1	Seeding and feeding milestones: the role of human milk microbes and oligosaccharides in the
2	temporal development of infant gut microbiota
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4	Martha F. Endika <sup>*1</sup> , David J.M. Barnett <sup>2,3</sup> , Cynthia E. Klostermann <sup>4,5</sup> , Noortje Kok <sup>1</sup> , Henk A.
5	Schols <sup>5</sup> , Arjen Nauta <sup>6</sup> , Ilja C.W. Arts <sup>2</sup> , John Penders <sup>3</sup> , Koen Venema <sup>7</sup> , Hauke Smidt <sup>1</sup>
6	
7	<sup>1</sup> Laboratory of Microbiology, Wageningen University & Research, Wageningen, the
8	Netherlands
9	<sup>2</sup> Maastricht Centre for Systems Biology (MaCSBio), Maastricht University, Maastricht, the
10	Netherlands
11	<sup>3</sup> Department of Medical Microbiology, Infectious Diseases and Infection Prevention,
12	Maastricht University Medical Center+, Maastricht, the Netherlands
13	<sup>4</sup> Biobased Chemistry and Technology, Wageningen University & Research, Wageningen, the
14	Netherlands
15	<sup>5</sup> Laboratory of Food Chemistry, Wageningen University & Research, Wageningen, the
16	Netherlands
17	<sup>6</sup> FrieslandCampina, Amersfoort, the Netherlands





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- <sup>18</sup> <sup>7</sup>Centre for Healthy Eating & Food Innovation (HEFI), Maastricht University campus Venlo,
- 19 Venlo, the Netherlands

20 \*Corresponding author. Email: martha.endika@wur.nl

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23

#### 24 Abstract

Breastfeeding represents a strong selective factor for shaping the infant gut microbiota. Besides 25 providing nutritional requirements for the infant, human milk is a key source of 26 oligosaccharides (HMOs) and diverse microbes in early life. This study aimed to evaluate the 27 influence of human milk microbiota and oligosaccharides on the composition of infant fecal 28 microbiota at one, three and nine months postpartum. We profiled milk microbiota, HMOs and 29 infant fecal microbiota from 23 mother-infant pairs at these timepoints. The predominant genera 30 in milk samples were Streptococcus, Staphylococcus and an unclassified Enterobacteriaceae 31 genus-level taxon (Enterobacteriaceae uncl.), whereas the infant fecal microbiota was 32 predominated by Bifidobacterium, Bacteroides and Enterobacteriaceae uncl. Mother-infant 33 dyads frequently shared bacterial amplicon sequence variants (ASVs) belonging to the genera 34 Bifidobacterium, Streptococcus, Enterobacteriaceae uncl., Veillonella, Bacteroides and 35 Haemophilus. The individual HMO concentrations in the milk showed either no change or 36 decreased over the lactation period, except for 3-fucosyllactose (3-FL), which increased. 37 Neither maternal secretor status nor HMO concentrations were significantly associated with 38 microbiota composition at the different ages or the bacterial ASVs of maternal milk and infant 39 feces. This study suggests an age-dependent role of milk microbes in shaping the gut 40 microbiota, while variations in HMO concentrations show limited influence. 41

#### 43 Introduction

Breastfeeding is one of the most important drivers of gut microbiota development in early life 44 [1-3]. Human milk contains rich nutrient resources and is a source of diverse microbes, 45 containing between  $10^2 - 10^5$  viable bacteria per ml [4-6]. Human milk also contains a high 46 concentration of structurally diverse non-digestible oligosaccharides (HMOs) in the range of 4 47 -22 g/L that vary geographically, between individuals, and over lactation stages, as previously 48 reviewed [7, 8]. Moreover, variations in the HMO profile are dependent on the expression of 49 the maternal secretor (Se) and Lewis (Le) genes, which determine the maternal secretor status 50 and Lewis blood group, as well as structural composition of fucosylated HMOs [9]. The milk 51 of Secretor (Se+) mothers contains an abundance of a1,2-fucosylated HMOs, such as 2'-52 fucosylactose (2'-FL), while the milk of non-secretor (Se-) mothers lacks this HMO group due 53 to the loss of fucosyltransferase 2 enzyme activity [10]. Additionally, the genetic variations in 54 FUT3, which define Lewis status, was correlated with the concentration of  $\alpha$ 1,4-fucosylated 55 HMOs, e.g. lacto-N-fucopentaose II (LNFP II) [11]. The majority of ingested HMOs reaches 56 the colon and provides selective substrates for the growth of HMO-utilizing bacteria, including 57 members of Bifidobacterium and Bacteroides that are both predominant genera in the gut 58 microbiota of breastfed infants [12, 13]. 59

In the first year of life, the compositional changes in human milk microbiota and HMOs occur alongside the temporal development of the infant gut microbiota [14]. The associations between HMO concentrations and the fecal microbiota of breastfed Dutch infants during the first 12 weeks of life were previously investigated [15]. However, only a few studies focused on the role of breastfeeding, particularly as source of both milk microbes and oligosaccharides, in the development of gut microbiota across the lactation period. Most studies have investigated this based on observations with two time points from the group of infants older than 3 months of age in Canadian and Danish populations [16, 17], while none have been reported from the Dutchpopulation.

