

1 **Ecological and molecular perspectives on responders and non-responders to probiotics**
2 **and prebiotics**

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12

13 **Abstract**

14

15 Bifidobacteria are widely used as a probiotic for their health-promoting effects. To
16 promote their growth, bifidogenic prebiotics, including human milk oligosaccharides (HMOs),
17 have been added to supplements and infant formula. However, the efficacy of both probiotic and
18 prebiotic interventions is often debated, as clinical responses vary significantly by case. Here,
19 we review clinical studies that aimed to proliferate human-residential *Bifidobacterium* (HRB)
20 strains in the gut, and we highlight the difference between responders and non-responders to
21 such interventions through an ecological, niche-based perspective and an examination of the
22 prevalence of genes responsible for prebiotic assimilation in HRB genomes. We discuss the
23 criteria necessary to better evaluate the efficacy of probiotic and prebiotic interventions and the
24 recent therapeutic potential shown by synbiotics.

25 **Introduction**

26

27 The human gut microbiota plays an important role in human health and disease. An
28 increasing body of work links the gut microbiota with several disease states [1–4]. As a result,
29 therapeutic interventions aimed at regulating the gut microbiota, such as probiotics (exogenously
30 administered microorganisms) and prebiotics (non-digestible compounds by the host that promote
31 the growth of gut microbes), have become increasingly popular and represent increasingly
32 marketable and growing industries [5,6]. Here, probiotics will refer to exogenously administered
33 strains to differentiate them from autochthonous strains already residing in the gut, and the terms
34 used in this review are summarized in Table 1. In this review, we examine the efficacy of both
35 probiotics and prebiotics in several clinical studies from an ecological and molecular perspective.
36 Specifically, we focus on human-residential bifidobacteria, a commonly used probiotic taxon as
37 model organisms and the prebiotics that promote their growth.

38 Bifidobacteria are Gram-positive and anaerobic bacteria that were first isolated from
39 breastfed infant feces [7], and several different species have been isolated from the gut of a variety
40 of animals, ranging from insects to mammals [8,9]. With a few exceptions, bifidobacteria show
41 strong exclusivity and adaptation to their specific hosts [10], and an evolutionary analysis between
42 gut microbes and hominids has shown that bifidobacteria have cospeciated with their respective
43 hosts over the last 15 million years [11]. We focus on bifidobacteria that naturally occur in humans
44 (hereinafter referred to as human-residential bifidobacteria (HRB), summarized in Table 2). The
45 type of HRB strains found varies between life stages (infant- and adult-type), suggesting that
46 bifidobacterial adaptation to the human gut environment may be mediated by diet (host- and plant-
47 derived glycans).

48 The presence of indigenous bifidobacteria is correlated with a variety of health effects,

49 such as the development of the immune system [12], prevention of allergy [13], and reduction of
50 gut inflammation [14–17]. As a result, bifidobacteria are often administered as probiotics to pre-
51 term infants who are expected to lack bifidobacteria [18–21]. Additionally, there has been an
52 increased effort to add bifidogenic prebiotics, such as HMOs, to infant formula. HMOs are
53 resistant to pancreatic digestion [22] and act as natural prebiotics for indigenous bifidobacteria
54 [23]. Currently, HMOs such as 2'-fucosyllactose (2'-FL), 3-fucosyllactose (3-FL),
55 lactodifucotetraose (LDFT), lacto-*N*-tetraose (LNT), and lacto-*N*-neotetraose (LNnT) are
56 synthesized by engineered *Escherichia coli* strains and generally considered safe by the US Food
57 and Drug Administration (FDA). Other prebiotics such as fructooligosaccharides (FOSs) and
58 galactooligosaccharides (GOSs), which are enzymatically synthesized from sucrose and lactose,
59 respectively, are also used to promote growth of bifidobacteria [24].

60 Despite increasing reports of health benefits conferred by probiotic bifidobacteria and
61 bifidogenic prebiotics, studies report conflicting results, and their efficacy shows high situational
62 variability. In certain cases, human trials using probiotic preparations are treated as a “black box,”
63 and the mechanisms that differentiate responders from non-responders to such microbiota-based
64 therapies remain elusive. We propose that a combined perspective utilizing both an ecological
65 framework and an understanding of molecular mechanisms is necessary to successfully
66 implement interventions aimed at modulating the gut microbiota, with the ultimate purpose to
67 improve health.

68

69 *A combined niche- and gene-based framework*

70

71 One of the long-standing issues with probiotics relates to their limited persistence in the
72 human gastrointestinal tract. Although stable colonization is not necessarily required for

73 probiotics to exert benefits on host health, a substantial population must, at least transiently,
74 establish for them to have a metabolic impact on the host and the resident gut microbiota. We
75 propose that an applied framework based on the modern species coexistence theory could help
76 predict colonization success, as summarized in Figure 1 [25,26]. Theory suggests that
77 colonization outcomes are determined by a combination of niche and relative fitness differences
78 between the exogenously administered probiotic strain (colonizer) and the indigenous baseline
79 microbiota (autochthonous taxa) [27]. According to this framework, higher niche difference (ND)
80 allows for niche differentiation between the invading and autochthonous taxa, reduces
81 competition, and ultimately increases the probability of colonization success. Within the gut
82 microbial community, differential resource specialization by gut microbes and the spatial
83 heterogeneity within the gastrointestinal tract [28] and the mucus layer [29,30] can allow for gut
84 microbes to reduce niche overlap. In the presence of increasing niche overlap and competition for
85 resources, relative fitness differences (RFD) also influence the colonization outcome. As high
86 RFD would exclude species with lower fitness in a given environment, the exogenously
87 administered probiotic strain must be better adapted to the gut environment to colonize.

