

1 **Gut microbiota condition the therapeutic efficacy of trastuzumab in HER2-positive breast**
2 **cancer.**

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4 **Authors:** Martina Di Modica¹, Giorgio Gargari¹, Viola Regondi¹, Arianna Bonizzi², Stefania
5 Arioli³, Beatrice Belmonte⁴, Loris De Cecco⁵, Elena Fasano¹, Francesca Bianchi¹, Alessia
6 Bertolotti⁶, Claudio Tripodo^{4,10}, Laura Villani⁷, Fabio Corsi^{2,8}, Simone Guglielmetti³, Andrea
7 Balsari^{1,9}, Tiziana Triulzi^{1†} and Elda Tagliabue^{1†*}.

8 **Affiliations:**

9 ¹Molecular Targeting Unit, Dept. of Research, Fondazione IRCCS Istituto Nazionale dei Tumori,
10 Milan, Italy.

11 ²Dept. of Biomedical and Clinical Sciences "L. Sacco", Università degli Studi di Milano, Milan,
12 Italy.

13 ³Dept. of Food, Environmental and Nutritional Sciences (DeFENS), Università degli Studi di
14 Milano, Milan, Italy.

15 ⁴Tumor Immunology Unit, Dept. PROMISE, Università degli Studi di Palermo, Palermo, Italy.

16 ⁵Platform of Integrated Biology, Dept. of Applied Research and Technology Development,
17 Fondazione IRCCS Istituto Nazionale dei Tumori, Milan, Italy.

18 ⁶Dept. of Pathology, Fondazione IRCCS Istituto Nazionale Tumori, Milan, Italy.

19 ⁷Pathology Unit, Istituti Clinici Scientifici Maugeri IRCCS, Pavia, Italy.

20 ⁸Breast Unit, Istituti Clinici Scientifici Maugeri IRCCS, Pavia, Italy.

21 ⁹Dept. of Biomedical Science for Health, Università degli Studi di Milano, Milan, Italy.

22 ¹⁰IFOM, the FIRC Institute of Molecular Oncology, Milan, Italy.

23 † These authors contributed equally to this work.

24 *Corresponding author.

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32 - Corresponding authors: Dr. Elda Tagliabue; email: elda.tagliabue@istitutotumori.mi.it;
33 phone: +39 02 23903013; Fax: +39 02 23903073
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38 **Abstract**

39 Emerging evidence indicates that gut microbiota affect the response to anticancer therapies by
40 modulating the host immune system. In this study, we investigated the impact of the gut
41 microbiota on immune-mediated trastuzumab antitumor efficacy in preclinical models of HER2-
42 positive breast cancer (BC) and in 24 patients with primary HER2-positive BC undergoing
43 trastuzumab-containing neoadjuvant treatment. In mice, the antitumor activity of trastuzumab
44 was impaired by antibiotic administration or fecal microbiota transplantation from antibiotic-
45 treated donors. Modulation of the intestinal microbiota was reflected in tumors by impaired
46 recruitment of CD4⁺ T cells and GZMB⁺ cells after trastuzumab treatment. Antibiotics caused
47 reductions in dendritic cell (DC) activation and the release of IL12p70 upon trastuzumab
48 treatment, a mechanism that was necessary for trastuzumab effectiveness in our model.

49 In patients, lower α -diversity and lower abundance of *Lachnospiraceae*, *Turicibacteriaceae*,
50 *Bifidobacteriaceae* and *Prevotellaceae* characterized nonresponsive patients (NR) compared to
51 those who achieved pathological complete response (R), similar to antibiotic-treated mice. The
52 transfer of fecal microbiota from R and NR into mice bearing HER2-positive BC recapitulated
53 the response to trastuzumab observed in patients. Fecal microbiota β -diversity segregated
54 patients according to response and positively correlated with immune signature related to
55 interferon, IL12-NO, activated CD4⁺ T cells and activated DC in tumors. Overall, our data
56 reveal the direct involvement of the gut microbiota in trastuzumab efficacy, suggesting that
57 manipulation of the gut microbiota is an optimal future strategy to achieve a therapeutic effect or
58 to exploit its potential as a biomarker for treatment response.

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61 **Significance**

62 Evidence of gut microbiota involvement in trastuzumab efficacy represents the foundation for
63 new therapeutic strategies aimed at manipulating commensal bacteria to improve response in
64 trastuzumab-resistant patients

