

# Rapid evolution of the human gut virome

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Humans are colonized by immense populations of viruses, which metagenomic analysis shows are mostly unique to each individual. To investigate the origin and evolution of the human gut virome, we analyzed the viral community of one adult individual over 2.5 y by extremely deep metagenomic sequencing (56 billion bases of purified viral sequence from 24 longitudinal fecal samples). After assembly, 478 well-determined contigs could be identified, which are inferred to correspond mostly to previously unstudied bacteriophage genomes. Fully 80% of these types persisted throughout the duration of the 2.5-y study, indicating long-term global stability. Mechanisms of base substitution, rates of accumulation, and the amount of variation varied among viral types. Temperate phages showed relatively lower mutation rates, consistent with replication by accurate bacterial DNA polymerases in the integrated prophage state. In contrast, Microviridae, which are lytic bacteriophages with single-stranded circular DNA genomes, showed high substitution rates ( $>10^{-5}$  per nucleotide each day), so that sequence divergence over the 2.5-y period studied approached values sufficient to distinguish new viral species. Longitudinal changes also were associated with diversity-generating retroelements and virus-encoded Clustered Regularly Interspaced Short Palindromic Repeats arrays. We infer that the extreme interpersonal diversity of human gut viruses derives from two sources, persistence of a small portion of the global virome within the gut of each individual and rapid evolution of some long-term virome members.

metagenomics | microbiome | diversity generating retroelement | CRISPR

There are an estimated  $10^{31}$  viral particles on earth, and human feces contain at least  $10^9$  virus-like particles per gram (1–3). Many of these are identifiable as viruses that infect bacteria (bacteriophages), but the great majority remains unidentified. Even today, gut virome samples taken from different human individuals still yield mostly novel viruses (4–8), and only a small minority of viral ORFs resembles previously studied genes (7).

Bacteriophages are of biomedical importance because of their ability to transmit genes to their bacterial hosts, thereby conferring increased pathogenicity, antibiotic resistance, and perhaps new metabolic capacity (4, 5, 9, 10). Despite their importance, the forces diversifying bacteriophage genomes in human hosts have not been studied in detail. Humans show considerable individual variation in the bacterial lineages present in their guts (11–13); this variation likely is one reason for the differences in their phage predators (5–8, 14). The large differences in phage populations among individuals also may be influenced by within-individual viral evolution.

To investigate the origin and nature of human viral populations, we carried out a detailed study of a single human gut viral community. Ultra-deep longitudinal analysis of DNA sequences from the viral community, combined with characterization of the host bacteria, revealed rapid change over time and begins to specify some of the mechanisms involved.

## Results

**Sample Collection, Viral Purification, and DNA Sequencing.** Stool samples ( $n = 24$ ) were collected from a healthy male at 16 time points spread over 884 days (Fig. 1A). For eight of the time points, two separate samples taken 1 cm apart were purified and

sequenced independently to allow estimation of within-time point sample variation. Virus-like particles were extracted by sequential filtration, Centricon ultrafiltration, nuclease treatment, and solvent extraction. Purified viral DNA was subjected to linear amplification using  $\Phi 29$  DNA polymerase, after which quantitative PCR showed that bacterial 16S sequences were reduced to less than 10 copies per nanogram of DNA, and human sequences were reduced to below 0.1 copies per nanogram, the limit of detection. Paired-end reads then were acquired using Illumina HiSeq sequencing, yielding more than 573 million reads ( $Q \geq 35$ ; mean read length, 97.5 bp), with 15–39 million reads per sample (Table S1). No attempt was made to study gut RNA viruses, which also are known to exist, although some samples were dominated by abundant plant RNA viruses ingested with food (15).

Sequence reads from each sample were first assembled individually using MetaIDBA (16). When reads were aligned back onto contigs generated within each sample, only 71% of reads could be aligned. Improved contigs then were generated using a hybrid assembly method combining all samples, taking advantage of the fact that viruses that are rare at one time point may be abundant at another. After this step, 97.6% of the reads could be aligned to contigs, allowing assessment of within-contig diversity. Rarefaction (collector's curve) analysis showed that the detection of these contigs was saturated at  $<10^7$  reads per sample and at 7–10 samples (Fig. 1B), well below our sampling effort. After quality filtering and manual editing, 478 contigs showed  $>20$ -fold coverage (median, 82-fold); from the purification results, we infer these contigs to be mostly or entirely DNA viruses (Fig. 1C). Sixty contigs assembled as closed circles (ranging in size from 4–167 kb), an indication of probable completion of these genome sequences, providing an estimate of the viral population size and composition in unprecedented detail. One circular genome was sequenced independently using the Sanger method and was confirmed to have the structure predicted from the Solexa/Illumina data (SI Methods). The abundance of each contig at each time point was measured by the proportion of reads that aligned to it, normalized to the length of each contig. The correlation coefficient between replicate samples from the same time point was at least 0.99, indicating a high degree of reproducibility (Fig. S1).