88 While bifidogenic prebiotics are predicted to provide a fitness advantage to bifidobacteria,
89 the response of bifidobacteria to prebiotics varies significantly not only at the species level but
90 also at strain level. In the prebiotics section of this review, we propose that the presence or absence
91 of certain prebiotic-utilization genes and the strain-level genotypic diversity may explain the
92 difference between responders and non-responders to probiotics and prebiotics. While the
93 addition of bifidogenic prebiotics may shift the effect of ND and RFD in favor of probiotics,
94 predicting the responder status to such therapeutic interventions requires an understanding of
95 prebiotic consumption behavior of autochthonous/probiotic bifidobacteria at the genotype level.

96 In the following sections, we examine the role played by niche and fitness differences

97 and their impact on the colonization success of exogenously administered probiotic HRB strains
98 (Table 3), as well as the prevalence of genes responsible for prebiotic utilization in HRB strains
99 (Table 4). We highlight studies that examine changes in the gut microbiota composition as a result
100 of probiotic and prebiotic interventions and show that for both probiotics and prebiotics,
101 evaluation of efficacy can only be described within the context of the resident gut microbiota.
102 Here, we argue that predicting the clinical responses to such interventions requires a combined
103 understanding of the ecological and molecular mechanisms.

104

105 **Probiotic Bifidobacteria**

106

107 In this section, we consider individuals to be “responders” to probiotics if successful
108 colonization of the administered strain is observed. The inability of bifidobacteria and other
109 probiotic strains to stably colonize the adult gut microbiota is a long-standing issue in probiotic
110 therapy [31]. Compared to the infant gut microbiota, the adult gut microbiota is more
111 taxonomically diverse, stable [32], and resistant to colonization [33]. However, a study by
112 Maldonado-Gómez et al. [34] using *Bifidobacterium longum* AH1206 showed that colonization
113 is possible as long as there is niche availability (Table 3). In that study, AH1206 was orally
114 administered to adults, and they reported long-term (at least 6 months) colonization by AH1206
115 in approximately 30 % of the subjects. In AH1206-responders, the baseline gut microbiota before
116 probiotic administration had a low abundance of indigenous *B. longum* and underrepresentation
117 in certain carbohydrate utilization genes. While AH1206 would be otherwise competitively
118 excluded due to high RFD in favor of the autochthonous microbiota, colonization is possible if
119 taxa that occupy the same niche (conspecifics or taxa that are superior competitors for the same
120 resources) are absent in subjects responding to AH1206 administration. By utilizing a strain-

121 specific approach, the authors were able to show that colonization resistance in the adult gut can
122 be overcome with sufficiently high niche difference between exogenously administered probiotics
123 and the resident microbiota.

124 In contrast to the stable microbial community in the adult gut, the infant gut microbiota
125 is in rapid development. The infant gut is generally considered sterile at birth, and more open
126 niches are available during the early stages of community assembly. Earlier arriving species gain
127 an advantage due to priority effects, in which the order and timing of species arrival dictate
128 community composition (Table 1), as they colonize the available niches first [35,36]. Therefore,
129 the timing of probiotic administration becomes especially important, as seen in the administration
130 of *Bifidobacterium breve* strains in preterm infants. For example, a study by Costeloe et al. [37]
131 found that the administration of *B. breve* BBG-001 to preterm infants did not significantly reduce
132 the incidence of necrotizing enterocolitis (NEC), and colonization by bifidobacteria was not
133 observed (Table 3). In that study, the median age at the first dose was approximately 44 hours.
134 However, studies in which the first dose of *B. breve* (YIT4010 [38] and M-16V[39]) was
135 administered within a few hours of birth showed increased gut colonization by bifidobacteria
136 (Table 3). Taken together, these results suggest that the timing of arrival plays a significant role
137 in gut microbiota assembly and can influence host response to probiotic administration. Indeed,
138 when a study by Li et al. [40] compared the timing of administration of *B. breve* (strain
139 unspecified), they reported increased effectiveness when the first dose was administered a few
140 hours after birth compared to when administered more than 24 hours after birth. Furthermore, a
141 study by Horigome et al. [41] reported a decreased abundance of phylum Proteobacteria in low
142 birth weight infants given M-16V, suggesting that preemptive colonization by bifidobacteria can
143 competitively exclude undesirable taxa, and facilitative priority effects can enhance the growth
144 of other *Bifidobacterium* species. Altogether, these studies show that in the stable adult gut, the

145 availability of vacant niches is determined by the composition of the resident gut microbiota. On
146 the other hand, the infant gut microbiota is in its developmental stage and niche availability is
147 significantly affected by the timing of arrival, increasing the impact on community structure.

