sup> ,
21	Jacopo Troisi <sup>8,9,10</sup> , Marinella Marzano <sup>4</sup> , Bianca Oresta <sup>2</sup> , Ilaria Spadoni <sup>11</sup> , Koji
22	Atarashi <sup>12,13</sup> , Sara Carloni <sup>11</sup> , Stefania Arioli <sup>14</sup> , Giulia Fornasa <sup>2</sup> , Francesco Asnicar <sup>15</sup> ,
23	Nicola Segata <sup>15</sup> , Simone Guglielmetti <sup>14</sup> , Kenya Honda <sup>12,13</sup> , Graziano Pesole <sup>4,16</sup> ,
24	William Vermi <sup>5,17</sup> , Giuseppe Penna <sup>2</sup> and Maria Rescigno <sup>2, 11*</sup>
25	Affiliations:
26	<sup>1</sup> Department of Experimental Oncology, European Institute of Oncology IRCCS,
27	20139 Milan, Italy
28	<sup>2</sup> Humanitas Clinical and Research Center – IRCCS, Via Manzoni 56, 20089 Rozzano
29	– Milan, Italy
30	<sup>3</sup> Department of Molecular and Translational Medicine, University of Brescia, 25121
31	Brescia, Italy
32	<sup>4</sup> Institute of Biomembranes, Bioenergetics and Molecular Biotechnologies (IBIOM),
33	Consiglio Nazionale delle Ricerche, Via Amendola 122/O, 70126 Bari, Italy
34	<sup>5</sup> Section of Pathology, Department of Molecular and Translational Medicine,
35	University of Brescia, 25121 Brescia, Italy
36	<sup>6</sup> Pathology Department, Fondazione Poliambulanza Hospital, 25124 Brescia, Italy
37	<sup>7</sup> Gastroenterology and Endoscopy Unit, Fondazione IRCCS Cà Granda, Ospedale
38	Maggiore Policlinico, 20122 Milan, Italy
39	<sup>8</sup> Department of Medicine, Surgery and Dentistry, "Scuola Medica Salernitana",
40	University of Salerno, Via Allende, 84081 Baronissi (SA) Italy

- <sup>9</sup>Theoreo srl, spin-off company of the University of Salerno, Via degli Ulivi 3, 84090
- 42 Montecorvino Pugliano (SA), Italy
- 43 <sup>10</sup>European Biomedical Research Institute of Salerno (EBRIS), Via S. de Renzi, 3,
- 44 84125 Salerno, Italy
- <sup>11</sup>Humanitas University Department of Biomedical Sciences, Via Rita Levi
  Montalcini, 20090 Pieve Emanuele Milan, Italy
- 47 <sup>12</sup>RIKEN Center for Integrative Medical Sciences (IMS), 1-7-22 Suehiro-cho,
- 48 Tsurumi-ku, Yokohama, Kanagawa 230-0045, Japan
- <sup>13</sup>Department of Microbiology and Immunology, Keio University School of Medicine,
- 50 35 Shinanomachi, Shinjuku-ku, Tokyo 160-8582, Japan<sup>14</sup>Division of Food
- 51 Microbiology and Bioprocesses, Department of Food, Environmental and Nutritional
- 52 Sciences (DeFENS), Università degli Studi di Milano, 20133 Milan, Italy
- <sup>15</sup>Department CIBIO, University of Trento, Trento, Italy
- 54 <sup>16</sup>Department of Biosciences, Biotechnology and Biopharmaceutics, University of
- 55 Bari, 70124 Bari, Italy
- <sup>17</sup>Department of Pathology and Immunology, Washington University, Saint Louis,
- 57 MO 63110, USA
- 58
- 59 \*Correspondence: <u>maria.rescigno@hunimed.eu</u>
- 60 <sup>§</sup>Current address: Institute of Oncology Research (IOR), Università della Svizzera
- 61 italiana (USI), Bellinzona 6500, Switzerland.
- 62 <sup>1</sup>Current address: Medical University of South Carolina, Department of Microbiology
- and Immunology, Hollings Cancer Center, 86 Jonathan Lucas St, Charleston, SC
- 64 (USA)
- 65 †Elena Zagato and Chiara Pozzi contributed equally to this work.
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#### 67 SUMMARY

68 The microbiota has been shown to promote intestinal tumorigenesis, but a possible 69 anti-tumorigenic effect has also been postulated. Here, we demonstrate that changes 70 in microbiota and mucus composition are concomitant with tumorigenesis. We 71 identified two anti-tumorigenic strains of the microbiota, Faecalibaculum rodentium 72 and its human homolog Holdemanella biformis, which are strongly underrepresented during tumorigenesis. Reconstitution of Apc<sup>Min/+</sup> or AOM/DSS-treated mice with an 73 74 isolate of F. rodentium (F. PB1) or its metabolic products reduced tumor growth. F. 75 PB1 and H. biformis produced short-chain fatty acids (SCFAs) that contributed to 76 protein acetylation and tumor cell proliferation by control inhibiting 77 calcineurin/NFATc3 activation both in mouse and human settings. Thus, we have 78 identified endogenous anti-tumorigenic bacterial strains with strong diagnostic, 79 therapeutic and translational potential.

80

#### 81 **INTRODUCTION**

82 Colorectal cancer (CRC) is a multifactorial disorder influenced by genetic, 83 environmental and lifestyle factors, including the deregulation of the microbiota<sup>1</sup>. A decrease in *Clostridium* and *Bacteroides* and an increase in *Fusobacterium*<sup>2,3</sup> has been 84 reported in CRC, also in association with recurrence<sup>4</sup>. The role of bacteria in 85 86 tumorigenesis has been extensively demonstrated in spontaneous mouse models of 87 tumorigenesis such as the Apc<sup>Min/+</sup> mice, carrying a mutation in the APC gene which is mutated in more than 80% of sporadic CRC<sup>5</sup>. Microbiota-derived signals drive 88 89 ERK phosphorylation and increased stability of the oncogene Myc, or trigger the c-90 Jun/JNK and STAT3 signaling pathways driving cell proliferation and accumulation of suppressive immune cells within the tumor<sup>6</sup> or the exacerbation of the 91

inflammatory response<sup>7</sup>. Enterotoxigenic Bacteroides fragilis (ETBF)<sup>8</sup> and colibactin-92 producing *Escherichia coli*<sup>9</sup> exert their protumorigenic effect through bacterial toxins. 93 94 On the other hand, in an inflammation-induced model of colitis associated CRC, after 95 treatment with azoxymethane (AOM) and dextran sulfate sodium (DSS), germ-free (GF) mice develop significantly more and larger tumors compared with SPF mice<sup>9,10</sup>. 96 97 After fecal microbiota transplantation, GF AOM/DSS treated mice develop more 98 tumors if transplanted with fecal microbiota from CRC patients than healthy subjects, 99 but it is not clear whether this is due to an increase in tumor promoting-, a decrease of antitumorigenic-bacteria, or both<sup>11</sup>. Further, a diet rich in fibers can protect against 100 tumor development in a microbiota-dependent manner<sup>12</sup>. Thus, although most studies 101 102 have concentrated on identifying tumor-promoting bacteria the role and identification 103 of endogenous anti-tumorigenic microbiota remains elusive.

Here, we identified an endogenous strain of the mouse microbiota (*Faecalibaculum rodentium* PB1, *F.* PB1) and its human counterpart *Holdemanella biformis* belonging to the *Erysipelotrichaceae* family, which are lost during the early phases of tumorigenesis and that block tumor cell proliferation via reducing NFATc3 and calcineurin activation.

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110 **RESULTS** 

### 111 Faecalibaculum rodentium is underrepresented during the early phases of 112 tumorigenesis.

We followed changes in microbiota composition in a longitudinal study in cohorts of Apc<sup>Min/+</sup> mice and age- and sex-matched C57BL/6 wild-type (WT) littermates born from the same mothers. Bacterial DNA was extracted at 4, 8 and 12 weeks from feces. As shown in Fig. 1a and Extended Data Fig. 1a, we did not observe any change in the

117 Shannon, Chao1 and Simpson diversity indexes among the two groups at any age, 118 while we observed differences in genus abundance at 8 and 12 weeks (Fig. 1b). 119 Already at 8 weeks, when tumor start developing (Extended Data Fig. 1b), and even 120 more so at 12 weeks, we observed a quantitative contraction of the paired end reads 121 (PE) ascribed to the genus *Faecalibaculum* (8 weeks P < 0.01; 12 weeks P < 0.0005) in Apc<sup>Min/+</sup> mice compared to WT littermates. Moreover, we detected an expansion of 122 123 PE-associated to Lactobacillus (P=0.04), Parabacteroides (P=0.03) and Bacteroides (P=0.016) in Apc<sup>Min/+</sup> mice compared to WT mice, but only at 12 weeks (Fig. 1b). 124 125 Among the 10 most abundantly represented taxonomic units of WT mice, we found that only the reads ascribed to Faecalibaculum rodentium<sup>13</sup> were strongly and 126 significantly underrepresented in Apc<sup>Min/+</sup> mice compared to WT mice (P < 0.001). 127 This taxon was not expanded at 8 weeks in Apc<sup>Min/+</sup> mice, coincident with the 128 129 initiation of tumor development (Fig. 1c and Extended Data Fig. 1c). These data were 130 confirmed by qPCR (Fig. 1d). We then isolated and entirely sequenced a strain 131 belonging to this taxon from WT mice and found that it is the only representative of F. 132 rodentium in our mouse WT colony (Fig. 1c, not shown). The previously 133 uncharacterized isolate named PB1 (hereafter called F. rodentium PB1, F. PB1), was 134 associated to the mucus of the small and large intestines, but was drastically reduced in mucus from Apc<sup>Min/+</sup> mice (Fig. 1e). Hence, we have identified a strain of F. 135 136 rodentium which is normally highly abundant in WT mice and is strongly underrepresented in Apc<sup>Min/+</sup> mice early in tumorigenesis. 137

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#### 139 F. PB1 loss coincides with mucus changes and protects from tumor development

140 The mucus layer serves as a niche for the intestinal microbiota<sup>14</sup>, and changes in its 141 composition may influence the microbiota profile. During tumorigenesis, epithelial

142 cell transformation could lead to modification in the production of mucins, the major 143 components of mucus, resulting in a non-permissive environment for F. PB1. As 144 shown in Fig. 2a, we observed that, similarly to human CRC (hCRC), mucin Muc1 and Muc20<sup>15</sup> were overexpressed, while Muc5ac was aberrantly expressed in tumors, 145 as it is not normally expressed in the lower GI tract<sup>16</sup>. We found a downregulation of 146 Muc3 and Muc13; the latter also in the non-tumoral region of Apc<sup>Min/+</sup> mice at 8 147 148 weeks of age, suggesting that this may be an early event in tumorigenesis. We 149 confirmed at protein level the downregulation of Muc13 both in tumor and non-tumor regions in Apc<sup>Min/+</sup> mice compared to WT mice, while differently from RNA data. 150 151 Muc1 and 20 were downregulated in gut tissues (Extended Data Fig. 2a). This may be due to increased secretion as Muc1 was higher in the mucus of Apc<sup>Min/+</sup> tumors 152 153 (Extended Data Fig. 2b).