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66 **Introduction**

67
68 The aggressive biological behavior of breast carcinoma (BC) overexpressing human epidermal
69 growth factor receptor 2 (HER2) and the consequent worse clinical outcomes of patients with
70 these tumors (1) have largely been addressed by targeting HER2. Trastuzumab, a recombinant
71 humanized monoclonal antibody that binds to the extracellular domain of HER2, represents the
72 first treatment option for women with early and advanced stages of HER2-positive BC (2).
73 Although trastuzumab substantially improves the clinical outcomes of HER2-positive BC
74 patients, a large number of patients present or develop resistance to this treatment, underlying the
75 need to optimize the response rate in resistant patients. Several attempts have been made to
76 understand the reason for the lack of efficacy and to identify biomarkers that predict patients
77 who will benefit from trastuzumab treatment (reviewed in (3)). By using the PAM50 classifier to
78 define different tumor intrinsic subtypes within HER2-positive BC, patients with tumors
79 classified as HER2-enriched (i.e., characterized by the high expression of *ERBB2* and other
80 genes of the 17q amplicon and low to intermediate expression of luminal genes, such as *ESR1*
81 and *PGR*) are more likely than the others to benefit from anti-HER2 treatment (4). However,
82 despite the high sensitivity of HER2-enriched tumors, no more than 50% of these patients
83 respond to trastuzumab (reviewed in (3)), indicating that the effectiveness of this mAb is not
84 determined by intrinsic tumor features only. In line with this speculation, evidence shows that the
85 addition of anti-HER2 therapies in combination with trastuzumab (e.g., trastuzumab emtansine,
86 pertuzumab, and lapatinib) remains ineffective in many resistant patients (5).
87 The importance of the host immune system in the mechanism of action of trastuzumab has
88 become increasingly clear (reviewed in (6;7)), indicating that trastuzumab not only inhibits
89 HER2-triggered signal transduction but also has immunomodulatory properties. Patients with

90 highly infiltrated tumors or tumors expressing a particular subset of immune system genes have a
91 lower risk of relapse than others upon trastuzumab treatment (7). However, even considering
92 tumor and/or immune microenvironment characteristics, the prediction of trastuzumab benefit
93 did not result in sufficient accuracy for clinical practice (3;8), indicating that host-related features
94 might add missing clues to identify sensitive/resistant patients.

95 The gut microbiota has been described as one of the major environmental factors that is able to
96 regulate the development and maintenance of the immune system. Recently, studies in
97 preclinical models (9-13) and patient cohorts (12;14-18) have clearly shown the causal role of
98 commensal communities in the efficacy of both chemotherapy and immunotherapy through the
99 modulation of host immunity.

100 Based on the relevance of the patient immune system to the therapeutic effect of trastuzumab and
101 the importance of gut commensal bacteria in host immune system maintenance, in this study, we
102 investigated, in experimental models and HER2-positive BC patients, the role of gut microbiota
103 as an extrinsic tumor feature contributing to the response to trastuzumab through regulation of
104 the pre-existing or trastuzumab-conditioned tumor immune microenvironment.

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108 **Materials and Methods**

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110 **Antibiotic treatment and *in vivo* experiments**

111 Female FVB/Ncr1 mice (four weeks old) were purchased from Charles River Laboratories
112 (Calco, Italy; cat no. CRL:207; RRID:IMSR_CRL:207). The mice were treated with a single
113 antibiotic (vancomycin or streptomycin dissolved in drinking water, 200 mg/L) for the entire
114 duration of the experiment and water was used as control (NoA). These antibiotics were selected
115 because poorly absorbed in the intestine and for their different mechanisms of action with
116 vancomycin mainly directed against Gram-positive bacteria (19) and streptomycin as a broad
117 spectrum protein synthesis inhibitor (20). After four weeks of antibiotic treatment, 1×10^6
118 human HER2-positive MI6 murine mammary carcinoma cells were injected into the mouse
119 mammary fat pad. When tumors reached a palpable volume (3-4 mm in diameter), the mice
120 were randomized into two groups and treated biweekly with intraperitoneal (i.p.) injections of
121 trastuzumab (5 mg/kg body weight), or saline (NaCl 0.9%) as control, for the duration of the
122 entire experiment. The tumors were measured by caliper, and the volume was calculated as 0.5
123 $\times d1^2 \times d2$, where $d1$ and $d2$ are the smaller and larger diameters, respectively. For the
124 depletion experiments the following *InVivoMab* antibodies (BioXcell, Lebanon, NH, USA)
125 were used: rat IgG2b isotype control, clone LTF-2 (400 μ g i.p. twice a week) (cat no. BE0090;
126 RRID:AB_1107780); anti-mouse CD4, clone GK1.5 (400 μ g i.p. twice a week) (cat no.
127 BE0003-1; RRID:AB_1107636); anti-mouse IL12p70, clone R2-9A5 (1 mg the day before the
128 first trastuzumab injection and then 500 μ g i.p. twice a week (21)) (cat no. BE0233;
129 RRID:AB_2687715). Recombinant mouse IL12p70 (rIL12p70) (Biolegend, cat no. 577006)
130 was administered to mice under vancomycin, starting the day before trastuzumab
131 administration (500 ng i.p. three times a week) (adapted from (22)). Experimental protocols

132 used for animal studies were approved by the institutional review board and by the Italian
133 Ministry of Health.

134 Detailed protocols for experiments carried out in FVB Δ 16HER2 transgenic mice can be found
135 in supplementary materials and methods.