148 In addition to the timing of administration, the presence of prebiotic substances influences
149 host response to probiotics. A study by Underwood et al. [42] using M-16V strain found that
150 responders were fed breastmilk that contained more non-fucosylated and/or non-sialylated neutral
151 (undecorated) HMOs, such as lacto-*N*-tetraose (LNT) (Table 3). Only a limited subset of *B. breve*
152 strains can utilize fucosylated HMOs, while LNT assimilation ability is conserved within *B. breve*
153 strains. Therefore, most likely, the HMOs available in the breastmilk fed to non-responder infants
154 could not be consumed by the bifidobacteria present in those individuals. Indeed, a study by
155 Thongaram et al. [43] showed that M-16V cannot utilize 2'-FL. These findings indicate that the
156 fitness advantage conferred to probiotic bifidobacteria is highly dependent on the presence of
157 HMO-utilization genes, which will be discussed in the prebiotics section of this review. A separate
158 study administered *B. infantis* EVC001, a strain that can utilize a wide range of HMOs (both
159 decorated and undecorated), to breastfed infants. They observed the long-term persistence of this
160 strain in addition to a significant reduction in the amount of HMOs remaining in feces, even after
161 the cessation of probiotic administration, suggesting that persistence was achieved through HMO
162 consumption (Table 3) [44]. Additionally, a study by O'Brien et al. [45] reported long-term
163 colonization by *B. infantis* EVC001 that persisted for at least one year postpartum, due to the
164 combination of early probiotic administration and breastmilk. This is further illustrated by Duar
165 et al. [46], who performed an *in vivo* competition experiment in two breastfed infants with two *B.*
166 *infantis* strains. They found that *B. infantis* EVC001 successfully colonized the gut of both infants,
167 and outcompeted *B. infantis* NLS, a strain that has a genetic lesion in an HMO-utilization gene
168 cluster (Table 3). Together, these studies illustrate that prebiotics like HMOs can confer a fitness

169 advantage to probiotic strains and facilitate colonization in the infant gut, but only if the genes to
170 utilize them are also present in the genomes.

171 Predicting responses to probiotics requires an understanding of both niche availability
172 within the resident gut microbiota and the relative fitness of the probiotic strain. The probability
173 of colonization success increases with high niche differences and the presence of prebiotics such
174 as HMOs can shift RFD to favor growth of probiotics. However, prebiotic supplementation is
175 effective only when the necessary response genes are present, and the presence of those genes is
176 highly strain-dependent. In the following section, we focus on bifidogenic prebiotics and the
177 prevalence of response genes in HRB strains.

178

179 **Bifidogenic Prebiotics**

180

181 A growing body of work provides evidence of the benefits of bifidogenic prebiotics, but
182 the criteria that differentiate responders from non-responders has not been well understood until
183 recently. Two studies showed that the administration of two HMOs (2'-FL and LN_nT) to healthy
184 infants [47] and adult patients with irritable bowel syndrome (IBS) [48] increased the abundance
185 of bifidobacteria in some subjects, but there was no clear baseline microbiota signature that was
186 predictive of responder status. In both instances, the baseline microbiota was profiled at the
187 species level, and the presence of genes responsible for 2'-FL and LN_nT assimilation could not
188 be confirmed. We argue that species-level information alone cannot predict responder status to
189 prebiotics, and in-depth genotype analysis of the baseline microbiota is necessary.

190

191 *2-Fucosyllactose and Lacto-N-neotetraose*

192

193 While 2'-FL and LN_nT have been added to commercial infant formula in several
194 countries, the ability to utilize these two HMOs is highly strain-specific. With regards to 2'-FL,
195 a trisaccharide comprised of lactose with an α -linked fucose residue, an ATP-binding cassette
196 (ABC)-type transporter responsible for its uptake was identified in *B. longum* [49] and *B. breve*
197 [50]. Further work by Sakanaka et al. [51] showed that *B. infantis* ATCC 15697^T possesses two
198 functionally overlapping but distinct paralogs of this transporter (FL transporter-1 and FL
199 transporter-2). Both paralogs import 2'-FL, although FL transporter-2 has wider substrate
200 specificity for fucosylated HMOs. In this study, the abundance of homologs for the substrate-
201 binding protein (SBP) of this transporter in fecal samples was positively correlated with the
202 abundance of bifidobacteria in breastfed infants and negatively correlated with the concentration
203 of the substrate HMOs remaining in feces. These results strongly indicate that the presence of
204 this transporter could predict response status to 2'-FL. While the presence of this transporter is
205 limited to the genus *Bifidobacterium*, the occurrence of this transporter varies considerably by
206 strain (Table 4). Specifically, homologs of the FL transporter-1 SBP were found in 4 % of *B.*
207 *breve* strains and 57 % of *B. infantis* strains (Table 4) [51,52]. Homologs for the FL transporter-
208 2 SBP were more widely distributed within bifidobacteria strains, with its prevalence of 8 % of
209 *B. breve*, 100 % of *B. kashiwanohense*, 86 % of *B. infantis*, 3 % of *B. longum*, and 13 % of *B.*
210 *pseudocatenulatum* strains [51,52]. We do note that *B. bifidum* does not possess this transporter
211 [53] as it extracellularly degrades 2'-FL to assimilate lactose, without utilizing liberated fucose
212 [54].

213 LN_nT, a tetrasaccharide comprised of galactose, *N*-acetylglucosamine, and glucose
214 joined by β -linkages, is imported by a similar mechanism by the LN_nT-SBP, a homolog of NahS
215 that was first identified in *B. breve* UCC2003 [55]. The LN_nT-SBP homolog is conserved in all
216 analyzed strains of *B. breve* (Table 4) [52], and most strains are capable of growing on LN_nT

217 [56]. About 48 % of *B. infantis* strains possess the LN_nT-SBP homolog (Table 4).

