



Dramatically improved viral profiling from metagenomes and metatranscriptomes using marker sequence identification

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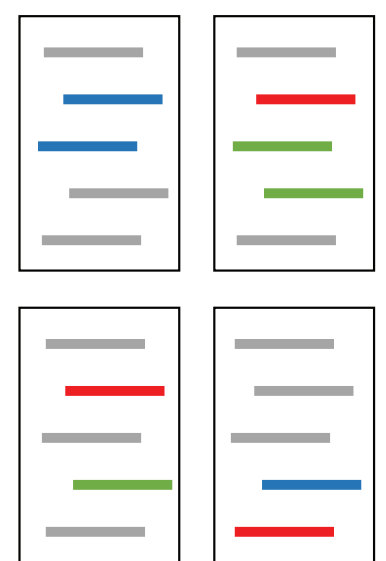


BAQLaVa viral profiling of metagenomes & metatranscriptomes

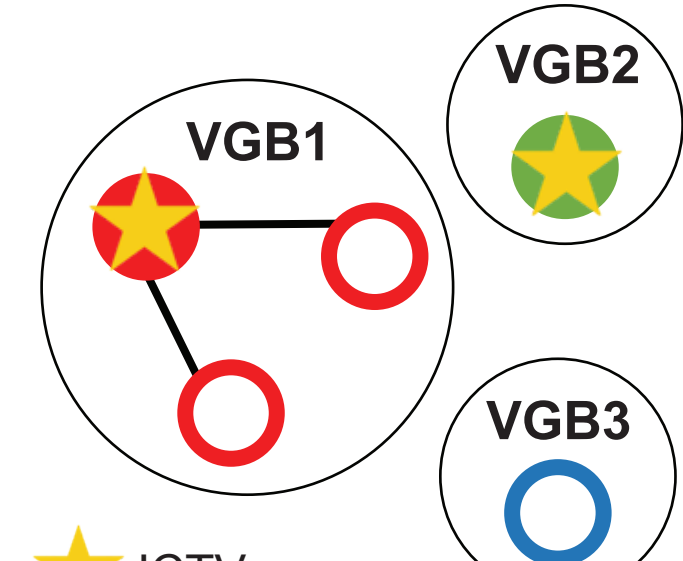
BAQLaVa (Bioinformatic Application for Quantification and Labeling of Viral taxonomy), integrates reference-based profiling with nucleotide and protein databases to generate viral taxonomic profiles from shotgun DNA or RNA sequencing.

1 Dereplication & Clustering

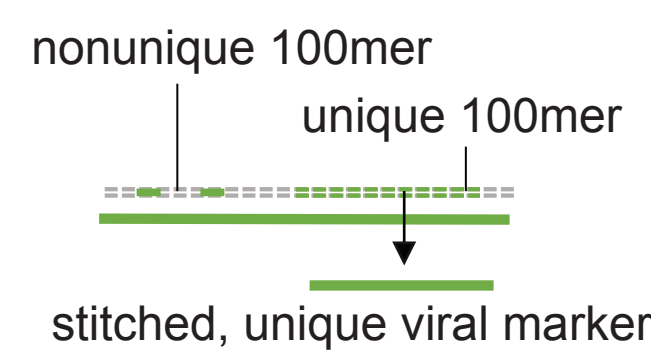
Databases of isolated/assembled viral sequences



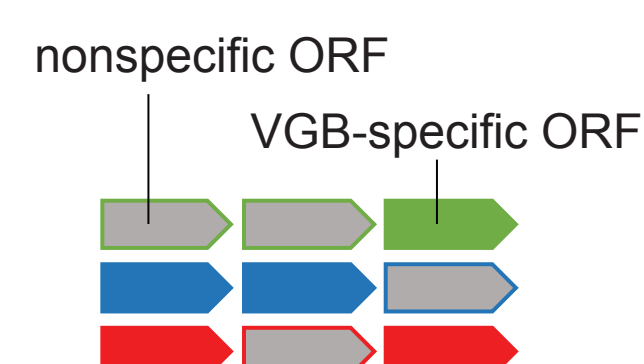
Two-stage clustering into Viral Genome Bins (VGBs)



