

# 

**Citation:** Altan E, Aiemjoy K, Phan TG, Deng X, Aragie S, Tadesse Z, et al. (2018) Enteric virome of Ethiopian children participating in a clean water intervention trial. PLoS ONE 13(8): e0202054. https://doi.org/10.1371/journal.pone.0202054

Editor: Ulrich Melcher, Oklahoma State University, UNITED STATES

Received: May 1, 2018

Accepted: July 26, 2018

Published: August 16, 2018

**Copyright:** © 2018 Altan et al. This is an open access article distributed under the terms of the Creative Commons Attribution License, which permits unrestricted use, distribution, and reproduction in any medium, provided the original author and source are credited.

Data Availability Statement: The genomes of viruses are available on the NCBI website; the accession numbers are given in Tables 1 and S1. The raw sequence data is available at NCBI's Short Reads Archive under GenBank accession number SRP120619.

**Funding:** The funders had no role in study design, data collection and analysis, decision to publish, or preparation of the manuscript. This work was entirely supported by funds from the Blood Systems Research Institute, the National Institutes of Health (NEI U10 EY016214, NEI K23EY019071, RESEARCH ARTICLE

# Enteric virome of Ethiopian children participating in a clean water intervention trial

Eda Altan<sup>1,2</sup>, Kristen Aiemjoy<sup>3,4</sup>, Tung G. Phan<sup>1,2</sup>, Xutao Deng<sup>1,2</sup>, Solomon Aragie<sup>5</sup>, Zerihun Tadesse<sup>5</sup>, Kelly E. Callahan<sup>6</sup>, Jeremy Keenan<sup>3</sup>, Eric Delwart<sup>1,2</sup>\*

1 Blood Systems Research Institute, San Francisco, California, United States of America, 2 University of California San Francisco, Department of Laboratory Medicine, San Francisco, California, United States of America, 3 Francis I. Proctor Foundation, University of California San Francisco, San Francisco, California, United States of America, 4 Department of Epidemiology and Biostatistics, University of California San Francisco, California, United States of America, 6 The Carter Center, Atlanta, Georgia, United States of America

\* Eric.Delwart@ucsf.edu

# Abstract

# Background

The enteric viruses shed by different populations can be influenced by multiple factors including access to clean drinking water. We describe here the eukaryotic viral genomes in the feces of Ethiopian children participating in a clean water intervention trial.

# Methodology/principal findings

Fecal samples from 269 children with a mean age of 2.7 years were collected from 14 villages in the Amhara region of Ethiopia, half of which received a new hand-dug water well. Feces from these villages were then analyzed in 29 sample pools using viral metagenomics. A total of 127 different viruses belonging to 3 RNA and 3 DNA viral families were detected. Picornaviridae family sequence reads were the most commonly found, originating from 14 enterovirus and 6 parechovirus genotypes plus multiple members of four other picornavirus genera (cosaviruses, saliviruses, kobuviruses, and hepatoviruses). Picornaviruses with nearly identical capsid VP1 were detected in different pools reflecting recent spread of these viral strains. Next in read frequencies and positive pools were sequences from the Caliciviridae family including noroviruses GI and GII and sapoviruses. DNA viruses from multiple genera of the Parvoviridae family were detected (bocaviruses 1-4, bufavirus 3, and dependoparvoviruses), together with four species of adenoviruses and common anelloviruses shedding. RNA in the order Picornavirales and CRESS-DNA viral genomes, possibly originating from intestinal parasites or dietary sources, were also characterized. No significant difference was observed between the number of mammalian viruses shed from children from villages with and without a new water well.

# Conclusions

We describe an approach to estimate the efficacy of potentially virus transmission-reducing interventions and the first complete (DNA and RNA viruses) description of the enteric viromes



and NICHD F31 HD088070-01A1), the Sara & Evan Williams Foundation, the Bernard Osher Foundation, That Man May See, the Harper Inglis Trust, the Bodri Foundation, the South Asia Research Fund, Research to Prevent Blindness, and the Carter Center Ethiopia. There was no additional external funding received for this study.

**Competing interests:** The authors have declared that no competing interests exist.

of East African children. A wide diversity of human enteric viruses was found in both intervention and control groups. Mammalian enteric virome diversity was not reduced in children from villages with a new water well. This population-based sampling also provides a baseline of the enteric viruses present in Northern Ethiopia against which to compare future viromes.

# Introduction

Limited access to clean drinking water is an enduring health hazard that can exacerbate enteric and malnutrition problems. Diarrhea also remains one of the leading causes of mortality in children from low and medium income countries [1].

Clean water and sanitation play an essential role in protecting human health during crisis and disease outbreaks. According to a WHO/UNICEF 2014 report, clean water sources were not available in 58% of Ethiopian rural areas. A National Water, Sanitation, and Hygiene Inventory from 2012 reported that only 32% of health facilities in Ethiopia have access to safe water. In Ethiopia, the children under five had a mortality rate of 59 deaths per 1,000 live births and diarrhea was the third leading cause of mortality in 2015 [2–5].

In this study we characterize the enteric viromes in children under-five years old in the Amhara region of Ethiopia in the context of a cluster-randomized trial of a water improvement intervention for trachoma. Description of these fecal viruses provide a baseline against which future viromes from the same population can be compared to monitor longitudinal changes in the composition and prevalence of circulating viruses.

## Materials and methods

#### Study design

The virome analysis described in this report is a non-pre-specified secondary analysis from a cluster-randomized trial of a water improvement intervention for trachoma (clinicaltrials.gov NCT02373657). The primary outcome for the trial was ocular chlamydia. Fourteen communities in rural Ethiopia were selected for the trial, with half randomized to a water point intervention and the other half randomized to no intervention. The intervention consisted of building a new hand dug water well in each community. Stool samples were collected from 0–5 year-old children during the final 24-month study visit of the trial.

#### Study population and selection

The cluster-randomized trial study took place in a rural agrarian region in the Goncha Siso Enese district (*woreda*) of Amhara, Ethiopia. *Woredas* in Ethiopia are divided into administrative units known as *kebeles*, and at the time of the study, *kebeles* were subdivided into government-defined units known as state teams. State teams, which consisted of approximately 275 people in our study area, are termed communities for this report.

Communities had been participating in a series of cluster-randomized trials testing different mass drug administration strategies for trachoma elimination since 2006 (clinicaltrials.gov #NCT00322972). As part of these trials, 72 communities had received some form of mass azi-thromycin distribution for trachoma at least annually from 2010 to 2013. Methods for these trials are described in detail elsewhere [6]. From these 72 communities we randomly selected fourteen that were relatively accessible (<1 hour walk from the farthest place a four-wheel drive vehicle could reach) and had poor access to water (only one or no water well). The baseline visit

for the trial occurred in April 2014 and the final study visit occurred in April 2016. April is the dry season in this region.

A door-to-door population census was taken in all communities before the study visit. All children aged 0–5 years (i.e., up to but not including the sixth birthday) enumerated on the census were eligible to participate in the study.

#### Stool sample collection

Caregivers were instructed to have their child defecate in a plastic child's potty chair lined with a black plastic bag. For children unable to produce a stool within two hours, supplies were provided to the caregiver, with instructions to collect stool at home the following morning, and bring it to a collection site the following day at a designated time.

At the time the stool sample was returned, 0.5ml of stool was placed in a 1ml plastic tube. The sample was immediately put on ice and transferred to a -20 Celsius freezer at the end of the day. At the completion of the sample collection, in early May 2016, all samples were transferred to Bahir Dar Regional Laboratory (Bahir Dar, Ethiopia) and kept at -20 Celsius until they were shipped to University of California, San Francisco in February 2017.

#### Viral metagenomics

Approximately 0.1 gram of fecal matter from 269 stool samples were assembled into 29 pools of six to twelve samples either from villages with or without water improvement. To reduce possible batch effects, pools from the control and the intervention groups were processed in an inter-digitated manner. Pools were first clarified by 15,000g centrifugation for ten minutes, and supernatants filtered using a 0.45-µm filter (Millipore). Nucleic acids in the filtrates were digested with a mixture of nuclease enzymes and viral nucleic acids were then extracted using a Maxwell 16 automated extractor (Promega) [7]. Random RT-PCR followed by Nextera<sup>™</sup> XT Sample Preparation Kit (Illumina) were used to generate a library for Illumina MiSeq (2 × 250 bases) with dual barcoding as previously described [8, 9].

#### **Bioinformatic analyses**

**Overview.** An in-house analysis pipeline was used to analyze sequence data. Raw data was first pre-processed by subtracting human and bacterial sequences, duplicate sequences, and low quality reads. The reads were de novo assembled and contigs and singlet reads were aligned against a customized viral proteome database using BLASTx. Candidate viral hits were then compared to a non-virus non-redundant (nr) protein database to remove false positive viral hits.

**Database compilation.** To electronically subtract non-viral sequences the human reference genome sequence (hg38) and mRNA sequences were first concatenated. Bacterial nucleotide sequences were also extracted from NCBI nt fasta file [10] based on NCBI taxonomy [11]. Human and bacterial nucleotide sequences were then compiled into bowtie2 (version 2.2.4) databases [12] for human and bacterial sequences subtraction. Two databases were constructed: 1) virus BLASTx database was compiled using NCBI virus reference proteome [13] to which was added viral protein sequences from NCBI nr fasta file (based on annotation taxonomy in Virus Kingdom); and 2) a non-virus nr (NVNR) database was compiled using non-viral protein sequences extracted from NCBI nr fasta file (based on annotation taxonomy excluding Virus Kingdom). Repeats and low-complexity regions were masked using segmasker from blast+ suite (version 2.2.7)[14].