218 The transporters for the utilization of 2'-FL and LN_nT are limited to infant gut-
219 associated species, suggesting adaptation by bifidobacteria to the breastfed infant gut
220 environment. However, as mentioned above, their occurrence is not ubiquitous and highly
221 strain-dependent. Therefore, in the absence of strains with the necessary transporters,
222 individuals are unlikely to respond to such prebiotic therapies. While the addition of 2'-FL and
223 LN_nT to formula does provide certain benefits, not all bifidobacteria are capable of utilizing
224 HMOs currently available in infant formula. As more types of HMOs receive approval for
225 commercial use, the use of a wider variety of native HMO molecules with a composition that
226 mimics natural breastmilk may further promote the efficacy of HMOs as prebiotics. In this
227 regard, LNT could be the most effective prebiotic, as almost all infant-type HRB strains isolated
228 to date are positive for LNT assimilation [57].

229

230 *Galactooligosaccharides*

231

232 Galactooligosaccharides (GOSs), which are widely used as a prebiotic, are a mixture of
233 mono-, di-, and trigalactolylactose (GL) species with galactose moiety(ies) attached by β-
234 1,3/4/6-linkage(s) and produced from lactose through the transgalactosylation activity of β-
235 galactosidases [58]. They also have been shown to effectively increase the abundance of
236 bifidobacteria in the gut [59,60]. Furthermore, in a cohort of infants from the United States,
237 there was a strong positive correlation between the abundance of GOS utilization genes and
238 bifidobacteria in feces [52,61,62]. GOS utilization genes are highly conserved in HRB strains
239 (homologs for 3'-GL utilization is highly conserved in infant type HRB strains, and homologs
240 for 4'-GL / 6'-GL utilization genes are conserved both infant- and adult-type strains [52]) (Table

241 4). These results provide further support for the use of GOSs as bifidogenic prebiotics in infant
242 formula, although its ability to selectively promote the growth of bifidobacteria is slightly lower
243 than that of HMOs.

244

245 *Lactulose*

246

247 The importance of the genotypic composition of the resident gut microbiota to predict
248 responder status to prebiotics is highlighted in a recent study by Yoshida et al. [63], which
249 focused on lactulose. Lactulose is a disaccharide composed of galactose and fructose produced
250 through the alkaline isomerization of lactose, is also used as a bifidogenic prebiotic [64,65]. In a
251 previously published clinical study [65], healthy Japanese adult women were given 2 g of
252 lactulose daily for 2 weeks, and they found that the fold change in *Bifidobacterium* abundance
253 showed high variance (0.38 to 48.11). To examine the difference between responders and non-
254 responders to lactulose ingestion, the study by Yoshida et al. [63] examined and identified the
255 gene responsible for lactulose uptake by bifidobacteria, which was revealed to be a solute-
256 binding protein (SBP), termed LT-SBP. An examination of the baseline microbiota of subjects
257 before lactulose ingestion showed that there was a marked increase in *Bifidobacterium* in
258 subjects with 10^7 – 10^9 copies of the total LT-SBP genes per gram of feces. It is interesting to note
259 that responses to lactulose were found in individuals with a specific range of LT-SBP gene copy
260 abundance. Changes in *Bifidobacterium* abundance were not observed in subjects who had more
261 than 10^9 copies of LT-SBPs per gram of feces, possibly because the dose of lactulose was not
262 sufficient to further increase *Bifidobacterium* abundance, and available niches were all
263 occupied. On the other hand, responses were not observed in individuals with fewer than 10^7
264 copies per gram of feces, at which the relative abundance of lactulose-utilizing bifidobacteria

265 was below detection level and estimated to be < 0.001 %. This suggests that there is a minimum
266 population size required to have a significant effect within the gut microbiota, and with an
267 insufficient population size, lactulose-utilizing bifidobacteria may have been out-competed by
268 other taxa with moderate ability of assimilating lactulose. Through analyzing the prevalence and
269 abundance of bifidobacterial LT-SBP homologs in the gut microbiota (Table 4), Yoshida et al.
270 [63] illustrate how responder status can be predicted by analyzing certain target genes within the
271 gut microbiota.

272

273

274 *Arabinoxylan and Type-II Arabinogalactan*

275

276 Bifidobacteria also possess the genes to utilize plant-derived glycans such as
277 arabinoxylan and arabinogalactan, and recent studies have identified the genes responsible for
278 their utilization by bifidobacteria.

279 Arabinoxylan (AX) is found in cereal grains, such as wheat, rye, barley, oats, rice, and
280 sorghum. It represents a major hemicellulose component in the cell wall of plants and is
281 composed of a β -1,4-linked xylose polymer partially decorated with α -L-arabinofuranosyl
282 residues at the O-2 and/or O-3 position [66]. They are further hydrolyzed into arabinoxylan
283 hydrolysates by gut bacteria [67]. Such AX oligosaccharides have been reported to promote the
284 growth of bifidobacteria in human clinical trials [68], but the ability to utilize them is also
285 highly strain-dependent [69]. A study by Saito et al. [70] with *B. pseudocatenulatum* YIT 4072^T
286 identified 3 transporters responsible for AX oligosaccharide utilization and found that the SBPs
287 of these transporters have high affinities for AX oligosaccharides. Homologs of the three
288 transporters for AX oligosaccharide utilization were mostly found in adult-type bifidobacteria

289 (*B. adolescentis*, *B. catenulatum* subsp. *catenulatum*, *B. longum*, *B. pseudocatenulatum*)
290 [70,71], with AXBP3 being the most prevalent (22–92 % in infant type HRB, 50–100 % in adult
291 type HRB; Table 4), indicating an adaptive response of bifidobacteria as the host diet changes
292 from infancy to adulthood.