Next, we tested whether F. PB1 was capable of colonizing  $Apc^{Min/+}$  mice. We treated 154 WT or Apc<sup>Min/+</sup> mice with antibiotics to eliminate competing microorganisms and 155 156 administered F. PB1 by gavage. As shown in Fig. 2b, at 48h F. PB1 was lower in ileal mucus of Apc<sup>Min/+</sup> than WT mice suggesting that the Apc<sup>Min/+</sup> gut is unfavorable for F. 157 158 PB1 colonization. This was confirmed by FISH analysis (Fig. 2c). Thus, to evaluate a 159 possible role of F. PB1 in tumor protection, we administered it by gavage every other day to ensure an appreciable level throughout the experiment. We treated Apc<sup>Min/+</sup> and 160 161 WT littermates with F. PB1 before or during tumor development. We observed that 162 administration of F. PB1 from 4 to 8 weeks did not affect tumor development (Fig. 163 2d). However, administration of F. PB1 from week 8 to 12 (i.e. when the bacterium was not enriched in Apc<sup>Min/+</sup> mice) resulted in a clear reduction in tumor numbers and 164 165 dimension (Fig. 2e,f). The reduction in tumor multiplicity observed macroscopically 166 was no longer statistically significant when analyzing the number of lesions

microscopically (Extended Data Fig. 2c), indicating that some small lesions could not
be detected by eye and that *F*. PB1 likely affects tumor growth rather than initiation.

169 These results suggest that the modification in mucus composition creates an 170 unfavorable environment for *F*. PB1 colonization. Administration of *F*. PB1 has an 171 antitumor effect only when tumors have already started developing.

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### 173 *F.* PB1 affects tumor cell proliferation without major impact on adaptive174 immune cells

175 The anti-tumor activity of F. PB1 may depend on the immune system. Thus, we 176 assessed the capacity of F. PB1 to activate an immune response in the absence of a 177 confounding microbiota, through monocolonization of germ-free (GF) mice. As 178 shown in Extended Data Fig. 3, F. PB1 did not significantly impact on immune cell 179 development. It did not modify the amount of FoxP3+ T regulatory cells in the small 180 intestine lamina propria and only slightly in the large intestine (Extended Data Fig. 3a) and had no effect on IL-17 or IFN $\gamma$  producing CD4<sup>+</sup> T cells at both locations 181 (Extended Data Fig. 3b,c). We then analyzed the effect of F. PB1 in Apc<sup>Min/+</sup> mice. 182 183 We could not detect any difference in the frequencies of all tested  $CD4^+$  T cell populations (FoxP3<sup>+</sup> T regulatory cells, Th1 or Th17) in SPF Apc<sup>Min/+</sup> mice 184 185 administered with F. PB1. However, we observed a trend towards a reduction in their 186 absolute numbers (Fig. 3a and Extended Data Fig. 3d,e). We then analyzed the innate 187 immune cell components, and found no difference in neutrophil frequencies and 188 counts in the small intestinal lamina propria, while we observed a reduction in all of the mononuclear phagocytes in  $Apc^{Min/+}$  mice administered with F. PB1 (Extended 189 190 Data Fig. 3f,g).

191 Consistent with our previous data<sup>17</sup>, we observed a higher frequency, albeit not 192 significant, of circulating Ly6G<sup>+</sup> CD11b<sup>+</sup> neutrophils at 12 weeks of age in Apc<sup>Min/+</sup> 193 mice compared to WT littermates<sup>17</sup> regardless of *F*. PB1 treatment. By contrast, 194 treatment with *F*. PB1 resulted in the reduction of circulating Ly6C<sup>high</sup> CD11b<sup>+</sup> 195 inflammatory monocytes in both WT and Apc<sup>Min/+</sup> mice (Fig. 3b and Extended Data 196 Fig. 3h). Hence, the reduction of gut inflammatory monocytes may be due to a 197 reduction of circulating monocytes during *F*. PB1 treatment.

We then evaluated whether *F*. PB1 was acting directly on tumor cell growth. We administered *F*. PB1 to 8 weeks old mice and then analyzed tumor growth two weeks later. *F*. PB1 treatment induced a reduction of: tumor numbers by a macroscopic evaluation (Fig. 3c), tumor size (Fig. 3d), tumor cell proliferation (Fig. 3e,f) and rectal bleeding (Fig. 3g).

203 We then analyzed whether F. PB1 administration had changed the microbiota 204 composition and its metabolic output. Bacterial DNA was extracted from feces of  $Apc^{Min/+}$  mice treated or not with F. PB1 and the 16S rRNA gene profiling data were 205 206 analyzed. We observed an increase in SCFA-producing bacteria in mice treated with F. PB1, particularly Butyricimonas, butyric acid-producing bacteria<sup>18</sup> (Extended Data 207 208 Fig. 4a). As these and the other SCFA-producing bacteria were not reduced in the initial assessment of microbiota in untreated Apc<sup>Min/+</sup> versus WT mice during tumor 209 210 development, it is unlikely that they impact on tumorigenesis.

It has been reported that  $Apc^{Min/+}$  mice deleted for *niacr1* (GPR109A, the receptor for butyrate) are more susceptible to tumor development via a mechanism that depends on the microbiota<sup>19</sup>. Thus, we evaluated whether *F*. PB1 administration may affect the fecal level of SCFAs. We detected an increase in SCFAs (propionate, butyrate and acetate) and a reduction in lactate in the fecal content of *F*. PB1 treated mice at 12 weeks as compared to 8 weeks of age (Fig. 3h). No significant differences were
observed in succinate and isovalerate while a slight increase in valerate was observed
between treated and untreated mice (Extended Data Fig. 4b).

These results suggest that *F*. PB1 alone or in cooperation with other bacteria affectstumor cell proliferation, probably via the release of SCFAs.

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#### 222 F. PB1 releases SCFAs that have anti-proliferative activity

223 Butyrate has been described to have histone deacetylase (HDAC) inhibitory activity<sup>20</sup> 224 that affects cell proliferation. Differently from normal epithelial cells, colorectal 225 cancer cells do not use butyrate for their growth and its concentration accumulates, acting as HDAC inhibitor<sup>21,22</sup>. We carried out a dose-dependent response on four 226 227 different mouse intestinal tumor cell lines (APC, CT26, MC-38 and CMT-93) and 228 found maximal cell growth inhibition, without compromising cell viability at 1-2 mM 229 butyrate, and at a much higher doses of acetate and propionate (2,5-50 mM). We 230 found that the combination of SCFAs additively inhibited the proliferation of all 231 tested cell lines (Fig. 4a).

232 Then we assessed whether F. PB1 itself was capable of synthesizing SCFAs in vitro. 233 F. PB1 grown in strictly anaerobic conditions was very efficient in producing both 234 butyrate and lactate (Fig. 4b). Interestingly, the concentration of butyrate (1 mM) was 235 very similar to the one identified on cell lines as capable of inhibiting cell 236 proliferation, while that of acetate or propionate was extremely low (250-5000 times 237 lower than the one effective *in vitro* on cell lines). We then evaluated whether also the 238 F. PB1 spent medium (SUP), containing SCFAs, had anti-proliferative activity. As 239 shown in Fig. 4c, the addition of SUP drastically inhibited tumor cell proliferation without affecting tumor cell viability (not shown), suggesting that *F*. PB1 releasesmetabolites that interfere with cell proliferation.

A recent report has shown that tumorigenesis in hCRC and Apc<sup>Min/+</sup> mice is 242 243 dependent on a calcineurin-mediated activation of the Nuclear factor of activated T 244 cells (NFAT)c3 transcription factor which is important for cell proliferation<sup>23</sup>. 245 Because the HDACi panobinostat can induce calcineurin degradation in multiple 246 myeloma cells<sup>24</sup>, we assessed whether the SCFAs produced by F. PB1 could act as 247 HDAC inhibitors and therefore affect calcineurin and NFATc3 activation. This would 248 explain why administration of F. PB1 or its spent medium could inhibit tumor cell 249 proliferation. Treatment with F. PB1 SUP (Fig. 4d) or the combination of SCFAs 250 (Extended Data Fig. 5a) drastically increased acetylation of histone H3 (H3K27Ac) 251 confirming its HDACi activity. This correlated with the downregulation of calcineurin 252 (PP2B-A) and NFATc3 activation in CRC cell lines (Fig. 4d and Extended Data Fig. 253 5b).

