Optimizing Protocols for MicroRNA Profiling of Infant and Toddler Stool

- 3 David A. Armstrong 1,2, Shannon M. Soucy 3,4,5, Meghan E. Muse⁶, Fred W. Kolling IV⁵, Heidi W.
- 4 Trask⁵, Alexandra L. Howell ^{2, 8}, Hannah E Laue ⁹, Anne G. Hoen⁷, Jiang Gui ⁵, Brock C.
- 5 Christensen ^{5,6,7}, Juliette C. Madan ^{6,10,11}, Margaret R. Karagas ⁶, Caitlin G. Howe ⁶
- 7 1Department of Dermatology, Dartmouth Health, Lebanon, NH, USA
- 8 2 Research Service, V.A. Medical Center, White River Junction, VT, USA
- 9 3 Genomic Data Science Core, Center for Quantitative Biology (COBRE), Dartmouth College,
- 10 Hanover NH, USA

1

2

6

- 11 4 Department of Biomedical Data Science, Geisel School of Medicine, Dartmouth College,
- 12 Hanover NH, USA
- 13 5 Dartmouth Cancer Center, Geisel School of Medicine at Dartmouth, Lebanon, NH, USA
- 14 6 Department of Epidemiology, Geisel School of Medicine at Dartmouth, Lebanon, NH, USA
- 15 7 Department of Molecular and Systems Biology, Geisel School of Medicine at Dartmouth,
- 16 Lebanon, NH, USA
- 17 8 Department of Microbiology & Immunology, Geisel School of Medicine at Dartmouth.
- 18 Lebanon, NH, USA

23

24

- 19 9 Department of Biostatistics and Epidemiology, University of Massachusetts Amherst School
- 20 of Public Health and Health Sciences, Amherst, MA, USA
- 21 10 Department of Pediatrics, Geisel School of Medicine at Dartmouth, Lebanon, NH, USA
- 22 11 Department of Psychiatry, Geisel School of Medicine at Dartmouth, Lebanon, NH, USA

Abstract

25

26

27

28

29

30

31

32

33

34

35

36

37

38

39

40

41

42

43

44

45

46

47

48

49

Background: MicroRNAs (miRNAs) are increasingly being investigated as potential biomarkers for child development and disease. Although a growing number of studies are utilizing infant and toddler stool for transcriptomic analyses, no studies have compared protocols for preserving and extracting miRNAs from this specimen type, despite unique challenges, including abundant levels of RNAses and microbial RNA. Methods: To address this, we first compared three commercially available kits and four preservation methods for their ability to yield high quality RNA from infant and toddler stool (Phase 1). RNA quality was determined by fragment analyzer. Results: Of the three RNA extraction kits compared, Zymo BIOMICs yielded the highest overall RNA Quality Number (RQN) (median (range) RQN 9.4 (5.7-10.0)). Of the four preservation methods tested, stool collected in RNAlater and Zymo DNA/RNA Shield Fecal Collection Tubes yielded the highest two RQNs (median (range) RQN 9.8 (5.7-10.0) and 9.4 (5.4-10.0), respectively), which did not differ significantly from each other (p = 0.47). Second, using miRNA-seq we directly compared miRNA profiles for RNA extracted using the Zymo BIOMICs kit from paired aliquots of the same stool sample from four infants collected into RNAlater and Zymo DNA/RNA Shield Fecal Collection Tubes (Phase 2). Given that microbial sequences greatly outnumber human miRNAs in stool, reads were first classified as human versus microbial prior to aligning human-classified reads to miRBase v22.1. The percentage of reads classified as human and the percentage of human reads aligning to miRBase did not differ for samples collected in RNAlater versus Zymo Shield (p = 0.12 and p = 0.86. respectively). Furthermore, after multiple testing correction, normalized miRNA counts did not differ significantly between the two preservatives for any of the 42 human miRNAs detected across the eight samples. Conclusions: Collecting infant and toddler stool in either RNAlater or Zymo DNA/RNA Shield Fecal Collection Tubes, when paired with RNA extraction using the Zymo BIOMICs extraction kit, yielded high-quality RNA with similar human miRNA profiles.

Moreover, of the 42 miRNAs that were detected, several (i.e., miR-194a-3p, miR-200c-3p, miR-26a-5p) are thought to contribute to overall gut homeostasis. These findings may inform protocols for future studies that aim to profile miRNAs in infant and toddler stool to evaluate their potential utility as biomarkers for children's health.

Key Words: microRNA, Stool, Infant, Toddler, RNA Preservation, RNA Extraction, RNA Quality

Background

MicroRNAs (miRNAs) are a class of small non-coding RNAs, 19 to 24 nucleotides in length, that regulate a range of developmental and physiological processes by modulating gene expression through post-transcriptional RNA interference and other gene silencing pathways [1, 2]. MiRNAs have been shown to exert their influence by regulating dosage-sensitive genes for which small fluctuations in protein expression may have significant functional consequences [3]. Moreover, a single miRNA can target multiple genes and conversely, a single gene can be regulated by several different miRNAs [4]. As of the latest version of miRBase (version 22) 2,637 annotated human miRNA loci have been identified [5]. Collectively, these miRNAs have a profound impact on gene expression and are estimated to regulate up to 60% of protein-coding genes.

Increasingly, miRNAs have gained attention for their potential as diagnostic tools, and dysregulation of miRNAs has been implicated in various diseases and pediatric outcomes. For example, many studies have profiled miRNAs in diverse specimens with the goal of identifying potential biomarkers for pediatric cancers, such as neuroblastoma and hematological cancers [6], as well as infectious diseases [7] and immune disorders [8, 9]. MiRNAs also play important roles in maintaining a healthy pregnancy, and their levels in the placenta, maternal circulation, and cord blood have been associated with a number of pregnancy and birth outcomes, including

gestational diabetes, preeclampsia, low birth weight, and gestational duration, further illustrating their potential to serve as early biomarkers of child health [10-21].

Despite its utility for studying important aspects of children's health, including the developing microbiome, stool from infants and toddlers has not been used widely for studying miRNAs. Notably, more than 50 published studies have utilized adult stool for RNA extraction, but only nine published studies have focused on RNA from stool of young children [22-30]. Currently, several challenges exist for accurately profiling miRNAs in stool, such as the presence of components that inhibit downstream methodologies (e.g., bilirubin), which can make it difficult to isolate high-quality RNA from stool or to conduct downstream sequencing [31]. Another major challenge is the high prevalence of both host and microbiome-derived RNases resulting in RNA degradation [32, 33]. For transcriptomic applications, it has therefore been recommended that fixatives blocking *de novo* transcription and RNA decay be used for stool collection to preserve the RNA composition of the sample [34]. Differences in specimen handling can further compound this issue. This is a particularly important consideration when focusing on stool from infants and young toddlers, given that most children of this age are still using diapers, which may lead to substantial variability in the time between sample void and collection. RNA extraction efficiency from stool can also differ by kit, influencing RNA quality and downstream transcriptomic analyses.