293 Type-II arabinogalactan (AG), a component of gum arabic widely used as a food
294 additive, was shown to be bifidogenic in a clinical trial [72]. A study by Sasaki et al. [73]
295 focused on the gum arabic arabinogalactan protein (AGP), which is preferentially utilized by
296 specific bifidobacterial strains that possess a 3-*O*- α -D-galactosyl- α -L-arabinofuranosidase
297 (GAfase). They isolated GAfase from *B. longum* JCM 7052 and identified it as an important
298 genetic element in the degradation of AGP. GAfase is a cell surface-anchored enzyme that
299 removes α -D-Galp-(1→3)-L-Ara disaccharide from AGP, and once α -D-Galp-(1→3)-L-Ara is
300 removed, it is metabolized by type-II AG degradative enzymes [74]. However, these enzymes
301 alone cannot act on intact gum arabic AGP in the absence of GAfase. Therefore, although type-
302 II AG degradative enzymes are found in a wider range of bifidobacterial strains, the presence of
303 GAfase is the predictive factor that determines responder status to gum arabic AGP. Homology
304 searches revealed that similar to the distribution of AX oligosaccharide utilization genes,
305 GAfase was generally conserved in adult-type bifidobacteria [73]. However, its prevalence is
306 considerably lower (7–23 %; Table 4) than that of AX transporters, which may explain its
307 inability to increase bifidobacterial abundance in previous studies [75].

308

309 *Raffinose*

310

311 Raffinose is a non-digestible oligosaccharide found in a wide variety of plants (sugar
312 beet, sugar cane, cabbage, potato, grape, wheat, barley, corn, legumes), and a prebiotic

313 commercially available in Japan, the EU, and recently the US. It is comprised of galactose,
314 glucose, and fructose residues, and the linkage between galactose and glucose is hydrolyzed by
315 1,6- α -galactosidase [76]. O'Connell et al. [77] identified a raffinose-binding protein (*rafB*) from
316 *B. breve* UCC2003, and homologs of this gene were conserved in both infant- and adult-type
317 HRB strains (Table 4), indicating its potential as a bifidogenic prebiotic.

318

319 **Synbiotics**

320

321 Given that prebiotics can shift RFD and ND in favor of probiotic colonization, the
322 combination of probiotics and prebiotics, termed synbiotics, are expected to improve the efficacy
323 of probiotic therapy. For example, a study showed that when an exogenous, porphyrin-utilizing
324 *Bacteroides* strain was administered with porphyrin, a new niche was created and allowed for
325 stable colonization [78]. Therefore, synbiotics are predicted to synergistically improve probiotic
326 efficacy and colonization success by providing a selective fitness advantage to the probiotic strain.
327 Two studies have tested the synergistic effect of administering *B. breve* M-16V with short-chain
328 GOS (scGOS) and long-chain FOS (lcFOS) to two different age groups. In infants, the increase
329 in bifidobacterial abundance was aided by the presence of scGOS and lcFOS, and a reduction in
330 pH was also observed [79]. Synbiotics also reduced colonization by pathogens such as
331 *Clostridioides difficile*, setting the stage for the development of a healthy gut microbial
332 community. While the increase in bifidobacteria can be expected in infants as the gut microbiota
333 is still developing, responses to synbiotics were also observed in young children (1–3 years old)
334 [80]. These results show that the combined use of probiotics with the appropriate prebiotics can
335 facilitate probiotic colonization, perhaps even in established communities, by shifting ND and
336 RFD in favor of colonization by probiotic strains.

337

338 **Conclusions**

339

340 The efficacy of both probiotics and prebiotics has been recently debated. Here, we
341 synthesized ecological and molecular perspectives that can dictate responder status to probiotic
342 and prebiotic interventions. From an ecological viewpoint, an understanding of the relative niche
343 and fitness difference between the exogenous probiotic strain and the diversity of the indigenous
344 gut microbiota can help predict colonization success. Strain-level, genomic knowledge of
345 probiotics and the baseline microbiota from a metabolic perspective can elucidate fitness
346 differences between the two. This can then inform the selection of effective prebiotics that can
347 promote the growth of target bifidobacteria, as well as help tailor precision therapy to better suit
348 individual needs. Prebiotics can provide a fitness advantage to indigenous taxa that possess an
349 adequate abundance of target genes, and also serve as a substrate for probiotics, which can then
350 modulate the intestinal metabolic profile and ultimately influence host health. We note that further
351 work is necessary to identify the prevalence and abundance of prebiotic-utilization genes in non-
352 target taxa to improve the precision of prebiotic therapy. Finally, recent advances in synbiotics
353 show that the combined use of probiotics and prebiotics are effective in improving probiotic and
354 prebiotic efficacy. As responder status is highly individualized, a higher resolution and strain- and
355 genotype-level analysis of both probiotics and the baseline gut microbiota would provide
356 improved predictive power regarding responder status to probiotics and prebiotics.

357

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359

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362 [81-89]

363

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Table 1. List of terms and definitions used in this study.

Terms	Definition
Probiotics	Live microorganisms when administered in adequate amounts, confer a health benefit on the host [81].
Prebiotics	Non--digestible compound that, through its metabolization by microorganisms in the gut, modulates the composition and/or activity of the gut microbiota, thus, conferring a beneficial physiological effect on the host [82].
Human Residential Bifidobacteria (HRB)	Bifidobacterial species that are naturally found in the human gastrointestinal tract, with two major groups (infant-type and adult-type, with some species belonging to both groups) [83].
Colonization	When a species has successfully occupied an ecological niche and persists, in which population birth rate (growth) is greater than or equal to death rate (wash-out).
Niche Difference (ND)	The difference in resource requirements of each species (high ND indicates low overlap) [27].
Relative Fitness Difference (RFD)	The difference in competitive ability and advantage between two species in a given environment [27].
Priority Effects	The effect of species arrival order on species interactions and community composition [36].
Synbiotics	A mixture of probiotics and prebiotics that benefits the host by improving the survival and implantation of live microbial dietary supplements in the gastrointestinal tract, by selectively stimulating the growth and/or by activating the metabolism target health-promoting bacteria, and thus improving host welfare [84].