254 SCFAs are volatile and can be extracted through evaporation. Thus, we compared the 255 effect of the untreated F. PB1 SUP with one treated by evaporation to deplete SCFAs. 256 There was a minor effect of SUP evaporation on the concentration of lactate, still the 257 evaporated SUP was strongly impaired in inducing H3 acetylation and NFATc3 258 downregulation, suggesting that lactate was not involved in this process (Fig. 4e,f and 259 Extended Data Fig. 5c). By contrast, there was very little acetate and propionate in the 260 evaporated SUP while the concentration of butyrate was halved. Thus the residual 261 effect on H3 acetylation and NFATc3 downregulation could be due to the left-over of 262 butyrate still present in the supernatant after evaporation (Fig. 4f), or to other 263 metabolites not affected by evaporation. Hence, F. PB1 releases metabolites,

including SCFAs that can impact tumor cell proliferation by inhibiting HDACs thusblocking NFATc3 and calcineurin activation.

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## *F.* PB1 metabolic products have anti-proliferative activity *in vivo* and this is independent on the microbiota

269 We then evaluated whether the F. PB1 SUP had anti-tumorigenic activity in vivo. F. 270 PB1 SUP did not statistically affect tumor multiplicity, but significantly reduced the 271 size of tumor lesions (Fig. 5a,b and Extended Data Fig. 6a). We then pretreated 11 weeks old Apc<sup>Min/+</sup> mice (having already developed tumors) with antibiotics to affect 272 273 the microbiota but not tumor growth and then the SUP was administered in the 274 presence of antibiotics. In this case we observed an even higher reduction in the 275 dimension of tumor lesions indicating that the spent medium had anti-proliferative 276 activity in vivo and this was independent on the microbiota (Fig. 5c,d and Extended 277 Data Fig. 6b). Furthermore, the SUP reduced activation of NFATc3 and induced 278 histone H3 acetylation in dysplastic lesions, again in a microbiota-independent 279 fashion (Fig. 5e). These data suggest that metabolic products of F. PB1 have a direct 280 effect on tumor growth and affect NFATc3 activation.

We then evaluated whether butyrate was sufficient to mediate the anti-proliferative response. We administered sodium butyrate at 1 mM (the same concentration found in the SUP of *F*. PB1) to Apc<sup>Min/+</sup> mice treated with antibiotics, so to avoid that butyrate could be used up by the indigenous microbiota. As shown in Fig. 5f,g butyrate had a very similar antiproliferative activity as *F*. PB1 SUP, indicating that butyrate is the main effector of *F*. PB1 activity.

Finally, we showed that *F*. PB1 SUP significantly reduced the dimension of lesions also in a model of inflammation-driven CRC (AOM/DSS), in which tumors

preferentially develop in the colon, more closely mirroring the human pathology (Fig.5h,i and Extended Data Fig. 6c).

Overall, these data show that *F*. PB1 metabolic products, in particular butyrate, thanks to their HDACi activity control NFATc3 activation blocking tumor cell proliferation *in vivo* in Apc<sup>Min/+</sup> mice, independently on the microbiota. A similar antiproliferative activity is observed also in inflammation-driven CRC model.

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### 296 The anti-proliferative activity of *F*. PB1 can be exerted by other SCFAs 297 producing bacteria.

298 We then evaluated whether the activity of F. PB1 could be shared by other SCFAs 299 producing bacteria. We selected *Lactococcus lactis* because it secreted butyrate and some lactate in culture similarly to F. PB1 (Extended Data Fig. 7a) and it has been 300 proposed to have anti-proliferative activities in vitro by an unknown mechanism<sup>25</sup>. 301 302 We administered L. lactis following a schedule similar to that of F. PB1, but we could 303 not detect any anti-tumoral effect (Extended Data Fig. 7b,c). This is probably due to 304 the inability of L. lactis to survive/colonize in the mouse intestine, as we could not 305 detect L. lactis even in WT mice, independently of the microbiota (Extended Data Fig. 306 7d). We thus analyzed the anti-proliferative activity of SUP from L. lactis in vivo in antibiotic treated Apc<sup>Min/+</sup> mice. We found that *L. lactis* SUP reduced the size of 307 308 tumor lesions, even though not as well as F. PB1 SUP (Extended Data Fig. 7e,f). This 309 difference cannot be due to a reduction in lactate production as lactate did not impact 310 on tumor cell proliferation in vitro (Extended Data Fig. 7g). Hence, the 311 antiproliferative activity of F. PB1 is not unique to this bacterium but can be shared 312 by other bacteria that produce SCFAs provided that they are capable of colonizing or 313 surviving enough time to produce butyrate.

#### 315 Holdemanella biformis is the equivalent of F. PB1 in humans.

316 We then assessed the relevance of these findings in human CRC. We interrogated a 317 dataset of a shot-gun microbiome analysis carried out in patients with colorectal adenomas<sup>26</sup> and found that, similarly to the mouse, there was a reduction in the 318 319 abundance of the family of *Erysipelotrichaceae* in patients with large adenomas as 320 compared to healthy individuals, but there was no change in the Shannon diversity 321 index (Fig. 6a). In this family, an undefined genus (Erysipelotrichaceae\_noname) and 322 a species, *Holdemanella biformis*, were strongly underrepresented in advanced colon 323 adenomas (Fig. 6b). Interestingly, a high-quality phylogeny of the 324 Erysipelotrichaceae family and the F. PB1 isolate showed that among the bacteria that colonize the human gut, Holdemanella biformis is the second bacterium 325 326 phylogenetically closest to F. PB1 (phylogenetic distance 0.273, Fig. 6c).

327 H. biformis released SCFAs (Fig. 6d), and the SUP of H. biformis inhibited human 328 tumor cell proliferation (HT-29 and Caco-2) similarly to F. PB1 (Extended Data Fig. 329 8a). This activity was mediated by the HDAC inhibitory activity of the SUP as 330 shown by increased histone acetylation and reduced NFATc3 activation (Fig. 6e and 331 Extended Data Fig. 8b). In vivo, H. biformis was unable to survive/colonize the mouse intestine and we could not observe any anti-proliferative activity in Apc<sup>Min/+</sup> mice 332 333 (Extended Data Fig. 8c-e). However, when we tested the *H. biformis* SUP in Apc<sup>Min/+</sup> 334 mice we observed a much higher effect on tumor multiplicity (Fig. 6f,g), suggesting 335 that *H. biformis* may have also some effect on tumor initiation. This remains to be 336 evaluated.

We confirmed our data on human specimens from CRC patients using a technology
 set up in our laboratory<sup>27</sup>. Tumor specimens from CRC patients were treated either

with the SCFA mix (acetate:propionate:butyrate 2:1:1) or with the SUP of *F*. PB1 or *H. biformis*. As shown in Fig. 6h and Extended Data Fig. 9a, SUP of *F*. PB1 or *H*. *biformis*, as well as the mix of SCFAs induced an increase of H3K27 acetylation and
a reduction of NFATc3 protein levels. This correlated with reduced tumor cell
proliferation as shown by lower nuclear Ki67 immunostaining in the presence of
either *F*. PB1 SUP (Extended Data Fig. 9b) or SCFA combination (Extended Data Fig.
9c). These results suggest that *H. biformis* is the human counterpart of *F*. PB1.

346

#### 347 **DISCUSSION**

348 During CRC tumorigenesis, due to epithelial cell dedifferentiation, the mucus 349 layer has been shown to undergo profound changes, both in size and in composition<sup>28</sup>. 350 These changes may result in two concomitant and non-mutually exclusive events that 351 may be responsible for fostering intestinal tumorigenesis. On one side, the increased 352 penetrance or adherence of protumorigenic bacteria which may favor immune cell 353 recruitment and activation, drive tumor cell transformation or Th17 cell activation thus contributing to tumor development  $^{7,29-35}$ . On the other side, tumorigenesis may be 354 355 due to the contraction of anti-tumorigenic bacteria that release anti-proliferative 356 metabolites. We focused on the latter and identified a bacterial member of the murine 357 gut microbiota, F. rodentium PB1, belonging to the Erysipelotrichaceae family that is 358 one of the most abundant taxa in the murine gut and is not expanded during 359 tumorigenesis, presumably due to the different mucus composition. This may explain 360 why its contraction affects so drastically tumor development.

Tumorigenesis in human CRC and Apc<sup>Min/+</sup> mice is dependent on a calcineurin-mediated activation of NFATc3 transcription factor which drives tumor cell proliferation<sup>23</sup>. NFATc3 is also involved in driving expression of MUC5ac<sup>36</sup> and

this may explain why hCRC and ApcMin/+ mice ectopically express MUC5ac. 364 Calcineurin can be induced to degradation by the HDACi panobinostat<sup>24</sup>. Here we 365 366 show that bacterial spent medium (SUP) from F. PB1 and its human counterpart 367 Holdemanella biformis, acts as HDACi affecting calcineurin and NFATc3 activation 368 and this results in inhibition of tumor cell growth, independently of the microbiota 369 (Extended Data Fig. 10). In some cases we observed an effect of F. PB1 or of H. 370 biformis SUP also on tumor multiplicity. This could be due to a technical issue due to 371 the inability to detect also small tumors, but we cannot exclude an effect on tumor 372 initiation.

We found a reduction of lactate in the feces of mice treated with *F*. PB1. This was unexpected as *F*. PB1 was found to produce large amounts of lactate *in vitro*, but we cannot anticipate whether it was produced also *in vivo*. In addition, as lactate is known to be produced and used by tumor cells<sup>37,38</sup>, the reduction of lactate after *F*. PB1 administration could be due to reduced tumor cell proliferation or to increased use of lactate by tumor cells. Alternatively, lactate could be used by other bacterial species for their own growth<sup>39</sup>.

The involvement of SCFAs in the observed anti-proliferative activity is demonstrated by the following observations: 1. evaporation to deplete SCFAs leads to a strong reduction in the activity of the SUP; 2. SUP from another butyrate producing bacterium (*L. lactis*) or 3. butyrate itself, at a concentration similar to that found in the SUP, can mimic the effect of *F*. PB1. This suggests that the anti-tumor activity of *F*. PB1 is not unique and could be shared with other SCFA-producing bacteria as long as they have the ability to colonize or survive in the gut and produce butyrate locally.