A previous study observed geographic variations in HMOs among ethnically similar mothers, 69 suggesting environmental and dietary influences [8]. Additionally, dietary habits are strongly 70 influenced by cultural factors and country of birth, and maternal diet holds the potential to 71 impact the microbiota in human milk and the infant gut, as previously reviewed [18]. Moreover, 72 cultural differences related to solid food introduction were identified between Dutch and 73 Canadian populations [19]. In the Netherlands, children are introduced to complementary food 74 from the age of four months and their growth and development are monitored through eight 75 visits to local child health clinics during the first year, including appointments at one, three, and 76 nine months after birth. Therefore, we aimed to evaluate the influence of microbes and HMO 77 concentrations in the breast milk of Dutch mothers on the development of infant gut microbiota 78 throughout the lactation period at one, three and nine months of age. 79

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#### 81 Methods

# 82 Study design and sample collection

The current study included breast milk and infant fecal samples collected from mother-infant 83 pairs who participated in the Baby Carbs study (Figure 1). Healthy, vaginally delivered, full-84 term Caucasian infants whose mothers intended to exclusively breastfeed at least up to three 85 months after birth, were eligible for the study. Exclusion criteria included pre-term birth (< 3786 weeks of gestation) and infants who received antibiotics during their first month of life. This 87 study was exempted from medical research ethics committee approval for the collection of 88 samples, after review by the Medical Ethical Reviewing Committee of Wageningen University. 89 All parents provided written informed consent before the start of the sample collection. Sample 90 collection was scheduled at one, three and nine months postpartum. 91



**Figure 1.** Overview of Baby Carbs study design and sample collection.

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The participants collected up to 20 ml breast milk in the morning before feeding their child 94 (foremilk), without cleaning the breast. The milk samples were collected without aseptic 95 cleansing in order to provide a more representative analysis of the microbiota, present in breast 96 milk and on the breast surface, as ingested by the suckling infant during breastfeeding [20, 21]. 97 The milk was collected by hand expression or using a breast pump into a sterile 50 ml tube 98 (Greiner Bio-One<sup>TM</sup> CellStar<sup>TM</sup> test tubes, Alphen aan den Rijn, the Netherlands) and kept in 99 the home refrigerator for a maximum of 5 h prior to the visit from one of the researchers. Infant 100 fecal samples were collected from a diaper using a sterile spoon (Sampling Systems, Coleshill, 101 United Kingdom). The collected feces were kept anoxically in a sterile 50 ml collection tube 102

with filter cap (Greiner Bio-One<sup>TM</sup> Cellreactor<sup>TM</sup> tubes, Alphen aan den Rijn, the Netherlands)
placed inside BD GasPak EZ anaerobe gas generating pouches (BD Diagnostics, Sparks, MD,
United States). These fecal samples were stored in the home refrigerator at approximately 4 °C
for a maximum of 72 h before being collected by one of the researchers for transport to the lab.
The samples, both breast milk and infant feces, were transported to the laboratory inside an
insulated bag containing frozen cooling elements and stored at −80 °C until further processing.

#### 110 **DNA Extraction from breast milk samples**

The milk samples were thawed at room temperature, and subsequently centrifuged (10,000  $\times$ 111 g, 10 min, 4 °C). The aqueous fraction was then transferred to a new Eppendorf tube for further 112 analysis of HMO structures. The DNA extraction from breast milk was performed based on the 113 method previously described by Schwab et al. [6]. Briefly, the cell pellet including the fat layer 114 was used for DNA extraction to identify the overall prokaryotic profile in breast milk [22]. The 115 milk DNA was extracted using the FastDNA spin kit for soil (MP Biomedical, Eschwege, 116 Germany) following the manufacturer's protocol, which includes a bead beating step. Each 117 DNA extraction batch included milk samples and negative control (buffer only). 118

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# 120 Human milk oligosaccharide analysis

HMOs were isolated from milk and purified based on a method slightly modified from the protocol described by Gu et al. [23], using Supelclean ENVI-Carb 250 mg/3 ml solid-phase extraction (SPE) cartridges (Merck, Darmstadt, Germany). Two fractions were extracted, the first fraction (fraction A) containing 3-fucosyllactose (3-FL) as eluted by 3% acetonitrile (ACN) and the second fraction containing other HMOs (fraction B) eluted using 40% acetonitrile with 0.05% trifluoroacetic acid. Both fractions were subsequently evaporated to dryness using Eppendorf Concentrator plus (Eppendorf Nederland BV, Nijmegen, the

Netherlands) overnight at room temperature and then rehydrated in Milli-Q water for furtheranalysis.