136 **Patient cohort**

137 In this study, we analyzed 24 consecutive patients who received neoadjuvant trastuzumab-based
138 chemotherapy between 2017 and 2019 at the Istituti Clinici Scientifici Maugeri of Pavia. Twenty
139 patients received 4 cycles of AC (adriamycin plus cyclophosphamide), followed by four to six
140 cycles of TH (taxane and trastuzumab) as therapy, while four patients received taxane plus
141 trastuzumab for six cycles since the beginning. Pathological complete response (pCR) was
142 defined as no residual invasive tumor in the complete resected breast specimen. Table 1 lists the
143 characteristics of patients and diseases according to the response. Fecal samples from patients
144 were collected before the beginning of TH. The biospecimens consisted of leftover material from
145 samples that had been collected during standard biopsy surgical and medical procedures at the
146 Istituti Clinici Scientifici Maugeri – Breast Unit. Samples were donated by patients to the
147 Institutional BioBank for research purposes, and aliquots were designated for this study after
148 approval by the institutional review board and by an independent ethical committee of the Istituti
149 Clinici Scientifici Maugeri and the Fondazione IRCCS Istituto Nazionale dei Tumori. All
150 procedures were performed in accordance with the Declaration of Helsinki and all subjects
151 signed a written informed consent for the study. Additional information can be found in
152 supplementary materials and methods.

153 **Fecal microbial transplantation (FMT) experiment**

154 The intestinal flora of four-week-old FVB mice was depleted by feeding the animals for 28 days
155 with an antibiotic cocktail (ABX) (neomycin, ampicillin, metronidazole 1 g/L and vancomycin
156 500 mg/L), as described (23;24). The feces of antibiotic-treated donor mice were homogenized
157 in prerduced 1X PBS at a concentration of 130-150 mg/ml. Fecal suspensions (200 μ l) were
158 delivered to mice via oral gavage twice a week for 2 weeks and then once a week until the end of
159 the experiment. Trastuzumab treatment started when the tumor reached a palpable volume as
160 described above. Further details on FMT with patients stool sample are reported in the
161 supplementary materials and methods.

162 **Immune characterization and plasma cytokines quantification** Detailed protocols can be
163 found in Supplementary Materials and Methods. Supplementary Table 1 lists the antibodies used.

164 **Fecal sample analysis**

165 Metagenomic DNA was extracted from 250 mg (or from one pellet in mice) of stool using a
166 PowerLyzer PowerSoil DNA isolation kit (Qiagen, cat no. 12855-100, Hilden, Germany).
167 Starting from 12.5 ng of total DNA, the bacterial community structure was determined by the
168 sequencing of the variable region 3 and 4 (V3 and V4) of the 16S rRNA gene on the MiSeq
169 Illumina technology platform at the Center for Life Nanosciences, Italian Institute of
170 Technology (Rome, Italy). The sequence reads were then analyzed using the bioinformatics
171 pipeline Quantitative Insights Into Microbial Ecology (QIIME) version 1.9.1 (25). Bacterial
172 abundances in each fecal sample were reported at the taxonomic levels of phylum, order,
173 family and genus.

174 **Gene expression and bioinformatics analysis**

175 For patient's study, RNA was extracted from FFPE BC core biopsies using the miRNAeasy
176 FFPE kit (Qiagen, cat no. 217504). A total of 13 tumor core biopsies collected at diagnosis

177 before neoadjuvant treatment were available out of 24 patients. Gene expression profile was
178 carried out using ClariomTM S Pico Assay (Thermo Fisher Scientific), a detailed protocol for the
179 gene expression profile can be found in supplementary materials and methods. The data were
180 deposited into the Gene Expression Omnibus (GEO; RRID:SCR_005012) repository (accession
181 number GSE149283). The research-based PAM50 subtype predictor was applied using the
182 publicly available algorithm as described after merging the dataset with 50 consecutive BC cases
183 profiled on the same platform and performing median centering of the PAM50 genes (26).

184 For ileum and colon samples, RNA was extracted from frozen samples using miRNeasy mini Kit
185 (Qiagen, cat no. 217004). Gene expression was performed as described above, the data were
186 deposited into the GEO repository (accession number GSE149712).

187 Functional annotation clustering of differentially expressed genes (DEGs) between NoA and
188 vancomycin was performed by DAVID Bioinformatics Resources v6.8 (RRID: SCR_001881)
189 (27). Gene-set enrichment analyses (GSEA; RRID:SCR_003199) in the intestines were
190 performed by GSEA v4.0.3 (28) using a selection of immune pathways from GO biological
191 processes and KEGG pathways gene set. In patients' tumors, GSEA analysis was performed in
192 continuous based on PC1 values of patient's β -diversity analysis using a previously described
193 cancer-related geneset (29). Pearson metric for ranking genes was used. Gene set permutation
194 type was applied 1000 times and gene set enrichment was considered significant at FDR<10%.

195 Immune metagenes were determined per Rody et al. (30). The average log-transformed
196 expression of the genes that belonged to each metagene was calculated. Single-sample GSEA
197 (ssGSEA) was performed with previously published immune signatures (31).