**Preprocessing.** Paired-end reads of 250 bp generated by MiSeq were debarcoded using vendor software from Illumina. Human host reads and bacterial reads are identified and removed by mapping the raw reads to human reference genome hg38 and bacterial genomes

release 66 using bowtie2 in local search mode with other parameters set as default, requiring finding 60bp aligned segments with at most 2 mismatches and no gaps [12]. Reads were considered duplicates if 5bp to 55bp from 5' end are identical. One random copy of duplicates was kept. Duplicate sequences were replaced with sequence 'A' as a place holder; preserving the original order of the paired-end files for paired-end sequence assembly. A paired-end sequence record is removed if both paired reads are deleted duplicates. Low sequencing quality tails were trimmed using Phred quality score 20 as the threshold. Adaptor and primer sequences were trimmed using the default parameters of VecScreen using default parameters [14].

**De novo assembly.** We developed a strategy that integrates the sequential use of various de Bruijn graph (DBG) and overlap-layout-consensus assemblers (OLC) with a novel partitioned sub-assembly approach called ENSEMBLE [15].

Both single reads (singlets) and de novo assembled contiguously overlapping reads (contigs) were first analyzed using BLASTx (version 2.2.7) for translated protein sequence similarity to all viral protein sequences in GenBank's virus RefSeq database plus protein sequences taxonomically annotated as viral in GenBank's non-redundant database. An initially nonstringent E-value cutoff of <0.01 was selected in order to identify even weakly matching potential viral sequences. To remove background due to sequence misclassification these initial viral hits were then compared to all protein sequences in NR using the program DIA-MOND (version 0.9.6) and retained only when the top hit was to a sequence annotated as viral. A threshold E score of <10<sup>-10</sup> was then used to ensure only reads with high levels of similarity to viral proteins were counted. Further analyses focused on eukaryotic viruses.

To align singlets and contigs to reference viral genomes from GenBank and generate complete or partial genome sequences the Geneious R10 program was used. For plotting read numbers to different viral clades the number of reads with BLASTx E score  $<10^{-10}$  to named viruses was divided by the total number of reads multiplied by  $10^4$  then log 10 transformed to determine the size of the colored circles using Excel.

#### **Phylogenetic analyses**

Phylogenetic trees were constructed from VP1 amino acid sequence for picornaviruses or nucleotide for norovirus RdRp region. Evolutionary analyses were conducted in MEGA6 using the Neighbor-Joining method [16]. Percentage bootstrap values from 1000 replicate trees are shown [17]. All positions with less than 95% site coverage were eliminated.

# Statistical methods

All statistical analyses were performed in R version 3.4.2 (R Foundation for Statistical Computing, Vienna, Austria) using R Studio version 1.1.383. The number of virus matching singlets (E score  $<10^{-10}$ ) for each sample pool along with their viral taxonomic assignments and sample characteristics were analyzed using the 'phyloseq' package [18]. The 'phyloseq' package was used to calculate alpha diversity measures, which were then plotted using boxplots in 'ggplot'[19]. A Kruskal-Wallis test was then used to evaluate if differences in alpha diversity measures were statistically significant between the control and intervention groups.

# Data availability

The genomes of viruses are available on the NCBI website; the accession numbers are given in Tables 1 and S1. The raw sequence data is available at NCBI's Short Reads Archive under Gen-Bank accession number SRP120619.

| Family         | Genus       | Species       | Genotypes          | Pool<br>ID# | GenBank<br>accession<br>number | Length of genome<br>assembled (%<br>sequenced) | Reference genome<br>GenBank accession<br>number | Region of<br>reference<br>genome covered | Nucleotide<br>similarity with<br>reference | aa idendity<br>to VP1 |
|----------------|-------------|---------------|--------------------|-------------|--------------------------------|--|---|--|--|-----------------------|
| Picornaviridae | Enterovirus | Enterovirus A | Coxsackievirus A6  | P11         | MG692404                       | 3597 (100%)                                    | KX064297  | 3712_7309                                | 84.7%                                      |                       |
|                |             |               |                    | P20         | MG692405                       | 3729 (61.1%)                                   | KX064297  | 922_7023                                 | 82.1%                                      |                       |
|                |             |               |                    | P22         | MG692406                       | 2782 (76.6%)                                   | KX064297  | 4216_7278                                | 84.8%                                      |                       |
|                |             |               | Coxsackievirus A14 | P25         | MG692407                       | 5425 (77.7%)                                   | KP036482  | 197_7176                                 | 82.6%                                      |                       |
|                |             |               | Coxsackievirus A16 | P4          | MG692408                       | 2203 (82.8%)                                   | JQ746670  | 1950_4673                                | 85.0%                                      |                       |
|                |             |               |                    | P11         | MF990299                       | 2607 (100%)                                    | JQ746670  | 1068_3674                                | 85.9%                                      | 99.3%                 |
|                |             |               |                    | P12         | MF990300                       | 7225 (100%)                                    | JQ746670  | $101_{-}7325$                            | 82.6%                                      | 99.3%                 |
|                |             | Enterovirus B | Echovirus E6       | P17         | MG692409                       | 4713 (77.5%)                                   | KT353725  | 23_6013                                  | 85.4%                                      |                       |
|                |             |               |                    | P22         | MG692410                       | 2315 (73.9)                                    | HM852755  | 3631_6762                                | 83.2%                                      |                       |
|                |             |               | Echovirus E14      | P14         | MF990302                       | 6462 (100%)                                    | AY302540  | $1_{-6462}$                              | 79.8%                                      | 93.6%                 |
|                |             |               |                    | P19         | MF990305                       | 7333 (99.2%)                                   | AY302540  | 1_6505                                   | 79.9%                                      | 93.6%                 |
|                |             |               | Echovirus E16      | P4          | MF990293                       | 7392 (100%)                                    | AY302542  | 24_7421                                  | 80.6%                                      | 97.2%                 |
|                |             |               |                    | P7          | MG525060-62                    | 891 (49.4%)                                    | KP289436  | 1131_2933                                | 80.4%                                      |                       |
|                |             |               | Echovirus E18      | P12         | MF990301                       | 7270 (100%)                                    | KX139457  | 91_7362                                  | 81.3%                                      | 94.8%                 |
|                |             |               |                    | P18         | MG692411                       | 1642 (64.2%)                                   | KX139456  | 1317_3871                                | 80.3%                                      |                       |
|                |             |               |                    | P26         | MG692412                       | 2982 (87.7%)                                   | KX139456  | 1311_4709                                | 80.7%                                      |                       |
|                |             |               | Echovirus E19      | P3          | MF990292                       | 7274 (100%)                                    | AY302544  | 70_7344                                  | 79.4%                                      | 92.4%                 |
|                |             |               |                    | P14         | MF990303                       | 3988 (99.2%)                                   | AY302544  | 1025_5053                                | 79.4%                                      | 92.1%                 |
|                |             |               | Echovirus E27      | P8          | MF990295                       | 7167 (100%)                                    | AY302551  | 207_7376                                 | 78.8%                                      | 89.2%                 |
|                |             | Enterovirus C | Coxsackievirus A1  | P8          | MF990294                       | 7160 (100%)                                    | AF499635  | 197_7357                                 | 83.2%                                      | 89.8%                 |
|                |             |               | Coxsackievirus A13 | P21         | MG692413                       | 3489 (65.4%)                                   | JF260922  | 1496_6832                                | 79.3%                                      |                       |
|                |             |               | Coxsackievirus A17 | 6d          | MF990296                       | 6215 (100%)                                    | AF499639  | 661_6875                                 | 80.9%                                      | 95.0%                 |
|                |             |               |                    | P18         | MG692414                       | 4076 (81.1%)                                   | AF499639  | 1216_6240                                | 79.4%                                      |                       |
|                |             |               |                    | P26         | MF990306                       | 3147 (58.3%)                                   | AF499639  | 1774_7164                                | 80.9%                                      | 93.4%                 |
|                |             |               |                    | P28         | MF990307                       | 6525 (100%)                                    | AF499639  | 748_7272                                 | 81.9%                                      | 95.0%                 |
|                |             |               | Coxsackievirus A20 | 6d          | MF990297                       | 6082(100%)                                     | DQ358078  | 803_6885                                 | 83.8%                                      | 97.6%                 |
|                |             |               |                    | P10         | MF990298                       | 6541 (100%)                                    | DQ358078  | 311_6852                                 | 83.3%                                      | 98.3%                 |
|                |             |               |                    | P15         | MG692415                       | 4040 (66.1%)                                   | DQ358078  | 732_6839                                 | 83.5%                                      |                       |
|                |             |               |                    | P16         | MF990304                       | 7280 (99.2%)                                   | DQ358078  | 55_7392                                  | 84.5%                                      | 98.0%                 |
|                |             |               | Enterovirus C99    | P20         | MF990308                       | 1950 (96.2%)                                   | EF015009  | 1296_3320                                | 81.6%                                      | 94%*                  |
|                |             |               |                    | P13         | MG560270                       | 4280 (68.9)                                    | EF015009  | 852_7061                                 | 82.4%                                      |                       |
|                | Cosavirus   | Cosavirus A   | cosavirus A_12     | P4          | MF621606                       | 3344 (68.3%)                                   | JN867774  | $1_{-690}$                               | 90.0%                                      | 96.8%*                |
|                |             |               |                    | P8          | MG692416                       | 1473 (50.4%)                                   | FJ438902  | 4069_6987                                | 90.9%                                      |                       |
|                |             |               |                    | P10         | MG692417                       | 900 (50.5)                                     | FJ438902  | 5635_7416                                | 88.0%                                      |                       |
|                |             |               | cosavirus A_8      | P11         | MF621609                       | 6047 (88.3%)                                   | JN867776  | 1_905                                    | 85.2%                                      | 98.2%*                |
|                |             |               | cosavirus A_5      | P12         | MF621608                       | 5728 (91.3%)                                   | JN867785  | $1_{-694}$                               | 85.0%                                      | 97%*                  |
|                |             |               |                    | P14         | MG692418                       | 336 (100%)                                     | FJ438904  | 1234_1599                                | 86.3%                                      |                       |
|                |             |               |                    | P16         | MG525054-56                    | 1179 (38.49%)                                  | FJ438902  | 4354_7416                                | 89.6%                                      |                       |
|                |             |               |                    | P21         | MF621610                       | 1987 (56.4%)                                   | FJ438902  | 3850_7374                                | 86.9%                                      |                       |
|                |             |               |                    | P25         | MG525057-59                    | 1758 (35.8%)                                   | AB920345  | 1278_6182                                | 89.8%                                      |                       |
|                |             | Cosavirus D   | Cosavirus D1       | P9          | MF621607                       | 5330 (96.8%)                                   | NC012802  | 672_6173                                 | 83.0%                                      | 94.5%                 |
|                |             | Cosavirus E/D |                    | P16.2       | MG692419                       | 672 (100%)                                     | JN867757  | 4699_5370                                | 91.0%                                      |                       |
|                | 1           |               |                    | P26         | MF621611                       | 2501 (81.5%)                                   | JN867757  | 3436_6501                                | 91.3%                                      |                       |
|                |             | Cosavirus E   | Cosavirus E        | P2.         | MF621605                       | 2391 (77.7%)                                   | FI555055  | 2770 5844                                | 85 9%                                      |                       |