In total, 18 HMO structures were analyzed (see **Supplementary Table 1** for full HMO names), 130 including eight fucosylated HMOs (3-FL, 2'-FL, LNFP I, LNFP II, LNFP III, LNFP V, LNDFH 131 I, DFL), four non-fucosylated neutral HMOs (LNT, LNnT, LNH, LNnH) and six sialylated 132 HMOs (3'-SL, 6'-SL, LST a, LST b, LST c, DSLNT). The quantification of 3-FL (fraction A) 133 and DSLNT (fraction B) was performed using high-performance anion-exchange 134 chromatography-pulsed amperometric detection (HPAEC-PAD). For HPAEC, a gradient of 135 two eluents was used, namely 0.1 M NaOH (eluent A) and 1 M NaOAc in 0.1 M NaOH (eluent 136 B). The gradient for detection of 3-FL included 0-15% B (0-15 min), 15-100% B (15-20 min), 137 100% B (20-25 min), followed by 20 min re-equilibration with 0% B. The gradient for detection 138 of DSLNT included 0-25% B (0-25 min), 25-100% B (25-30 min), 100% B (30-35 min), 139 followed by 20 min re-equilibration with 0% B. Elution was performed at 0.3 ml/min at 25°C. 140 For quantification of other HMO structures, fraction B was further reduced to alditols using 0.5 141 M sodium borohydride, followed by SPE-based purification. The purified sample was analyzed 142 on a porous graphitized carbon-liquid chromatography mass spectrometry (PGC-LC-MS) 143 equipped with a Thermo Hypercarb column (3  $\mu$ m particle size, 2.1 mm  $\times$  150 mm; Hypercarb, 144 Thermo Scientific, San Jose, CA, USA) in combination with a guard column (3 µm particle 145 size,  $2 \text{ mm} \times 10 \text{ mm}$ ; Hypercarb, Thermo Scientific). 146

The HMOs were identified by comparing the retention time and mass-to-charge ratios with commercial reference oligosaccharides (**Supplementary Table 1**). The total HMO concentration was calculated as the sum of the 18 identified HMOs. Maternal secretor status was classified based on the high concentration (secretor) or near absence (non-secretor) of 2'-FL with the lower quartile as a cut-off concentration (16.5  $\mu$ g/ml). The Lewis status was classified based on the presence or absence of LNFP II [24].

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# 154 **DNA Extraction from infant fecal samples**

Fecal DNA was extracted from 50 - 200 mg infant feces that was re-suspended in 350 µl Stool 155 Transport and Recovery (STAR) buffer (Roche Diagnostics, Indianapolis, IN, USA), then 156 transferred to a sterile screw cap tube (BIOplastics, Landgraaf, the Netherlands) containing 0.25 157 g of 0.1 mm zirconia beads and 3 glass beads (diameter 2.7 mm). The DNA extraction was 158 performed following the repeated bead beating method [25]. Automated purification was 159 performed using the Maxwell® 16 Tissue LEV Total RNA purification Kit Cartridge 160 customized for DNA purification (XAS1220) on the Maxwell® 16 Instrument (Promega, 161 Madison, WI, USA). 162

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## 164 Microbiota analysis

The V4 region of the 16S rRNA gene was amplified in duplicate using barcoded 515F [26]-165 806R [27] primers. The full description of the PCR steps has been provided in a previous study 166 [28]. 25 or 30 PCR cycles were used for fecal or milk samples, respectively. No-template 167 controls were included for each PCR run. Duplicate PCR products were pooled for each sample 168 and then purified by the use of the CleanPCR kit (CleanNA, Waddinxveen, the Netherlands). 169 Two mock communities of known 16S rRNA gene composition and one no-template control 170 were included for each library. An equimolar mix of purified PCR products was prepared and 171 sent for Illumina paired-end 150 bp Novaseq6000 sequencing at Novogene (Novogene-Europe, 172 Cambridge, United Kingdom). The raw sequence data was processed using NG-Tax 2.0 with 173 default settings [29]. Taxonomy was assigned based on SILVA database version 138.1 [30]. 174

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#### 176 Data Analysis

Data analysis was performed in R version 4.2.0, and data was visualized using the microViz 177 package version 0.10.8 [31]. Potential reagent contaminants in milk samples were identified 178 based on either the frequency of amplicon sequence variants (ASVs) that varied inversely with 179 sample DNA concentration or an increased prevalence of ASVs in negative controls using the 180 decontam package version 1.17.0 [32]. Subsequently, ASVs belonging to a list of known 181 contaminant genera were removed [33]. After processing, averages of 118,395 reads per milk 182 sample and 271,775 reads per fecal sample were obtained. For alpha-diversity analyses, we 183 used the exponent of Shannon index, calculated at genus level (effective Shannon Index). The 184 Wilcoxon signed-rank test was performed to test differences in alpha-diversity between age 185 groups using the rstatix package version 0.7.0 [34]. Centered-log-ratio (CLR)-transformed 186 abundances at genus level were used in principal component analysis (PCA) scatterplots to 187 visualize major patterns of microbiota variation. The binary Jaccard similarity index (presence-188 absence of shared ASVs), ranging from 0 (no shared ASVs) to 1 (all ASVs shared), was 189 calculated to measure similarity between breast milk and infant fecal microbiota. For the 190 statistical models, the HMO concentrations were transformed to z-scores. PERMANOVA, 191 using 9,999 permutations on the Aitchison distance, was performed to test the association of 192 infant sex, birth place, milk collection method and each HMO with age-specific microbiota at 193 ASV level in milk or feces. To explore associations between HMO exposures and the microbial 194 relative abundances at ASV level, a simple linear regression model was used on the log2-195 transformed bacterial proportions (zeroes were replaced by half of the smallest observed value), 196 per taxon, per age group. Only ASVs observed in more than five samples were included in the 197 analysis. The p-values were corrected (Benjamini-Hochberg FDR-adjusted) per age group, for 198 each HMO variable. 199