198 **Statistical analyses**

199 Analyses were performed using GraphPad Prism 5.0 (GraphPad Software; RRID:SCR_002798).
200 Differences between the groups were determined using a two-tailed unpaired t-test. The
201 association among categorical variables was tested by Fisher's exact test and correlation between
202 continuous variables were examined by Spearman correlation analysis. Differences were
203 considered significant at $p < 0.05$. The software R version 3.4.2 was used for the statistics
204 concerning the microbiota analysis. The Linear discriminant analysis Effect Size (LEfSe;
205 RRID:SCR_014609) algorithm was used to discover taxa differences between groups (32).
206 Specifically, the algorithm uses the nonparametric factorial Kruskal-Wallis sum-rank test
207 associated with a p-value correction test to detect features with significant differential abundance
208 with respect to the group of interest. Statistical significance was set at $p \leq 0.05$, and mean
209 differences with $0.05 < p \leq 0.10$ were accepted as trends. The ecological diversity (α and β) was
210 calculated by QIIME software version 1.9.1 (RRID:SCR_008249). Concerning the α -diversity
211 (intrasample diversity), we used three different indexes: Chao1, Shannon and Simpson. The first
212 index examines the richness of different bacteria present in each sample. The second and the
213 third indexes also evaluate importance at the evenness and richness levels. The β -diversity,
214 described as intersample diversity, was measured using the UniFrac distance metric (33). This
215 distance was used because it incorporates information on the relative relatedness of community
216 members by incorporating phylogenetic distances between the observed bacteria, and principal
217 coordinate analyses were performed to visually compare the microbiota of the different treatment
218 groups considering the bacterial phylogenetic distances. In the analysis of the patient β -diversity,
219 an analysis of similarities (ANOSIM) (34) was performed to determine the significance of the
220 dissimilarities observed between responsive (R) and non responsive (NR) patients. LEfSe was
221 performed to identify differentially abundant taxa in groups of treatment or R and NR patients.

222 **Results**

223 **Antibiotic administration reduces trastuzumab therapeutic activity in preclinical models**

224 To address the role of commensal bacteria in the therapeutic benefit of HER2 inhibition, the
225 antitumor activity of trastuzumab was investigated in conventional (no antibiotic, NoA) FVB
226 mice bearing MI6 cells, and in mice whose intestinal microflora was altered by the use of
227 vancomycin or streptomycin, two broad-spectrum antibiotics that are poorly absorbed in the
228 intestine. The anti-HER2 mAb showed reduced antitumor efficacy in mice under antibiotic
229 regimens (Fig. 1A; Supplementary Fig. S1A). No consequences on HER2 expression and
230 phosphorylation (Supplementary Fig. S1B and C) or on trastuzumab distribution in tumors
231 (Supplementary Fig. S1D) were observed following antibiotic treatment, except for a slight
232 decrease in tumor growth in vancomycin-treated mice, ruling out possible antibiotic-induced
233 tumor changes that led to the inefficacy of trastuzumab. The causal contribution of the gut
234 microbiota to trastuzumab efficacy was investigated in mice whose intestinal microbiota was
235 depleted by an antibiotic cocktail (ABX), and then the gut was recolonized through a fecal
236 microbiota transplant (FMT) by using a fecal suspension obtained from vancomycin or NoA
237 donor mice (Fig. 1B; Supplementary Fig. S2A-S2C). The inhibition of tumor growth observed
238 after trastuzumab treatment was more effective in mice transplanted with stool from NoA
239 animals (FMT-NoA) than in mice receiving feces from vancomycin-treated donors (FMT-
240 vancomycin).

241 The impact of vancomycin administration on the benefit of trastuzumab therapy was also
242 investigated in FVB- Δ 16HER2 transgenic female mice (35), a model of spontaneous mammary
243 carcinoma. Under vancomycin treatment, the mice did not benefit from trastuzumab

244 administration compared to the NoA group (Supplementary Fig. S3A). No impact of vancomycin
245 on tumor onset or multiplicity was observed (Supplementary Fig. S3B and S3C).

246 **Vancomycin and streptomycin significantly alter the gut microbiota composition**

247 The bacterial community structure in the gut of antibiotic-treated mice was analyzed by 16S
248 rRNA gene profiling. Both antibiotics significantly reduced bacterial taxonomic richness, with
249 vancomycin having a stronger impact on the microbiota than streptomycin, as reflected by the
250 Chao1 and Shannon α -diversity indexes (Fig. 2A) and the β -diversity PCoA plot (Fig. 2B),
251 where the microbiota of the antibiotic-treated mice was segregated from that of the NoA mice
252 (Fig. 2B). Consistently, analysis of microbial β -diversity in the feces of transplanted mice
253 collected at the end of the experiment showed that although the FMT-vancomycin mice did not
254 thoroughly recapitulate the bacterial community of donor mice, they clustered separately from
255 the FMT-NoA mice (Supplementary Fig. S2C).