Why is butyrate inhibiting proliferation of only tumor cells and not normal epithelial cells? In colorectal cancer, due to the Warburg effect, tumor cells undergo

increased glycolysis rather than mitochondrial oxidative metabolism<sup>21</sup>. Thus, cancer cells do not use butyrate for their growth and butyrate concentration raises and can act as HDACi<sup>22</sup>. Consistently, dietary fibers, which promote the growth of butyrateproducing bacteria, affect tumorigenesis in  $Apc^{Min/+}$  mice<sup>40</sup> and  $Apc^{Min/+}$  mice deleted for *niacr1* (GPR109A, the receptor for butyrate) are more susceptible to tumor development via a mechanism that depends on the microbiota<sup>19</sup>.

Consistent with literature data<sup>41,42</sup>, we have shown that *Holdemanella biformis* 395 396 is able to produce SCFAs and its spent medium can inhibit tumor cell proliferation. 397 We do not know whether *H. biformis*, similarly to mouse *F.* PB1, is the major 398 bacterium responsible for the antitumor properties in humans, or whether other 399 SCFA-producing bacteria are also contracted in humans and may contribute to failure 400 of tumor growth control. Future studies should aim at addressing this point and at 401 assessing whether this species may have a therapeutic potential. As H. biformis is 402 reduced in the feces of patients with large adenomas, it may also be used as a 403 potential biomarker for detecting tumors in their early phase.

404

#### 405 **METHODS**

406 Bacterial strains. Faecalibaculum rodentium PB1 was isolated in Kenya Honda 407 laboratory (RIKEN IMS, Yokohama, Japan) from fecal pellets coming from 12 weeks old WT C57BL/6 littermates of our Apc<sup>Min/+</sup> colony as described in<sup>43</sup>. Briefly, feces 408 409 were suspended in Tryptic Soy (TS) Broth, serially diluted and plated on Eggerth 410 Gagnon (EG) agar plates. Forty-eight colonies were picked and sequenced using 411 panbacterial primers targeting the 16S rRNA gene. Similarity to F. rodentium was 412 checked both on databases and with the sequence retrieved from our metagenomic 413 analysis, resulting in 99.7% and 98% homology respectively. Faecalibaculum

414 rodentium PB1 strain was deposited to DSMZ (Type strain No.: DSM32803). 415 Holdemanella biformis was purchased from the German collection of microorganisms 416 DSMZ (Type strain No.: 3989). Both bacteria were cultured in the anaerobic chamber 417 (gas atmosphere  $N_2/CO_2/H_2$ , 80:15:5), in pre-reduced EG broth under anaerobic 418 conditions for 48 hours. The bacterial strain Lactococcus lactis subsp. lactis was 419 purchased from DSMZ (Type strain No.:20481) and cultured in pre-reduced MRS 420 broth at 30°C in static conditions. Bacterial supernatant (SUP) was derived from o/n 421 cultures of the strains in the conditions described above. The medium fermented by 422 bacteria (SUP) was filtered in 0,25 µm filters and immediately frozen.

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424 Cell lines. Mouse CRC cell line CT26 and human CRC cell lines HT-29 and Caco-2 425 were purchased from the American Type Culture Collection (ATCC). CMT-93 mouse 426 rectum carcinoma cell line is a kind gift of Dr. David Artis (Cornell University, NY, 427 USA). MC-38 mouse carcinoma cell line is a kind gift of Dr. Carsten Krieg (Zurich University, Switzerland). APC cell line was derived from Apc<sup>Min/+</sup> small intestinal 428 429 adenomas by mechanical disruption. Cell lines were purchased from the American 430 Type Culture Collection (ATCC) and no other authentication method was performed. 431 In APC cell line the loss of heterozygosity (loss of the WT allele and presence of the 432 Min allele) was checked by TaqMan assay. CT26 cells were cultured in RPMI 1640 433 supplemented with 10% FBS, 2 mM L-glutamine. CMT-93 and MC-38 cells were 434 cultured in DMEM supplemented with 10% FBS, 2 mM L-glutamine. APC cells were 435 cultured in complete DMEM supplemented with Insulin-Transferrin-Selenium-436 Ethanolamine (ITS-X, Gibco) and human EGF (10  $pg/\mu$ l). HT-29 cells were cultured 437 in DMEM supplemented with 10% FBS, 2 mM L-glutamine. Caco-2 were cultured in 438 MEM with Earle's Salt supplemented with 20% FBS, 2 mM L-glutamine, 1 mM

sodium pyruvate (NaP), 0.1 mM nonessential amino acids (NEAA). All cell lineswere tested to exclude mycoplasma contamination.

441 To evaluate the effect of SCFA either alone or in combination and of the bacterial 442 spent medium (SUP), cells were seeded and after one overnight stimulated. Cells 443 were stimulated with sodium acetate (S5636, Sigma-Aldrich), sodium propionate 444 (P5436, Sigma Aldrich), sodium butyrate (ARK2161, Sigma-Aldrich) or a mix of the 445 three. APC, CT26, MC-38, HT-29 and Caco-2 cells were stimulated with 50 mM 446 sodium acetate, 10 mM sodium propionate, 2 mM sodium butyrate and a mix of 447 sodium acetate:propionate:butyrate 50:10:2 mM. CMT-93 cells were stimulated with 448 10 mM sodium acetate, 2.5 mM sodium propionate, 1 mM sodium butyrate and a mix 449 of sodium acetate:propionate:butyrate 10:2.5:1 mM. Cell were stimulated also with 450 different concentrations (0.8, 4, 20 mM) of sodium L-lactate (71718, Sigma-Aldrich). 451 Finally, cells were stimulated with the bacterial broth diluted 40% v/v in cell culture 452 medium, (EG broth) fermented by F. PB1 or H. biformis (SUP) or relative control 453 non-fermented broth (Vehicle). CT26 cells were treated also with the fermented broth 454 (called also spent medium) evaporated to remove the SCFAs. The spent medium was 455 evaporated to dryness at 50°C under reduced pressure (5 mbar). The residue was 456 taken up with water, filtered and diluted 40% v/v in cell culture medium.

457 Cell proliferation was evaluated after 48 h of stimulation with CyQUANT Cell
458 Proliferation assay (Molecular Probes). Each condition was tested in 6 wells of a 96459 multiwell plate and 12 reads per well were recorded.

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461 Mice. This study employed both male and female mice of the following strains as
462 model organisms: C57BL6/J; C57BL6/J-ApcMin/J; Germ-free ICR. 6 weeks old
463 C57BL6/J mice were purchased from Harlan Laboratories. C57BL6/J-Apc<sup>Min</sup>/J

(referred to as Apc<sup>Min/+ 44</sup>) are maintained as inbred strain in our animal facility. For 464 experiments where Apc<sup>Min/+</sup> were employed, wild type littermates born from the same 465 466 mothers of experimental mice were used as controls. All mice were maintained in 467 microisolator cages in specific pathogen-free (SPF) animal facility. Germ-free ICR 468 male mice were maintained in the isolators at RIKEN IMS (Yokohama, Japan). 469 Experiments were performed in accordance with the guidelines established in the 470 Principles of Laboratory Animal Care (directive 86/609/EEC) and approved by the 471 Italian Ministry of Health. On the basis of our experience with animal models and 472 according to animal-welfare policy (directive 86/609/EEC), which strongly suggests 473 the use of a limited number of animals, we estimated that two experiments with n = 5474 mice per group would allow us to reach statistical significance. Animals were 475 allocated randomly to each treatment group. Different treatment groups were 476 processed identically, and animals in different treatment groups were exposed to the 477 same environment. The investigators were not blinded during experimental mice 478 allocation and outcome assessment. For macroscopical analysis of the tumor lesions, 479 we calculated the average of tumor numbers in vehicle group, then the number of 480 tumors of each individual mouse is referred to this average as a percentage.

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**Bacterial profiling of intestinal microbiota**. DNA from fecal pellets and mucus scraped from the small intestine and colon was extracted with G'NOME DNA isolation kit (MP) following a published protocol<sup>45</sup>. V5-V6 hypervariable regions of bacterial 16S rRNA gene were amplified and processed with a modified version of the Nextera protocol<sup>46</sup>. Metagenomic libraries obtained were sequenced with MiSeq Illumina platform with 2x250 paired-end (PE) approach. Metagenomic amplicons were analyzed by applying the BioMaS pipeline<sup>47</sup>: (i) the paired-end reads were

merged into consensus sequences using PEAR<sup>48</sup> and subsequently dereplicated 489 490 applying Usearch<sup>49</sup>, maintaining the information about the total number of reads 491 supporting each consensus sequence; (ii) the PE reads which remained non 492 overlapping were considered for further analysis only if after the low-quality region 493 trimming (Phred quality cut-off = 25) both read ends were  $\geq$ 50 bp long; (iii) Both the 494 merged sequences and the unmerged reads were matched against the RDP database (Ribosomal Database Project) (release 11.2)<sup>50</sup> by Bowtie2<sup>51</sup>. The mapping data were 495 496 filtered according to two parameters: identity percentage and query coverage ( $\geq 70\%$ ). 497 In particular, sequences obtaining an identity percentage  $\geq 97\%$  were classified to 498 species level and those with identity  $\geq$  90% and < 97% were classified at higher 499 taxonomic rank; (iv) Finally, all mapped reads fulfilling the settled filters were taxonomically annotated using the Tango tool<sup>52</sup>. Assigned genera were filtered 500 501 considering as present only the ones for which at least 5 reads per samples were 502 present. The read counts were normalized using an approach similar to the RPKM 503 (Reads per kilo-base per million): normalized count = assigned reads / (total assigned reads at the rank level/1.000.000). Significant differences between WT and Apc<sup>Min/+</sup> 504 505 mice in fecal microbiota at the genus and species level were calculated with the DESeq2 R-package<sup>53</sup>. Taxa associated specifically associated to one of the analyzed 506 507 conditions were identified by using the LEfSe (Linear discriminant analysis Effect 508 Size)<sup>54</sup>.