Although a prior study by Reck, *et al.* [35] compared commercially available RNA preservation solutions and extraction kits for stool, it focused exclusively on samples from adults with the goal of informing best practices for metatranscriptomics. As of yet, there has been no comparison of preservatives or extraction kits for isolating RNA from stool of infants and young toddlers for the detection of human transcripts. While several recent studies have aimed to profile human miRNAs in stool from this early life stage, methods for stool collection and RNA extraction varied. Additionally, most studies did not report using any RNA stabilizing solution at the time of stool collection [22-30]. Thus, to inform best practices for future studies, the primary objectives of

this study were to (1) compare RNA quality of stool collected from infants and young toddlers (<2 years of age) in different preservative conditions, focusing on protocols used in prior published studies of either child or adult stool [24, 36-41] and, (2) compare the quality of RNA extracted from stool collected from infants of young toddlers using different commercially available and widely used stool RNA extraction kits. For protocols yielding high-quality RNA, we additionally aimed to (1) compare miRNA profiles across protocols and (2) identify the most abundant human miRNAs present in stool from infants and young toddlers to serve as a resource for future studies on this topic.

Methods

Sample collection

All study protocols were approved by the Dartmouth College Committee for the Protection of Human Subjects, which is the Institutional Review Board at Dartmouth College. Parents of participating children provided written informed consent, and stool samples and their associated data were de-identified.

In the first phase of the study, a total of six parent-child pairs were enrolled (Figure 1).

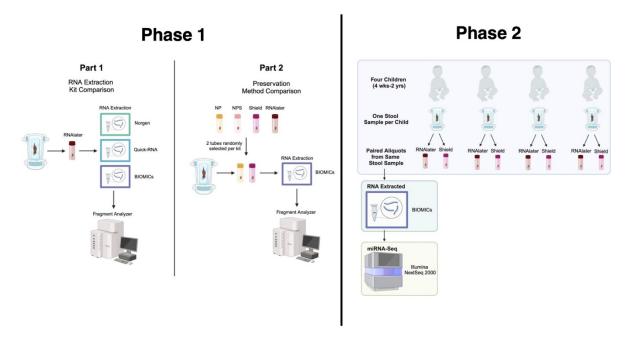


Figure 1

In the second phase of the study, a total of four parent-child pairs were enrolled (**Figure 1**). Inclusion criteria were the same for each phase of the study: children needed to be between 4 weeks and 2 years of age and using diapers. For both phases of the study, participants were recruited by word-of-mouth and flyer advertisements at Dartmouth College and local daycares. In the first phase of the study, the parent was told that they could participate up to six times and receive a \$25 gift card each time they participated. Upon enrollment, participants received up to six collection kits (depending on the number of times that they decided to participate), containing two of any of the following collection tube types: Stool Nucleic Acid Collection and Preservation Tubes (Norgen, Thorold, ON, Cat 45660) (Norgen), DNA/RNA Shield Fecal Collection Tubes (Zymo, Irvine, CA Cat R1011) (Shield), a Sarstdedt feces tube (Sarsdedt, Newton, NC, Cat

126

127

128

129

130

131

132

133

134

135

136

137

138

139

140

141

142

143

144

145

146

147

148

149

80.734.001) containing 9 mL of RNAlater (ThermoFisher Scientific, Waltham, MA Cat AM7020), or an empty Sarstdedt feces tube (no preservative). Tube types were randomized to each kit prior to distribution. For the second phase of the study, to ensure representation of different children, parents were told that they could participate once and received a \$25 gift card for participating. During this second phase, each participant received one stool collection kit, which included the two tube types yielding the two highest median RQN values during the first phase of the study.

Each stool collection kit included a specimen form and detailed written instructions for collecting the samples. As soon as the parent noticed that their child had a bowel movement, they were instructed to transfer a nickel-diameter ("marble-sized") mass of stool from the diaper into each of the provided tubes. These tubes were cylindrical screw-cap fecal collection containers with an attached spoon to assist with collection. The parent was then instructed to immediately cap the tube, place it in a provided biohazard bag, and store the specimen(s) in their home freezer until collection by the study team. If the tube contained a preservative, the participant was instructed to first invert the tube multiple times to ensure that the sample was completely immersed in the preservation fluid. During the first phase of the study, parents were told that for each tube they could collect stool from the same diaper or from different diapers. During the second phase of the study, parents were instructed to collect two stool aliquots from the same diaper into each of the two provided tubes. In addition to collecting stool from their child, parents were asked to complete the following information on the specimen form: the date and time of stool collection, the child's age (in months), the child's biological sex assigned at birth, whether the child was currently breastfed, and the brand and type of diaper used for stool collection. Although parents were not advised to use a specific type of diaper to facilitate collection, all participating parents reported using disposable diapers. Participants were instructed to coordinate transfer of the samples to the laboratory within 48 hours of collection. Samples were transported by study staff on cold packs to the COBRE Center for Molecular Epidemiology Laboratory at Dartmouth

151

152

153

154

155

156

157

158

159

160

161

162

163

164

165

166

167

168

169

170

171

172

173

College. Upon arrival to the laboratory, samples were immediately transferred to a -80°C freezer where they were stored until processing. The median (range) duration that the samples were stored in the participant's home freezer prior to being transferred to the laboratory's -80°C freezer was 46 (1-142) hours for Phase 1 of the study, and 25 (19-86) hours for Phase 2 of the study. The median (range) duration that samples were on cold packs during transport to the laboratory was 52 (23-99) minutes for Phase 1 of the study, and 23 (10-80) minutes for Phase 2 of the study. *RNA Extraction Kits, Extraction Protocols and RNA Quantitation.*

Three different stool RNA extraction kits were tested for their ability to isolate high quality RNA from infant/toddler stool: Stool Total RNA Purification Kit (Norgen Biotek 49500), (2) Quick-RNA Fecal/Soil Microbe Microprep Kit (Zymo R2040) (Quick-RNA) and (3) Zymo BIOMICs RNA Miniprep (Zymo R2001) (BIOMICs). These kits were selected based on the following criteria: [42] recent publications had reported using the kit for RNA isolation from either infant/toddler or adult stool [23, 41], (2) there was current market availability, as some kits referenced in prior literature were no longer available when the study was initiated [43], (3) the protocol involved a straightforward column-based format, and (4) the protocol did not include a phenol/chloroform extraction step. The latter two selection criteria were based on technical and safety considerations. Given prior work from Reck, et al. (2015), which identified RNAlater as the optimal stool RNA preservation solution for adult stool (based on RNA Integrity Number), infant/ stool samples collected in RNAlater were used for this initial kit comparison. Approximately 100-200 milligrams of stool were used for each extraction based on manufacturer recommendations. For the Norgen and Quick-RNA kits, RNA was extracted following the manufacturer's written instructions without any modifications. However, the BIOMICs kit protocol was modified in accordance with the manufacturer's technical support quidelines. Specifically, Step 4 of the Sample Preparation section of the manufacturer's protocol was modified by increasing the ratio

of RNA Lysis Buffer to supernatant from 1:1 to 3.6:1 (i.e., 1250 μ l Lysis Buffer: 350 μ l of sample supernatant). Additionally, within the <u>Total RNA Purification</u> section of the protocol (Step 1), the volume of 100% ethanol was adjusted to 1600 μ l to account for the increased Lysis Buffer input. These modifications were implemented to reduce sample precipitate and improve RNA yields. All other steps were followed according to the manufacturer's instructions. RNA was quantified by Qubit (ThermoFisher, Waltham, MA) and integrity (RQN) was measured using a fragment analyzer (Agilent Technologies, Santa Clara, CA) by the Genomics and Molecular Biology Shared Resource at the Dartmouth Cancer Center (Lebanon, NH).

miRNA Sequencing

MiRNA-sequencing (miRNA-seq) was conducted by the Genomics and Molecular Biology Shared Resource at the Dartmouth Cancer Center (RRID: SCR-021293) for the four sets of paired samples collected in phase 2 of the study (*n*=8 samples total). After RNA quantification by qubit and integrity measurement using a Fragment Analyzer instrument (Agilent), 100 ng of total RNA was used as input into the Qiaseq smRNA library preparation kit (Qiagen) and processed following the manufacturer's instructions, using 16 cycles for final library PCR. Samples were uniquely indexed and pooled for sequencing on a NextSeq 2000 instrument (Illumina), targeting 10 million reads per sample.