Impact of clean water intervention on detections of enteric virus nucleic acids

| I ante I. (Commuca) | ( nonin      |                       |                  |              |              |                                |  |   |  |  |                              |
|---------------------|--------------|-----------------------|------------------|--------------|--------------|--------------------------------|--|---|--|--|------------------------------|
| Family              | Genus        | Species               | Genotypes        | bes          | Pool<br>ID # | GenBank<br>accession<br>number | Length of genome<br>assembled (%<br>sequenced) | Reference genome<br>GenBank accession<br>number | Region of<br>reference<br>genome covered | Nucleotide<br>similarity with<br>reference | aa idendity<br>to VP1        |
|                     | Parechovirus | Human parechovirus 1  |                  |              | P1           | MG438289                       | 5070 (74%)                                     | EF051629  | 254_7096                                 | 86.8%                                      | 96.9%                        |
|                     |              |                       |                  |              | P5           | MG026486                       | 7041 (99%)                                     | EF051629  | 165_7272                                 | 85.7%                                      | 96.1%                        |
|                     |              |                       |                  |              | P6           | MG026487                       | 7054 (100%)                                    | EF051629  | 203_7256                                 | 85.4%                                      | 96.5%                        |
|                     |              |                       |                  |              | P13          | MG692434                       | 1597 (68.4%)                                   | EF051629  | 319_2653                                 | 89.2%                                      |                              |
|                     |              |                       |                  |              | P16          | MG026489                       | 7091 (99.5%)                                   | EF051629  | 159_7286                                 | 83.1%                                      | 96.5%                        |
|                     |              |                       |                  |              | P21          | MG026491                       | 5965 (86.8%)                                   | EF051629  | 245_7115                                 | 86.5%                                      | 96.5%                        |
|                     |              |                       |                  |              | P28          | MG026490                       | 7102 (100%)                                    | EF051629  | 173_7274                                 | 85.7%                                      | 96.1%                        |
|                     |              | Human parechovirus 4  |                  |              | P3           | MG692433                       | 1078 (96%)                                     | DQ315670  | 568_1689                                 | 88.2%                                      |                              |
|                     |              | Human parechovirus 5  |                  |              | 64           | MG026488                       | 6877 (98.8%)                                   | HQ696575  | 148_7109                                 | 81.4%                                      | 92.8%                        |
|                     |              | Human parechovirus 6  |                  |              | P20          | MG438290                       | 3506 (66.8%)                                   | AB252582  | 565_5812                                 | 94.6%                                      | 95.8%*                       |
|                     |              | Human parechovirus 8  |                  |              | P25          | MG026492                       | 2622 (91.6%)                                   | EU716175  | 154_3006                                 | 82.8%                                      | 97.6%*                       |
|                     |              | Human parechovirus 17 |                  |              | P26          | MG438291                       | 6606 (100%)                                    | KT319121  | 334_6936                                 | 81.3%                                      | 97.3%                        |
|                     | Hepatovirus  | Hepatovirus A         | Hepatovirus A_IB | s A_IB       | P5           | MF621612                       | 3819 (78.1%)                                   | M20273  | 1759_6642                                | 93.9%                                      | 99.5%                        |
|                     |              |                       |                  |              | P11          | MF621613                       | 4062(81.4%)                                    | M20273  | 1819_6807                                | 93.5%                                      | 99.5%*                       |
|                     |              |                       |                  |              | P16          | MF621614                       | 7209(100%)                                     | M20273  | 159_7368                                 | 94.6%                                      | 100.0%                       |
|                     |              |                       |                  |              | P18          | MF621615                       | 5511 (84.4%)                                   | M20273  | 150_6672                                 | 94.7%                                      | $100\%^{*}$                  |
|                     | Kobuvirus    | Aichivirus A          |                  |              | P4           | MG009596                       | 7917 (98.2%)                                   | FJ890523  | 3_8059                                   | 96.4%                                      | 98.6%*                       |
|                     |              |                       |                  |              | P6           | MG692430                       | 4213 (57.1%)                                   | FJ890523  | 411_7780                                 | 96.3%                                      |                              |
|                     |              |                       |                  |              | 6d           | MG692431                       | 5632 (72.7%)                                   | FJ890523  | 226_7966                                 | 96.6%                                      |                              |
|                     |              |                       |                  |              | P24          | MG692432                       | 3322 (63.4%)                                   | FJ890523  | 407_5644                                 | 96.6%                                      |                              |
|                     | Salivirus    | Salivirus             |                  |              | P2           | MG026493                       | 6452 (93.1%)                                   | KT240115  | 968_7895                                 | 91.0%                                      | 92.3%                        |
|                     |              |                       |                  |              | P3           | MG692420-21                    | 1476 (49.2%)                                   | KT310068  | 4519_7512                                | 96.5%                                      |                              |
|                     |              |                       |                  |              | P6           | MG026494                       | 6866 (100%)                                    | KT310068  | 955_7820                                 | 95.8%                                      | 97.1%                        |
|                     |              |                       |                  |              | P14          | MG026495                       | 7587 (99.7%)                                   | KT310068  | 225_7827                                 | 95.6%                                      | 97.1%                        |
|                     |              |                       |                  |              | P25          | MG692422-24                    | 1082 (23%)                                     | KM023140  | 1730_6292                                | 91.3%                                      |                              |
|                     |              |                       |                  |              | P26          | MG692425-28                    | 2034 (45.8%)                                   | KT310068  | 1087_5520                                | 93.4%                                      |                              |
|                     |              |                       |                  |              | P27          | MG692429                       | 459 (100%)                                     | KT310068  | 3043_3501                                | 95.4%                                      |                              |
|                     |              |                       |                  |              | P28          | MG026496                       | 7440 (95%)                                     | NC_012957                                       | 8_7839                                   | 91.1%                                      | 95.5%*                       |
|                     |              |                       | Orfi             | rf1 Orf2     |              |                                |  |   |  |  | RdRp region<br>nt similarity |
| Caliciviridae       | Norovirus    | Norwalk virus         | Norovirus GI.3   | I.3 GI.3     | P8           | MG557648                       | 6257 (85.2%)                                   | KJ196292  | 272_7613                                 | 89.5%                                      | 91.8%**                      |
|                     |              |                       | GI GI.7          | 1.7          | P10          | MG572183                       | 588 (98.5%)                                    | KU311161  | 4803_5390                                | 86.1%                                      | 85.6%**                      |
|                     |              |                       | GI.7             | I.7 GI.7     | 12           | MG557649                       | 4663 (72.5%)                                   | KU311161  | 369_6795                                 | 92.6%                                      | 94.5%**                      |
|                     |              |                       | GI.3             | I.3 GI.3     | P15          | MG557650                       | 7425 (100%)                                    | KJ196292  | 74_7498                                  | 89.4%                                      | $91.4\%^{**}$                |
|                     |              |                       | GI.7             | I.7 GI.7     | P20          | MG557651                       | 7012 (95.3%)                                   | KU311161  | 1_7351                                   | 91.1%                                      | 90%**                        |
|                     |              |                       | GI.6             | I.6 GI.6     | P26          | MG557652                       | 4702 (66%)                                     | AF093797  | 392_7498                                 | 91.1%                                      | 91%**                        |
|                     |              |                       | rus              | GII.7 GII.6  | 5 P3         | MG557654                       | 7236 (100%)                                    | KU935739  | 179_7414                                 | 97.8%                                      | 98.9%                        |
|                     |              |                       | GII GI           | GII.e GII.10 | 10 P4        | MG557655                       | 6351 (100%)                                    | JX459907  | 236_6595                                 | 86.5%                                      | 95.5%                        |
|                     |              |                       | CI               | GII.7 GII.9  | 9 P6         | MG557656                       | 2999 (58%)                                     | AB039777  | 68_5180                                  | 89.2%                                      | 91.8%**                      |
|                     |              |                       |                  | _            | P8           | MG557653                       | 3388 (79.5%)                                   | EF187497  | 422_4681                                 | 82.0%                                      |                              |
|                     |              |                       | 19               | GII.e GII.4  | 4 P11        | MG557657                       | 4508 (64.4%)                                   | JX459907  | 356_7345                                 | 95.3%                                      | 96%**                        |
|                     |              |                       |                  |              |              |                                |  |   |  |  | (Continued)                  |