509 F. PB1 abundance was validated with qPCR assay with specific primers and
510 abundance was normalized to panbacterial primers targeting the 16S rRNA gene (UNI
511 16S)<sup>55</sup>. Bacterial primer sequences are listed in Supplementary information Table 1.

512 Normalized reads count for differentially represented species in WT and Apc<sup>Min/+</sup>
513 mice were log-transformed and plotted as heatmap by using the vegan<sup>56</sup> and the
514 ggplot2<sup>57</sup> R packages.

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516 Histological evaluation. Formalin-fixed and paraffin embedded swiss rolls of colon 517 and small intestine were sectioned at 3-4 mm and the sections stained with 518 hematoxylin and eosin. For histopathological examination and scoring, H&E slides 519 were evaluated by an expert pathologist. The extent of inflammatory changes was defined according to the score proposed by Cooper et al.<sup>58</sup>. The histological scoring 520 521 system to evaluate the colitis grade is described in Supplementary Information Table 522 2. For each sample, also the number of ulcers and dysplastic/adenomatous lesions was 523 reported. The proliferative lesions are classified according to mouse pathology 524 consensus recommendations<sup>59</sup>. The tissue area of dysplastic and adenomatous lesions 525 was measured on H&E stained slides by digital microscopy. Briefly, slides were 526 digitalized by an Aperio ScanScope CS Slide Scanner (Aperio Technologies) at 40X 527 magnification. The dysplastic and adenomatous lesions were identified and selected 528 using Aperio ImageScope (Leica Biosystems Imaging). The value of every selected dysplastic/adenomatous area is expressed in  $\mu m^2$  and its major axis in  $\mu m$ . 529

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Fluorescence In situ Hybridization (FISH). Carnoy's fixed, paraffin embedded tissues were sectioned 5 μm thickness. The probes used were designed to specifically target different regions of the *F*. BPI 16S rRNA. All the probes were manufactured by SIGMA and labelled with Cyanine 3 (5'-[Cy3]GCCAACCAACTAATGCACCG; 5'[CY3]CCGGGAATACGCTCTGGAAA). Probes were used at 5 ng/μl in pre-warmed hybridization buffer (0.9 M NaCl, 20 mM Tris pH 7.4, 0.01% SDS). Slides

were incubated at 55°C in a humid chamber for 90 minutes, washed two times at
55°C in pre-warmed washing buffer (0.9 M NaCl, 20 mM Tris pH 7.4), mounted and
counterstained with DAPI (contained in the VECTA SHIELD mounting medium).
Confocal images were acquired with Leica DMi8 confocal microscope, through HCX
PL APO 40X(NA 1.25) oil immersion objective.

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543 Immunofluorescence. In order to maintain the mucus structure, murine intestines 544 were fixed in Carnoy fixative (60% Ethanol, 30% Chloroform, 10% Acetic acid, 545 glacial), manually processed, paraffin embedded and stored at RT until microtome 546 sectioning. Microsections (6 µm thick) were cut using a microtome (Leica), mounted 547 on ultra plus poly-L-lysine-coated glass slides (Menzel-Glaser) and left at 37° o/n. 548 Tissue sections were deparaffinized in histolemon and hydrated through graded alchol 549 series (100%, 95%, 70%, H<sub>2</sub>O). Antigen unmasking was performed in Tris-EDTA 550 pH9 (10mM Tris-HCl, 1mM EDTA, Tween 0.05%) for 50 minutes at 95°. Sections 551 were incubated with anti-Muc1 rabbit polyclonal primary antibody (1:100, clone aa 552 474-630, cat. LS-C343984, LifeSpan Bioscience) at +4° C o/n. After two washing 553 steps in Tris 0.1M pH7.4, slides were incubated with donkey anti-rabbit-Cy3 554 secondary antibody (1:300, cat. 711165153, Jackson Immuno research) for 2 hours at 555 RT. After washing twice in Tris 0.1M pH7.4 for 10 minutes slides were couterstained 556 and mounted with VECTASHIELD Mounting Medium with DAPI (Vector 557 Laboratories). Confocal images were acquired with Leica DMi8 confocal microscope 558 through HCX PL APO 40X (NA 1.25) oil immersion objective. All images were 559 adjusted and assembled in Fiji software.

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561 **RNA extraction, RT–PCR and qPCR.** Intestinal chunks from wild type mice, normal ileal chunks and pooled small intestinal polyps from Apc<sup>Min/+</sup> mice were 562 563 sampled at 8 and 16 weeks of age. Intestinal tissue was homogenized in 500 µl of 564 TRIzol (Invitrogen). RNA was extracted adding 100 µl of chloroform, precipitating 565 the aqueous phase with 1 volume of 100% ethanol and purifying RNA with Quick-566 RNA MiniPrep Kit (Zymo Research). RNA was retro-transcribed with ImProm-II 567 Reverse Transcriptase kit (Promega). qPCR assay was performed with Fast Sybr 568 Green Master Mix (Life Technologies). Primers used are listed in Supplementary 569 Information Table 1. Expression levels are normalized to the 60S ribosomal protein 570 gene expression Rpl32.

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572 **Human metagenomics.** For the analysis of the Zeller et al. 2014 CRC dataset, raw 573 sequences were downloaded from the sequence read archive (SRA) and used as input into MetaPhlAn2<sup>60</sup>. Individual sample profiles were merged and the final table was 574 575 filtered to include only members of the *Erysipelotrichaceae* family and samples 576 collected in France. The generated taxonomic profiles are available through the 577 *curatedMetagenomicData* resource<sup>61</sup>. At each taxonomic level, we applied a 578 Wilcoxon Rank-Sum test comparing relative abundances of large adenoma (n = 15)579 and control samples (n = 61). *P*-values obtained at each taxonomic level were 580 corrected for multiple hypothesis testing using the Benjamin-Hochberg procedure. A 581 high-quality phylogeny of the Erysipelotrichaceae family based on the 400 PhyloPhlAn<sup>62</sup> markers considering 47 complete reference genomes deposited in 582 583 NCBI (accession ids are reported within brackets in the node labels) and the F. PB1 584 isolate was performed.

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586 Samples from human patients. Colonic human specimens were obtained from 587 patients diagnosed with colon cancer and undergoing surgery at IEO. Inclusion 588 criteria were newly diagnosed CRC patients (stage: I to III), aged between 35-70 589 years old, performance status 0-1 based on the Eastern Cooperative Oncology Group 590 (ECOG) and signed informed consent according to ICH-GCP. Exclusion criteria were 591 a personal history of malabsorption syndrome or any chronic inflammatory bowel 592 disease, or subjects with hereditary syndrome (such as FAP HNPCC) and use of 593 antibiotics in the previous four weeks. All patients given written informed consent 594 and were enrolled in institutional protocol approved by IEO's ethical committee. 595 Human biological samples were sourced ethically and their research use was in 596 accord with the terms of the informed consent provided. Case selection was therefore 597 independent and blinded to baseline characteristics, treatments received, clinical 598 outcome and molecular characterization to reduce any potential self-selection bias.

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#### 600 F. PB1 administration to GF and F. PB1, H. biformis and L. lactis administration to Apc<sup>Min/+</sup> mice. In experiments of gnotobiotic colonization, 5 germ-free ICR male 601 602 mice were orally administered with 250 $\mu$ l of F. PB1 culture (O.D.<sub>600nm</sub> $\cong$ 0,6, corresponding to about $5 \times 10^7$ UFC/ml) and the abundance of small intestinal and 603 604 colonic cells was addressed after 4 weeks. To evaluate the effect of exogenous F. PB1 administration, WT and Apc<sup>Min/+</sup> mice were orally administered 3 times per week with 605 606 different schedules (see Figs. 2d,e and 3c) with frozen bacterial stocks equivalent to 607 $250 \ \mu$ l of culture at logarithmic growth phase. At 8, 10 or 12 weeks of age mice were 608 sacrificed and tumor multiplicity in the small intestine and colon assessed. Neutrophil 609 and inflammatory monocyte abundances in circulating blood and Treg, Th1 and Th17 610 abundances in small intestinal and colonic lamina propria were assessed. Bleeding

611 score was assigned as follows: 0 negative to Hemoccult (Beckman Coulter); 1 612 positive to Hemoccult; 2 gross bleeding. To evaluate the effect of exogenous H. *biformis* and *L.lactis* administration, Apc<sup>Min/+</sup> mice were orally administered 3 times 613 per week with frozen bacterial stocks from 8 to 10 weeks of age. In monocolonization 614 experiments, WT and Apc<sup>Min/+</sup> mice were treated or not with antibiotic cocktail 615 616 (Ampicillin 1g/L, Neomycin 1g/L, Vancomycin 0.5g/L in drinking water and 617 Metronidazole 2mg/mouse administered by oral gavage every 2 days) for 7 days and 618 challenged with either vehicle or F. PB1 or L.lactis for 3 days in a row. After 48 h 619 mice were sacrificed and bacterial abundance was validated in the feces, ileal and 620 colon mucus with qPCR assay with specific primers (Supplementary Information 621 Table 1).

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623 Spent medium (SUP) administration to AOM/DSS treated C57BL6/J WT mice or Apc<sup>Min/+</sup> mice. 8 weeks old C57BL6/J mice were treated with AOM 10mg/Kg of 624 625 body weight by intraperitoneal injection. After 3 days they received DSS 1.5% w/v in 626 drinking water for 7 days. Mice were allowed for recovery for 14 days. This schedule 627 was repeated for 2 cycles. During the second recovery (from week 12 to 14) 628 AOM/DSS mice were treated by oral gavage (200 µl/mouse) 3 times per week for two 629 weeks with EG broth fermented by F. PB1 (F. PB1 SUP) or relative control non-630 fermented broth (Vehicle) and tumor lesions were analyzed.