**Viral Groups Detected.** Taxonomic analysis of these contigs indicated recovery of Microviridae, Podoviridae, Myoviridae, and Siphoviridae, but contigs with taxonomic attributions were a minority, only 13%, emphasizing the enormous sequence variation present in bacteriophages. Microviridae (the group including

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**Table 1. CRISPR arrays from bacterial metagenomic sequence targeting viral contigs detected in this study**

CRISPR	Organism hosting CRISPR	No. of spacers associated with repeat	Median spacer length (bp)	Viral contig targeted	No. of spacers matching viral contig
CRISPR-2	<i>Ruminococcus bromii</i> L2-63 (temperate phage)	64	30 (29–31)	232_308	1
CRISPR-3	Unknown	38	30 (21–33)	112_6	2
CRISPR-7	Unknown	64	36 (22–40)	051_116	1
				75	1
CRISPR-21	Unknown	59	35 (30–38)	111_52	4
CRISPR-31	<i>Eubacterium siraeum</i> V105c8a	110	37 (25–40)	132_57	1
CRISPR-32	<i>Eubacterium siraeum</i> V105c8a	230	37 (22–46)	132_57	27
CRISPR-37	<i>Bacteroides fragilis</i> NCTC 9343	32	30 (29–30)	111_52	1

*bromii*, *Eubacterium siraeum*, and *Bacteriodes fragilis*, contain CRISPR repeats that were found here linked to spacers matching virome contigs from this study (contig 232\_308, contig 132\_57, and contig 111\_52, respectively), allowing us to infer that these phages infect these three bacteria in the subject studied. In another approach to associating phage–host pairs, phage sequences annotated as integrated prophages in sequenced bacterial genomes could be recognized that resembled our newly sequenced phage contigs, thereby also specifying potential hosts (4–6). Bacterial lineages identified as harboring phage from the virome analysis included *Bacteroides fragilis*, *Eubacterium siraeum*, *Ruminococcus bromii*, *Blautia hansenii*, and *Lachnospiraceae*, all of which were found to be present in metagenomic sequence analysis of total stool DNA (Fig. S2). Overall, 19 of the phage contigs sequenced here could be associated with bacterial hosts by at least one of the two approaches (Table S2), although for the great majority the hosts remain unknown.

**Longitudinal Sequence Variation Driven by Diversity-Generating Retroelements.** Another force diversifying bacteriophage genomes are diversity-generating retroelements (DGRs), which are reverse transcriptase-based systems that introduce mutations at adenines in specific repeated sequences using a copy–paste targeting mechanism (6, 30–33). We analyzed the viral contigs described here to investigate whether DGRs were detectably active within the human gut. DGRs were identified by searching contigs for regions that matched three criteria: (i) they contained protein-coding regions resembling reverse transcriptases, (ii) they encompassed short repeat regions containing mismatches in adenine positions, and (iii) they contained hypervariable regions. Of the 20 contigs with both a reverse transcriptase and an adenine-mismatched repeat, six were associated with hypervariable regions (located no more than 100 bp away; Table S3) and were selected for further study. As was found previously, hypervariation was directed toward asparagine AAY codons in genes encoding either predicted C-type lectin or Ig-superfamily proteins (6, 30–33).

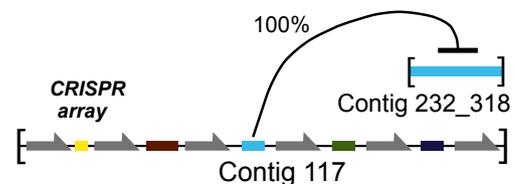
We next asked whether any of the DGRs were detectably active over the time series studied. The longest gap between sample collections was 22 mo, so to maximize sensitivity we asked whether the hypervariable regions had evolved to become clearly different over this time interval. Of the two hypervariable regions with sufficient longitudinal coverage for analysis, one (contig 42) showed change over the 22-mo time period, and change was greater than for samples closer together in time ( $P < 0.0001$ ) or for pairs of samples from the same time point ( $P < 0.0001$ ). For the second (contig d03-2), we did not obtain evidence for longitudinal variation. We conclude that one of our DGRs was active in the human gut. For the others, it is unclear whether they were inactive or whether we did not have enough sequence coverage to detect activity. Analysis showed that DGR-containing contigs were not among the most variable, highlighting the local nature of DGR variation and emphasizing the

contributions of other mechanisms. The possibility that some of the DGRs were inactive raises the question of whether the mutagenic activity might be regulated in the human host.