#### 201 **Results**

# 202 Participant characteristics

In total, 23 infant-mother dyads participated in the study. Two infant-mother pairs could not 203 provide samples at one month postpartum due to the restrictions related to the COVID-19 204 pandemic. Four mothers stopped breastfeeding their infants at nine months postpartum. All 205 infants were born vaginally at term and exclusively breastfed at least for the first three months 206 postpartum. Eleven infants were born at home, ten at a hospital, and two infants were born at a 207 clinic. Of all infants, 52% were female and 56% were born after 40 weeks of gestational age 208 (Supplementary Table 2). Regarding maternal secretor status, 17 mothers were classified as 209 secretors and six mothers were classified as non-secretors. All milk samples contained LNFP 210 II, indicating that all mothers in this study were Lewis-positive. 211

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# Temporal dynamics in microbiota composition and taxa shared within the mother-infant pairs

We observed that breast milk samples were often dominated (defined as one genus accounting 215 for at least 50% of reads from a given sample) by either Streptococcus or Staphylococcus or 216 Enterobacteriaceae uncl., however, the majority of samples were characterized by a mixed 217 microbial composition (Figure 2A). On the other hand, most of the infant fecal samples showed 218 a microbiota composition dominated by either Bifidobacterium, Bacteroides, or an unclassified 219 genus within the Enterobacteriaceae, and relatively few fecal samples showed a mixed 220 microbial composition (Figure 2B). The average alpha-diversity (effective Shannon index) of 221 infant fecal samples at nine months postpartum was significantly higher than that of samples at 222 one month (p = 0.011) and three months (p = 0.011) of age, while there was no significant 223 difference in alpha-diversity in milk microbiota among different age groups (Figure 2). 224



Figure 2. Alpha-diversity of microbiota in breast milk (A) and infant feces (B) at different sampling moments. Boxplot (median and inter-quartile range) of alpha-diversity as measured by the effective Shannon index at genus level, grouped by age. Paired Wilcoxon signed-rank test was used to compare the diversity between two age groups. Significant differences are indicated by \*p < 0.05.

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We also observed temporal changes in the composition of both milk and fecal microbiota with a separation of some of the microbiota profiles at nine months of age from those observed for

- the younger age groups (Figure 3), especially for fecal microbiota profiles (Figure 3B). Age
  significantly explained 9% and 11% of the variance in milk and fecal microbiota, respectively,
  as determined by PERMANOVA (p < 0.001, Supplementary Table 3).</li>
- 237



Figure 3. Beta-diversity of microbiota in breast milk and infant feces at different sampling moments. PCA plots based on CLR-transformed microbial proportion at genus level. Taxon loading vectors are shown for 10 taxa that contributed most to the observed variation in microbial composition. Plots are colored by age group, and the p-values shown are for the association of age with microbiota composition (PERMANOVA, Supplementary Table 3). Percentages at the PCA axes indicate the amount of variation explained. As a visual aid, convex hulls are drawn that connect the outermost data points for each age group.

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In the weaning period at nine months postpartum, the milk microbiota changed towards a community associated with increases in proportion of the bacterial genera *Neisseria*,

Granulicatella, Haemophilus, Actinomyces, Veillonella, Gemella and Streptococcus (Figure 3A). In the same period, the fecal microbiota changed towards a community associated with increases in the proportion of *Anaerostipes*, *Blautia* and *Faecalibacterium* (Figure 3B). The changes over time in the proportion of taxa shown on the PCA plot are visualized in

252 Supplementary Figure 1.

In order to evaluate the potential influence of bacteria from maternal breast milk in seeding the 253 infant gut, we compared the shared bacterial ASVs between related and unrelated mother-infant 254 pairs. This comparison revealed that the similarity between milk and infant feces microbiota 255 was higher within related mother-infant pairs than between mothers and unrelated infants at 256 one month postpartum, whereas no difference was observed at three and nine months 257 postpartum (Figure 4A). Furthermore, we observed that ASVs belonging to the genera 258 Bifidobacterium, Streptococcus, Enterobacteriaceae uncl., Veillonella, Bacteroides and 259 *Haemophilus* were frequently shared for all age groups (Figure 4B). 260

It should be noted that the high relative abundance of shared ASVs within the genus *Streptococcus* and *Staphylococcus* in milk did not correspond to a high relative abundance of these ASVs in infant fecal samples (**Figure 4C**). On the other hand, the shared ASVs belonging to the genera *Bifidobacterium, Bacteroides* and *Enterobacteriaceae* uncl. were often present at higher relative abundance in infant feces than in milk, indicating the selection of these ASVs by the gut environment.