Data Pre-Processing

Data pre-processing was conducted by the Dartmouth Center for Quantitative Biology Genomic Data Sciences Core. Raw reads were processed with UMItools v1.1.5 [44] to remove umi barcodes. Reads were then classified using centrifuger v.1.0.4-r153 with a custom database built from refseq bacterial, archaeal, and viral genomes plus the representative human genome (GRCh38.p14) to distinguish human reads from microbial reads. Reads were further classified as human *versus* microbial using kneaddata v.0.12.0, with reads mapping to GRCh38 identified as

human. Reads that were assigned as human by both centrifuger and kneaddata were retained as the final confident set of human reads for downstream analyses.

All miRNA sequences were downloaded from release 22.1 of miRbase. The file was filtered for unique human miRNAs and any uracil bases were converted to thymine bases. The accompanying gff file was used to ascertain the genome coordinates for each sequence. To account for any transcriptional wobble and increasing mapping rates, an additional five base pairs of sequence were added to each end of the miRNA sequence in the reference file. The confident set of human reads identified using centrifuger and kneaddata were mapped against this padded reference using bowtie2 v2.4.4 with custom settings that increased the probability of seed matching to short miRNA reference sequences, reduced the size of the seed, reduced the size of the window for extending the seed, and enabled mismatches within the seed (-D 20 -R 3 -N 1 -L 12 -i S,1,0.50). The mapped reads were filtered with samtools v1.11 such that matches were required to be between 16 and 28 base pairs in length, with no gaps, fewer than two mismatches, and a MAPQ score greater than one. Reads were then deduplicated with UMItools v.1.1.5 before using Samtools v1.11 to quantify reads mapped to each miRNA. Mapped reads were visually inspected with Integrative Genomics Viewer (IGV) [45] v.2.8.7.

Statistical Analysis

Statistical analyses were conducted in R (v.4.3.1). The median and interquartile range values for RQN were calculated for each kit and preservation method. Kruskal-Wallis tests were used to assess where RQNs differed by kit and preservation method. If test results were statistically significant (p < 0.05), pairwise Wilcoxon tests were then conducted to identify which pairs of kits or which pairs of preservation methods differed.

MiRNA counts were normalized using EdgeR (v.3.42.4) with the Trimmed Mean of M-values (TMM) method to remove technical variation related to variability in library sizes. The pheatmap (v.1.0.12) package was used to explore how samples clustered [46]. MiRNAs were

included in the heatmap if at least one sample had a minimum of 10 raw read counts. Paired ttests were used to evaluate whether the percent of human reads or the percent of human reads
aligning to miRbase differed between the paired stool aliquots collected in the two preservative
types yielding the two highest RQNs, and to evaluate whether the normalized counts differed
significantly between these preservatives for any of the detectable miRNAs. High confidence
predicted target genes of the top 10 most abundant miRNAs were identified using mirDIP (v.5.2)
and gene set enrichment analyses for gene ontology (GO) biological processes (2023) and
PANTHER pathways (2016) of identified target genes were conducted using enrichR (v.3.2)
[47].

Results

Participant Demographics

For Phase 1 of the study, a total of 60 stool samples were collected from eight children four to 19 months of age. In Phase 2 of the study, a total of eight stool samples were collected from four children four to 21 months of age. Demographics of the children who participated in each phase are shown in **Table 1**.

Table 1. Participant Characteristics

	Phase 1 (<i>n</i> =8 infant donors)	Phase 2 (<i>n</i> =4 infant donors)
	Median (Range) or N (%)	Median (Range) or N (%)
Age (Months)	6.8 (4.0-19.0)	11.3 (4.0-21.0)
Female Sex	2 (25.0)	3 (75.0)
Breastfed	4 (50.0)	3 (75.0)

Phase 1: Comparison of Extraction Kits and Preservation Methods

The median RQN for each stool RNA extraction kit is shown in Figure 2A.

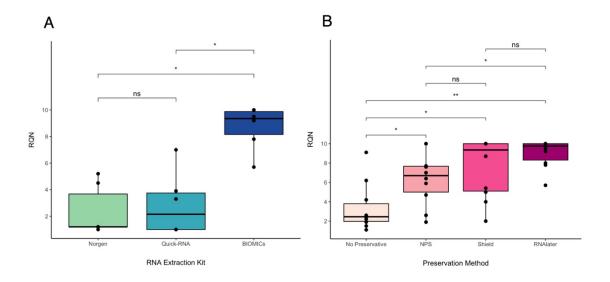


Figure 2

The BIOMICs kit yielded a higher RQN (median: 9.4, range: 5.7-10) than the Quick-RNA Kit (median: 2.2, range: 1.0-7.0) (p = 0.01) or the Norgen kit (median: 1.2, range: 1.0-5.2) (p = 0.01). Fragment analysis electropherograms are shown for each stool sample that had the RQN closest to the median RQN for each kit (**Additional File 1**). The median RQN for each preservative type are shown in **Figure 2B**. RNAlater yielded the highest median RQN (9.8, range: 5.7-10.0), which differed significantly from NPS (median: 6.7, range: 1.9-10.0) (p = 0.03) and No Preservative (median: 2.5, range: 1.1-9.1) (p < 0.01) but not Shield (median: 9.4, range: 2.0-10.0) (p = 0.47). Electropherograms are shown in **Additional File 2** for samples with RQNs falling closest to the median value for each preservative condition to illustrate what might reasonably be expected. For

all samples, electropherograms included peaks consistent with prokaryotic ribosomal 23, 16 and 5 S subunits with evidence of various degrees of RNA degradation as shown by small RNA peaks/fragments present between 140-1435 nucleotides in length.

Phase 2: Comparison of miRNA Profiles for Protocols Yielding High Quality RNA

For the eight samples that underwent miRNA-seq, library sizes ranged from 15.9 million to 20.4 million reads. Human reads represented less than 1% of total reads for all but one sample (Figure3).

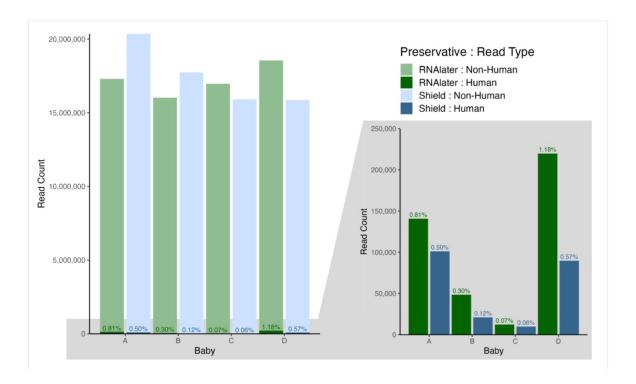
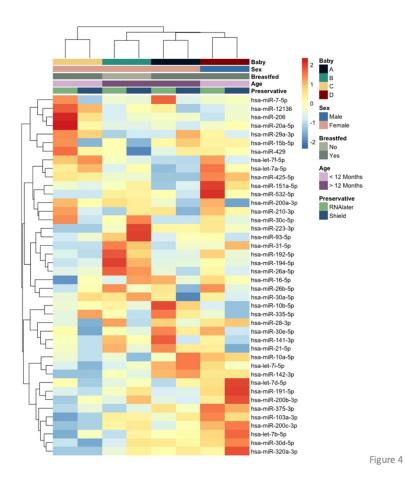


Figure 3

Although samples collected in RNAlater had a higher percentage of human reads (median: 0.56% range: 0.07-1.18%) compared with samples collected in Shield (median: 0.31%, range: 0.06%-0.57%), this difference was not statistically significant (p = 0.12). Of reads classified as human, 1.2%-4.4% aligned to miRbase across the eight samples with no differences by preservative (p = 0.12).