256 Antibiotic administration resulted in a substantial decrease in the relative abundance of bacteria
257 belonging to the *Actinobacteria* and *Firmicutes* phyla. Vancomycin treatment also caused a
258 substantial loss of *Bacteroidetes*, with a concomitant increase in the relative abundance of the
259 phyla *Proteobacteria* and *Verrucomicrobia*. Within the phylum *Firmicutes*, both antibiotics
260 reduced numerous taxonomic units belonging to the order *Clostridiales*, particularly to the
261 family *Lachnospiraceae* (Supplementary Fig. S4A). To further explore these data, LEfSe
262 analysis was performed, and the taxonomic families *Lachnospiraceae*, *Turicibacteriaceae*,
263 *Coriobacteriaceae* and *Prevotellaceae* were less abundant in antibiotic-treated mice (Fig. 2C and
264 D; Supplementary Fig. S4C and S4D). These bacteria are producers of short-chain fatty acids
265 (SCFAs), and their low abundance in the gut of vancomycin- or streptomycin-treated mice
266 negatively impacted the fecal levels of butyrate, propionate and acetate (Supplementary Fig. S5).

267 **Antibiotic treatment induces changes in the tumor immune microenvironment**

268 The immune infiltrate of tumors collected at the end of the experiments with antibiotics was
269 analyzed by immunohistochemistry (IHC) and flow cytometry (Fig. 3). Antibiotic treatment
270 increased the density of CD45+ positive cells within the tumor masses (Fig. 3A; Supplementary
271 Fig. S6A and S6B) along with an overall reduction in the number of CD3+ tumor-infiltrating
272 lymphocytes (Fig. 3B; Supplementary Fig. S6A and S6C) and an increase in Gr-1+ myeloid cells
273 (Fig. 3C; Supplementary Fig. S6A and S6D), as highlighted by IHC. Regarding the immune
274 populations relevant for trastuzumab antitumor activity (NK cells, CD4+ T cells and CD8+ T
275 cells) (36;37), we found that granzyme B (GZMB)-expressing cells were increased upon
276 trastuzumab treatment in control animals, while the recruitment of cytotoxic effectors was
277 impaired in vancomycin- or streptomycin-treated mice (Fig. 3D; Supplementary Fig. S6A).
278 CD4+ T cells were mainly relocated within tumor cell foci in NoA animals, whereas no
279 redistribution was found in antibiotic-treated mice (Fig. 3E; Supplementary Fig. S6A) upon
280 trastuzumab administration. Of note, a very small number of CD8+ T cells infiltrated MI6
281 tumors, and they were mainly localized within the stromal compartment (Supplementary Fig.
282 S6A and S6E), suggesting that GZMB+ cells in our model are mainly represented by cytotoxic
283 NK cells (Supplementary Fig. S6A and S6F). This speculation was supported by flow cytometry
284 analysis of an independent experiment in which an increase in CD49b+NKp46+ NK cells (Fig.
285 3F), but not CD8+ T cells (Supplementary Fig. S7A and S7B) or CD4+ T cells (Fig. 3G), was
286 found in tumors upon trastuzumab administration. Notably, antibiotic treatment impaired the
287 basal activation status, evaluated as CD69 expression, in NK cells and tumor-infiltrating T
288 lymphocytes (Fig. 3F and G; Supplementary Fig. S7A and S7B).

289 The analysis of tumors from FMT mice showed a similar increase in myeloid infiltrate in the
290 tumors of FMT-vancomycin mice (Supplementary Fig. S8A), and the number of intratumor
291 CD4⁺ T and GZMB-expressing cells increased upon treatment with trastuzumab in only the
292 FMT-NoA group (Supplementary Fig. S8B and S8C).

293 **Gut microbiota modification affects intestinal mucosal immunity and systemic cytokine** 294 **circulation**

295 The gene expression profile was analyzed in the ileum and colon of mice treated with
296 vancomycin, and while significant changes were observed in both intestinal tracts, the ileum was
297 the most affected by vancomycin administration, with a larger number of differentially expressed
298 genes (DEG) (FDR<0.1) than the colon (Supplementary Fig. S9A and S9B). Functional analysis
299 of the DEG list from the ileum revealed enrichment of pathways related to antigen presentation
300 via MHC class II, response to IFN γ and IgGA production in NoA animals (Fig. 4A and Table
301 S2), as confirmed by the impaired response to interferons (IFN γ and type I IFN) and by the
302 reduced antigen presentation machinery highlighted by GSEA analysis in vancomycin-treated
303 mice (Table S3). No statistically significant pathways emerged from the DEG list in colon
304 samples, while comparing NoA and vancomycin by GSEA revealed enrichment of pathways
305 related to the positive regulation of macrophage and myeloid cytokine production in the colon of
306 NoA animals (Table S4).

307 To link changes that occurred in the gut to systemic immune tone, a panel of 26 cytokines and
308 chemokines was measured in the plasma of NoA and vancomycin-treated mice (Fig. 4B). Most
309 of the cytokines were below the detection limit, while a trend of higher CCL11 and CCL7 or
310 lower CCL5 and IL12p70 levels in the vancomycin group than in the NoA group was found.
311 Interestingly, IL12p70 significantly increased upon trastuzumab administration in only NoA