631 Culture broths fermented with F. PB1, H. biformis or L.lactis (F. PB1 SUP, H.

632 *biformis* SUP, *L.lactis* SUP) or not (Vehicle) were administered by oral gavage 3

633 times per week for two weeks in 8 weeks old  $Apc^{Min/+}$  mice.

634 Vehicle (EG for F. PB1 or H.biformis; MRS for L.lactis), SUP and butyrate 1mM

635 were also administered by oral gavage (200  $\mu$ l/mouse) 3 times in a row (two times at

day 1) in combination with antibiotic cocktail (Ampicillin 1g/L, Neomycin 1g/L,
Vancomycin 0.5g/L in drinking water and Metronidazole 2 mg/mouse administered
by oral gavage every 2 days) in 11 weeks old Apc<sup>Min/+</sup> mice pre-treated with antibiotic
cocktail for two days. In these experiments mice were sacrificed 24h after the last
gavage.

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642 Quantification of fecal and spent medium SCFAs. SCFAs were quantified in fecal 643 and spent medium (F. PB1 SUP, H. biformis SUP and L. lactis SUP) samples as previously described<sup>63</sup> with few modifications. In detail, 100 mg of feces or 200  $\mu$ l of 644 645 SUP were resuspended in 2 ml of 0.001% HCOOH and vortexed for 1 min. The 646 suspension was centrifuged at 1000 x g for 2 min at 4  $^{\circ}$ C and the supernatant was 647 recovered. The residue was extracted again as described above. The supernatants were 648 combined, and the volume was adjusted to 5 ml with a solution of 0.001% HCOOH in 649 water. All extracts were stored at -20 °C. Before UPLC-HR-MS analysis, samples 650 were diluted 1:100 in 0.001% HCOOH and centrifuged at 3000 x g for 1 min. UPLC-651 HR-MS analysis was carried out on an Acquity UPLC separation module (Waters, 652 Milford, MA, USA) coupled with an Exactive Orbitrap MS with an HESI-II probe for 653 electrospray ionization (Thermo Scientific, San Jose, CA, USA). The ion source and 654 interface conditions were as follows: spray voltage -3.0 kV, sheath gas flow-rate 35, 655 auxiliary gas-flow rate 10 and temperature 120 °C, and capillary temperature 320 °C. 656 A 1.8-mm HSS T3 column (150 x 2.1 mm, Waters) was used for separation at a flow 657 rate of 0.2 ml/min. The eluents were 0.001% HCOOH in MilliQ-treated water 658 (solvent A) and CH<sub>3</sub>OH:CH<sub>3</sub>CN (1:1, v/v, solvent B). A 5 µl aliquot of the sample 659 was separated by the UPLC using the following elution gradient: 0% B for 4 min, 0-660 15% B in 6 min, 15–20% B in 5 min, 20% for 13 min, and then return to initial

661 conditions in 1 min. The column and samples were maintained at 30 and 15°C, 662 respectively. The UPLC eluate was analyzed in full-scan MS in the range 50-130 m/z. 663 The resolution was set at 50 K, the AGC target was 1E6, and the maximum ion 664 injection time was 100 ms. The ion with m/z 91.0038, corresponding to the formic 665 acid dimer [2M-H]<sup>-</sup>, was used as the lock mass. The mass tolerance was 2 ppm. The 666 MS data were processed using Xcalibur software (Thermo Scientific). Analytical 667 grade SCFAs were used as standards (Sigma-Aldrich, Milan, Italy). Five-point 668 external calibration curves were adopted to quantify pyruvic, lactic, succinic, acetic, 669 propionic, butyric, isobutyric, valeric and isovaleric acid in fecal samples. SCFA 670 concentrations were expressed in millimoles per 100 grams of wet feces.

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672 Flow cytometry. Peripheral blood was sampled in heparin and red blood cells were 673 lysed. Samples were stained with anti-CD45.2, CD3, Ly6C, Ly6G and CD11b 674 antibodies. On the CD45+ CD3- population, neutrophils were defined as 675 Ly6G+CD11b+ and inflammatory monocytes as Ly6Chi CD11b+. Small intestinal 676 and colonic lamina propria (LP) lymphocytes were isolated incubating intestinal 677 chunks PBS 5% FCS 1.5 mM EDTA 1mM DTT at 37°C for 15 min to remove epithelial cells. LP cells were mechanically isolated in RPMI 5% FCS with 678 679 GentleMACS dissociator. The cells were permeabilized with FoxP3 intracellular 680 staining kit (eBioscience) and stained with anti-CD45.2, CD3, CD4, CD25, FoxP3 681 and Helios antibodies. For Th1 and Th17 detection LP cells were incubated for 4h 682 with PMA (50 ng/ml, Sigma Aldrich), ionomycin (500 ng/ml, Sigma Aldrich) and 683 GolgiStop (BD Biosciences). Cells were then stained with anti-CD45.2, CD3, CD4, 684 IL17 PE and IFNy antibodies. For mononuclear phagocytes identification LP cells 685 were stained with anti-CD45.2, CD11, F4/80, CD11c, Ly6G, and Ly6C antibodies.

Dead cells were excluded with the Fixable Viability Stain510 (BD Biosciences).
Samples were acquired at FACSCantoII and Fortessa (BD Biosciences) and analyzed
with FlowJo (Treestar). See Supplementary Information Table 3 for detailed
informations.

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691 Western blotting. For western blot analysis cells and tissue samples were lysed with 692 RIPA buffer (50mM Tris-HCl pH 8, 150 mM NaCl, 1mM EDTA, 1% Triton, 1% 693 sodium deoxycholate, 0,1% SDS) supplemented with protease inhibitors (cOmplete 694 Mini, EDTA-free, Roche) and tyrosine protein phosphatases, acid and alkaline-695 phosphatases inhibitors (Phosphatase Inhibitor Cocktail 2, Sigma-Aldrich) 48h after 696 stimulation and lysates were sonicated. Cell lysates were freshly prepared, measured 697 using Bradford assay (Bio-Rad) and equal amounts of proteins were run on SDS-698 PAGE and followed by western blotting. After 30 min at room temperature in 699 blocking solution-5% milk or 5% bovine serum albumin (BSA) in tris-buffered 700 saline and Tween-20 (TBST) (10 mM Tris, pH 7.5, 150 mM NaCl, 0.1% (v/v) 701 Tween-20)—membranes were probed with primary antibodies in 5% milk (or 5% 702 BSA) in TBST overnight at 4 °C, washed in TBST and incubated for 1 h at room 703 temperature with secondary antibodies goat anti-rabbit-HRP (1:10,000, 170-6515, 704 Bio-Rad), goat anti-mouse-HRP (1:10,000, 170-6516, Bio-Rad) or rabbit anti-goat-705 HRP (1:2000, P0449, DAKO). The following primary antibodies were used: anti-706 PP2B-A (1:1000, clone H-209, sc-9070, Santa Cruz Biotechnology), anti-NFATc3 707 (1:1000, polyclonal (M-75) sc-8321, monoclonal (F-1) sc-8405, Santa Cruz 708 Biotechnology), anti-Histone H3 acetyl K27 (1:1000, ab4729, abcam), anti-Histone 709 H3 (1:1000, ab1791, abcam), anti-actin (1:1000, A4700, Sigma), anti-Muc1 (1:200, 710 clone F-19, sc-6826, Santa Cruz Biotechnology); anti-Muc13 (1:1000, ab124654, abcam); anti-Muc20 (1:1000, PA5-50238, Thermofisher). Visualization was carried
out with chemiluminesence (Clarity Western ECL substrate, Bio-Rad; or ECL,
Amersham). Densitometric quantification was performed using Fiji software.

714

715 Immunohistochemistry. Formalin-fixed paraffin embedded sections were 716 deparaffinised and rehydrated through alcohol series. Antigen unmasking was 717 performed in 1 mM EDTA pH 8 for 50 minutes at 95°C. Endogenous peroxidases 718 were quenched with 3% H<sub>2</sub>O<sub>2</sub> (SZBF1960V, Sigma). Human slides were incubated 719 with anti-Ki67 antibody (1:200, ab15580, abcam) or anti-NFATc3 polyclonal (1:200, 720 sc-8321, Santa Cruz Biotechnology), whereas mouse slides were incubated with anti-721 NFATc3 monoclonal (1:200, sc-8405, Santa Cruz Biotechnology, unmasking in 722 EDTA pH8 for 40 minutes at 98 °C) for 2 hours at room temperature. For acetylation 723 visualization antigen unmasking was performed in 10 mM sodium citrate, 0.05% 724 Tween 20, pH 6.0 for 20 minutes at 95°C. After peroxidase quenching slides were 725 incubated 1 hour with anti-Histone H3 acetyl K27 (1:500 for human and 1:800 for 726 mouse tissues ab4729, abcam). After washing slides were incubated with Envision 727 System HRP Rabbit (K4003, DAKO) and developed with DAB solution (K3468, 728 DAKO). Slides were counterstained with hematoxylin and mounted. The DAB+ 729 signal was quantified with Fiji software with ImmunoRatio plugin<sup>64</sup>.

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*Ex-vivo* stimulation of human colonic mucosa. Colonic human specimens were
obtained from patients diagnosed with colon cancer and undergoing surgery at IEO
upon informed consent, according to ICH-GCP. The protocol was approved by the
IEO's ethical committee. *Ex-vivo* organ cultures were performed on colonic tumor
mucosa specimens, according to Tsilingiri et al.<sup>27</sup>. Briefly tumor specimens were cut

into pieces of about 0.5 cm<sup>2</sup> and placed on sterile metal grids, in a center-well organ
culture plate containing 1 ml of medium (DMEM supplemented with 2mM Glutamine,
15% FBS-Na, 1% ITS-X and 200 ng/ml EGF). Tissues were incubated in 100% O<sub>2</sub>
atmosphere in the pressure of 1 Atm, inside an airtight container at 37°C, overnight.
Colonic tissues were either fixed in 4% paraformaldehyde and processed for
histological and IHC analyses or snap-frozen for protein extraction.