0.86). Most remaining human reads did not align uniquely (across the eight samples the percentage ranged from 81.3%-95.2%). For the remaining human reads that did align uniquely (4.8%-18.7% across the eight samples), the majority were classified as protein-coding or mitochondrial (Additional File 3, Supplemental Table 1).

A total of 42 human miRNAs were detectable across the eight samples based on a criterion of \geq 10 raw counts in at least one sample (**Additional File 4, Supplemental Table 2**). Unsupervised hierarchical clustering of these miRNAs demonstrated strong clustering by child but not preservative (**Figure 4**), and normalized counts did not differ significantly between the two preservatives for any of the 42 detectable miRNAs after multiple testing correction ($p_{\text{FDR}} \geq 0.05$).



The top 10 most abundant miRNAs, ranked by normalized counts, are presented in **Table 2**.

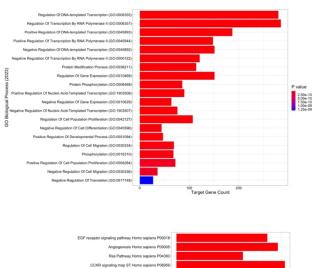
Table 2. Summary of Top 10 miRNAs Ranked by Normalized Counts

		Raw Counts		TMM Normalized		
Rank	miRNA	Length	Mean (SD)	Range	Mean (SD)	Range
1	hsa-miR-194-5p	22	150 (170)	11 - 443	5.9 (5.0)	1.5 - 15.8
2	hsa-miR-16-5p	22	93 (82)	21 - 284	4.2 (0.8)	2.8 - 5.0
3	hsa-miR-141-3p	22	80 (73)	20 - 230	3.5 (1.2)	2.2 - 5.6
4	hsa-miR-200c-3p	23	71 (80)	6 - 253	2.7 (1.5)	0.8 - 4.9
5	hsa-miR-21-5p	22	58 (54)	15 - 172	2.6 (0.8)	1.2 - 3.7
6	hsa-miR-191-5p	23	62 (73)	7 - 223	2.4 (1.7)	0.8 - 5.9
7	hsa-miR-26a-5p	22	46 (42)	12 - 129	2.0 (0.7)	1.3 - 3.2
8	hsa-let-7a-5p	22	44 (56)	16 - 180	1.9 (0.7)	0.9 - 3.0
9	hsa-let-7f-5p	22	40 (55)	9 - 173	1.7 (1.0)	0.7 - 2.9
10	hsa-miR-200a-3p	22	31 (32)	12 - 106	1.4 (0.4)	0.8 - 1.8

Gene Set Enrichment Analysis

MirDIP identified 1,340 unique high confidence predicted target genes for the top 10 most abundant miRNAs identified in infant/toddler stool. These predicted target genes were overrepresented ($p_{\text{FDR}} < 0.050$) in 446 GO Biological Processes and 27 PANTHER pathways, with the top pathways being Regulation of DNA-Templated Transcription and the epidermal growth

286 factor (EGF) Receptor Signaling Pathway, respectively (Figure 5).



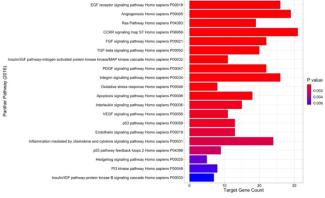


Figure 5

Discussion

MiRNAs in infant/toddler stool may provide unique insights into the mechanisms by which early factors influence children's health, such as the developing microbiome and dietary patterns. The primary goal of this study was to identify optimal collection and extraction methods for obtaining high-quality RNA from infant/toddler stool for miRNA profiling. A secondary goal was to gain an initial understanding of the miRNA transcripts present in stool during this early life stage to inform future research on their potential to serve as non-invasive biomarkers for pediatric health. Of the kits and preservatives evaluated, one extraction kit (BIOMICs) and two preservation solutions (RNAlater and Shield) yielded high-quality RNA from infant/toddler stool, and no differences were observed in the levels of specific miRNA transcripts across the two

preservatives. Using these collection and extraction protocols and a conservative approach for filtering out microbial reads, 42 unique mature human miRNA transcripts were identified in infant/toddler stool. A number of these miRNAs are known to be involved in the maintenance of gut barrier function (miR-194a-3p) [48], mucosal immunity (miR-200c-3p) [49], and cell proliferation (miR-26a-5p) [50, 51], which collectively contribute to gut homeostasis.

Over the last decade, 50 published studies have isolated RNA from adult stool samples. However, only nine studies have focused on stool from infants or young toddlers, and the majority either reported that they did not collect stool in a preservative [22-25, 30] or did not provide sufficient detail to determine if a preservative was used [26-29, 52]. Yet, use of a fixative that can preserve RNAs may be particularly important for stool which contains abundant amounts of RNases [35, 53]. This is an especially important consideration when studying a dual host-microbe environment, as microbial transcripts vastly outnumber human transcripts in stool, and degraded microbial RNA may have high sequence similarity to human miRNAs. Thus, degraded microbial RNA may be misclassified as human miRNAs. Minimizing RNA degradation is therefore important for downstream miRNA-seq analysis [34]. As expected, in the current study the highest degree of RNA degradation (based on RQN) was observed for infant/toddler stool samples that were collected without a preservative (median RQN: 2.5).

Currently, none of the nine published studies that specifically profiled miRNAs in infant/toddler stool reported use of an RNA preservation solution during stool collection, and the number of unique miRNA transcripts identified has varied substantially. For example, Carney *et al.* [23] used miRNA-seq for stool samples collected from infants 0-12 months of age to identify miRNAs associated with early growth and the gut microbiome and reported 53 detectable mature miRNAs. The full list of these miRNAs was not reported. However, 13 of the miRNAs that were associated with either infant growth or the gut microbiome overlapped with miRNAs that we also found to be detectable in infant/toddler stool. Furthermore, several of these

324

325

326

327

328

329

330

331

332

333

334

335

336

337

338

339

340

341

342

343

344

345

346

common miRNAs were the most abundant miRNAs identified in our study (e.g., miR-194-5p, miR-16-5p, miR-141-3p, miR-200c-3p, and miR-30d-5p). In contrast, Kazokova, et al. [27] reported identifying 1,918 detectable miRNAs in meconium and infant stool samples using miRNA-seq. The much larger number of miRNAs reported in their study could be due to both the stool collection protocol used (no preservative) and the lack of a filtering step to remove microbial transcripts, which could have led to some reads being misclassified as human miRNAs, as well as library depth and threshold of reporting. Recent studies in adults that used a preservative (NPS) and RNA extraction kit (Norgen) that did not yield high quality RNA in our study have also reported much larger numbers of detectable human miRNA transcripts [38, 40, 41]. While this may be due in part to differences in life stage, misclassification of degraded microbial RNA could be a contributing factor, as no RNA integrity measures were reported in these studies, and microbial reads were not removed prior to human miRNA annotation. Notably, all the preservative solutions evaluated here decreased RNA degradation compared to no preservative. However, RNAlater and Shield yielded the highest average RQN with median values of 9.8 and 9.4, respectively. High RQN values were observed despite potential lags between the sample being voided and the parent noticing the stool prior to transferring it to the respective preservative. Although samples collected in RNAlater generally yielded a higher percentage of reads being classified as human as compared with Shield, these

differences were not statistically significant. The percentage of human reads aligning to

miRbase also did not differ significantly by preservative, nor were any statistically significant

differences observed between RNAlater and Shield for the abundance of specific miRNA

transcripts. Furthermore, when comparing miRNA profiles of paired samples collected in

RNAlater versus Shield, stronger clustering was observed by child than by preservative type.