312 mice, which likely reflects the activation status (CD86 expression) of DCs found in the tumor-
313 draining lymph nodes (dLNs) (Supplementary Fig. S9C and S9D). The functional role of
314 IL12p70 in our model with regard to trastuzumab efficacy was investigated in NoA mice: the
315 neutralization of IL12p70 through an anti-IL12p70 mAb impaired the antitumor activity of
316 trastuzumab, with a parallel significant decrease in NK cells recruitment within the tumor (Fig.
317 4C and D), while no impact on their activation, or CD4⁺ T cells, was observed (Supplementary
318 Fig. S10A and S10B). Conversely, the administration of recombinant IL12p70 (rIL-12p70) to
319 mice under vancomycin treatment restored the efficacy of trastuzumab (Fig. 4E), increasing NK
320 cells recruitment and basal activation (Fig. 4F; Supplementary Fig. S10C) in tumors. A similar
321 increase was observed for CD4⁺ T cells (Supplementary Fig. S10D). Unexpectedly, when CD4⁺
322 T cells were depleted in NoA mice before trastuzumab treatment, a slight improvement in anti-
323 HER2 mAb efficacy was observed (Supplementary Fig. S10E), suggesting that NK cells play a
324 major role in our model and that the microbiota-DC activation axis influences trastuzumab
325 efficacy by regulating NK cell activation and recruitment through an IL12p70-dependent
326 mechanism.

327 **The gut microbiota contributes to trastuzumab benefit in HER2-positive BC patients**

328 To translate our findings to the clinical setting, we analyzed 24 consecutive primary HER2-
329 positive BC patients who were treated with neoadjuvant therapy containing trastuzumab. Sixteen
330 patients experienced pCR and were considered responsive (R), while eight presented residual
331 disease at surgery (NR) (Table 1). To investigate the composition of the commensal microbiota,
332 DNA was extracted from stool samples collected before the beginning of trastuzumab treatment,
333 and the 16S rRNA gene was profiled. Metagenomic analysis was successfully carried out for 23
334 samples (R, n=16 and NR, n=7). α -Diversity analysis with the Chao1, Shannon and Simpson

335 indexes revealed significantly higher diversity in R patients than in NR patients (Fig. 5A). A
336 clustering effect between R and NR patients (ANOSIM $p=0.029$) (Fig. 5B) was shown by β -
337 diversity analysis; the higher PC1 values were, the larger the number of R patients. PAM50
338 molecular classification was applied to the GEP of tumor core biopsies (i.e., represented in the
339 PCoA plot as HER2-enriched (\square) or non HER2-enriched (Δ)), showing that microbiota
340 clustering was independent of the tumor molecular subtypes (Fig. 5B).

341 Differentially abundant bacterial taxa between R and NR were then investigated by LefSe.
342 Patients who achieved pCR were characterized by a microbiota enriched in bacteria from the
343 *Clostridiales* (i.e., *Lachnospiraceae*), *Bifidobacteriaceae*, *Turicibacteraceae* and *Bacteroidales*
344 (i.e., *Prevotellaceae* family) taxonomic orders, while the phylum *Bacteroidetes* (such as the class
345 *Bacteroidia*) was more abundant in NR patients (Fig. 5C). The link between patients' gut
346 microbiota and the response to trastuzumab was evaluated by FMT of fecal material from R
347 (n=5) and NR (n=4) patients into recipient mice (Fig. 5D). Notably, FMT-R mice benefitted the
348 most from anti-HER2 treatment (Fig. 5D; Supplementary Fig. S11A and S11B), recapitulating
349 the response observed in donor patients and strengthening the idea of direct involvement of
350 commensal bacteria in trastuzumab effectiveness.

351 Differences in the tumor immune infiltrate between R and NR were investigated by applying
352 immune signatures as a surrogate for immune cell infiltration to the GEP of tumor core biopsies.
353 No significant differences were observed when comparing the two groups; however, we found
354 that signatures significantly correlated with PC1 values, i.e., the main descriptor of β -diversity
355 separated R from NR according to the microbiota. In particular, a positive correlation between
356 gut microbiota composition and STAT1 metagene was found, and a trend was also observed for
357 the MHCII metagene (Supplementary Fig. S11C). Moreover, immune signatures related to

358 lymphocyte infiltration, B cells, activated CD4 T cells and activated DCs were found to be
359 significantly positively correlated with PC1 (Supplementary Fig. S11C). Similarly, immune
360 pathways related to interferon and IL12-NO were enriched in patients with higher PC1 values
361 (R), while non immune pathways such as electron transport chain, oxidative phosphorylation and
362 luminal genes were enriched in patients with lower PC1 values (mainly NR) (FDR<10%) (Fig.
363 5E). IL12 is one of the leading genes in these pathways, and although no differential IL12
364 expression was found between R and NR, its levels correlate with intestinal β -diversity (Fig. 5F),
365 emerging as a possible link between gut microbiota composition, tumor immune infiltration and
366 trastuzumab efficacy in patients.