Figure 4. Shared ASVs between breast milk and infant feces. (A) Boxplots of binary Jaccard 268 similarity based on shared ASVs between milk and infant feces at one, three and nine months 269 of age from related or unrelated mother-infant pairs. Significant differences are indicated by p-270 value < 0.05. (B) Bar plot showing the number of times each bacterial ASV is shared between 271 milk and infant feces. (C) Bar plot showing the relative abundances of the bacterial ASVs that 272 are shared or not shared within families (mother-infant pairs) for each sample (upper facets are 273 milk sample compositions, lower facets are fecal sample compositions). ASVs belonging to the 274 same genus are indicated by the same color. 275

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# 277 Temporal changes in HMO concentrations and associations between milk HMOs and

# 278 milk or fecal bacteria

Changes in the concentrations of HMOs during lactation were observed (Figure 5). 279 Particularly, the concentration of 3-FL increased during the first nine months of lactation in the 280 milk from secretor mothers (Supplementary Table 4). The concentrations of other HMOs 281 showed either a decreasing trend or remained constant throughout the first nine months of 282 lactation. On the other hand, we did not see significant differences in the HMO concentrations 283 quantified in the milk from non-secretor mothers among samples collected at different time 284 points (Supplementary Table 5). Besides the near absence of 2'-FL, milk from non-secretor 285 mothers also contained a lower concentration of DFL, LNFP I, and LNDFH I, compared to 286 milk from secretor mothers (Supplementary Table 6). Interestingly, there was no significant 287 difference in the concentration of total fucosylated HMOs between milk samples grouped by 288 maternal secretor status. This can be explained by the observed higher concentrations of 3-FL, 289 LNFP II, and LNFP V in the milk of non-secretor mothers, compared to the milk from secretor 290 mothers. 291

Despite the natural variation in HMO profiles, the secretor status and HMO concentrations had 292 limited effect on the gut microbiota of breastfed infants at one, three and nine months of age. 293 Neither infant sex, birth place, milk collection method, maternal secretor status nor individual 294 HMOs significantly contributed to explaining the observed variation in microbiota composition 295 of maternal milk and infant feces after FDR correction (PERMANOVA, Supplementary 296 Table 7). Moreover, we did not observe significant associations, after FDR correction for 297 multiple comparisons, between the individual HMO concentrations and the bacterial ASVs in 298 the maternal milk and infant feces (Supplementary Table 8). 299



Figure 5. HMO concentration trajectories during the first nine months of lactation in milk of
 secretor and non-secretor mothers. The thick solid lines represent the trend lines plotted with a
 locally-weighted scatterplot smoothing (LOESS).

304 **Discussion** 

In this longitudinal study of a total of 23 mother-infant pairs, we observed that the microbiota in the maternal milk and infant gut developed in a temporal manner. The microbiota in the maternal milk samples was predominated by the genera *Streptococcus*, *Staphylococcus* and an unclassified genus within *Enterobacteriaceae*, in line with previous studies that reported human milk microbiota profiles [10, 16, 35].

Compared to milk at one and three months postpartum, a distinct composition of the milk 310 microbiota was observed at nine months postpartum, characterized by an increased proportion 311 of Neisseria, Granulicatella, Haemophilus, Actinomyces, Veillonella, Gemella and 312 Streptococcus, which are all bacterial genera that often colonize the oral cavity of infants [36]. 313 Infancy represents an important stage in the development of the oral microbiota, marked by the 314 eruption of teeth, exploratory mouthing behaviors, and the introduction of solid foods [37]. It 315 should be noted that at nine months postpartum, the initiation of teeth eruption might provide 316 an adhesion surface that favors the growth of common dental plaque bacteria in the mouth, such 317 as Granulicatella, Gemella, Actinomyces, Neisseria and Streptococcus [38]. The presence of 318 infant oral bacteria in the maternal milk microbiota might be explained by the backward flow 319 of breast milk into mammary ducts during infant suckling [39]. 320

On the other hand, we observed that the microbiota in most of the infant fecal samples was either dominated by *Bifidobacterium* or showed a mixed proportion of bacterial genera, typical of this age in infancy [40]. In the weaning period, when infants received complementary food, an increase in alpha-diversity was seen, and the changes in the fecal microbial composition were characterized by an increase in the relative abundance of members of the class *Clostridia*,

including Faecalibacterium, Blautia, and Anaerostipes, similar to a previous study on infants 326 at the same age group [17]. Although the composition of milk microbiota was distinct from that 327 of the microbiota of infant feces, some shared taxa at ASV level were identified. ASVs 328 belonging to the genera Bifidobacterium, Streptococcus, Staphylococcus, Veillonella, and 329 Haemophilus frequently co-occurred in the mother's milk and the feces from her own infant, in 330 line with previous studies [16, 17]. It should be noted that the co-occurrence of bacterial ASVs 331 in milk and infant feces suggests mother-to-child microbial transmission, but is insufficient to 332 confirm transmission during breastfeeding. Confirming this transmission during breastfeeding 333 requires strain level resolution, which cannot be obtained from 16S rRNA gene amplicon 334 sequence data. 335

Moreover, our data showed that the extent to which ASVs were shared within mother-infant 336 pairs compared to unrelated pairs was only higher at one month postpartum, indicating that the 337 colonization of the gut by ingested milk bacteria was more likely to occur at a younger age 338 when the gut microbiota was less diverse. A previous study using a combined metagenomic-339 culture-based approach showed that strains of Bifidobacterium and Staphylococcus were 340 frequently transmitted between maternal milk and infant stool at one month of age [41]. In 341 addition, the same culturable bacterial strains of Lactobacillus were observed in breast milk and 342 feces of infants younger than three months of age [42]. 343