Collectively, these results suggest that while collecting infant/toddler stool in RNAlater may

potentially improve sensitivity for downstream miRNA analysis, infant/toddler stool collected in RNAlater and Shield generally yields similar miRNA profiles.

347

348

349

350

351

352

353

354

355

356

357

358

359

360

361

362

363

364

365

366

367

368

369

370

371

As expected, the majority of reads in infant/toddler stool were microbial (>98% for each sample). This finding is consistent with two prior studies, one in infants [27] that did not use a preservative for stool collection, and one in adults [40] that collected stool in NPS. Of the reads that were classified as human, most did not align uniquely, and some aligned to coding and mitochondrial genes, likely reflecting degraded RNA. However, across the eight stool samples profiled a total of 42 unique mature miRNA transcripts were detectable. Many of the most abundant miRNAs in infant/toddler stool have been associated with biological processes relevant to gut homeostasis, such as epithelial cell differentiation and proliferation, epithelial-tomesenchymal transition, maintenance of gut barrier function, and regulation of mucosal immunity. For example, the most abundant miRNA (miRNA-194) is known to be important for cell differentiation [48, 54] and is involved in epithelial-to-mesenchymal transition. A study of adults by Martinez, et al. [55] also reported that miRNA-16 is involved in dysregulation of intestinal immune system activation and epithelial barrier function, both of which contribute to the pathophysiology of irritable bowel syndrome. Additionally, Chen, et al. [56] showed that miR-141-3p can alleviate inflammatory response and oxidative damage in necrotizing enterocolitis through its regulation of inflammatory cytokines (IL-1β, IL-6, and TNF-α), and oxidative stress markers (MPO, MDA, and SOD). Moreover, Rawat, et al. has demonstrated that miR-200c-3p can alter the intestinal epithelial tight junction (TJ) barrier acting through the TJ protein occludin [49]. Finally, miR-21 and let-7 miRNAs have been shown to induce anti-inflammatory effects in response to Toll-like receptor mediated inflammatory responses [52, 57, 58]. Target genes of the top 10 most abundant miRNAs in infant/toddler stool were enriched in GO biological processes involved in a very broad range of cellular activities (e.g., DNA-templated transcription). However, several of the enriched PANTHER pathways, including EGF receptor,

Ras, and MAP kinase signaling, play important roles in regulating intestinal development and intestinal barrier function. Thus, while a limited number of human miRNAs with generally low abundance were identified in infant/toddler stool, the specific miRNAs present may play important roles in intestinal development and gut homeostasis and have the potential to serve as useful biomarkers of child intestinal health.

372

373

374

375

376

377

378

379

380

381

382

383

384

385

386

387

388

389

390

391

392

393

394

395

396

Strengths of this study include comprehensive miRNA profiling using miRNA-seg and the collection of paired stool aliquots from the same diaper into two different preservatives, such that miRNA profiles could be directly compared across these two conditions. There are also several important considerations. First, it is possible that the approach used to distinguish human from microbial reads may have underestimated the true number of human miRNAs present in infant/toddler stool and their abundance. However, by using this conservative approach we were able to identify human miRNAs in infant/toddler stool with high confidence. This is important given the large quantities of microbial RNA present in stool that could be misclassified as human RNA when degraded. Notably, this study was designed to evaluate mature miRNAs given the growing interest in leveraging these as potential biomarkers of child health and development. However, pre-miRNAs and other classes of small RNAs have also been reported in stool [23, 27]. It will therefore be important to conduct future studies that compare these protocols for other classes of small RNAs. Finally, it is possible that this study was underpowered to quantify differences in levels of specific miRNA transcripts between samples collected in RNAlater versus the Shield preservative. There could be value in conducting future studies that collect a larger number of paired stool samples in these two preservatives to determine if collection in RNAlater improves the yield of low abundance miRNAs.

398

399

400

401

402

403

404

405

406

407

408

409

410

411

412

413

414

415

416

417

418

419

420

Conclusions Through this initial study, we identified two protocols that yield high-quality RNA for stool collected from infants and young toddlers. We also confirmed the presence of 42 mature human miRNAs in infant/toddler stool, many of which have known roles in gut homeostasis. This information can be used to inform the future collection of stool from young children to investigate the potential of these miRNAs to serve as non-invasive biomarkers for pediatric health. **List of Abbreviations** EGF- epidermal growth factor, miRNA – microRNA, NP – No Preservative, NPS – Norgen Preservative Solution, Quick-RNA – Zymo Quick-RNA Fecal/Soil Microbe Microprep Kit, RQN – RNA Quality Number. Shield – Zymo DNA/RNA Shield Fecal Collection Tubes and Preservation Solution, TMM - Trimmed Mean of M-Values **Declarations** Ethics approval and consent to participate. All protocols were reviewed and approved by the Committee for the Protection of Human Subjects (CPHS), which is the Institutional Review Board for Dartmouth College. All participants provided written informed consent prior to participating. Consent for publication. This manuscript does not include any identifiable data from individual study participants. However, study participants consented to their use of their data for publications resulting from this research. Availability of data and materials. The datasets created and analyzed for this study are available from the corresponding author on reasonable request. However, requests for data access will require additional review by the Dartmouth College CPHS.

422

423

424

425

426

427

428

429

430

431

432

433

434

435

436

437

438

439

440

441

442

443

Competing interests. All authors declare that they have no competing interests. Funding. The work presented in this paper was supported by a Pilot Program within the Dartmouth COBRE Center for Molecular Epidemiology (P30GM149408, P20GM104416). miRNA-seg was carried out in the Genomics and Molecular Biology Shared Resource (RRID:SCR 021293) at Dartmouth which is supported by an NCI Cancer Center Support Grant (5P30CA023108) and NIH award (P20GM130454). Authors' contributions. CGH conceptualized and designed the study; oversaw data acquisition, analysis, and interpretation of the data; and contributed to writing the initial draft of the paper. DAA contributed to the design of the study; data acquisition; interpretation of the data; and writing the initial draft of the paper. SMS contributed to data analysis and interpretation of the data and substantially revised the paper. MEM contributed to data analysis, interpretation of the data, and contributed to writing the initial draft of the paper. FWK contributed to data acquisition. interpretation of the data, and substantially revised the paper. HWT contributed to data acquisition. HEL contributed to the interpretation of the data and substantially revised the paper. AGH contributed to the interpretation of the data and substantially revised the paper. JG contributed to interpretation of the data and substantially revised the paper. BCC, JCM, ALH, and MRK substantially revised the paper. References: Chen X, Liang H, Zhang J, Zen K, Zhang CY: Secreted microRNAs: a new form of 1. intercellular communication. Trends Cell Biol 2012, 22(3):125-132. 2. Wang J, Chen J, Sen S: MicroRNA as Biomarkers and Diagnostics. J Cell Physiol 2016, **231**(1):25-30.