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369

370 **Discussion**

371 This study provides evidence that the host gut microbiota composition plays a role in
372 trastuzumab efficacy. Vancomycin or streptomycin administration resulted in the complete
373 abrogation of tumor growth inhibition by trastuzumab. Despite the different mechanisms of
374 action of the two antibiotics, we found a similar decrease in bacteria belonging to the taxonomic
375 phyla *Clostridiales* (i.e., *Lachnospiraceae*), *Actinobacteria* (i.e., the *Coriobacteriaceae*
376 taxonomic family), *Turicibacteriaceae*, and *Bacteroidetes* (specifically, the family
377 *Prevotellaceae*) upon treatment with both antibiotics, raising the possibility that certain bacteria,
378 rather than the general diversity of the gut microbial community, may be of particular relevance
379 for trastuzumab therapeutic activity. The reduction in taxa belonging to the order *Clostridiales*,
380 specifically to the *Lachnospiraceae* family, can explain the reduction of butyrate, propionate and
381 acetate observed in antibiotic-treated mice; these compounds are usually exploited as a source of
382 energy by intestinal epithelial cells (IECs) to favor the maintenance of barrier stability. The
383 reductions in their concentrations not only reflect the disruption of the intestinal microflora that
384 occurs upon antibiotic administration but also result in the modulation of mucosal immunity
385 (38).

386 The existence of a gut microbiota/immune-mediated trastuzumab activity axis was strongly
387 supported by the lower basal activation of tumor-infiltrating NK and CD4+ T cells as well as by
388 a significant decrease in the recruitment of CD4+ T lymphocytes and GZMB+ cells (mainly NK
389 cells) within the tumor upon trastuzumab treatment in antibiotic-treated mice. These
390 modifications of the tumor immune microenvironment induced by the alteration of the gut
391 microbiota, rather than its impact on tumor growth (39), are likely to be the reason for a reduced
392 response to trastuzumab treatment, as tumor proliferation has never been associated with the

393 efficacy of anti-HER2 monotherapy in patients (40;41). Remarkably, by transferring fecal
394 material from NoA and vancomycin-treated mice into recipient mice, the response to
395 trastuzumab and the tumor immune infiltrate scenario were recapitulated in FMT mice, revealing
396 a cause-effect link between the gut microbiota and immune-mediated trastuzumab activity.
397 Consistent with the diminished expression of MHC class II molecules on the IEC surface after
398 microbiota depletion by antibiotics or germ-free conditions (42), pathways such as antigen
399 presentation and processing were diminished in the ileum of vancomycin-treated animals.
400 Moreover, the enrichment in NoA animals of pathways associated with the inflammatory
401 response and type I interferons is in line with the capability of commensal bacteria to instruct
402 mononuclear phagocytes, such as DCs, to maintain a proper tone at steady state (43), which
403 renders them ready for prompt activation upon stimulation. While further studies are needed to
404 better understand the mechanisms through which gut bacteria sustain a DC tone favorable for
405 trastuzumab efficacy, we found an increase in circulating IL12p70 upon trastuzumab treatment
406 in only NoA-responsive mice, likely reflecting DC activation in the lymph nodes, supporting the
407 causal involvement of this cytokine in the gut microbiota-mediated regulation of trastuzumab
408 antitumor activity, as previously shown in the context of CTLA-4 and PD-1 blockade (11;12).
409 Similar to vancomycin, no modulation of IL12p70 upon trastuzumab was observed in
410 streptomycin-treated mice, strengthening evidence for the role of this cytokine. IL12p70 is a Th1
411 cytokine released by microbiota sensing, activated APCs to induce the effector functions of T
412 and NK cells (44), and it has been previously described to have an adjuvant effect on
413 trastuzumab activity in mice (22). The antithetical modulation of NK cells tumor infiltration by
414 an anti-IL12p70-depleting mAb and rIL12p70 strongly supports the key role of IL12p70 in
415 mediating the gut microbiota regulation of NK cells expansion and activity in trastuzumab-

416 coated cells in our *in vivo* model. The administration of rIL12p70 modulated CD4⁺ T cells in
417 vancomycin-treated mice, and although CD4⁺ T cells were dispensable for trastuzumab activity
418 in our model, this modulation highlights an alternative way through which gut bacteria may
419 affect the trastuzumab response, increasing CD4⁺ priming in the ileum (42), and effector activity
420 via IL12 secreted by DCs (12) , particularly in patients where CD4⁺ T cells have been reported
421 to be relevant for trastuzumab activity (37;45;46). Dysregulation of T cell activity may also
422 occur in the colon as a consequence of antibiotic-induced disruption of macrophage homeostasis
423 (47), as we observed in the colon of vancomycin-treated mice.

424 The clinical relevance of these findings is supported by the results obtained in HER2-positive BC
425 patients treated with trastuzumab-containing therapy in the neoadjuvant setting. Similar to
426 vancomycin-treated mice, compared to that of R patients, the gut microbiota of NR patients was
427 characterized by lower α -diversity and higher abundance of *Bacteroides*. In particular, as
428 occurred in mice under antibiotic treatment, low abundance of members of the *Lachnospiraceae*,
429 *Prevotellaceae*, *Actinobacteria* (i.e., *Bifidobacteriaceae*), *Turicibacteriaceae* and *Desulfovibrio*
430 taxonomic families emerged in the gut microbiota of NR women, highlighting the relevance of
431 these bacteria for trastuzumab benefit and encouraging further studies to understand whether
432 they have a direct role in the antibody mechanism of action. Although 16S rRNA gene
433 sequencing did not allow us to identify bacteria to the species level, similarities with published
434 studies on the response to immunotherapy were observed, as bacteria belonging to
435 *Lachnospiraceae* (order *Clostridiales*) and *Bifidobacteriaceae* are more abundant in patients
436 responsive to anti-PD1 treatment, while *Bacteroidales* characterized the microbiota of NR
437 patients, as found in (15).