| Family                          | Genus          | Species                                 | Genotypes         | Pool<br>ID# | GenBank<br>accession<br>number | Length of genome<br>assembled (%<br>sequenced) | Reference genome<br>GenBank accession<br>number | Region of<br>reference<br>genome covered | Nucleotide<br>similarity with<br>reference | aa idendity<br>to VP1 |
|---------------------------------|----------------|---|-------------------|-------------|--------------------------------|--|---|--|--|-----------------------|
|                                 | Sapovirus      | Sapporo_virus                           | Sapporo_virus     | P5          | MG692435                       | 3804 (58.4%)                                   | AJ249939  | 350_6856                                 | 94.8%                                      |                       |
|                                 |                |   |                   | P19         | MG692436                       | 3898 (54.4%)                                   | AJ249939  | 152_7311                                 | 95.0%                                      |                       |
|                                 |                |   |                   | 24          | MG692437                       | 3162 (55.9%)                                   | AY237420  | 686_6337                                 | 94.9%                                      |                       |
|                                 |                |   |                   |             |                                |  |   |  |  | aa identity to<br>NS1 |
| Parvoviridae                    | Bocaparvovirus | Bocaparvovirus Primate_bocaparvovirus_1 | Human_bocavirus_1 | P20         | MG383449                       | 5155 (100%)                                    | KX373884  | 121_5275                                 | 99.4%                                      | 99.7%                 |
|                                 |                |   | Human_bocavirus_3 | P2          | MG383445                       | 4195 (87.8%)                                   | FJ973562  | 133_4912                                 | 95.6%                                      | 98.5%                 |
|                                 |                |   |                   | P27         | MG522845-6                     | 1065 (40%)                                     | KM624026.1                                      | 2354_5003                                | 97.3%                                      |                       |
|                                 |                | Primate_bocaparvovirus_2                | Human_bocavirus_2 | P4          | MG383447                       | 5204 (100%)                                    | EU082213  | $1_{-5204}$                              | 98.8%                                      | 99.8%                 |
|                                 |                |   |                   | 6d          | MG522843                       | 562 (100%)                                     | EU082213  | 2081_2642                                | 98.8%                                      |                       |
|                                 |                |   |                   | P12         | MG522844                       | 652 (100%)                                     | EU082213  | 2066_2717                                | 98.6%                                      |                       |
|                                 |                |   |                   | P15         | MG383448                       | 3401 (72.1%)                                   | EU082213  | 434_5149                                 | 96.5%                                      |                       |
|                                 |                |   |                   | P25         | MG383450                       | 5155 (100%)                                    | FJ170279  | 1_5172                                   | 98.4%                                      | 100.0%                |
|                                 |                |   | Human_bocavirus_4 | P3          | MG383446                       | 5269 (100%)                                    | KC461233  | 49_5207                                  | 99.3%                                      | 99.8%                 |
|                                 |                |   |                   | P29         | MG522847                       | 2538 (66.4%)                                   | KC461233  | 480_4299                                 | 99.2%                                      |                       |
|                                 | None           | Bufavirus-3                             | Bufavirus-3       | P4          | MG550916                       | 321 (100%)                                     | AB982221  | 3895_4215                                | 97.0%                                      |                       |
|                                 |                |   |                   | P16         | MG550917                       | 183 (100%)                                     | AB982221  | 2416_2598                                | 96.7%                                      |                       |
| Picobirnaviridae Picobirnavirus | Picobirnavirus |   | Picobirnavirus    | P6          | MG522848                       | 447 (87%)                                      | KJ206568.1                                      | 724_1236                                 | 91.0%                                      |                       |
|                                 |                |   |                   | D75         | MG522849                       | 474(100%)                                      | A F776930 1                                     | 22 1140                                  | 91.0%                                      |                       |

\*3–29% gaps in VP1 protein alignments,

 $^{\ast\ast}1$  to 67% gaps in RdRp region nucleotide alignments

https://doi.org/10.1371/journal.pone.0202054.t001

#### **Ethics statement**

Ethical committees at the University of California (San Francisco, CA, USA); Emory University (Atlanta, GA, USA); The Food, Medicine and Health Care Administration and Control Authority of Ethiopia; and the Ethiopian Ministry of Science and Technology granted approval for this study. We obtained verbal informed consent in Amharic from the parent or guardian of each study participant.

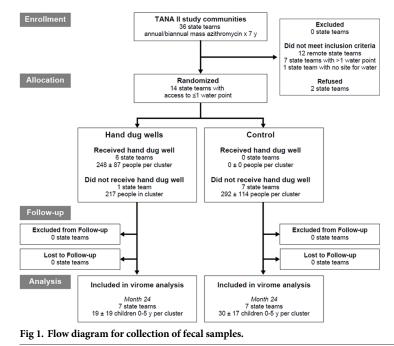
#### Results

#### Characteristics of study population

A flow diagram of sampling and participation is shown (Fig 1). Of 446 censored children who were eligible to participate, 317 children presented for the study visit examination and 269 provided stool samples. The mean age of children with stool samples was 2.7 years old, 56.5% (152/269) of children were female.

Pools of fecal samples were then processed by filtration and nuclease treatment to digest non-capsid protected nucleic acids. Viral genomes where then extracted and DNA and RNA randomly amplified and sequenced on the Illumina MiSeq platform (250 bases paired end reads). A total number of 27.8 million reads were generated for an average number of reads of approximately one million per pool. The raw sequence data for each pool is available at NCBI's Short Reads Archive under GenBank accession number **SRP120619**.

The most commonly detected viral reads belonged to the *Picornaviridae* family which were detected in 27/29 (93.1%) pools. 0.90% (249,982) of 27.8 million total sequence reads, were found to encode *Picornaviridae* related proteins (E scores  $<10^{-10}$ ). The fraction of the 29 sample pools analyzed that were positive for members of six different *Picornaviridae* genera were: Enterovirus (72.4%), Parechovirus (41.3%), Cosavirus (41.3%), Salivirus (27.5%), Kobuvirus (13.7%), and Hepatovirus (13.7%). Next in prevalence, *Caliciviridae* family members were detected in 44.8% of pools and consisted of norovirus GI (20.6%), norovirus GII (17.2%) and



https://doi.org/10.1371/journal.pone.0202054.g001

sapporovirus (10.3%). *Parvoviridae* family members were also detected in 41.3% of the pools including primate bocaparvovirus 1 and 2 (34.4%), adeno-associated virus 2 (13.7%), and bufavirus 3 (6.8%). In the *Adenoviridae* family human\_mastadenoviruses A species (HAdV-A) was detected in 17.2% of pools, HAdV-C in 10.3%, HAdV-D in 13.7%, and HAdV-F in 3.4%. Picobirnavirus sequences were found in 2/29 (6.8%) of the pools. No rotavirus nor astrovirus sequence reads were detected. The fraction of total reads from each pool encoding proteins with high-level similarity (E scores <10<sup>-10</sup>) to different human viruses is shown (Fig 2).

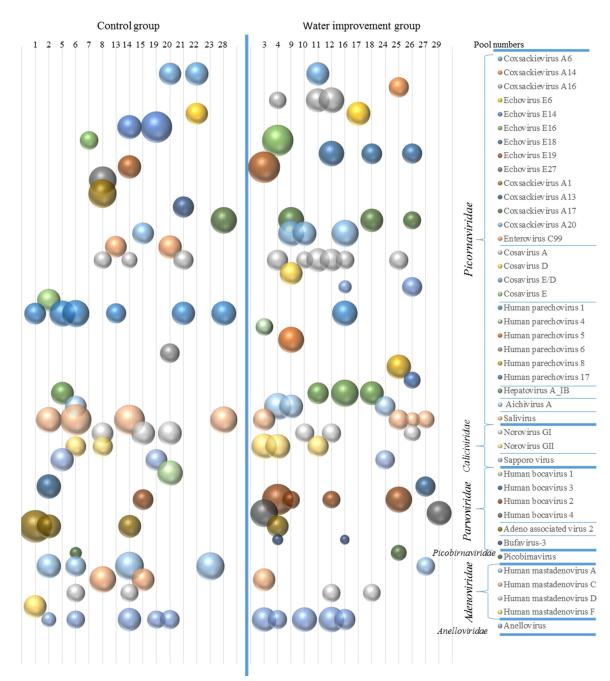


Fig 2. Distribution of viral sequences reads to named viruses using BLASTx E score  $<10^{-10}$ .

https://doi.org/10.1371/journal.pone.0202054.g002

For the viruses that yielded the largest number of reads complete or more partial genome sequences were separately assembled from each of the 29 libraries. Nucleotide sequence reads from each library were aligned against the GenBank available genomes that showed the greatest translated protein similarity. Single large contigs of nearly complete genomes, or multiple contigs aligned to the same reference genome but with gaps remaining between mapped segments, were generated (Table 1). These assembled viral sequences were then compared to tax-onomically classified genomes. The results are presented as % amino acid identity for proteins used for genotype classification (VP1 of picornaviruses) or when not available as % nucleotide identity determined using BLASTn (Table 1).