742 To evaluate the effect of SCFAs on human colon tumors and controls, medium was 743 supplemented with 200mM sodium acetate (S5636, Sigma-Aldrich), 100mM sodium 744 propionate (P5436, Sigma Aldrich) and 100mM sodium butyrate (ARK2161, Sigma-745 Aldrich) at a ratio similar to that found in fecal content of F. PB1 treated mice 746 (acetate:propionate:butyrate 2:1:1). To evaluate the effect of F. PB1 or H. biformis-747 produced SCFAs, fermented EG broth (SUP) was added to the medium at a 748 concentration of 40%; as control, non-fermented EG broth (Veh) was used. Tumor 749 tissues were either processed for immunohistochemistry, or lysed, and H3 acetylation 750 and NFATc3 levels analyzed.

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752 Statistical analysis. Data were analyzed for normal distribution before any statistical 753 analyses. Data analyses were carried out using GraphPad Prism version 6.01b. Values 754 are presented as means  $\pm$  standard error mean (s.e.m.) or  $\pm$  standard deviation (s.d.), 755 individual values as scatter plots with column bar graphs or as box plots showing the 756 interquartile range, median value and whiskers min to max. Outliers were detected 757 with the Grubbs' test and excluded from the analysis. The statistical significance 758 between two groups was determined with two-tailed unpaired Student's t test, 759 multiple *t*-tests corrected for multiple comparisons using the Holm-Sidak method, 760 Mann-Whitney test or Wilcoxon Rank-Sum test, whereas the comparison of multiple

761 groups was carried out by Kruskal-Wallis test followed by Dunn test, by one-way or 762 two-way ANOVA, followed by Bonferroni's or Tukey's post-test. The Benjamini and 763 Hochberg procedure was used to adjust P values for multiple testing. Data display 764 normal variance. A probability value of \*P < 0.05 was considered to be significant. 765 All statistics and reproducibility information are reported in the figure legends. 766 Sample size was chosen taking in consideration the means of the target values 767 between the experimental group and the control group, the standard error and the 768 statistical analysis used. For animal studies, sample size was defined on the basis of 769 past experience with the models. For ethical reasons the minimum number of animals 770 necessary to achieve the scientific objectives was used. Animals were allocated 771 randomly to each treatment group. Different treatment groups were processed 772 identically and animals in different treatment groups were exposed to the same 773 environment. In IHC and IF analyses, the investigators were unaware of the 774 experimental groups.

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**Reporting summary.** Further information on experimental design is available in theNature Research Reporting Summary linked to this paper.

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#### 779 DATA AVAILABILITY

Source Data for the figures and Extended Data figures are provided in the online
version of the paper. Raw sequencing data and metadata associated to samples are
available online at <u>https://www.ncbi.nlm.nih.gov/bioproject/PRJNA564752</u>.
Accession number: PRJNA564752.

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985

#### 986 AUTHORS CONTRIBUTIONS

987 E.Z. and C.P. ideated, performed and analysed all the experiments; T.S. and F.S. 988 helped in the execution of experiments; A.B., I.S. and Sil.G. helped in the execution 989 of the mouse experiments; B.F., M.M. and Gr.P. performed 16s rRNA metagenomic 990 analysis; L.M. and W.V. designed and carried out histological analyses. G.N. 991 performed *ex-vivo* stimulation of human colonic mucosa experiments; A.B. performed 992 confocal analyses; J.T. executed metabolomic analyses; B.O. helped in the execution 993 of in vitro experiments; K.A. and K.H. isolated F.PB1 and carried out GF 994 experiments; S.A. and S.G. set up F. PB1 growth and supernatant production; S.C. set 995 up H. biformis and L. lactis growth and supernatant production; G.F. performed 996 FACS analyses; F.A. and N.S. performed phylogenetic analysis and human CRC 997 dataset interrogation; G.P. participated with ideas and results interpretation; M.R. 998 ideated the study, coordinated the work, and wrote the manuscript.

999

#### 1000 DECLARATION OF INTERESTS

1001 The authors declare no competing interests.

#### 1003 FIGURE LEGENDS

### Fig. 1. *Faecalibaculum rodentium* is underrepresented during the early phases of tumor development

**a-c**,16S rRNA gene profiling of the fecal microbiota of WT and Apc<sup>Min/+</sup> mice at 4, 8 1006 1007 and 12 weeks of age (n = 8 mice/group). **a**, Shannon diversity index. Box plots show 1008 the interquartile range, median value and whiskers min to max. b, Genus abundance (inner pie: WT, outer pie:  $Apc^{Min/+}$ ). Genera with a relative abundance higher than 1% 1009 1010 in at least one of the tested condition, were shown, otherwise are collapsed into the 1011 "Other genera" section. P values were assessed by two-tailed unpaired Mann-Whitney 1012 test. c, Relative abundance of the 10 most abundant species in fecal bacterial DNA isolated from WT and Apc<sup>Min/+</sup> mice at 8 and 12 weeks of age. Abundance shown as 1013 1014 the normalized number of assigned sequences in the 16S rRNA sequencing. P values 1015 were determined by two-way ANOVA with Bonferroni post-test. d,e, qPCR of F. 1016 PB1 abundance normalized to panbacterial primers targeting the 16S rRNA gene 1017 (UNI 16S) in bacterial DNA extracted from feces ( $\mathbf{d}$ , n = 8 mice/group) and mucus from the small intestine and colon (e, n = 11 mice/group) from WT and Apc<sup>Min/+</sup> mice. 1018 1019 P values were determined by multiple t-tests corrected for multiple comparisons using 1020 the Holm-Sidak method to compare F. PB1 abundance between groups at each time 1021 point (d) or by two-tailed unpaired t-test (e). a-e, Data from two independent 1022 experiments and represented as means  $\pm$  s.e.m.

1023

### Fig. 2. F. PB1 loss coincides with mucus changes and when reintroduced reduces tumor growth

1026 **a**, qPCR of mucin expression in the ileal tissue of WT mice and healthy (H) and 1027 tumor (T) tissue of  $Apc^{Min/+}$  mice at 8 and 16 weeks of age. Expression levels

1028 normalized to the reference gene Rpl32. Data from two independent experiments (8wks: WT n = 10, Apc<sup>Min/+</sup> H n = 8, Apc<sup>Min/+</sup> T n = 7; 16 wks: WT n = 8, Apc<sup>Min/+</sup> H n 1029 = 9, Apc<sup>Min/+</sup> T n = 9 mice/group). P values were determined by one-way ANOVA 1030 1031 with Bonferroni post-test to compare expression levels within the same time point. **b**,**c**, F. PB1 administration experiments in WT and  $Apc^{Min/+}$  mice pre-treated with 1032 1033 antibiotic cocktail. **b**, gPCR of F. PB1 abundance normalized to panbacterial primers 1034 targeting the 16S rRNA gene (UNI 16S) in bacterial DNA extracted from ileal mucus. 1035 Data from two independent experiments (WT Veh n = 7; WT F. PB1 n = 10; Apc<sup>Min/+</sup> Veh n = 6; Apc<sup>Min/+</sup> F. PB1 n = 11 mice/group). P values were determined by two-1036 1037 tailed unpaired Mann-Whitney test. c, Representative FISH images of F. PB1 (green) on the mucosal surface of Apc<sup>Min/+</sup> ileum polyp and WT normal ileum. DAPI nuclear 1038 stain in blue. Images obtained at 40X magnification, scale bars 50  $\mu$ m; n = 3 1039 mice/group. **d**. Tumor multiplicity in the small intestine of Apc<sup>Min/+</sup> mice treated with 1040 1041 vehicle (Veh) or F. PB1 from week 4 to 8 (n = 5 mice/group). Significance 1042 determined by multiple t-tests corrected for multiple comparisons using the Holm-1043 Sidak method to compare tumor multiplicity between groups at each time point. e.f.  $Apc^{Min/+}$  mice received vehicle (Veh) or F. PB1 from week 8 to 12. Two independent 1044 1045 experiments were performed with consistent results. e, Tumor multiplicity in the small intestine normalized to vehicle treated Apc<sup>Min/+</sup> mice at 12 weeks of age. Data 1046 from two independent experiments (n = 14 mice/group). f, Area and 1047 1048 maximum diameter (axis length) of ileal dysplastic lesions normalized to the total number of lesions per mouse. Data from one representative experiment (n = 71049 1050 mice/group). Box plots show the interquartile range, median value and whiskers min 1051 to max. P values were determined by two-tailed unpaired t-test (e) and two-tailed 1052 unpaired Mann-Whitney test (f). **a,b,d-f**, Data are represented as means  $\pm$  s.e.m.