444	3.	Mehta A, Baltimore D: MicroRNAs as regulatory elements in immune system logic. Nat
445		Rev Immunol 2016, 16 (5):279-294.
446	4.	Hashimoto Y, Akiyama Y, Yuasa Y: Multiple-to-multiple relationships between microRNAs
447		and target genes in gastric cancer. PLoS One 2013, 8(5):e62589.
448	5.	Kozomara A, Birgaoanu M, Griffiths-Jones S: miRBase: from microRNA sequences to
449		function. Nucleic Acids Res 2019, 47(D1):D155-D162.
450	6.	Carvalho de Oliveira J, Molinari Roberto G, Baroni M, Bezerra Salomao K, Alejandra Pezuk
451		J, Sol Brassesco M: MiRNA Dysregulation in Childhood Hematological Cancer. Int J Mol
452		Sci 2018, 19 (9).
453	7.	Jia HL, Liu CW, Zhang L, Xu WJ, Gao XJ, Bai J, Xu YF, Xu MG, Zhang G: Sets of serum
454		exosomal microRNAs as candidate diagnostic biomarkers for Kawasaki disease. Sci Rep
455		2017, 7 :44706.
456		
	8.	Jeong HR, Hwang IT: MicroRNAs as novel biomarkers for the diagnosis and treatment of
457	8.	Jeong HR, Hwang IT: MicroRNAs as novel biomarkers for the diagnosis and treatment of pediatric diseases. Clin Exp Pediatr 2024, 67(3):119-125.
457 458	 8. 9. 	
		pediatric diseases. Clin Exp Pediatr 2024, 67(3):119-125.
458		pediatric diseases. Clin Exp Pediatr 2024, 67(3):119-125. Tiwari A, Wang AL, Li J, Lutz SM, Kho AT, Weiss ST, Tantisira KG, McGeachie MJ: Seasonal
458 459		pediatric diseases. Clin Exp Pediatr 2024, 67(3):119-125. Tiwari A, Wang AL, Li J, Lutz SM, Kho AT, Weiss ST, Tantisira KG, McGeachie MJ: Seasonal Variation in miR-328-3p and let-7d-3p Are Associated With Seasonal Allergies and
458 459 460	9.	pediatric diseases. Clin Exp Pediatr 2024, 67(3):119-125. Tiwari A, Wang AL, Li J, Lutz SM, Kho AT, Weiss ST, Tantisira KG, McGeachie MJ: Seasonal Variation in miR-328-3p and let-7d-3p Are Associated With Seasonal Allergies and Asthma Symptoms in Children. Allergy Asthma Immunol Res 2021, 13(4):576-588.

464 11. Cook J, Bennett PR, Kim SH, Teoh TG, Sykes L, Kindinger LM, Garrett A, Binkhamis R, 465 MacIntyre DA, Terzidou V: First Trimester Circulating MicroRNA Biomarkers Predictive of 466 Subsequent Preterm Delivery and Cervical Shortening. Sci Rep 2019, 9(1):5861. Dinesen S, El-Faitarouni A, Dalgaard LT: Circulating microRNAs associated with 467 12. 468 gestational diabetes mellitus: useful biomarkers? J Endocrinol 2023, 256(1). 469 13. Fallen S, Baxter D, Wu X, Kim TK, Shynlova O, Lee MY, Scherler K, Lye S, Hood L, Wang K: 470 Extracellular vesicle RNAs reflect placenta dysfunction and are a biomarker source for 471 preterm labour. J Cell Mol Med 2018, 22(5):2760-2773. 472 14. Garcia-Beltran C, Carreras-Badosa G, Bassols J, Malpique R, Plou C, de Zegher F, Lopez-473 Bermejo A, Ibanez L: microRNAs in newborns with low birth weight: relation to birth size and body composition. *Pediatr Res* 2022, **92**(3):829-837. 474 475 15. Ghosh S, Thamotharan S, Fong J, Lei MYY, Janzen C, Devaskar SU: Circulating extracellular 476 vesicular microRNA signatures in early gestation show an association with subsequent clinical features of pre-eclampsia. Sci Rep 2024, 14(1):16770. 477 478 16. Howe CG, Foley HB, Kennedy EM, Eckel SP, Chavez TA, Faham D, Grubbs BH, Al-Marayati 479 L, Lerner D, Suglia S et al: Extracellular vesicle microRNA in early versus late pregnancy 480 with birth outcomes in the MADRES study. Epigenetics 2022, 17(3):269-285. 481 17. Hromadnikova I, Dvorakova L, Kotlabova K, Krofta L: The Prediction of Gestational 482 Hypertension, Preeclampsia and Fetal Growth Restriction via the First Trimester 483 Screening of Plasma Exosomal C19MC microRNAs. Int J Mol Sci 2019, 20(12). Kochhar P, Vukku M, Rajashekhar R, Mukhopadhyay A: microRNA signatures associated 484 18. 485 with fetal growth restriction: a systematic review. Eur J Clin Nutr 2022, 76(8):1088-1102.

486	19.	Kondracka A, Stupak A, Rybak-Krzyszkowska M, Kondracki B, Oniszczuk A, Kwasniewska A:
487		MicroRNA Associations with Preterm Labor-A Systematic Review. Int J Mol Sci 2024,
488		25 (7).
489	20.	Menon R, Debnath C, Lai A, Guanzon D, Bhatnagar S, Kshetrapal PK, Sheller-Miller S,
490		Salomon C, Garbhini Study T: Circulating Exosomal miRNA Profile During Term and
491		Preterm Birth Pregnancies: A Longitudinal Study. Endocrinology 2019, 160(2):249-275.
492	21.	Rodosthenous RS, Burris HH, Sanders AP, Just AC, Dereix AE, Svensson K, Solano M, Tellez-
493		Rojo MM, Wright RO, Baccarelli AA: Second trimester extracellular microRNAs in
494		maternal blood and fetal growth: An exploratory study. Epigenetics 2017, 12(9):804-810.
495	22.	Bennett WE, Jr., Gonzalez-Rivera R, Shaikh N, Magrini V, Boykin M, Warner BB, Hamvas A,
496		Tarr PI: A method for isolating and analyzing human mRNA from newborn stool. J
497		Immunol Methods 2009, 349 (1-2):56-60.
498	23.	Carney MC, Zhan X, Rangnekar A, Chroneos MZ, Craig SJC, Makova KD, Paul IM, Hicks SD:
499		Associations between stool micro-transcriptome, gut microbiota, and infant growth. ${\it J}$
500		Dev Orig Health Dis 2021, 12 (6):876-882.
501	24.	Espira LM, Lee GO, Baye K, Jones AD, Love NG, Eisenberg JNS: Stool biomarkers as
502		measures of enteric pathogen infection in infants from Addis Ababa informal
503		settlements. PLoS Negl Trop Dis 2023, 17(2):e0011112.
504	25.	Ferro: A short-term, randomized, controlled, feasibility study of the effects of different
505		vegetables on the gut microbiota and microRNA expression in infants. Frontiers
506		Microbiomes 2024, 3.