#### Family Picornaviridae: Enteroviruses

Thirty one near complete or partial enterovirus genomes ranging in size from 891 nucleotides (nt) to 7,392 nt were generated, 17 of which included the VP1 capsid region. A phylogenetic analysis of the VP1 of enteroviruses and other *Picornaviridae* genera is shown (Fig 3).

**Enterovirus species A.** Seven enterovirus A infections were identified. Two enterovirus A (EV-A) Coxsackievirus A16 (CV\_A16) sequences from different pools showed 99.3% VP1 region amino acid closest identity to CV-A16 genomes in GenBank. Five other EV-A sequences without VP1 capsid region showed 82.1 to 85% nucleotide closest identity to three different enterovirus species A genotypes yielding three genotypes Coxsackievirus A6, one Coxsackievirus A14, and another Coxsackievirus A16 partial genomes. The two CV\_A16 with VP1 showed 0 amino acid substitution per site and their available genome sequences (Table 1) shared 99.3% overall similarity indicating a recent common origin.

**Enterovirus species B.** Twelve enterovirus B infections were identified. Seven enterovirus B (EV-B) contigs containing the VP1 capsid region were generated. These sequences showed 89.2 to 97.2% VP1 region amino acid closest identity to five different enterovirus B genotypes (two Echovirus E14, one Echovirus E16, one Echovirus E18, two Echovirus E19, and one Echovirus E27) reported in GenBank (Table 1). The genotypes detected twice (echovirus E14 and E19) with complete polyprotein coding genome regions showed 0.025 and 0.006 amino acid substitutions per site respectively. Pair-wise alignment showed nucleotide identity of 90.5 and 94.0% similarities respectively. Five EV-B sequence contigs without VP1 capsid region showed 82 to 85.4% nucleotide identity to three enterovirus B genotypes (two echovirus E6, one echovirus E16, and two echovirus E18) reported in GenBank (Table 1).

**Enterovirus species C.** Twelve enterovirus C infections were identified. Four different genotypes of enterovirus C (EV-C) were detected showing 89 to 98.3% VP1 region amino acid identity to reference enterovirus C genotypes. One Coxsackievirus CV-A1, one EV-C99, three Coxsackievirus CV-A17, and three Coxsackievirus CV-A20 viruses could be identified. The complete VP1 coding sequences of the twice detected CV-A17 (excluding the more divergent CV-A17 from pool 9) and the thrice detected CV-A20 showed 0.012 and 0.0–0.012 amino acid substitutions per site respectively. Pair-wise alignment showed nucleotide identity of 98.0 and 94.6–98.3% similarities respectively again reflecting a recent common origin. Four other EV-C sequence contigs without VP1 capsid region showed 79 to 85% nucleotide identity to enterovirus C genotypes (coxsackievirus A13, coxsackievirus A17, coxsackievirus A20, enterovirus C99) reported in GenBank (Table 1).

#### Family Picornaviridae: Parechoviruses

Twelve human parechovirus infections were detected, 10 of which generated complete VP1 sequences. Six VP1 showed closest amino acid identity (96.1 to 96.9%) to human parechovirus 1 (HPeV1). One HPeV5, one HPeV6, one HPeV8, and one HPeV17 viral sequences were also

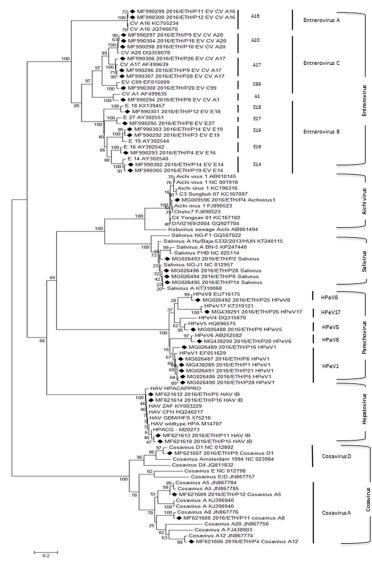


Fig 3. Phylogenetic analysis of VP1s from different genera of the *Picornaviridae* family. Viral sequences described here are highlighted by black diamonds.

https://doi.org/10.1371/journal.pone.0202054.g003

detected showing closest amino acid identity of 92.8, 95.8, 97.6 and 97.3% respectively to their respective genotype VP1. The two non-VP1 contigs showed 89.2 and 88.2% nucleotide identity to HPeV1 and HPeV4. Two pairs of very closely related HPeV-1 VP1 sequences showed 0.006–0.008 amino acid substitutions per site. When their contigs were compared they showed nucleo-tide similarities of 98.3 and 98.5% indicating a recent common origin for both pairs.

#### Family Picornaviridae: Hepatoviruses

Four hepatovirus A infections were detected. Four of the observed contigs included the VP1 region and showed closest amino acid identity from 99.5 to 100% to hepatovirus A genotype IB genome available in GenBank. When the four contigs were aligned, their overlapping regions showed nucleotide identity of 95.2–99.9%. Two pairs of very closely related hepatovirus A VP1 sequences showed 0.006 and 0.008 amino acid substitution per site, respectively.

PLOS ONE

When their contigs were compared they showed nucleotide similarities of 95.4 and 99.7%, respectively indicating a recent common origin for both pairs.

#### Family Picornaviridae: Saliviruses

Eight salivirus infections were detected, 4 of which included the VP1 capsid region. Three sequences showed 92.3 to 97.1% VP1 amino acid identity to Salivirus\_A strain GUT/2009/A-1746 from Guatemala, while the fourth VP1 was closest (95.5%) to Salivirus\_NG-J1 from Nigeria. These four contigs of nearly complete coding sequences showed 87.3 and 98% nucleotide identity over at least 6452 bp. Four other contigs showed 91.3 to 96.5% nucleotide identity to other salivirus strains reported in GenBank. Three saliviruses with very closely related VP1 sequences (excluding the more divergent pool 2 salivirus) showed 0–0.06 amino acid substitutions per site. These 3 contigs showed nucleotide similarities of 97.8–99.3% similarity, again indicating a recent common origin for these 3 viruses.

## Family Picornaviridae: Kobuviruses

Four kobuvirus infections were detected, only 1 of which included the VP1 capsid region. This VP1 showed 98.6% region amino acid identity to Aichi virus 1 isolate Chshc7 from China. The three other viral sequences showed nucleotide identity of 96.3 to 96.6% to other Aichi viruses 1.

#### Family Picornaviridae: Cosaviruses

Thirteen cosavirus infections were detected. Four of these sequences included the VP1 region and showed closest amino acid identities of 97, 98.2, 96.8 and 94.5%, respectively, to an HCoSV\_A5 genotype, HCoSV\_A8 genotype, HCoSV\_A12 genotype, and HCoSV\_D1 genotype. Nine cosavirus sequences without VP1 capsid region showed 85.9 to 91.9% nucleotide identity to Cosavirus A (six sequences), cosavirus E (one sequence) and cosavirus E/D (two sequences) reported in GenBank. In total, 9 HCoSV\_A (species A), 1 HCoSV\_D, 2 HCoSV\_E/D, and 1 HCoSV\_E viral sequences, were identified and the near complete or partial genomes submitted to GenBank.

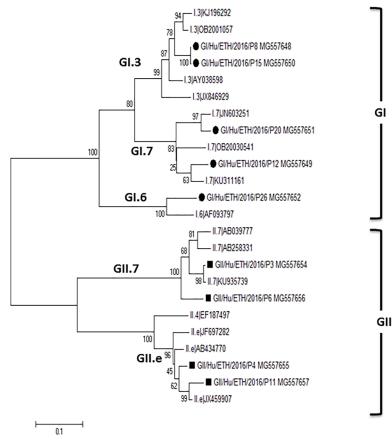
# Family Caliciviridae

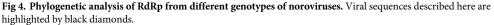
Eleven noroviruses viral infections were detected, 10 of which included the regions used for genogroup determination (partial RdRp) and 9 also included ORF2 for capsid genotyping. To determine genogroups and capsid genotypes the Norovirus Genotyping Tool was used [20]. 5 genogroup I (two GI.P3, two GI.P7, and one GI.P6) and 4 genogroup II (two GII.Pe and two GII.P7) were identified. The ORF2 genotyping results were identical for GI but for GII viruses genotypes GII.6, GII.10, GII.9, and GII.4\_Sydney\_2012 capsid were reported. A phylogenetic analysis of the partial RdRp region of these noroviruses is shown (Fig 4).