438 Microbial β -diversity segregated patients according to the response to treatment, and the absence
439 of an association between microbiota and HER2-enriched tumor intrinsic subtype suggests that
440 the patients' gut microbial ecosystem contributes to therapy benefit independently of tumor
441 intrinsic subtype. This evidence might explain why not all BCs scored as HER2-enriched benefit
442 from treatment, underlining how the gut microbiota of HER2-positive BC patients can add
443 relevant information for the prediction of trastuzumab efficacy independent of tumor molecular
444 characteristics. In addition to representing a potential predictive biomarker, our data show that
445 the gut microbiota plays an active role in trastuzumab activity, as demonstrated by transferring
446 fecal material from R and NR donors into "avatar mice" that recapitulated the response observed
447 in the clinical setting.

448 Notably, the correlation of microbial β -diversity with immune pathways relevant for immune cell
449 activation and trastuzumab activity (i.e., interferon; IL12-NO; STAT1 metagene) (36;41) found
450 in basal tumor biopsies supports the influence of the gut microbiota in shaping pre-existing
451 tumor immune infiltrate. In addition, correlations with lymphocyte infiltration (i.e., activated
452 CD4+ T cells) and activated DCs suggest the involvement of the microbiota-sensing APCs/IL12
453 axis in HER2-positive BC patients. Based on the marked differences that emerged in the tumor
454 immune infiltrate upon trastuzumab treatment in our *in vivo* experiments, and based on the
455 immunological changes observed in patients according to response to treatment after a single
456 dose of trastuzumab (41;48), it is likely that the evaluation of local and systemic immune
457 modulation upon brief exposure to trastuzumab would highlight a stronger association with gut
458 microbiota characteristics in patients.

459 The direct involvement of the gut microbiota in trastuzumab activity sets the starting point for
460 the exciting possibility of manipulating gut bacteria to improve the success of anti-HER2

461 treatment. In this context, the low abundance of *Clostridiales* commonly found in antibiotic-
462 treated mice and in NR patients suggests that a dietary intervention that increases the amount of
463 fiber or is supplemented with favorable prebiotics may boost immune-mediated trastuzumab
464 activity. This intervention has also been under investigation for immune checkpoint inhibitor
465 agents (49) based on a similar reduction in bacteria associated with fiber consumption found in
466 NR patients (15). Further studies and larger clinical cohorts are needed to understand whether
467 bacteria specifically related to the trastuzumab response exist or whether *Clostridiales* and
468 *Bacteroidales*, which were found to be enriched in the gut of patients responsive and
469 unresponsive to immune checkpoint blockade, respectively(15), can also be considered overall
470 ‘good’ and ‘poor’ bacteria for trastuzumab activity. In an era in which dual anti-HER2
471 combinations are becoming a common clinical practice (50), we believe that knowing the
472 favorable gut microbiota composition for trastuzumab efficacy could impact de-escalating
473 strategies in terms of single agent versus dual blockade, minimizing overtreatment in patients
474 who would benefit from single-agent trastuzumab treatment.

475

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484 **Author contributions:**

485 MDM, ABa, ET, and TT conceived and designed the study. ABo and FC collected human
486 materials and data. MDM, VR, SA, BB, EF, FB performed the experiments. BB, ABe and CT
487 analyzed and interpreted IHC data. LDC, performed and analyzed GEP. MDM, GG, SG, ET, and
488 TT analyzed and interpreted the data. MDM, ET, and TT wrote the manuscript. All authors
489 critically revised the manuscript.

490 **Data and materials availability:** All data related to this study are present in the paper or the
491 Supplementary Materials. Gene expression data of the tumor core biopsies and mice intestine are
492 available in the GEO repository (GSE149283 and GSE149712).

493

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Table 1. Clinical characteristics of the patients analyzed in this study.

	R, n=16	NR, n=8	p-value*
Age (years)			0.155 [‡]
Median (range)	54 (36-80)	61 (41-76)	
Tumor size^c			1.00
≤ 2 cm	6 (43%)	4 (50%)	
>2 cm	8 (57%)	4 (50%)	
Lymph node status			0.064
Negative	3 (19%)	5 (63%)	
Positive	13 (81%)	3 (37%)	
ER status			0.657
Negative	7 (44%)	2 (25%)	
Positive	9 (56%)	6 (75%)	
PGR status			0.189
Negative	7 (44%)	1 (12%)	
Positive	9 (56%)	7 (88%)	
Grade			1.00
I and II	8 (50%)	4 (50%)	
III	8 (50%)	4 (50%)	

648 ER, estrogen receptor; PGR, progesterone receptor; R, pathological complete response; NR, non-responsive; ^cR,
 649 n=14 and NR, n=8. *, p-value of Fisher's exact test. [‡], p-value of the Mann-Whitney test
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