507	26.	Kaeffer B, des Robert C, Alexandre-Gouabau MC, Pagniez A, Legrand A, Amarger V, Kuster
508		A, Piloquet H, Champ M, le Huerou-Luron I et al: Recovery of exfoliated cells from the
509		gastrointestinal tract of premature infants: a new tool to perform "noninvasive
510		biopsies?". Pediatr Res 2007, 62 (5):564-569.
511	27.	Kazakova P, Abasolo N, de Cripan SM, Marques E, Cereto-Massague A, Garcia L, Canela N,
512		Tormo R, Torrell H: Gut Microbiome and Small RNA Integrative-Omic Perspective of
513		Meconium and Milk-FED Infant Stool Samples. Int J Mol Sci 2023, 24(9).
514	28.	Knight JM, Davidson LA, Herman D, Martin CR, Goldsby JS, Ivanov IV, Donovan SM, Chapkin
515		RS: Non-invasive analysis of intestinal development in preterm and term infants using
516		RNA-Sequencing. Sci Rep 2014, 4:5453.
517	29.	Ng PC, Chan KYY, Lam HS, Wong RPO, Ma TPY, Sit T, Leung KT, Chan LCN, Pang YLI, Cheung
518		HM et al: A Prospective Cohort Study of Fecal miR-223 and miR-451a as Noninvasive and
519		Specific Biomarkers for Diagnosis of Necrotizing Enterocolitis in Preterm Infants.
520		Neonatology 2020, 117 (5):555-561.
521	30.	Singh A, Potani I, Griswold SP, Suri D, Langlois B, Shen Y, Walton SM, Kwan Ho Chui K,
522		Manary MJ, Webb P et al: Host Fecal mRNAs Predicted Environmental Enteric
523		Dysfunction among Children with Moderate Acute Malnutrition in Sierra Leone. Am J
524		Trop Med Hyg 2021, 105 (5):1376-1382.
525	31.	Al-Soud WA, Ouis IS, Li DQ, Ljungh S, Wadstrom T: Characterization of the PCR inhibitory
526		effect of bile to optimize real-time PCR detection of Helicobacter species. FEMS Immunol
527		Med Microbiol 2005, 44 (2):177-182.

528	32.	Lu L, Li J, Moussaoui M, Boix E: Immune Modulation by Human Secreted RNases at the
529		Extracellular Space. Front Immunol 2018, 9:1012.
530	33.	Pickard JM, Nunez G: Pathogen Colonization Resistance in the Gut and Its Manipulation
531		for Improved Health. Am J Pathol 2019, 189 (7):1300-1310.
532	34.	Westermann AJ, Vogel J: Cross-species RNA-seq for deciphering host-microbe
533		interactions . <i>Nat Rev Genet</i> 2021, 22 (6):361-378.
534	35.	Reck M, Tomasch J, Deng Z, Jarek M, Husemann P, Wagner-Dobler I, Consortium C: Stool
535		metatranscriptomics: A technical guideline for mRNA stabilisation and isolation. BMC
536		Genomics 2015, 16 (1):494.
537	36.	Francavilla A, Gagliardi A, Piaggeschi G, Tarallo S, Cordero F, Pensa RG, Impeduglia A,
538		Caviglia GP, Ribaldone DG, Gallo G et al: Faecal miRNA profiles associated with age, sex,
539		BMI, and lifestyle habits in healthy individuals. Sci Rep 2021, 11(1):20645.
540	37.	Omran TA, Madso IL, Saether PC, Bemanian V, Tunsjo HS: Selection of optimal extraction
541		
		and RT-PCR protocols for stool RNA detection of colorectal cancer associated immune
542		and RT-PCR protocols for stool RNA detection of colorectal cancer associated immune genes. <i>Sci Rep</i> 2024, 14 (1):27468.
542 543	38.	
	38.	genes. Sci Rep 2024, 14 (1):27468.
543	38.	genes. <i>Sci Rep</i> 2024, 14 (1):27468. Pardini B, Ferrero G, Tarallo S, Gallo G, Francavilla A, Licheri N, Trompetto M, Clerico G,
543 544	38.	genes. <i>Sci Rep</i> 2024, 14 (1):27468. Pardini B, Ferrero G, Tarallo S, Gallo G, Francavilla A, Licheri N, Trompetto M, Clerico G, Senore C, Peyre S <i>et al</i> : A Fecal MicroRNA Signature by Small RNA Sequencing Accurately
543544545	38. 39.	genes. <i>Sci Rep</i> 2024, 14 (1):27468. Pardini B, Ferrero G, Tarallo S, Gallo G, Francavilla A, Licheri N, Trompetto M, Clerico G, Senore C, Peyre S <i>et al</i> : A Fecal MicroRNA Signature by Small RNA Sequencing Accurately Distinguishes Colorectal Cancers: Results From a Multicenter Study. <i>Gastroenterology</i>
543544545546		genes. <i>Sci Rep</i> 2024, 14 (1):27468. Pardini B, Ferrero G, Tarallo S, Gallo G, Francavilla A, Licheri N, Trompetto M, Clerico G, Senore C, Peyre S <i>et al</i> : A Fecal MicroRNA Signature by Small RNA Sequencing Accurately Distinguishes Colorectal Cancers: Results From a Multicenter Study . <i>Gastroenterology</i> 2023, 165 (3):582-599 e588.

550 40. Tarallo S, Ferrero G, De Filippis F, Francavilla A, Pasolli E, Panero V, Cordero F, Segata N, 551 Grioni S, Pensa RG et al: Stool microRNA profiles reflect different dietary and gut 552 microbiome patterns in healthy individuals. *Gut* 2022, **71**(7):1302-1314. 553 41. Tarallo S, Ferrero G, Gallo G, Francavilla A, Clerico G, Realis Luc A, Manghi P, Thomas AM, 554 Vineis P, Segata N et al: Altered Fecal Small RNA Profiles in Colorectal Cancer Reflect Gut 555 Microbiome Composition in Stool Samples. mSystems 2019, 4(5). 556 42. NCT05144386: (Clinical Trial). Safety and efficacy of EBT-101, a CRISPR based gene 557 **therapy for HIV-1**. *ClinicalTrialsgov*. 558 43. Zhu Y, Xu A, Li J, Fu J, Wang G, Yang Y, Cui L, Sun J: Fecal miR-29a and miR-224 as the 559 noninvasive biomarkers for colorectal cancer. Cancer Biomark 2016, 16(2):259-264. Smith T, Heger A, Sudbery I: UMI-tools: modeling sequencing errors in Unique Molecular 560 44. 561 Identifiers to improve quantification accuracy. Genome Res 2017, 27(3):491-499. 562 45. Robinson JT, Thorvaldsdottir H, Winckler W, Guttman M, Lander ES, Getz G, Mesirov JP: 563 Integrative genomics viewer. Nat Biotechnol 2011, 29(1):24-26. Kolde R: pheatmap: Pretty Heatmaps. https://githubcom/raivokolde/pheatmap 2018, R 564 46. package version 1.0.12. 565 566 Kuleshov MV, Jones MR, Rouillard AD, Fernandez NF, Duan Q, Wang Z, Koplev S, Jenkins 47. 567 SL, Jagodnik KM, Lachmann A et al: Enrichr: a comprehensive gene set enrichment 568 analysis web server 2016 update. Nucleic Acids Res 2016, 44(W1):W90-97. 569 Yu X, An J, Hua Y, Li Z, Yan N, Fan W, Su C: MicroRNA-194 regulates keratinocyte 48. 570 proliferation and differentiation by targeting Grainyhead-like 2 in psoriasis. Pathol Res 571 Pract 2017, **213**(2):89-97.