Three Sapporo virus sequences were also found which showed 94.8–95% nucleotide identity to SLV/Bristol/98/UK and Sapovirus Mc10. The overlapping region of the 3 contigs showed nucleotide identities of 72 to 99.5%.

#### Family Parvoviridae: Bocaparvovirus

A total of ten bocavirus infections were detected. Five bocavirus NS1 contigs were generated which showed closest amino acid identity of 99.7% to HBoV\_1, two showed closest amino acid identity of 99.8–100% to HBoV\_2 genome, one showed closest amino acid identity of 98.5% to an HBoV\_3 genome, and one showed closest amino acid identity of 99.8% to HBoV\_4. Five





https://doi.org/10.1371/journal.pone.0202054.g004

non-NS1 containing contigs, three showed 96.5–98.8%, one showed 97.3%, and one showed 99.2% nucleotide identity to HBoV2, HBoV3 and HBoV4 respectively. All together, we detected one bocavirus 1, five bocavirus 2, and two bocavirus 3 and two bocavirus 4.

#### Family Parvoviridae: Dependoparvovirus

Four contigs of adeno-associated virus\_2 in the dependoparvovirus genus ranging in size from 2730 nt to 4377 nt were identified. Their overlapping region showed a nucleotide similarity of 96.9 to 99.6%.

#### Family Parvoviridae: Protoparvovirus

Two short contigs of bufavirus 3 in two pools were also identified with 96.7–97% nucleotide identity to bufavirus-3 in GenBank.

#### Families Adenoviridae, Anelloviridae, Picobirnaviridae

Sequences from human\_mastadenoviruses A species (HAdV-A), HAdV-C, HAdV-D, and HAdV-F in the *Adenoviridae* family ranging in size from 250 nt to 6282 nt, from 1068 nt to 6829 nt, from 250nt to 980 nt, and of 1153 nt were identified in five, three, four, and one pool, respectively.

PLOS ONE

Two human picobirnavirus contigs, of 474 nt and 513 nt were also generated which both showed 91% nucleotide identity with human picobirnavirus strain 1-CHN-97 and human picobirnavirus VS6600008 respectively.

#### Viral families of unknown host tropism

Also generated were nearly complete genomes of ss+RNA posaviruses and husaviruses, both members of the order *Picornavirales*. Contigs related to the *Smacoviridae* family and related genome named hudisaviruses both members of the highly diverse group known as CRESS-DNA viruses (Circular Rep-encoding ss DNA genomes) were also detected (S1 Table). These viruses have been described in human fecal samples but since their cellular host tropisms remain unknown they have not been included in the subsequent virome comparison analysis.

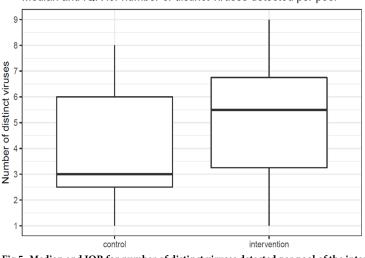
#### Virome comparison in control and intervention groups

The median number of different human viruses present per pool was 5.5 (IQR 3.25–6.75) in the intervention arm and 3.0 (IQR 2.5–6.0) in the control arm (Fig 5). There was no visual signal for a difference in alpha diversity of the human enteric virome between the intervention and control arm (Fig 6). For each of the three evaluated distance metrics, p-values from the Kruskal-Wallis test evaluating the differences in alpha diversity by intervention arm were non-significant: Richness (observed), p = 0.2893; Shannon, p = 0.2559; and Simpson, p = 0.162.

# Discussion

The high diversity of enteric viruses described in 269 children from 14 Ethiopian villages represents the first description of the enteric virome of East African children. Prior studies in that region have relied on the use of PCR or antigen detection targeting restricted subsets of enteric viruses [21–24].

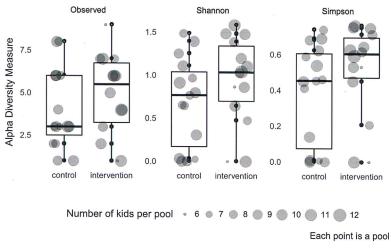
The fecal samples analyzed were collected as part of a cluster-randomized trial of a waterimprovement intervention. Children participating in this trial were randomly sampled from a population census and thus the viromes characterized here are broadly representative for children <5 years old from the Goncha region of Northern Ethiopia in 2016. Availability of this

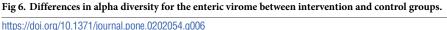


Median and IQR for number of distinct viruses detected per pool

Fig 5. Median and IQR for number of distinct viruses detected per pool of the intervention and control groups.

https://doi.org/10.1371/journal.pone.0202054.g005





data set can therefore be considered a baseline against which future viromes in that population can be compared to identify sequence changes in the most common viruses and help identify newly introduced or emerging viruses.

The great majority of sequence reads here mapped to RNA viruses of the *Picornaviridae* and *Caliciviridae* families. Picornaviruses showed a particularly high level of genetic diversity including multiple genera, species, and genotypes particularly in the enterovirus, cosavirus, and parechovirus genera. Some picornaviruses had nearly identical VP1 and very closely related genomes (>95%). This high level of similarity between variants from different children reflects recent common origins and point towards those genotypes that, due to either immune, viral, or environmental factors may be spreading particularly efficiently.

Beside picornaviruses, other RNA (caliciviruses, picobirnaviruses) and DNA (adenoviruses, parvoviruses, and anelloviruses) viruses were also detected. Rotavirus sequences were not detected. Globally rotavirus remains a leading cause of severe acute water diarrhea but has shown a significant decline in vaccine age-eligible children in Africa following introduction of rotavirus vaccination [25, 26]. Ethiopia initiated a vaccination campaign in 2013 with an estimated coverage of 85% by 2015 [26], We did not detect any rotavirus in the sample, which may be an indication of successful recent vaccination campaigns or because this was a population-based sample and may not have captured children ill with rotavirus infections. Astroviruses are also common enteric childhood enteric infections [27–30] but none was detected among the population sampled.

Metagenomic studies limited to DNA viruses of feces from 65 rural Kenyan adults with and without HIV infections showed a more restricted virome consisting of adenovirus D, anelloviruses, and papillomaviruses (the last in a single sample)[31]. Reads belonging to the *Circoviridae* family (members of the CRESS-DNA group) were also reported but circoviruses have not been shown to replicate in humans and therefore may represent genomes related to other CRESS-DNA viruses such as the smacoviruses described above. A greater fraction of adenovirus reads could be measured in AIDS patients with CD4 counts <200. The greater number of viral families detected in the current study may be due to greater susceptibility or exposure of children versus adults, socio-economic or geographic difference, and/or the unbiased amplification methods used which targeted only DNA viruses. While we also found adenovirus and anellovirus sequences numerous genera from the DNA *Parvoviridae* family were also detected here. A metagenomics fecal virome study of Malawian twin infants with severe acute malnutrition was also restricted to DNA viruses [32]. The human viruses reported were the ubiquitous anelloviruses, parvoviruses (bocaviruses and dependoviruses), as well as very low levels of papillomavirus and polyomavirus [32].

Viral genomes of unknown cellular origins were detected namely ssRNA+ posaviruses and husaviruses and circular ssDNA smacoviruses and hudisaviruses, all previously reported in human feces. Based on sequence similarity to cDNA from the long worm of pig (Ascaris suum), posaviruses from feces of pigs [33-37] and other mammals [38] have been hypothesized to infect nematodes present in their intestinal track [33]. This possibility was reinforced by the recent description of a similar genome (Hubei picorna-like virus 11) (YP\_009336580) showing 80% protein identity to a posavirus sequenced here from a large pig roundworm from China [39]. The detection of posaviruses may therefore reflect the presence of enteric nematodes in Ethiopian children, a frequent occurrence in that country [40]. Husaviruses are distantly related to posaviruses with a similar RNA genome organization and also phylogenetically located in the Picornavirales order [41]. Husaviruses were originally detected in feces from men in Amsterdam (HIV positive and negative) and more recently in Vietnamese human and pig feces (BAV31552.1) [38]. While their cellular host(s) are also unknown these related member of the *Picornavirales* order, which also includes fisaviruses from fish gut content [42], rasavirus from rat feces [38], and basavirus from bat feces [38], share a nucleotide composition which groups them with members of that viral order known to infect arthropods [38]. Nematodes and arthropods, both with exoskeleton principally made of chitin, are phylogenetically related and both members of the Ecdysozoa superphylum.

Smacoviruses and hudisaviruses make up two subgroups of the highly diverse CRESS-DNA viruses whose known cellular hosts range from mammals (Circoviridae) and plants (Geminiviridae) to fungi (SsHADV)[43]. Originally described in feces of chimpanzees [44], smacovirus genomes have also been reported in feces from other non-human primates and humans [45], pigs [46–48] other mammals [49–51] and a bird [52]. Hudisavirus DNA has also been reported in human and macaque feces [53, 54]. As for the large majority of the recently described CRESS-DNA genomes the cellular tropism of the smacoviruses and hudisaviruses genomes detected here remains unknown and could consist of human intestinal epithelial cells, parasites in the gut, or originate from viruses in consumed food products.