2 VGB Markerization



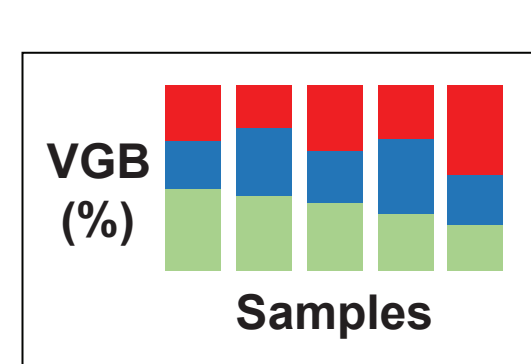
3 ORF calling & clustering



4 Parallel search of MGX/MTX reads



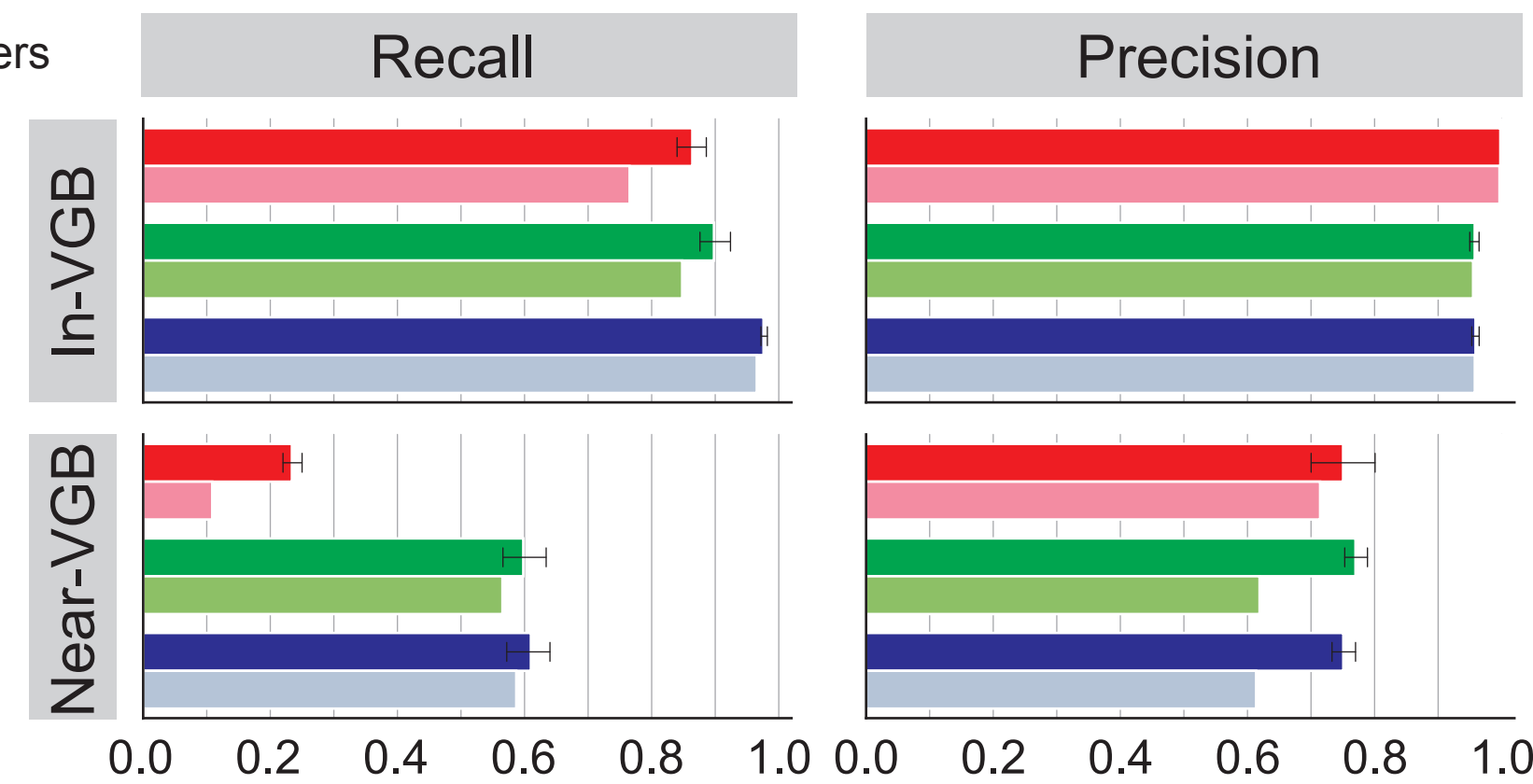
5 Profile Harmonization



(1) BAQLaVa database generation: 122,099 Viral Genome Bins (VGBs) were generated by integrating well-characterized viral databases (ICTV and RefSeq) and novel viral metagenome assembled genome (vMAG) databases. Two-stage clustering included initial dereplication & clustering followed by a graph