Table 2. List of human residential *Bifidobacterium* (HRB) strains

Human Residential <i>Bifidobacterium</i> (HRB) Strain	HRB Type	Type Strain Isolation Source
<i>Bifidobacterium adolescentis</i>	Adult	Adult intestine [85]
<i>Bifidobacterium bifidum</i>	Adult/Infant	Infant feces [7]
<i>Bifidobacterium breve</i>	Infant	Infant feces [85]
<i>Bifidobacterium catenulatum</i>	Adult	Adult intestine [86]
<i>Bifidobacterium catenulatum</i> subsp. <i>kashiwanohense</i> (<i>B. kashiwanohense</i>)	Infant	Infant feces [87]
<i>Bifidobacterium dentium</i>	Adult (Oral)	Dental cavities [86]
<i>Bifidobacterium gallicum</i>	Adult	Adult intestine [88]
<i>Bifidobacterium longum</i> subsp. <i>infantis</i> (<i>B. infantis</i>)	Infant	Infant intestine [85]
<i>Bifidobacterium longum</i> subsp. <i>longum</i> (<i>B. longum</i>)	Adult/Infant	Adult intestine [85]
<i>Bifidobacterium pseudocatenulatum</i>	Adult/Infant	Infant feces [89]

Table 3. Ecological mechanisms that allow for colonization by probiotic human-residential *Bifidobacterium* (HRB) strains in the human gut.

Probiotic Strain	Clinical Conditions	Desired Clinical Response	Primary Outcome	Proposed Response Mechanism	Reference
<i>B. longum</i> AH1206	Adults Daily dose of 10^{10} cells of AH1206	Long-term colonization by <i>B. longum</i>	Long-term colonization observed in individuals with low abundance of <i>B. longum</i> and prevalence of certain carbohydrate utilization genes in the baseline microbiota prior to intervention	In the absence of conspecifics and competitors for the same resource, vacant niches were available for exogenously added microbes (high niche difference).	Maldonado-Gomez et al. [34]
<i>B. breve</i> BBG-001	Preterm infants 8.3 to 8.8×10^8 (CFUs) daily First dose: 44 h after birth	Colonization by bifidobacteria and prevention of infant necrotizing enterocolitis	<i>B. breve</i> colonization was not observed, and probiotic administration did not reduce the incidence of NEC.	First dose of probiotics were administered around 44 hours after birth. Pathogenic taxa may have arrived first and excluded BBG-001 (niche preemption).	Costeloe et al. [37]
<i>B. breve</i> YIT4010	Preterm infants 5×10^9 CFUs daily First dose: a few hours after birth	Colonization by bifidobacteria	Colonization by bifidobacteria observed, as well as decreased incidence of abnormal abdominal symptoms	Infants were administered YIT04010 within a few hours of birth, which allowed for colonization before the arrival of other taxa (priority effects).	Kitajima et al. [38]
<i>B. breve</i> M-16V	Low birth weight infants 1×10^9 CFUs daily First dose: ~7 h after birth	Colonization by bifidobacteria and prevention of infant necrotizing enterocolitis	Colonization by bifidobacteria observed, as well as decreased incidence of NEC	Infants were administered M-16V within a few hours of birth, which prevented the colonization of pathogenic bacteria (through inhibitory priority effects)	Satoh et al. [39]
<i>B. breve</i> M-16V	Low birth weight infants 1×10^9 CFUs daily	Colonization by bifidobacteria	Long-term colonization by <i>B. breve</i> , increased the abundance of <i>Bifidobacterium</i> species other than <i>B. breve</i> , reduced abundance of Proteobacteria	Early colonization by M-16V in the infant gut not only prevented the proliferation of pathogenic bacteria (priority effects), but also stimulated the growth of other <i>Bifidobacterium</i> species (facilitative priority effects).	Horigome et al. [41]
<i>B. breve</i> M-16V	Premature infants 1.66×10^9 CFUs once to twice daily	Colonization by <i>B. breve</i>	Higher rates of <i>B. breve</i> colonization was associated with higher consumption of undecorated HMOs in faces.	Undecorated HMOs provided a fitness advantage to M-16V and promoted its persistence (high relative fitness difference).	Underwood et al. [42]
<i>B. breve</i> (Strain unspecified)	Low birth weight infants 1.6×10^8 cells twice a day, either a few hours after birth or 24 h after birth	Formation of a bifidobacteria-rich gut microbiota	When infants given <i>B. breve</i> several hours after birth, a bifidobacteria-rich microbiota formed earlier than in infants given <i>B. breve</i> 24 h after birth	More niches were available for colonization and <i>B. breve</i> benefitted from priority effects when administered early.	Li et al. [40]
<i>B. infantis</i> EVC001	Infants 1.8×10^{10} CFUs for 21 days	Colonization by <i>B. infantis</i>	Colonization by <i>B. infantis</i> EVC001 persisted until at least 1 year postnatal due to early probiotic administration (within one month of birth), combined with breastfeeding.	The combination of early life administration and breastfeeding provided the optimum conditions for <i>B. infantis</i> EVC001, as niches were likely available and EVC001 had a fitness advantage due to presence of HMOs in breastmilk.	O'Brien et al. [45]
<i>B. infantis</i> EVC001	Infants 4×10^9 CFUs daily	Colonization by <i>B. infantis</i>	<i>B. infantis</i> EVC001 with the gene cluster that efficiently assimilates HMOs successfully colonized infant gut.	<i>B. infantis</i> with the complete HMO-utilization gene cluster had a higher fitness (than <i>B. infantis</i> with the incomplete HMO cluster and the other resident microbiota) which allowed for colonization (high relative fitness difference).	Duar et al. [46]
<i>B. infantis</i> EVC001	Infants 1.8×10^{10} CFUs daily	Colonization by <i>B. infantis</i>	Breastfed infants given EVC001 had higher abundances of bifidobacteria, and the amount of remaining HMOs significantly decreased. Reduced endotoxin production observed in groups with high abundances of bifidobacteria than in groups with low abundances of bifidobacteria.	EVC001 has higher fitness (ability to utilize wide range of HMOs) and thereby dominated the environment. Breastfeeding (HMO supplementation) allows for the strain to persist in infant gut. EVC001 reduced endotoxin production by inhibiting the growth of Gram-negative taxa by decreasing pH (production of acetate and lactate; inhibitory priority effects)	Frese et al. [44]

