

# Untargeted, tandem mass spectrometry metaproteome of Columbia River sediments

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**ABSTRACT** Rivers are critical ecosystems that impact global biogeochemical cycles. Nonetheless, a mechanistic understanding of river microbial metabolisms and their influences on geochemistry is lacking. Here, we announce metaproteomes of river sediments that are paired with metagenomes and metabolites, enabling an understanding of the microbial underpinnings of river respiration.

**KEYWORDS** microbial ecology, river microbiology, metagenomics, metaproteomics, metabolomics, genomes, hyporheic zone

Rivers are vital ecosystems with global-scale consequences. While they have economic value for practices like agriculture, they are also a link between terrestrial and aquatic ecosystems. In fact, rivers transport, mineralize, and bury ~2.7 Pg of carbon per year (1). The hyporheic zone (HZ) is a saturated transitional space between river surface water and underlying sediments, which greatly contributes to river respiration (2, 3). Within HZs, microbial metabolisms significantly contribute to the biogeochemical transformations that ultimately modulate river respiration (4). Currently, a lack of genome-resolved, multi-omic data sets makes the linkages between microbial metabolism and river biogeochemistry opaque, leading to uncertainties in ecological model constraints. Here, we present a metaproteomic data set from Columbia River sediments with paired metagenomes and metabolites and Hyporheic Uncultured Microbial and Viral (HUM-V), a genome-resolved database of river microorganisms (5), providing a multi-omics infrastructure to decode microbial contributions to river carbon and nutrient processing.

We collected six HZ sediment cores of the Columbia River (46°22'15.80"N, 119°16'31.52"W) and subsampled each core into six 10 cm depth sections (0–60 cm) (5, 6). Liquid nitrogen frozen sediment profiles were collected across two transects (170 m apart), yielding 33 samples that were processed for metaproteomics, metagenomics, Fourier-transform ion cyclotron resonance mass spectrometry and <sup>1</sup>H nuclear magnetic resonance spectroscopy. Sediment was prepared for metaproteomic analysis as described previously in detail (6) with a modified application of the MPLEX protocol (7).

Briefly (6), extractions were analyzed on a Q-Exactive Plus Orbitrap mass analyzer (Thermo Electron, Waltham, MA, USA) coupled to a Waters NanoAcquity high-performance liquid chromatography system (Waters Corporation, Milford, MA, USA) through 75 μm × 70 cm columns packed with Phenomenex Jupiter C<sub>18</sub> 3 μm beads (Phenomenex, Torrance, CA, USA). Samples were loaded onto columns with 0.05% formic acid in water and eluted with 0.05% formic acid in acetonitrile over 100 min. Ten data-dependent MS/MS scans (17.5 K resolution, centroided) were recorded for each survey MS scan (35K resolution) using a normalized collision energy of 30, isolation width of 2.0 *m/z*, and rolling exclusion window of ±1 *m/z* lasting 30 s before previously fragmented MS1

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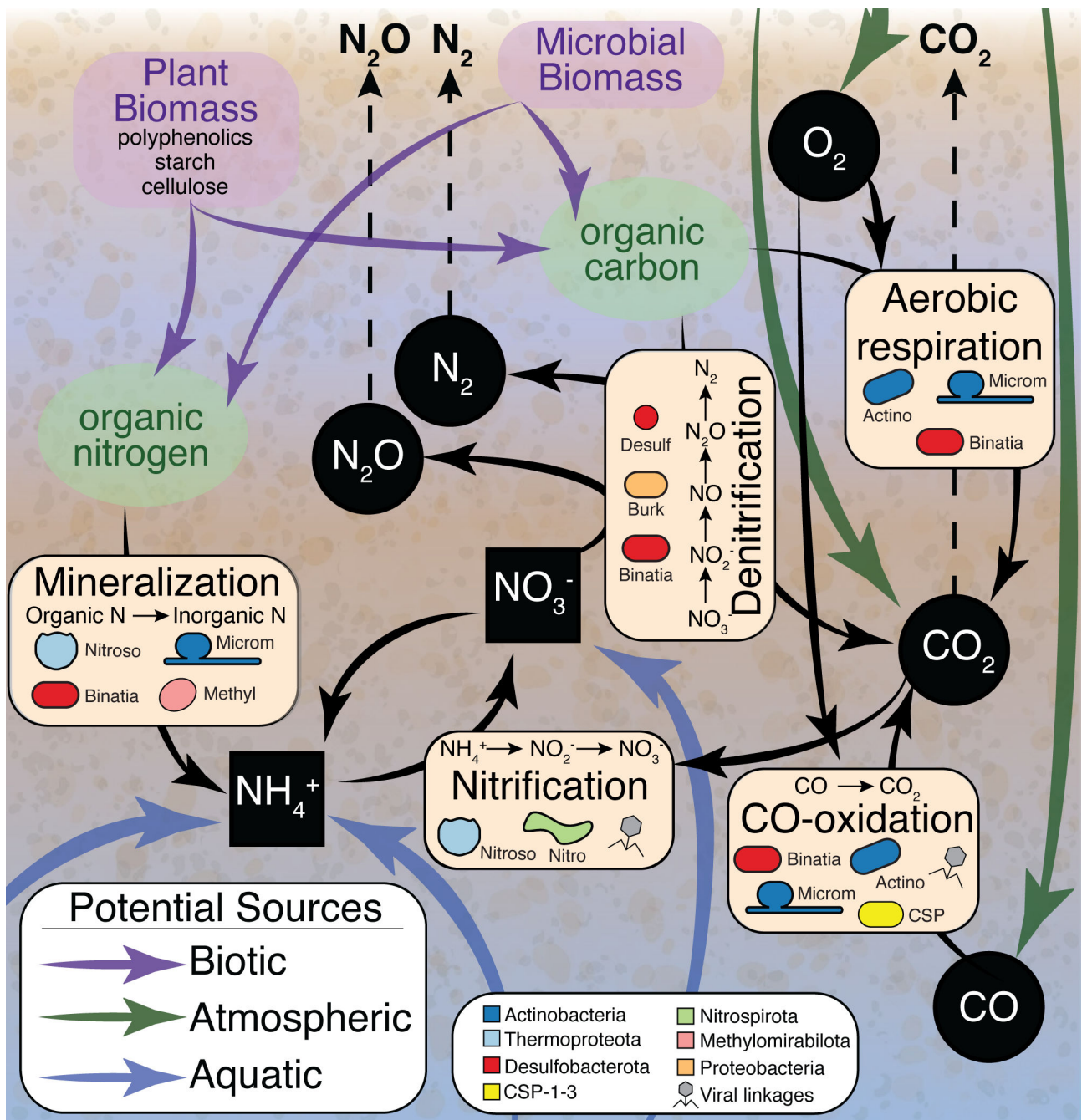
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**FIG 1** Conceptual model summarizing the microbial and viral contributions to HZ carbon and nitrogen cycling identified in this study. This figure is taken from the original publication of this data set in reference (5) and is included here to demonstrate the value of our metaproteomics approach. Black arrows signify microbial transformations uncovered in our MAG-resolved metaproteomic data. Specific processes (e.g., mineralization, nitrification, CO oxidation, denitrification, and aerobic respiration) are highlighted in beige boxes, with microorganisms inferred to carry out these processes denoted by overlaid cell shapes colored by phylum. Possible biotic, atmospheric, and aquatic carbon and nitrogen sources are indicated by purple, green, and blue arrows, respectively. Inorganic carbon and nitrogen sources are shown by black squares (aqueous) and black circles (gaseous), with white text and dashed arrows indicating possible gases that could be released to the atmosphere. Processes that could be impacted by viruses are marked with gray virus symbols.