network clustering step to account for viral recombination. From each resulting VGB, we identified (2) windows of unique marker nucleotide regions and (3) panproteome contents to which translated amino acid matches can be made. (4) In parallel, metagenomic (MGX) or metatranscriptomic (MTX) reads are searched against these databases to (5) produce a harmonized VGB profile.

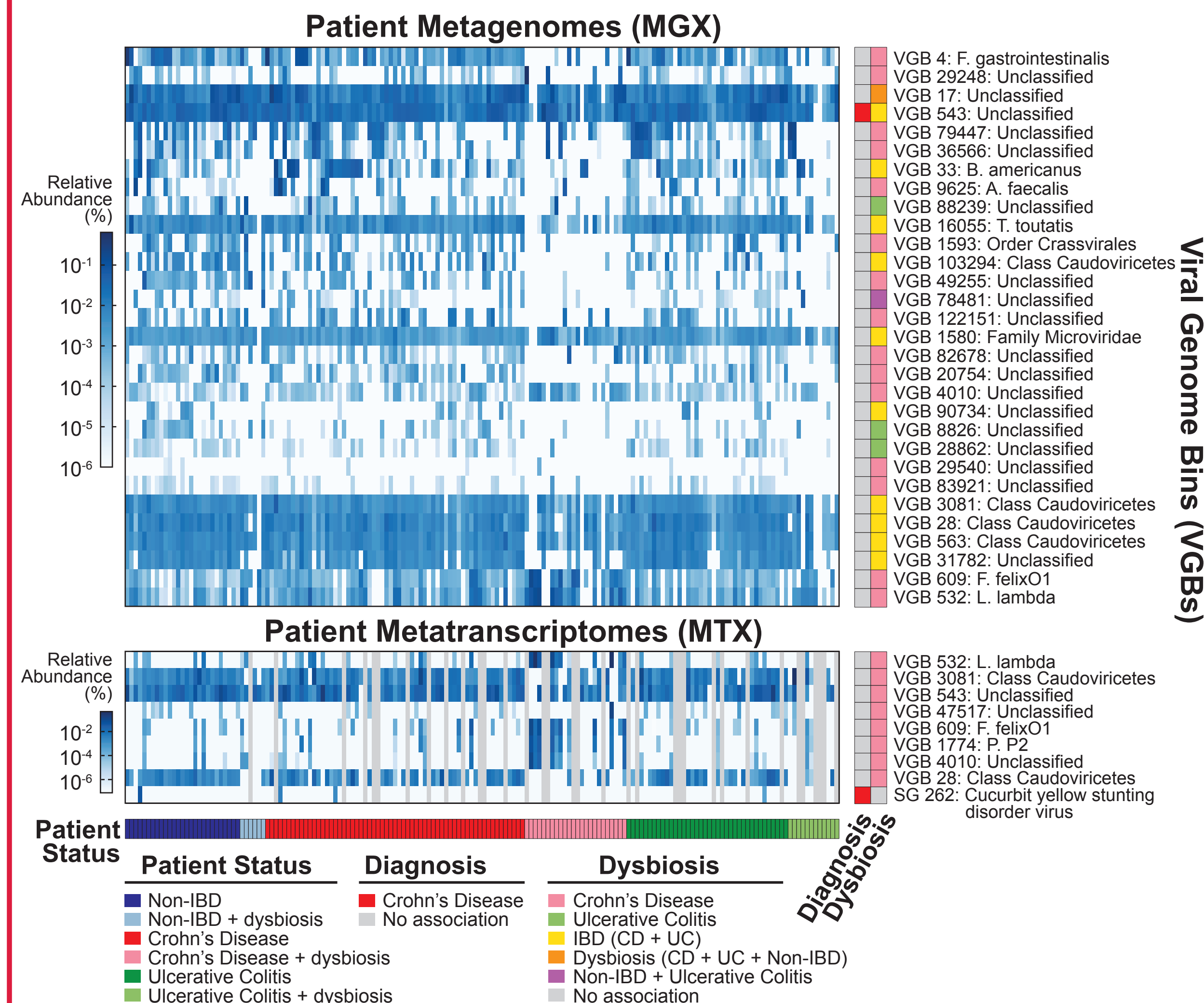
Nucleotide & translated search each contribute unique functionality to BAQLaVa