572	49.	Rawat M, Nighot M, Al-Sadi R, Gupta Y, Viszwapriya D, Yochum G, Koltun W, Ma TY: IL1B
573		Increases Intestinal Tight Junction Permeability by Up-regulation of MIR200C-3p, Which
574		Degrades Occludin mRNA. Gastroenterology 2020, 159(4):1375-1389.
575	50.	Yu XH, Liu SY, Li CF: TGF-beta2-induced NEAT1 regulates lens epithelial cell proliferation,
576		migration and EMT by the miR-26a-5p/FANCE axis. Int J Ophthalmol 2021, 14(11):1674-
577		1682.
578	51.	Li M, Xiao Y, Liu M, Ning Q, Xiang Z, Zheng X, Tang S, Mo Z: MiR-26a-5p regulates
579		proliferation, apoptosis, migration and invasion via inhibiting hydroxysteroid
580		dehydrogenase like-2 in cervical cancer cell. BMC Cancer 2022, 22(1):876.
581	52.	Bernstein DL, Jiang X, Rom S: let-7 microRNAs: Their Role in Cerebral and Cardiovascular
582		Diseases, Inflammation, Cancer, and Their Regulation. Biomedicines 2021, 9(6).
583	53.	Cardona S, Eck A, Cassellas M, Gallart M, Alastrue C, Dore J, Azpiroz F, Roca J, Guarner F,
584		Manichanh C: Storage conditions of intestinal microbiota matter in metagenomic
585		analysis. BMC Microbiol 2012, 12:158.
586	54.	Li J, He X, Wei W, Zhou X: MicroRNA-194 promotes osteoblast differentiation via
587		downregulating STAT1. Biochem Biophys Res Commun 2015, 460(2):482-488.
587 588	55.	downregulating STAT1. Biochem Biophys Res Commun 2015, 460(2):482-488. Martinez C, Rodino-Janeiro BK, Lobo B, Stanifer ML, Klaus B, Granzow M, Gonzalez-Castro
	55.	
588	55.	Martinez C, Rodino-Janeiro BK, Lobo B, Stanifer ML, Klaus B, Granzow M, Gonzalez-Castro

593

594

595

596

597

598

599

600

601

602

603

604

605

606

607

608

609

610

611

612

613

614

615

56. Chen H, Zeng L, Zheng W, Li X, Lin B: Increased Expression of microRNA-141-3p Improves Necrotizing Enterocolitis of Neonates Through Targeting MNX1. Front Pediatr 2020, **8**:385. 57. Barnett RE, Conklin DJ, Ryan L, Keskey RC, Ramjee V, Sepulveda EA, Srivastava S, Bhatnagar A, Cheadle WG: Anti-inflammatory effects of miR-21 in the macrophage response to peritonitis. J Leukoc Biol 2016, 99(2):361-371. 58. Chakrabarti M: Identification of human microRNAs targeting Pseudomonas aeruginosa genes by an in silico hybridization method. Infomatics in Medicine Unlocked 2022, 34. **Figure Legends** Figure 1. Study Design. Phase 1 of the study consisted of two steps: (1) comparing RNA quality when using three different RNA extraction kits for stool collected in RNAlater and (2) comparing RNA quality for RNA extracted from stool collected in four different preservation conditions, including no preservative (NP), with RNA extracted using the BIOMICs RNA extraction kit. For each step, RNA quality number was determined using a fragment analyzer. Phase 2 of the study entailed collecting paired aliquots from the same stool sample into RNAlater versus Shield for four infants. RNA was extracted using the BIOMICs RNA extraction

617

618

619

620

621

622

623

624

625

626

627

628

629

630

631

632

633

634

635

636

637

638

639

640

641

kit. MiRNAs were then quantified for each sample using miRNA-seg. (Figure created in Biorender). Figure 2. RNA Quality Number by RNA Isolation Kit (A) and Preservative Type (B). RNA was extracted from stool collected in RNAlater using three commercially available kits (A). RNA quality was determined based on RQN using a fragment analyzer. The highest median RQN (9.4) was observed for the BIOMICs extraction kit, followed by the Quick-RNA kit (2.2), followed by the Norgen kit (1.2) (n=6 samples per extraction kit). Next, RNA was extracted from samples stored in three different preservative solutions or in the absence of preservative using the BIOMICs kit (n=10 samples per collection protocol) (**B**). RNA from stool samples collected in RNAlater had the highest median RQN (9.8), followed by Shield (9.4), followed by NPS (6.7), followed by no preservative (2.5). *P<0.05, **P<0.01. Brackets are not shown if the difference was not statistically significant (P≥0.05) Additional Figure 1. Fragment Analyzer Electropherograms Comparing Isolation Kits. Representative fragment analyzer RNA electropherograms are shown for each RNA isolation kit: (A) Norgen, (B) Quick-RNA, (C) BIOMICs. Electropherograms for samples with an RQN closest to the median value for each kit are presented (Norgen: 1.2, Quick-RNA: RQN 2.2, BIOMICs: 9.4). The most prominent peaks are consistent with prokarvotic ribosomal subunits. The peak consistent with the 23S subunit migrated between 2875-3441 nucleotides (nt), the peak consistent with 16S subunit between 1572-1723 nt, and finally the peak consistent with 5S subunit migrated between 118-134 nt. Additional Figure 2. Fragment Analyzer Electropherograms Comparing Preservative **Type.** Representative fragment analyzer RNA electropherograms are shown for each preservation method: (A) No Preservative, (B) Norgen, (C) Shield, (D) RNAlater.

643

644

645

646

647

648

649

650

651

652

653

654

655

656

657

658

659

660

661

662

663

664

Electropherograms with the RQN value closest to the median value for each preservation method are shown (No Preservative: 2.5, Norgen: 6.7, Shield: 9.4, RNAlater: 9.8). All samples demonstrate peaks consistent with prokaryotic ribosomal 23, 16 and 5 S subunits. Additionally, each of the preservative solutions do show evidence consistent with some RNA degradation with small RNA peaks/fragments present between 140-1435 nt. However, the samples with the most abundant heterogenous RNA fragments were the samples stored in the absence of a preservation solution (A). Figure 3. Total Read Counts and Percent Classified as Human. Barplot showing total read counts and the percentage of reads classified as human for paired aliquots of infant stool transferred from four infants' (A, B, C, D) diapers into RNAlater and Shield preservatives. Percentages reflect the percentage of human reads for the sample. Figure 4: Scaled Heatmap of Detectable miRNAs in Infant Stool. Included miRNAs reflect the 42 miRNAs with 10 or more counts in at least one sample prior to normalization. The heatmap presents Z-score scaled counts for each miRNA. Manhattan distance was used for hierarchical clustering of both miRNAs and samples. Figure 5: GSEA for Target Genes of the 10 Most Abundant miRNAs for (A) GO biological processes and (B) PANTHER pathways. Gene set enrichment analysis was conducted for 1,340 unique high confidence target genes, identified via mirDIP (version 5.2), of the top 10 most abundant miRNAs. Benjamini-Hochberg-adjusted p-values are presented.