Table 4. Prevalence of gene sets responsible for the assimilation of prebiotics in human-residential *Bifidobacterium* (HRB) strains.

Prebiotic	Response Gene(s) (Transporter or Extracellular GH)	HRB Species	Prevalence		Homolog Search Criteria ¹	Reference
			%	Number of Strains (Hits/ Searched)		
Type- II Arabinogalactan (AG)	GAfase (BLGA_00340; <i>B. longum</i> subsp. <i>longum</i> 3-O- α -D-galactosyl- α -L-arabinofuranosidase)	<i>B. adolescentis</i>	7%	4 / 57	Identity \geq 60% Query coverage \geq 60% (Subspecies not identified in analysis for <i>B. catenulatum</i> and <i>B. longum</i> groups)	Sasaki et al. [73]
		<i>B. catenulatum</i> group	13%	1 / 8		
Arabinoxylian Hydrolysates (AXH)	BpAXBP1 (BBPC_RS01570; <i>B. pseudocatenulatum</i> AXH binding protein 1)	<i>B. adolescentis</i>	10%	5 / 50	*Identity \geq 60% Query coverage \geq 60%	Saito et al. [70] Prevalence from this study
		<i>B. catenulatum</i> subsp. <i>catenulatum</i>	36%	4 / 8		
		<i>B. pseudocatenulatum</i>	62%	45 / 73		
	BpAXBP2 (BBPC_RS02280; <i>B. pseudocatenulatum</i> AXH binding protein 2)	<i>B. adolescentis</i>	4%	2 / 50	*Identity \geq 60% Query coverage \geq 60%	
		<i>B. catenulatum</i> subsp. <i>catenulatum</i>	38%	3 / 8		
		<i>B. pseudocatenulatum</i>	34%	25 / 73		
	BpAXBP3 (BBPC_RS02385; <i>B. pseudocatenulatum</i> AXH binding protein 3)	<i>B. adolescentis</i>	96%	48 / 50	*Identity \geq 60% Query coverage \geq 60%	
		<i>B. catenulatum</i> subsp. <i>catenulatum</i>	50%	4 / 8		
		<i>B. catenulatum</i> subsp. <i>kashiwanohense</i>	67%	2 / 3		
<i>B. dentium</i>		100%	18 / 18			
Lactulose	LT-SBP (BL105A_0502; <i>B. longum</i> subsp. <i>longum</i> lactulose-binding protein)	<i>B. adolescentis</i>	100%	53 / 53	Identity > 65% Query coverage > 60% (Subspecies not identified in analysis for <i>B. catenulatum</i> and <i>B. longum</i> groups)	Yoshida et al. [63]
		<i>B. bifidum</i>	99%	94 / 95		
		<i>B. breve</i>	100%	108 / 108		
		<i>B. catenulatum</i> group	100%	16 / 16		
		<i>B. dentium</i>	100%	21 / 21		
		<i>B. longum</i> group	100%	338 / 338		
2'-Fucosyllactose	FL1-BP (Blon_0343; <i>B. longum</i> subsp. <i>infantis</i> fucosyllactose-binding protein 1)	<i>B. breve</i>	4%	4 / 91	Identity \geq 70% Query coverage \geq 60%	Sakanaka et al. [51]. Prevalence from Sakanaka et al. [52]
		<i>B. longum</i> subsp. <i>infantis</i>	57%	12 / 21		
		<i>B. breve</i>	8%	7 / 91		
	FL2-BP (Blon_2202; <i>B. longum</i> subsp. <i>infantis</i> fucosyllactose-binding protein 2)	<i>B. longum</i> subsp. <i>infantis</i>	86%	18 / 21	Identity \geq 70% Query coverage \geq 60%	
		<i>B. catenulatum</i> subsp. <i>kashiwanohense</i>	100%	2 / 2		
		<i>B. longum</i> subsp. <i>longum</i>	3%	5 / 151		
LNn T	LNn T-BP (NahS) (Bbr_1554; <i>B. breve</i> lacto- <i>N</i> -neo tetraose-binding protein)	<i>B. breve</i>	100%	91 / 91	Identity \geq 70% Query coverage \geq 60%	James et al. [55] Prevalence from Sakanaka et al. [52]
		<i>B. longum</i> subsp. <i>infantis</i>	48%	10 / 21		
		<i>B. adolescentis</i>	2%	1 / 46		
GOS	3'-Galactosyllactose	<i>B. bifidum</i>	100%	60 / 60	Identity \geq 70% Query coverage \geq 60%	Sotoya et al. [62]. Prevalence from Sakanaka et al [52]
		<i>B. breve</i>	100%	91 / 91		
		<i>B. catenulatum</i> subsp. <i>kashiwanohense</i>	50%	1 / 2		
		<i>B. longum</i> subsp. <i>infantis</i>	81%	17 / 21		
		<i>B. longum</i> subsp. <i>longum</i>	100%	151 / 151		
		<i>B. pseudocatenulatum</i>	84%	54 / 64		
	4'-Galactosyllactose	<i>B. adolescentis</i>	13%	6 / 46	Identity \geq 70% Query coverage \geq 60%	Shigehisa et al. [61]. Prevalence from Sakanaka et al. [52]
		<i>B. breve</i>	97%	88 / 91		
		<i>B. catenulatum</i> subsp. <i>catenulatum</i>	50%	1 / 2		
6'-Galactosyllactose	6'GL-BP (BBBR_RS01855; <i>B. breve</i> 4'-galactosyllactose-binding protein)	<i>B. dentium</i>	100%	9 / 9	Identity \geq 70% Query coverage \geq 60%	Sotoya et al. [62]. Prevalence from Sakanaka et al [52]
		<i>B. longum</i> subsp. <i>infantis</i>	14%	3 / 21		
		<i>B. longum</i> subsp. <i>longum</i>	87%	132 / 151		
		<i>B. pseudocatenulatum</i>	91%	58 / 64		
		<i>B. breve</i>	100%	91 / 91		
		<i>B. longum</i> subsp. <i>infantis</i>	14%	3 / 21		
Raffinose	RafB (Bbr_1867; <i>B. breve</i> raffinose-binding protein)	<i>B. longum</i> subsp. <i>longum</i>	100%	151 / 151	Identity \geq 70% Query coverage \geq 60%	O'Connell et al. [77] Prevalence from this study
		<i>B. adolescentis</i>	92%	46 / 50		
		<i>B. bifidum</i>	3%	3 / 87		
		<i>B. breve</i>	100%	103 / 103		
		<i>B. catenulatum</i> subsp. <i>kashiwanohense</i>	33%	1 / 3		
		<i>B. longum</i> subsp. <i>infantis</i>	100%	18 / 18		
<i>B. longum</i> subsp. <i>longum</i>	100%	56 / 56				
<i>B. pseudocatenulatum</i>	80%	58 / 73				