- Nucleotide search to markers
- Translated search to ORFeomes
- Full BAQLaVa (Nucleotide + Protein)
- Replicate
- Temporal Hold-Out



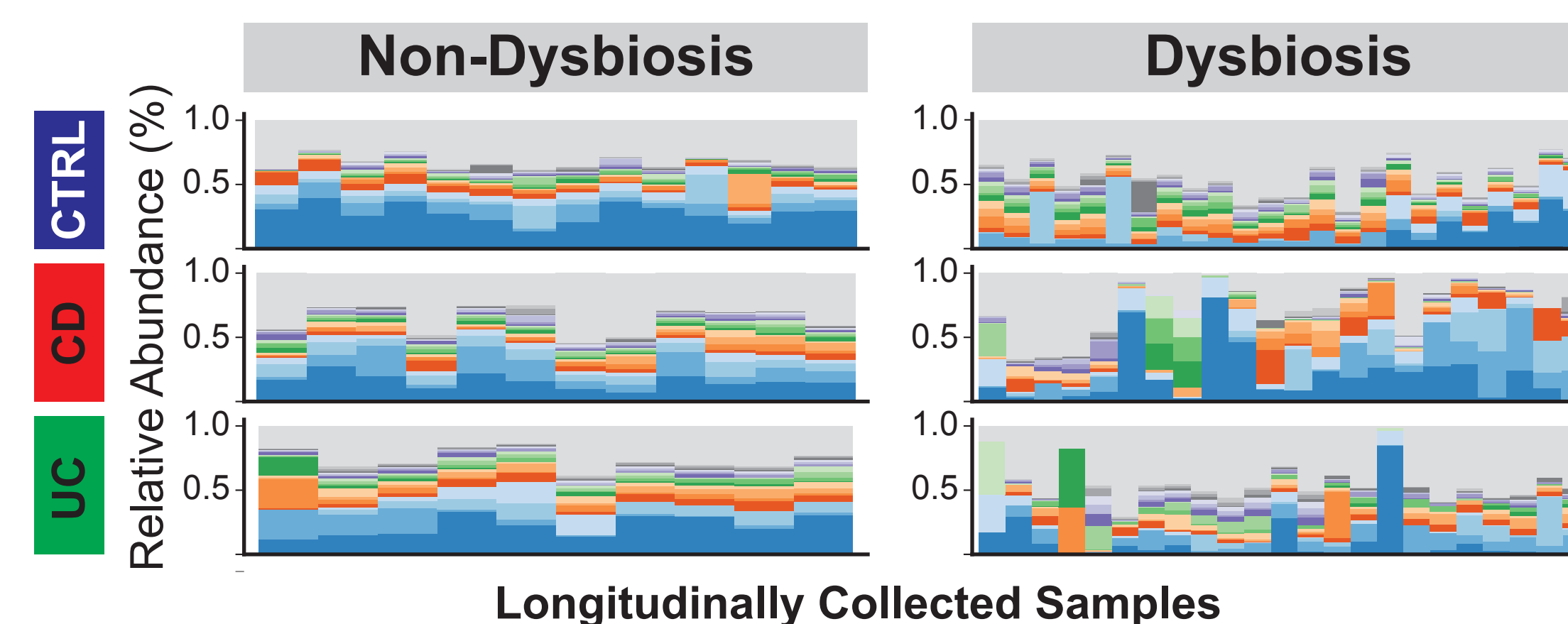
Synthetic samples representing either viruses in-database (In-VGB) or viruses with similarity to but not in-database (Near-VGB) were generated to examine whether BAQLaVa can predict a nearest neighbor when encountering novel genomes. Nucleotide search alone exhibits the highest precision, useful for targeting profiling to In-VGB viruses only. Nucleotide and translated search combined exhibit high recall for Near-VGB viruses, indicating its use in capturing a wider viral profile in the absence of a fully characterized viral landscape.