The viruses detected here represent minimum values for these children's viromes. It is possible that some viral nucleic acids may have gone undetected due to viral loads being below detection levels. The same library making method and sequencing depth was used for both intervention and control fecal samples that were processed in an interdigitated manner. Limitations of the metagenomics approach used here should therefore equally impact results from both groups.

The human enteric viruses genetically characterized here are transmitted by fecal-oral transmission and also for adenoviruses by the respiratory route. Because enteric viral infections and fecal shedding are typically acute events of limited duration it is unlikely that the viral nucleic acids detected in our 2016 sampling originate from chronic infections initiated prior to the start of the clean water intervention in 2014.

While we did not detect a difference between the prevalence of different virus families nor the median count of viruses across the control and intervention groups of the water improvement trial, we are wary to conclude that the intervention had no effect on the enteric virome. With samples from 269 children in 29 pools, we were likely underpowered to detect a difference between groups. Indeed, with a post-hoc power calculation we had 60% power to discern a 40% difference in richness and just 18% power to discern a 20% difference. Moreover, the fidelity of the intervention was suboptimal. One of the study intervention wells never hit water, two were functional in the wet season only and one was not functional after three months. Large public health intervention trials are challenging in very resource-limited settings and a more robust durable water improvement intervention may have shown a reduction in viral transmission. Moreover, clean water is not the only viral transmission pathway of interest. This study provides no information on the role of sanitation facilities, poor hygiene, contaminated food products, or limited sterilization during cooking. Finally, the laboratory staff was not masked to treatment allocation of the trial.

In summary, we provide here a description of the enteric virome of East African children. Expanded use of human virome characterization holds promise to measure changes in viral transmissions resulting from natural phenomena or human interventions.

## Supporting information

**S1** Table. Characteristics of contigs from viruses of unknown tropism. (XLSX)

# Acknowledgments

The funders had no role in study design, data collection and analysis, decision to publish, or preparation of the manuscript. This work was entirely supported by funds from the Blood Systems Research Institute, the National Institutes of Health (NEI U10 EY016214, NEI K23EY019071, and NICHD F31 HD088070-01A1), the Sara & Evan Williams Foundation, the Bernard Osher Foundation, That Man May See, the Harper Inglis Trust, the Bodri Foundation, the South Asia Research Fund, Research to Prevent Blindness, and the Carter Center Ethiopia. There was no additional external funding received for this study.

# **Author Contributions**

Data curation: Kristen Aiemjoy, Solomon Aragie, Zerihun Tadesse, Kelly E. Callahan.

Formal analysis: Xutao Deng.

Funding acquisition: Jeremy Keenan.

Investigation: Eric Delwart.

Methodology: Eda Altan, Kristen Aiemjoy, Tung G. Phan, Xutao Deng.

Project administration: Eric Delwart.

Resources: Eda Altan, Kristen Aiemjoy, Jeremy Keenan.

Supervision: Eric Delwart.

Writing - original draft: Eda Altan, Eric Delwart.

Writing - review & editing: Jeremy Keenan, Eric Delwart.

#### References

- Lopez AD, Mathers CD, Ezzati M, Jamison DT, Murray CJ. Global and regional burden of disease and risk factors, 2001: systematic analysis of population health data. Lancet. 2006; 367(9524):1747–57. Epub 2006/05/30. https://doi.org/10.1016/S0140-6736(06)68770-9 PMID: 16731270
- 2. Unicef\_Ethiopia. 2017 [September 2017]; Available from: https://data.unicef.org/country/eth/
- WHO WHO. Diarrhoeal disease Fact Sheet. 2017 [7/13/17]; Available from: <a href="http://www.who.int/mediacentre/factsheets/fs330/en/">http://www.who.int/mediacentre/factsheets/fs330/en/</a>

- WHO\_aho. Ethiopia Factsheets of Health Statistics. 2016 [September 2017]; Available from: <a href="http://www.aho.afro.who.int/profiles\_information/images/d/d5/Ethiopia-Statistical\_Factsheet.pdf">http://www.aho.afro.who.int/profiles\_information/images/d/d5/Ethiopia-Statistical\_Factsheet.pdf</a>
- WHO\_Ethiopia WHO. Country Health Topics. 2017 [September 2017]; Available from: <u>http://www.afro.</u> who.int/countries/ethiopia
- Gebre T, Ayele B, Zerihun M, Genet A, Stoller NE, Zhou Z, et al. Comparison of annual versus twiceyearly mass azithromycin treatment for hyperendemic trachoma in Ethiopia: a cluster-randomised trial. Lancet. 2012; 379(9811):143–51. Epub 2011/12/24. https://doi.org/10.1016/S0140-6736(11)61515-8 PMID: 22192488
- Phan TG, da Costa AC, Del Valle Mendoza J, Bucardo-Rivera F, Nordgren J, O'Ryan M, et al. The fecal virome of South and Central American children with diarrhea includes small circular DNA viral genomes of unknown origin. Archives of virology. 2016; 161(4):959–66. Epub 2016/01/20. https://doi.org/10. 1007/s00705-016-2756-4 PMID: 26780893
- Li L, Deng X, Mee ET, Collot-Teixeira S, Anderson R, Schepelmann S, et al. Comparing viral metagenomics methods using a highly multiplexed human viral pathogens reagent. Journal of virological methods. 2015; 213:139–46. Epub 2014/12/17. <u>https://doi.org/10.1016/j.jviromet.2014.12.002</u> PMID: 25497414
- Phan TG, Mori D, Deng X, Rajindrajith S, Ranawaka U, Fan Ng TF, et al. Small circular single stranded DNA viral genomes in unexplained cases of human encephalitis, diarrhea, and in untreated sewage. Virology. 2015; 482:98–104. Epub 2015/04/04. https://doi.org/10.1016/j.virol.2015.03.011 PMID: 25839169
- 10. http://ftp.ncbi.nlm.nih.gov/blast/db/FASTA/ FdbdF. 2017 [cited 2017 Oct 20]; Available from: http://ftp. ncbi.nlm.nih.gov/blast/db/FASTA/
- 11. /pub/taxonomy Fd. 2017 [cited 2017 Oct 20]; Available from: http://ftp.ncbi.nih.gov/pub/taxonomy
- Langmead B, Salzberg SL. Fast gapped-read alignment with Bowtie 2. Nat Methods. 2012; 9(4):357–9. https://doi.org/10.1038/nmeth.1923 PMID: 22388286
- 13. at Fdrrv. FTP directory /refseq/release/viral/ at 2017 [cited 2017 Oct 20]; Available from: http://ftp.ncbi. nih.gov/refseq/release/viral/
- Ye J, McGinnis S, Madden TL. BLAST: improvements for better sequence analysis. Nucleic Acids Res. 2006; 34(Web Server issue):W6–9. https://doi.org/10.1093/nar/gkl164 PMID: 16845079
- Deng X, Naccache SN, Ng T, Federman S, Li L, Chiu CY, et al. An ensemble strategy that significantly improves de novo assembly of microbial genomes from metagenomic next-generation sequencing data. Nucleic Acids Res. 2015.
- Tamura K, Stecher G, Peterson D, Filipski A, Kumar S. MEGA6: Molecular Evolutionary Genetics Analysis version 6.0. Molecular biology and evolution. 2013; 30(12):2725–9. Epub 2013/10/18. <a href="https://doi.org/10.1093/molbev/mst197">https://doi.org/10.1093/molbev/mst197</a> PMID: 24132122
- J. F. Confidence limits on phylogenies: An approach using the bootstrap. Evolution. 1985; 39:783–91. https://doi.org/10.1111/j.1558-5646.1985.tb00420.x PMID: 28561359
- McMurdie PJ, Holmes S. phyloseq: an R package for reproducible interactive analysis and graphics of microbiome census data. PloS one. 2013; 8(4):e61217. <u>https://doi.org/10.1371/journal.pone.0061217</u> PMID: 23630581
- 19. Wickham H. ggplot2. Wiley Interdisciplinary Reviews: Computational Statistics. 2011; 3(2):180-5.
- Kroneman A, Vennema H, Deforche K, v d Avoort H, Penaranda S, Oberste MS, et al. An automated genotyping tool for enteroviruses and noroviruses. Journal of clinical virology : the official publication of the Pan American Society for Clinical Virology. 2011; 51(2):121–5. Epub 2011/04/26.
- Basu G, Rossouw J, Sebunya TK, Gashe BA, de Beer M, Dewar JB, et al. Prevalence of rotavirus, adenovirus and astrovirus infection in young children with gastroenteritis in Gaborone, Botswana. East Afr Med J. 2003; 80(12):652–5. PMID: 15018423
- Kiulia NM, Kamenwa R, Irimu G, Nyangao JO, Gatheru Z, Nyachieo A, et al. The epidemiology of human rotavirus associated with diarrhoea in Kenyan children: a review. J Trop Pediatr. 2008; 54 (6):401–5. https://doi.org/10.1093/tropej/fmn052 PMID: 18593738
- Sisay Z, Djikeng A, Berhe N, Belay G, Gebreyes W, Abegaz WE, et al. Prevalence and molecular characterization of human noroviruses and sapoviruses in Ethiopia. Archives of virology. 2016; 161 (8):2169–82. https://doi.org/10.1007/s00705-016-2887-7 PMID: 27193022
- Brazier L, Elguero E, Koumavor CK, Renaud N, Prugnolle F, Thomas F, et al. Evolution in fecal bacterial/viral composition in infants of two central African countries (Gabon and Republic of the Congo) during their first month of life. PLoS ONE. 2017; 12(10):e0185569. https://doi.org/10.1371/journal.pone. 0185569 PMID: 28968427
- 25. Operario DJ, Platts-Mills JA, Nadan S, Page N, Seheri M, Mphahlele J, et al. Etiology of Severe Acute Watery Diarrhea in Children in the Global Rotavirus Surveillance Network Using Quantitative