### Discussion

Here we report a study of longitudinal variation in the human gut virome and some of the mechanisms responsible for change over time. Loss and acquisition of viral types was uncommon: Fully ~80% of viral forms persisted over the 2.5-y time course studied, as is consistent with previous studies of shorter duration (4–6). Most viral contigs showed diversity within each time point and accumulated variation over time. Temperate DNA phages showed relatively modest rates of variation compared with lytic phage, as is consistent with temperate phage DNA replication by accurate bacterial polymerases in the prophage state, and potentially fewer total rounds of replication. In contrast, the strictly lytic ssDNA Microviridae showed up to 4% substitutions in the major variants present over the time period studied. DGRs showed high diversity in variable repeat regions, and one was detectably active over the time series studied. CRISPR arrays encoded in viral genomes also were associated with longitudinal variation. Thus, multiple mechanisms contributed to viral sequence variation, and our data provide a detailed picture of their relative contributions.

This study did not yield any clear examples of known DNA viruses infecting animal cells. Rare reads did align to genomes of animal cell viruses, but it is uncertain whether these alignments represent true detection of these viruses or rare regions of homology between animal cell viruses and phages. In contrast, several studies have reported frequent detection of animal cell viruses in metagenomic analysis of stool DNA from humans and other primates, raising the question of how these studies differed. One observation is that samples from sick individuals (34, 35) or SIV-infected macaques (36) have yielded animal cell viruses more frequently than samples from healthy controls. Some of these studies did not attempt to analyze bacterial viruses,



**Fig. 5.** A phage-encoded CRISPR array targeting another phage. The array shown (contig 117) was detected in the viral contig collection. Gray indicates CRISPR repeats, and colors indicate CRISPR spacers. The target contig (contig 102) also was identified and observed to be present at some of the same time points; three other contigs also were targeted by the CRISPR array in contig 117. The CRISPR array in viral contig 117 is closely similar to CRISPR-2 detected in the total stool metagenomic sequencing.

instead using bioinformatic filters to extract animal cell viruses from complex sequence mixtures, potentially leading to an under-appreciation of the size of the phage populations. Thus, our data emphasize that in the healthy human gut bacterial viruses are much more numerous than animal cell viruses, although it remains possible that some of our contigs with no database matches correspond to previously unknown viruses infecting human cells.

Given the findings reported here, we can return to the question of why human gut viromes differ so greatly among human individuals. One factor must be the differences in bacterial populations in the guts of different humans. Many metagenomic studies emphasize that, although the human gut typically contains bacteria from only a few phyla, the bacterial strains are mostly different between individuals (11–13). Phages can be highly selective for different bacterial lineages—indeed, phage sensitivity is used clinically to distinguish some bacterial strains (e.g., refs. 37 and 38)—likely explaining some of the differences in phage populations in different individuals.

However, a second basis for the differences among individuals, highlighted in data reported here, is rapid within-host viral evolution. Microviridae lineages showed up to 4% substitution in the main variant over the 2.5-y period studied, consistent with laboratory experiments also showing high mutation rates for Microviridae (39). There is no single threshold of sequence identity accepted for splitting related viruses into separate species (40), but different Microviridae species specified by the International Committee on Taxonomy of Viruses show as little as 3.1% divergence (Table S4). Evidently the divergence seen here

for Microviridae contigs 122\_321 and 001\_39 approaches the level sufficient for designation as speciation events. Extrapolating from these rates, our data suggest that multiple new viral species commonly will arise in the gut of a typical human over the course of a human life. Thus, part of the explanation for the extremely large populations of gut viruses inferred from sequence information and for the extreme differences among individual humans appears to be rapid within-individual evolution of long-term viral residents.

## Methods

Longitudinal stool samples were collected from a single healthy male adult under a protocol approved by the Internal Review Board of the Perelman School of Medicine at the University of Pennsylvania. Samples of viral particles were purified by filtration, Centrifon ultrafiltration, and nuclease treatment, and then total DNA was extracted using the QIAamp DNA Stool kit. Sequence information was acquired using Illumina paired-end technology. Sequences were assembled by iterative deBruijn graph assembly using MetaIDBA, and contigs were combined using Minimo. Taxonomy was assigned using Blastp, ORFs were predicted using Glimmer, and bacterial taxa were called using Metaphlan. Oligonucleotides used in this study are presented in Table S5. All sequence information has been deposited at the National Center for Biotechnology Information. For further details see *SI Methods*.

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