Loss of viral diversity in IBD-associated dysbiosis



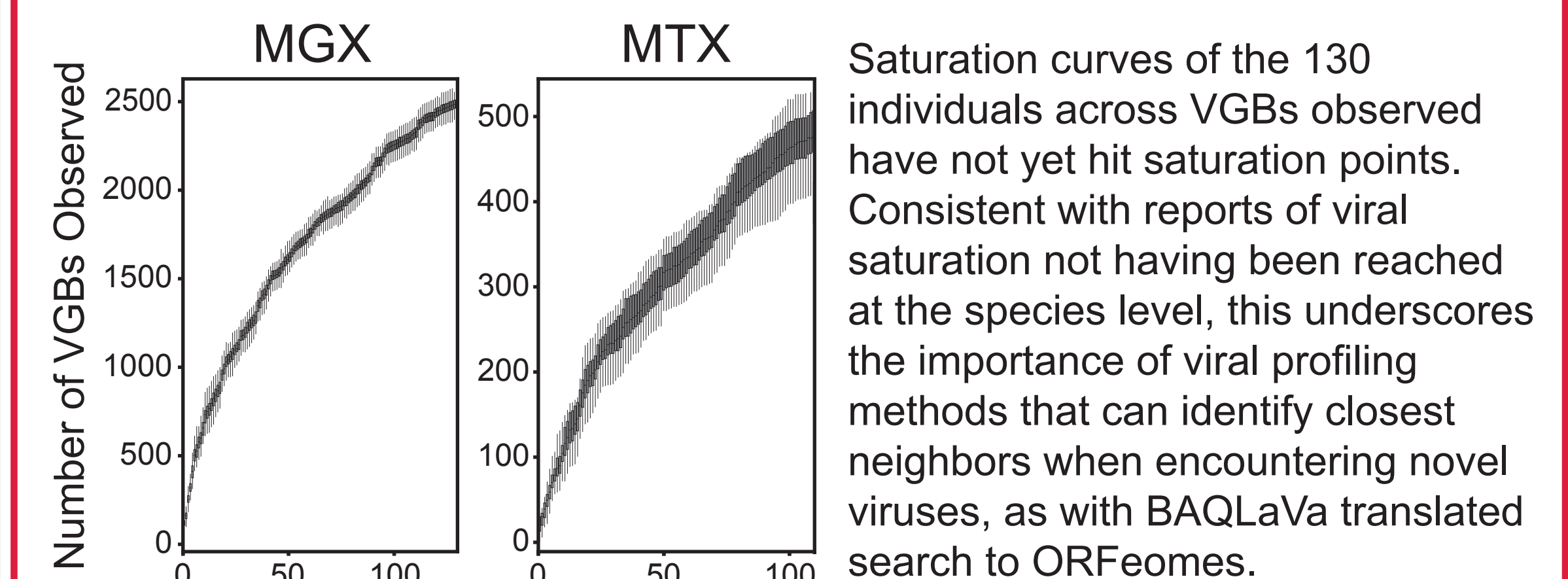
BAQLaVa was used to profile 1,626 MGX and 816 paired MTX from 130 individuals with inflammatory bowel disease (IBD) or non-IBD controls. Using MaAsLin 3, we identified significant changes to the virome that occur in both active and inactive IBD, including a strong loss of diversity in dysbiosis. We also observe that IBD is associated with an overrepresentation of novel VGB clusters containing no previously characterized viruses.