signals were eligible for re-analysis. All liquid chromatography-tandem mass spectrometry data sets were converted to ASCII text using MSConvert (8), and the files were interrogated with a target-decoy approach to reach a ~1% false detection rate with formula [100 × 191 decoy peptide-spectrum matches (PSMs)/19,084 total filter passing

PSMs] (9) and using MSGF+ (10). Our metaproteome contained 10,063,272 protein entries from 1,299,102,456 amino acids (6).

Spectra were searched against files that included (i) 55 dereplicated bacterial and archaeal metagenome-assembled genome (MAG) and (ii) 111 clustered viral MAG (vMAG) amino acid sequences. Due to functional conservation across closely related MAG strains, peptide recruitments were divided into three categories: (i) unique: peptides with hits to a single protein, (ii) non-unique specialized: peptides with hits to multiple amino acid sequences that shared functional annotation using multiple annotation databases by DRAM (5, 11) and MAG taxonomy with the genome-taxonomy database toolkit (12), and (iii) non-unique: peptides with hits to multiple amino acid sequences with different annotation or taxonomy. Microbial metaproteomes were converted to spectral abundance factors by calculating the length of each protein and normalizing by total counts per peptide mapped to each protein per sample.

Our genome-resolved strategies assigned gene expression to all 55 dereplicated, quality-verified MAGs in HUM-V. These MAGs recruited 13,102 total peptides to 1,313 proteins. The “unique” peptides represented 67% of genes expressed in our proteome. Interestingly, non-unique peptides with identical genus assignment and protein annotation accounted for 14% of the total genes expressed. The addition of this specialized non-unique category prevented the exclusion of ecologically relevant data due to strain overlap. In addition to our microbial results, 66% of our identified vMAGs uniquely recruited peptides (5).

Leveraging HUM-V, we unveiled a myriad of microbial and viral metabolisms contributing to carbon and nitrogen cycling in river sediments (Fig. 1) (5). Our co-expression analyses revealed heterotrophic microbial members (e.g., *Actinobacteriota* and *Nitrososphaeraceae*) that expressed enzymes for the degradation of complex carbon polymers like starch and cellulose to generate monomers that could be utilized by saccharolytic microorganisms (e.g., *Thermoplasmata* and *Proteobacteria*) (5). We also identified organisms (e.g., *Binatia* and *Nitrospiraceae*) that expressed nitrogen mineralization genes, supplying a source of ammonium that could sustain coupled nitrification and denitrification (5). Furthermore, viral metaproteomics demonstrated that viruses likely influence the biogeochemical cycling of river carbon and nitrogen both by active predation of microbial members and through the expression of auxiliary metabolic genes like glycoside hydrolases (5). Ultimately, our paired multi-omic data set enabled the description of a mechanistic, conceptual model of Columbia River microbial biogeochemical cycling.

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## DATA AVAILABILITY

The data sets supporting the conclusions of this article are publicly available. Sequencing data are available in NCBI under BioProject [PRJNA576070](#), with 16S rRNA amplicon sequences under accession numbers [SRX9312157-SRX9312180](#). Metaproteomics data are deposited in the MassIVE database under accession [MSV000087330](#). Metabolomics data are publicly available and deposited in Zenodo <https://doi.org/10.5281/zenodo.5076253>.

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