Polymerase Chain Reaction. J Infect Dis. 2017; 216(2):220–7. https://doi.org/10.1093/infdis/jix294 PMID: 28838152

- 26. Weldegebriel G, Mwenda JM, Chakauya J, Daniel F, Masresha B, Parashar UD, et al. Impact of rotavirus vaccine on rotavirus diarrhoea in countries of East and Southern Africa. Vaccine. 2017.
- Platts-Mills JA, Babji S, Bodhidatta L, Gratz J, Haque R, Havt A, et al. Pathogen-specific burdens of community diarrhoea in developing countries: a multisite birth cohort study (MAL-ED). Lancet Glob Health. 2015; 3(9):e564–75. https://doi.org/10.1016/S2214-109X(15)00151-5 PMID: 26202075
- Shioda K, Cosmas L, Audi A, Gregoricus N, Vinje J, Parashar UD, et al. Population-Based Incidence Rates of Diarrheal Disease Associated with Norovirus, Sapovirus, and Astrovirus in Kenya. PLoS ONE. 2016; 11(4):e0145943. https://doi.org/10.1371/journal.pone.0145943 PMID: 27116458
- Breurec S, Vanel N, Bata P, Chartier L, Farra A, Favennec L, et al. Etiology and Epidemiology of Diarrhea in Hospitalized Children from Low Income Country: A Matched Case-Control Study in Central African Republic. PLoS Negl Trop Dis. 2016; 10(1):e0004283. <u>https://doi.org/10.1371/journal.pntd.</u> 0004283 PMID: 26731629
- Meyer CT, Bauer IK, Antonio M, Adeyemi M, Saha D, Oundo JO, et al. Prevalence of classic, MLBclade and VA-clade Astroviruses in Kenya and The Gambia. Virol J. 2015; 12(1):78.
- Monaco CL, Gootenberg DB, Zhao G, Handley SA, Ghebremichael MS, Lim ES, et al. Altered Virome and Bacterial Microbiome in Human Immunodeficiency Virus-Associated Acquired Immunodeficiency Syndrome. Cell Host Microbe. 2016; 19(3):311–22. <u>https://doi.org/10.1016/j.chom.2016.02.011</u> PMID: 26962942
- Reyes A, Haynes M, Hanson N, Angly FE, Heath AC, Rohwer F, et al. Viruses in the faecal microbiota of monozygotic twins and their mothers. Nature. 2010; 466(7304):334–8. <u>https://doi.org/10.1038/</u> nature09199 PMID: 20631792
- Shan T, Li L, Simmonds P, Wang C, Moeser A, Delwart E. The fecal virome of pigs on a high-density farm. J Virol. 2011; 85(22):11697–708. https://doi.org/10.1128/JVI.05217-11 PMID: 21900163
- Hause BM, Palinski R, Hesse R, Anderson G. Highly diverse posaviruses in swine faeces are aquatic in origin. J Gen Virol. 2016; 97(6):1362–7. https://doi.org/10.1099/jgv.0.000461 PMID: 27002315
- Amimo JO, El Zowalaty ME, Githae D, Wamalwa M, Djikeng A, Nasrallah GK. Metagenomic analysis demonstrates the diversity of the fecal virome in asymptomatic pigs in East Africa. Archives of virology. 2016; 161(4):887–97. https://doi.org/10.1007/s00705-016-2819-6 PMID: 26965436
- Sano K, Naoi Y, Kishimoto M, Masuda T, Tanabe H, Ito M, et al. Identification of further diversity among posaviruses. Archives of virology. 2016; 161(12):3541–8. https://doi.org/10.1007/s00705-016-3048-8 PMID: 27619795
- Zhang B, Tang C, Yue H, Ren Y, Song Z. Viral metagenomics analysis demonstrates the diversity of viral flora in piglet diarrhoeic faeces in China. J Gen Virol. 2014; 95(Pt 7):1603–11. <u>https://doi.org/10. 1099/vir.0.063743-0 PMID: 24718833</u>
- Oude Munnink BB, Phan MVT, Consortium V, Simmonds P, Koopmans MPG, Kellam P, et al. Characterization of Posa and Posa-like virus genomes in fecal samples from humans, pigs, rats, and bats collected from a single location in Vietnam. Virus Evol. 2017; 3(2):vex022. <a href="https://doi.org/10.1093/ve/vex022">https://doi.org/10.1093/ve/vex022</a> PMID: 28948041
- 39. Shi M, Lin XD, Tian JH, Chen LJ, Chen X, Li CX, et al. Redefining the invertebrate RNA virosphere. Nature. 2016.
- Taticheff S, Kebede A, Bulto T, Werkeneh W, Tilahun D. Effect of ivermectin (Mectizan) on intestinal nematodes. Ethiop Med J. 1994; 32(1):7–15. PMID: 8187782
- Oude Munnink BB, Cotten M, Deijs M, Jebbink MF, Bakker M, Farsani SM, et al. A novel genus in the order Picornavirales detected in human stool. J Gen Virol. 2015; 96(11):3440–3. <u>https://doi.org/10. 1099/jqv.0.000279 PMID: 26354795</u>
- Reuter G, Pankovics P, Delwart E, Boros A. A novel posavirus-related single-stranded RNA virus from fish (Cyprinus carpio). Archives of virology. 2015; 160(2):565–8. https://doi.org/10.1007/s00705-014-2304-z PMID: 25488292
- 43. Yu X, Li B, Fu Y, Jiang D, Ghabrial SA, Li G, et al. A geminivirus-related DNA mycovirus that confers hypovirulence to a plant pathogenic fungus. Proc Natl Acad Sci U S A. 2010; 107(18):8387–92. https:// doi.org/10.1073/pnas.0913535107 PMID: 20404139
- **44.** Blinkova O, Victoria J, Li Y, Keele BF, Sanz C, Ndjango JB, et al. Novel circular DNA viruses in stool samples of wild-living chimpanzees. J Gen Virol. 2010; 91(Pt 1):74–86. <u>https://doi.org/10.1099/vir.0.015446-0 PMID</u>: 19759238
- 45. Ng TF, Zhang W, Sachsenroder J, Kondov NO, da Costa AC, Vega E, et al. A diverse group of small circular ssDNA viral genomes in human and non-human primate stools. Virus Evol. 2015; 1(1):vev017. https://doi.org/10.1093/ve/vev017 PMID: 27774288

- 46. Cheung AK, Ng TF, Lager KM, Bayles DO, Alt DP, Delwart EL, et al. A divergent clade of circular singlestranded DNA viruses from pig feces. Archives of virology. 2013; 158(10):2157–62. https://doi.org/10. 1007/s00705-013-1701-z PMID: 23612924
- 47. Cheung AK, Ng TF, Lager KM, Alt DP, Delwart EL, Pogranichniy RM. Unique circovirus-like genome detected in pig feces. Genome Announc. 2014; 2(2).
- Sachsenroder J, Twardziok S, Hammerl JA, Janczyk P, Wrede P, Hertwig S, et al. Simultaneous identification of DNA and RNA viruses present in pig faeces using process-controlled deep sequencing. PLoS ONE. 2012; 7(4):e34631. https://doi.org/10.1371/journal.pone.0034631 PMID: 22514648
- 49. Steel O, Kraberger S, Sikorski A, Young LM, Catchpole RJ, Stevens AJ, et al. Circular replication-associated protein encoding DNA viruses identified in the faecal matter of various animals in New Zealand. Infect Genet Evol. 2016; 43:151–64. https://doi.org/10.1016/j.meegid.2016.05.008 PMID: 27211884
- Kim HK, Park SJ, Nguyen VG, Song DS, Moon HJ, Kang BK, et al. Identification of a novel singlestranded, circular DNA virus from bovine stool. J Gen Virol. 2012; 93(Pt 3):635–9. <u>https://doi.org/10. 1099/vir.0.037838-0 PMID: 22071514</u>
- Sikorski A, Massaro M, Kraberger S, Young LM, Smalley D, Martin DP, et al. Novel myco-like DNA viruses discovered in the faecal matter of various animals. Virus Res. 2013; 177(2):209–16. <u>https://doi.org/10.1016/j.virusres.2013.08.008</u> PMID: 23994297
- Reuter G, Boros A, Delwart E, Pankovics P. Novel circular single-stranded DNA virus from turkey faeces. Archives of virology. 2014; 159(8):2161–4. https://doi.org/10.1007/s00705-014-2025-3 PMID: 24562429
- Altan E, Del Valle Mendoza J, Deng X, Phan TG, Sadeghi M, Delwart EL. Small Circular Rep-Encoding Single-Stranded DNA Genomes in Peruvian Diarrhea Virome. Genome Announc. 2017; 5(38).
- Kapusinszky B, Ardeshir A, Mulvaney U, Deng X, Delwart E. Case-Control Comparison of Enteric Viromes in Captive Rhesus Macaques with Acute or Idiopathic Chronic Diarrhea. J Virol. 2017; 91(18).