Furthermore, the HMO composition changed over the course of lactation. Except for 3-FL, the concentration of other HMOs showed either no change or decreased over time, in line with previous studies [11, 15, 43, 44]. It should be noted that while the milk of non-secretor mothers was lacking  $\alpha$ -1,2-fucosylated HMOs (2'-FL, DFL, LNFP I, LNDFH I), a higher concentration of other fucosylated HMOs was seen, including 3-FL, LNFP II, and LNFP V [43, 45]. Decorated fucose in  $\alpha$ -1,2-fucosylated HMOs, is removed by the  $\alpha$ -1,2-fucosidase GH95, which

is present in gut bacteria, including specific strains of *Bifidobacterium*, *Bacteroides* and *Akkermansia* [46].

In line with other studies, we observed a limited effect of maternal secretor status on the 352 composition of breast milk [47] or infant fecal microbiota [15, 17, 48]. A previous study showed 353 that the secretor status of the infant, but not maternal secretor status, was an important 354 determinant of infant fecal microbiota [49]. Moreover, in concurrence with Laursen et al. [17], 355 our results showed a lack of significant association between HMO concentrations and infant 356 fecal bacterial ASVs. In a larger study of 220 one-month-old infants, the concentrations of 6'-357 SL and LNH were associated with overall fecal microbiota composition, yet not with the 358 proportion of specific gut bacteria [48]. This might be partially explained by the redundant and 359 synergistic effects of HMOs, which could hinder the detection of associations between specific 360 HMOs and their role in stimulating specific gut bacteria [50]. 361

Our longitudinal study of a homogenous population of mother-infant pairs in the Netherlands 362 provided an integrated overview of the temporal changes of HMOs and microbiota in breast 363 milk and infant feces, even though the small number of mother-infant dyads limited the 364 statistical power of the analysis. Microbiota profiling was only performed on foremilk samples, 365 since a previous study showed that the microbiota composition between fore- and hindmilk was 366 similar [17]. However, we did not control for the variation in HMO concentrations of fore- and 367 hindmilk. Despite its limitation in underestimating the abundance of skin bacteria [51], the V4 368 universal primer pair was chosen for targeting both bacterial and archaeal 16S rRNA genes, 369 and to allow high throughput analysis of fecal and milk microbiota. However, the microbiota 370 analysis presented in this study focused only on bacterial composition due to low prevalence of 371 archaea in human milk and no detection of this microbial group in infant feces. The assessment 372 of infant gut microbiota was approximated based on fecal material, and careful consideration 373 should be given when interpreting these results, as fecal profiles may be a biased 374

375 representation of the true colonic ecosystem diversity [52]. Furthermore, a larger sample size,
a detailed measurement of dietary data, and the use of strain level analysis (e.g. combining
shotgun metagenomics and cultivation-based approaches) are of importance in the design of
future longitudinal studies investigating bacterial transmission via breastfeeding.

This study demonstrates that the concentration of milk oligosaccharides and the microbiota 379 composition of milk and infant feces changes between one and nine months postpartum. Shared 380 bacteria in human milk and infant feces within the mother-infant dyads suggests the importance 381 of milk microbes in shaping the assembly of gut microbiota in an age-dependent fashion. 382 Finally, considering the fact that we did not observe specific associations between bacterial taxa 383 and HMO concentrations, it is tempting to speculate that different HMOs might exhibit 384 overlapping roles in feeding the gut bacteria, regardless of the differences in HMO profiles 385 determined by the maternal secretor status. 386

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#### 388 Abbreviations

- 389 HMO Human milk oligosaccharide
- 390 ASV Amplicon sequence variant
- 391 CLR Centered-log-ratio
- 392 PCA Principal component analysis
- 393