Individuals who exhibit microbial dysbiosis show higher baseline variation in virome profiles

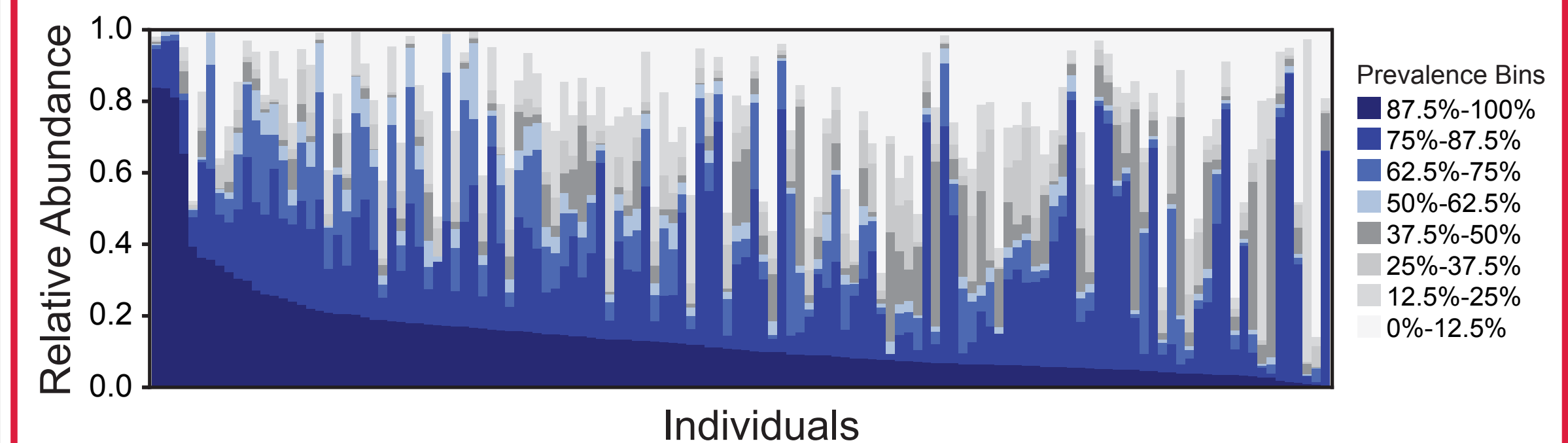


Example longitudinal virome profiles for individuals within subsets of disease and dysbiosis reveals that individuals who exhibit any days of dysbiosis tend to display more variation in weekly virome profiles than individuals who do not experience any dysbiotic days, regardless of disease status.

Viral properties observed across 130 longitudinally sampled individuals



Viromes exhibit bimodal VGB representation by prevalence



Relative abundance plots of viromes shaded by VGB prevalence reveals that viruses fall largely into one of two groups: highly prevalent viruses (those found in ~75% of individuals or more), or individual-specific viruses (found in ~37.5% of individuals or less). Viromes are rarely dominated by VGBs of moderate population prevalence.

VGB stability is associated with both abundance and prevalence

Analysis of consecutive longitudinal samples revealed greater within-subject stability of viruses that were locally abundant or globally prevalent in the population. Additionally, we show that IBD reduces stability when compared to healthy controls.

Acknowledgements

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