a) Asterisks indicate that prevalence of homologs was reanalyzed in this study with a blastp tool against *Bifidobacterium* genomes in NCBI refseq database (<https://ftp.ncbi.nlm.nih.gov/genomes/refseq/bacteria/>). When multiple sequences of the same strain from different culture collection providers were found in the database, only one representative sequence was used for analysis.

Relative Fitness Difference (Probiotic vs Resident Microbiota)

High

Exogenous Probiotic > Indigenous Microbiota
(Further aided by prebiotics)

Low

Exogenous Probiotic < Indigenous Microbiota

Niche Difference

High

Niches: Open

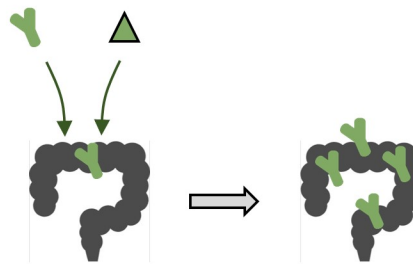
(Exogenous probiotic and indigenous microbiota competition low / resource requirement overlap low)

Low

Niches: Occupied

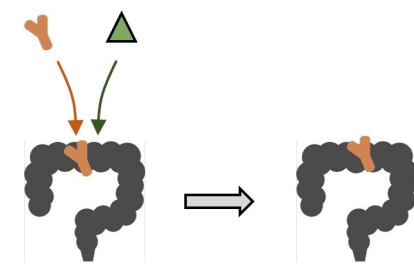
(Resource requirement overlap between exogenous probiotic and indigenous microbiota high)

a)



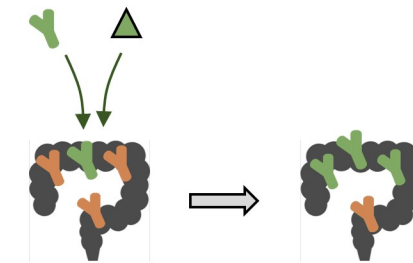
Response to probiotics and prebiotics likely. Probiotics colonize open niches and further proliferate using prebiotics.

c)



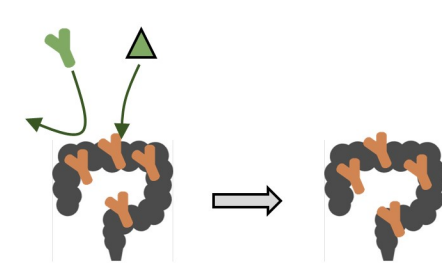
Response to probiotics possible only if niches available, as probiotics cannot outcompete resident taxa. Prebiotics cannot support growth without responder genes

b)



Response to probiotics possible if probiotics can outcompete resident taxa. Presence of prebiotics can provide competitive edge to probiotic strains.

d)



Responses to probiotics and prebiotics unlikely as niches are unavailable. Probiotics can neither utilize the prebiotics nor outcompete resident taxa.