# Fig. 3. F. PB1 reduces tumor cell proliferation without major impact on immunecells

1055	<b>a,b</b> , WT and Apc <sup>Min/+</sup> mice treated with vehicle (Veh) or <i>F</i> . PB1 from week 8 to 12. <b>a</b> ,
1056	Flow cytometric analysis of T regulatory, Th1 and Th17 cell populations in the small
1057	intestinal lamina propria. FoxP3+CD25+ are gated on the live CD45+ CD3+ CD4+
1058	cells; Helios+ is gated on the FoxP3+ CD25+ cells (WT Veh, Apc <sup>Min/+</sup> $F$ . PB1 n = 12;
1059	WT F. PB1 n = 14; Apc <sup>Min/+</sup> Veh n = 11 mice/group); IL17+, IFN $\gamma$ + and IL17+
1060	IFN $\gamma$ + cells are gated on the live CD45+ CD3+ CD4+ cells (WT Veh, Apc <sup>Min/+</sup> Veh n
1061	= 9; WT F. PB1 n = 11; Apc <sup>Min/+</sup> F. PB1 n = 10 mice/group). <b>b</b> , Flow cytometric
1062	analysis of peripheral blood cells. Percentages are relative to the CD45+ CD3-
1063	population; WT Veh, Apc <sup>Min/+</sup> F. PB1 n = 13; WT F. PB1 n = 15; Apc <sup>Min/+</sup> Veh n =
1064	12 mice/group. <b>c-g</b> , Apc <sup>Min/+</sup> mice received vehicle (Veh) or $F$ . PB1 from week 8 to
1065	10. Data from two independent experiments depicted. c, Tumor multiplicity in the
1066	small intestine normalized to vehicle treated $Apc^{Min/+}$ mice (Veh n = 10; F. PB1 n =
1067	11 mice/group). d, Area and maximum diameter (axis length) of ileal dysplastic
1068	lesions (number of lesions: Veh = 265; F. PB1 = 150) normalized to the total number
1069	of lesions per mouse. Box plots show the interquartile range, median value and
1070	whiskers min to max (Veh n = 10; F. PB1 n = 11 mice/group). e, Percentage of
1071	nuclear Ki67 positive cells in the polyps of Veh and F. PB1-treated mice; $n = 4$
1072	mice/group. $\mathbf{f}$ , Representative images of nuclear Ki67 staining in polyps of Veh and $F$ .
1073	PB1-treated mice. Scale bars 100 $\mu$ m. n = 4 mice/group. <b>g</b> , Bleeding score of Veh and
1074	<i>F</i> . PB1-treated mice (Veh n = 10; <i>F</i> . PB1 n = 11 mice/group). <b>h</b> , Fecal concentrations
1075	of L-lactate, acetate, propionate and butyrate in WT and $Apc^{Min/+}$ mice treated with
1076	Veh or <i>F</i> . PB1 from 8 to 12 weeks, detected by UPLC-MS; WT Veh, WT <i>F</i> . PB1 $n =$
1077	6; Apc <sup>Min/+</sup> Veh n = 11; Apc <sup>Min/+</sup> F. PB1 n = 10 mice/group.

1078 $\mathbf{a-d,g,h}$ , Data from two independent experiments are represented as means  $\pm$  s.e.m.. P1079values were assessed by one-way ANOVA using Bonferroni post-test for multiple1080comparisons (a) or two-tailed unpaired *t*-test (**b,c,e,g**), two-tailed unpaired Mann-1081Whitney test (d), or two-way ANOVA with Bonferroni post-test for multiple1082comparisons (h).

1083

#### 1084 Fig. 4. F. PB1 releases SCFAs that have anti-proliferative activity

1085 **a,c**, Cell proliferation assay on mouse CRC cell lines treated or not (NT) with acetate 1086 (Ac), propionate (Prop) and butyrate (But) either alone and in combination (MIX) (a) 1087 or with culture broth fermented by F. PB1 (SUP) (c). t0 is the signal from cells at the 1088 time of stimulation. Two independent experiments were performed with consistent 1089 results. Data from one representative experiment (n = 6 biologically independent 1090 samples). P values were determined by one-way ANOVA using Bonferroni post-test. 1091 **b**, Quantification of L-lactate and SCFAs in broth fermented by F. PB1 (SUP) by 1092 UPLC-MS. Data from six independent experiments. d, Representative Western blots 1093 from two to three independent experiments showing the effect on H3K27 acetylation, 1094 PP2B-A and NFATc3 expression in mouse cell lines treated or not (NT) with broths 1095 fermented by F. PB1 (SUP) or not fermented (Veh). Vinculin and actin were used as 1096 loading controls. Densitometric analysis is reported in Extended Data Fig. 5b. e.f. In 1097 vitro stimulation of CT26 cells with untreated broth fermented by F. PB1 (SUP) or 1098 one depleted of SCFAs by evaporation (SUP evap). Untreated broth not fermented 1099 (Veh) or evaporated (Veh evap) used as controls. e, Representative Western blots 1100 from two independent experiments showing the effect of SUP and SUP evap on 1101 H3K27 acetylation and NFATc3 expression. Vinculin was used as loading control. 1102 Densitometric analysis is reported in Extended Data Fig. 5c. f, Quantification of 1103 SCFAs and L-lactate by UPLC-MS. n = 3 (SUP evap) or 6 (SUP) biologically 1104 independent experiments. *P* values were determined by two-tailed unpaired Mann-1105 Whitney test. **a,b,c,f**, Data are presented as means  $\pm$  s.d.

1106

### Fig. 5. F. PB1 metabolic products, in particular butyrate, have anti-proliferative activity *in vivo* and this is independent on the microbiota

**a.b.** Apc<sup>Min/+</sup> mice received broths not fermented (Veh) or fermented by F. PB1 1109 (SUP) from week 8 to 10. Data from three independent experiments (Veh n = 13; 1110 SUP n = 11 mice/group). c-e, 11 weeks old Apc<sup>Min/+</sup> mice treated with Veh or F. PB1 1111 1112 SUP in the presence of an antibiotic cocktail (ABX). Data from two independent experiments (Veh n = 6; SUP n = 7 mice/group). f,g, 11 weeks old Apc<sup>Min/+</sup> mice 1113 1114 treated with Veh, F. PB1 SUP or butyrate 1 mM in the presence of ABX. Data from 1115 two independent experiments (Veh, n = 7; SUP and Butvrate n = 8 mice/group). **a.c.f.** Tumor multiplicity in the small intestine normalized to vehicle treated Apc<sup>Min/+</sup> mice. 1116 1117 **b.d.g.** Area and maximum diameter of ileal dysplastic lesions normalized to the total 1118 number lesions per mouse. e, Representative images of ileal dysplastic lesions stained 1119 with anti-NFATc3 antibody (200X magnification, scale bars 100 µm) or with anti-1120 Histone H3 acetyl K27 antibody (100X magnification, scale bars 200 µm). Right 1121 panel: Quantitative color deconvolution analysis of Histone H3 acetylation in dysplastic lesions of Apc<sup>Min/+</sup> mice treated or not with F. PB1 SUP (Veh, n = 6; SUP, 1122 1123 n = 4 biologically independent samples). h,i, AOM/DSS treated C57BL/6 WT mice 1124 received Veh (n = 5 mice/group) or F. PB1 SUP (n = 6 mice/group) Data from one 1125 representative experiment depicted. h, Tumor multiplicity in the colon normalized to vehicle treated Apc<sup>Min/+</sup> mice. **i**, Area and maximum diameter (axis length) of colon 1126 1127 adenomas normalized to the total number of lesions per mouse. Two (c-i) or three

1128 (**a,b**) independent experiments were performed with consistent results. **a-i**, Data are 1129 represented as means  $\pm$  s.e.m. and box plots show the interquartile range, median 1130 value and whiskers min to max in **b,d,g,i**. *P* values were evaluated using two-tailed 1131 unpaired Mann Whitney test (**a-e,h**), Kruskal-Wallis test with Dunn post-test (**f,g**) or 1132 two-tailed unpaired *t*-test (**i**).

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#### 1134 Fig. 6. Holdemanella biformis is the equivalent of F. PB1 in humans

1135 **a**, Shannon diversity index in fecal DNA from healthy donors (n = 61) and large 1136 adenoma (n = 15) patients and abundance of the family *Erysipelotrichaceae*. Box 1137 plots show the interquartile range, median value and whiskers min to max. b, 1138 Abundance of the undefined genus Erysipelotrichaceae noname and of the species 1139 Holdemanella biformis. At each taxonomic level, a two-tailed Wilcoxon Rank-Sum 1140 test comparing relative abundances of large adenoma (n = 15) and control samples (n 1141 = 61) was applied. P-values obtained at family and genus taxonomic levels were 1142 corrected for multiple hypothesis testing using the Benjamin-Hochberg procedure.  $\mathbf{c}$ , 1143 A high-quality phylogeny of the *Erysipelotrichaceae* family and the F. PB1 isolate. **d**, 1144 Quantification of SCFAs in the broth fermented by Holdemanella biformis (H. 1145 *biformis* SUP) by UPLC-MS. Data from two independent experiments (n = 21146 biologically independent experiments). e, Representative WB from two to three 1147 independent experiments performed with consistent results showing the effect of 1148 SCFAs MIX, F. PB1 SUP, H. biformis SUP on H3K27 acetylation and NFATc3 1149 expression in human CRC cell lines. Cells not treated (NT) or treated with non-1150 fermented medium (Veh) as a control. Vinculin used as loading control. 1151 Densitometric analysis is reported in Extended Data Fig. 8b. f,g, 11 weeks old Apc<sup>Min/+</sup> mice treated with Veh or *H. biformis* SUP in the presence of antibiotics 1152

1153	(ABX) (n = 5 mice/group). $\mathbf{f}$ , Tumor multiplicity in the small intestine normalized to
1154	vehicle treated $Apc^{Min/+}$ mice. <b>g</b> , Area and maximum diameter of ileal dysplastic
1155	lesions normalized to the total number lesions per mouse. Box plots show the
1156	interquartile range, median value and whiskers min to max. h, Representative WB
1157	from two (H. biformis SUP) to three (F. PB1 SUP) independent experiments
1158	performed with consistent results showing the effect of F. PB1 SUP or H. biformis
1159	SUP on H3K27 acetylation and NFATc3 expression in ex-vivo treated human colon
1160	tumor samples (hCRC). Bar plots show the densitometric quantification of NFATc3
1161	(normalized to vinculin) and H3K27 acetylation (normalized to total H3) (H. biformis
1162	SUP, $n = 2$ ; F. PB1 SUP, $n = 3$ biologically independent experiments). Data are
1163	represented as means $\pm$ s.e.m. in <b>a,b,d,f-h</b> . <i>P</i> values were evaluated using two-tailed
1164	unpaired Mann Whitney test (a,f,g right panel) and two-tailed unpaired t-test (g left
1165	panel, <b>h</b> ).