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400	Availability of data and material
401	The data for this study have been deposited in the European Nucleotide Archive (ENA) at
402	EMBL-EBI under accession number PRJEB64690.
403	
404	Competing interests
405	A.N. is employed at FrieslandCampina. The remaining authors declare that they have no
406	competing interests.
407	
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424	References		
425 426	1.	Bäckhed, F., et al., <i>Dynamics and stabilization of the human gut microbiome during the first year of life</i> . Cell Host Microbe, 2015. <b>17</b> (5): p. 690-703.	
427 428 429	2.	Azad, M.B., et al., <i>Impact of maternal intrapartum antibiotics, method of birth and breastfeeding on gut microbiota during the first year of life: a prospective cohort study.</i> Bjog, 2016. <b>123</b> (6): p. 983-93.	
430 431	3.	Stewart, C.J., et al., <i>Temporal development of the gut microbiome in early childhood from the TEDDY study</i> . Nature, 2018. <b>562</b> (7728): p. 583-588.	
432 433	4.	Martín, R., et al., <i>Human milk is a source of lactic acid bacteria for the infant gut.</i> J Pediatr, 2003. <b>143</b> (6): p. 754-758.	
434 435	5.	Jost, T., et al., Assessment of bacterial diversity in breast milk using culture-dependent and culture-independent approaches. Br J Nutr, 2013. <b>110</b> (7): p. 1253-1262.	
436 437	6.	Schwab, C., et al., <i>Characterization of the Cultivable Microbiota in Fresh and Stored Mature Human Breast Milk</i> . Front Microbiol, 2019. <b>10</b> .	
438 439 440	7.	McGuire, M.K., et al., <i>What's normal? Oligosaccharide concentrations and profiles in milk produced by healthy women vary geographically.</i> Am J Clin Nutr, 2017. <b>105</b> (5): p. 1086-1100.	
441 442	8.	Thum, C., et al., <i>Changes in HMO Concentrations throughout Lactation: Influencing Factors, Health Effects and Opportunities.</i> Nutrients, 2021. <b>13</b> (7).	
443 444	9.	Thurl, S., et al., <i>Detection of four human milk groups with respect to Lewis blood group dependent oligosaccharides</i> . Glycoconj J, 1997. <b>14</b> (7): p. 795-9.	
445 446 447	10.	Cabrera-Rubio, R., et al., Association of Maternal Secretor Status and Human Milk Oligosaccharides With Milk Microbiota: An Observational Pilot Study. J Pediatr Gastroenterol and Nutr, 2019. <b>68</b> (2): p. 256-263.	
448 449 450	11.	Lefebvre, G., et al., <i>Time of Lactation and Maternal Fucosyltransferase Genetic Polymorphisms Determine the Variability in Human Milk Oligosaccharides</i> . Front Nutr, 2020. <b>7</b> : p. 574459.	
451 452	12.	Marcobal, A., et al., <i>Consumption of human milk oligosaccharides by gut-related microbes</i> . J Agric Food Chem., 2010. <b>58</b> (9): p. 5334-5340.	
453 454 455	13.	Yu, ZT., C. Chen, and D.S. Newburg, <i>Utilization of major fucosylated and sialylated human milk oligosaccharides by isolated human gut microbes</i> . Glycobiology, 2013. <b>23</b> (11): p. 1281-1292.	
456 457 458	14.	Liu, F., et al., <i>Longitudinal changes of human milk oligosaccharides, breastmilk microbiome and infant gut microbiome are associated with maternal characteristics.</i> Int J Food Sci Technol, 2022. <b>57</b> (5): p. 2793-2807.	
459 460 461	15.	Borewicz, K., et al., <i>The association between breastmilk oligosaccharides and faecal microbiota in healthy breastfed infants at two, six, and twelve weeks of age.</i> Sci Rep, 2020. <b>10</b> (1): p. 4270.	
462 463 464	16.	Fehr, K., et al., <i>Breastmilk Feeding Practices Are Associated with the Co-Occurrence of Bacteria in Mothers' Milk and the Infant Gut: the CHILD Cohort Study.</i> Cell Host Microbe, 2020. <b>28</b> (2): p. 285-297.e4.	

Laursen, M.F., et al., Maternal milk microbiota and oligosaccharides contribute to the 17. 465 *infant gut microbiota assembly.* ISME Commun, 2021. **1**(1): p. 21. 466 18. Taylor, R., et al., Effect of maternal diet on maternal milk and breastfed infant gut 467 microbiomes: A Scoping review. Nutrients, 2023. 15(6): p. 1420. 468 19. Homann, C.-M., et al., Infants' first solid foods: impact on gut microbiota 469 development in two intercontinental cohorts. Nutrients, 2021. 13(8): p. 2639. 470 20. Sakwinska, O., et al., Microbiota in breast milk of Chinese lactating mothers. PLoS 471 472 One, 2016. 11(8): p. e0160856. 21. Simpson, M.R., et al., Breastfeeding-associated microbiota in human milk following 473 supplementation with Lactobacillus rhamnosus GG, Lactobacillus acidophilus La-5, 474 and Bifidobacterium animalis ssp. lactis Bb-12. J Dairy Sci, 2018. 101(2): p. 889-899. 475 Stinson, L.F., et al., Centrifugation does not remove bacteria from the fat fraction of 476 22. *human milk*. Sci Rep, 2021. **11**(1): p. 572. 477 23. Gu, F., et al., Structure-Specific and Individual-Dependent Metabolization of Human 478 Milk Oligosaccharides in Infants: A Longitudinal Birth Cohort Study. J Agric Food 479 Chem., 2021. 69(22): p. 6186-6199. 480 24. Wang, A., et al., The Milk Metabolome of Non-secretor and Lewis Negative Mothers. 481 Front Nutr, 2020. 7: p. 576966. 482 25. Salonen, A., et al., Comparative analysis of fecal DNA extraction methods with 483 phylogenetic microarray: Effective recovery of bacterial and archaeal DNA using 484 mechanical cell lysis. J Microbiol Methods, 2010. 81(2): p. 127-134. 485 26. Parada, A.E., D.M. Needham, and J.A. Fuhrman, Every base matters: assessing small 486 subunit rRNA primers for marine microbiomes with mock communities, time series 487 and global field samples. Environ Microbiol, 2016. 18(5): p. 1403-1414. 488 Apprill, A., et al., *Minor revision to V4 region SSU rRNA 806R gene primer greatly* 27. 489 increases detection of SAR11 bacterioplankton. Aquat Microb Ecol., 2015. 75(2): p. 490 129-137. 491 Endika, M.F., et al., *Microbiota-dependent influence of prebiotics on the resilience of* 28. 492 infant gut microbiota to amoxicillin/clavulanate perturbation in an in vitro colon 493 model. Front Microbiol, 2023. 14. 494 29. Poncheewin, W., et al., NG-Tax 2.0: A semantic framework for high-throughput 495 amplicon analysis. Front Genet., 2020. 10: p. 1366. 496 30. Quast, C., et al., The SILVA ribosomal RNA gene database project: improved data 497 processing and web-based tools. Nucleic Acids Res., 2012. 41(D1): p. D590-D596. 498 31. Barnett, D.J., I.C. Arts, and J. Penders, microViz: an R package for microbiome data 499 visualization and statistics. J Open Source Softw., 2021. 6(63): p. 3201. 500 Davis, N.M., et al., Simple statistical identification and removal of contaminant 501 32. sequences in marker-gene and metagenomics data. Microbiome, 2018. 6: p. 1-14. 502 Salter, S.J., et al., Reagent and laboratory contamination can critically impact 503 33. sequence-based microbiome analyses. BMC Biol, 2014. 12(1): p. 87. 504 Kassambara, A., rstatix: pipe-friendly framework for basic statistical tests. R package 505 34. v. 0.7. 0. 2021. 506

507 508	35.	Urbaniak, C., et al., <i>Human milk microbiota profiles in relation to birthing method, gestation and infant gender</i> . Microbiome, 2016. <b>4</b> (1): p. 1.
509 510 511	36.	Dzidic, M., et al., <i>Oral microbiome development during childhood: an ecological succession influenced by postnatal factors and associated with tooth decay.</i> ISME J, 2018. <b>12</b> (9): p. 2292-2306.
512 513	37.	Arishi, R.A., et al., <i>Impact of breastfeeding and other early-life factors on the development of the oral microbiome</i> . Front Microbiol, 2023. <b>14</b> : p. 1236601.
514 515	38.	Aas, J.A., et al., <i>Defining the normal bacterial flora of the oral cavity</i> . J Clin Microbiol, 2005. <b>43</b> (11): p. 5721-32.
516 517	39.	Ramsay, D.T., et al., <i>Ultrasound imaging of milk ejection in the breast of lactating women</i> . Pediatrics, 2004. <b>113</b> (2): p. 361-7.
518 519	40.	Borewicz, K., et al., <i>The effect of prebiotic fortified infant formulas on microbiota composition and dynamics in early life</i> . Sci Rep, 2019. <b>9</b> (1): p. 2434.
520 521 522	41.	Feehily, C., et al., <i>Detailed mapping of Bifidobacterium strain transmission from mother to infant via a dual culture-based and metagenomic approach</i> . Nat Commun, 2023. <b>14</b> (1): p. 3015.
523 524	42.	Martín, V., et al., <i>Sharing of Bacterial Strains Between Breast Milk and Infant Feces</i> . J Hum Lact, 2012. <b>28</b> (1): p. 36-44.
525 526 527	43.	Durham, S.D., et al., <i>A one-year study of human milk oligosaccharide profiles in the milk of healthy UK mothers and their relationship to maternal FUT2 genotype.</i> Glycobiology, 2021. <b>31</b> (10): p. 1254-1267.
528 529	44.	Plows, J.F., et al., <i>Longitudinal Changes in Human Milk Oligosaccharides (HMOs)</i> <i>Over the Course of 24 Months of Lactation.</i> J Nutr, 2021. <b>151</b> (4): p. 876-882.
530 531	45.	Menzel, P., et al., <i>Concentrations of oligosaccharides in human milk and child growth</i> . BMC Pediatr, 2021. <b>21</b> (1): p. 481.
532 533 534	46.	<ul> <li>Kiely, L.J., et al., Molecular strategies for the utilisation of human milk oligosaccharides by infant gut-associated bacteria. FEMS Microbiol Rev, 2023.</li> <li>47(6).</li> </ul>
535 536	47.	Moossavi, S., et al., Integrated Analysis of Human Milk Microbiota With Oligosaccharides and Fatty Acids in the CHILD Cohort. Front Nutr, 2019. 6.
537 538 539	48.	Barnett, D., et al., <i>Human milk oligosaccharides, antimicrobial drugs, and the gut microbiota of term neonates: observations from the KOALA birth cohort study.</i> Gut Microbes, 2023. <b>15</b> (1): p. 2164152.
540 541 542	49.	Thorman, A.W., et al., <i>Gut Microbiome Composition and Metabolic Capacity Differ</i> by <i>FUT2 Secretor Status in Exclusively Breastfed Infants</i> . Nutrients, 2023. <b>15</b> (2): p. 471.
543 544	50.	Sprenger, N., et al., <i>Biology of human milk oligosaccharides: From basic science to clinical evidence</i> . J Hum Nutr Diet, 2022. <b>35</b> (2): p. 280-299.
545 546	51.	Meisel, J.S., et al., <i>Skin Microbiome Surveys Are Strongly Influenced by Experimental Design</i> . J Invest Dermatol, 2016. <b>136</b> (5): p. 947-956.
547 548	52.	Levitan, O., et al., <i>The gut microbiome–Does stool represent right?</i> Heliyon, 2023. <b>9</b> (3).