



BioDIGS

BioDiversity and Informatics for Genomics Scholars

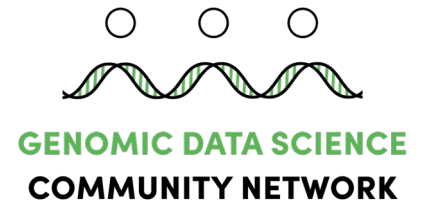
Michael Schatz
February 8, 2024
AGBT



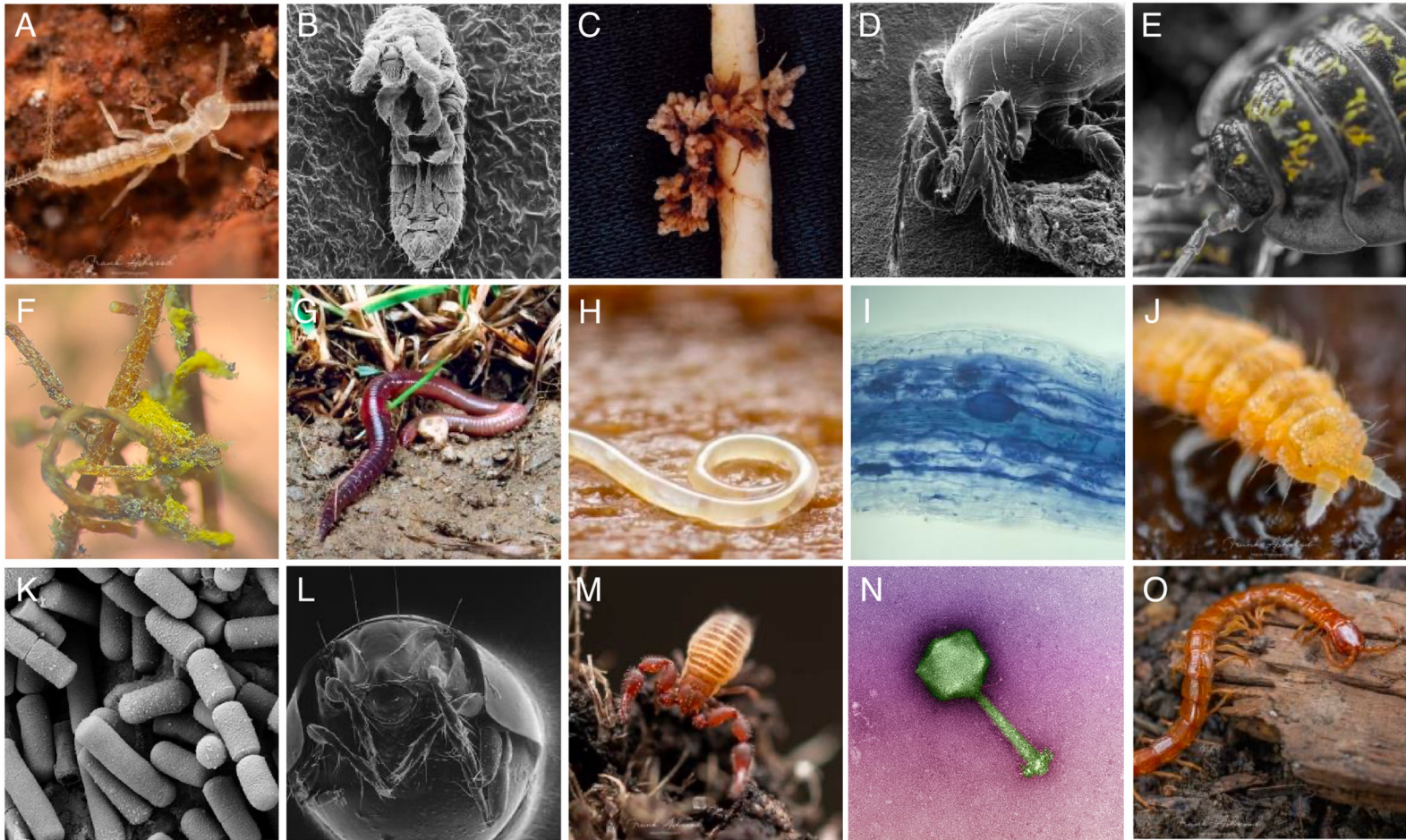
Disclosures

I (Michael Schatz) am a Scientific Advisory Board Member for CosmosID

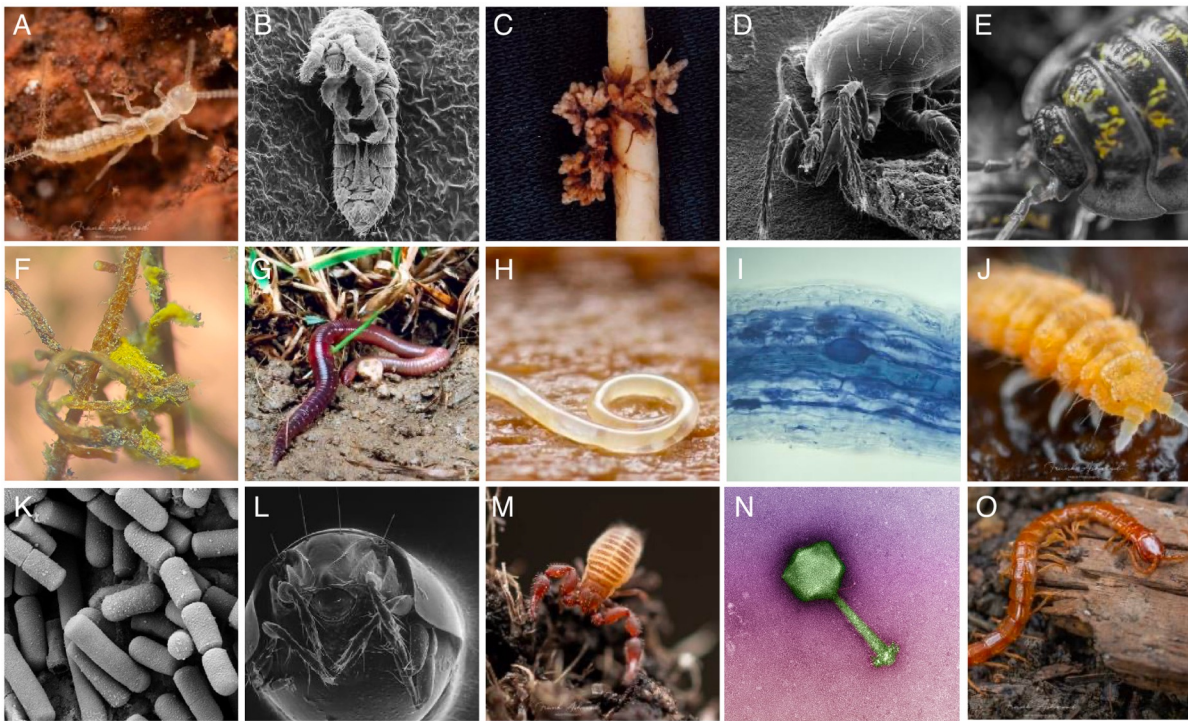
Rita Colwell is the founder of CosmosID and
an Advocacy Board Member
for the Genomic Data Science Community Network (GDSCN)



Genomic Diversity



Genomic Diversity



“... soil is likely home to 59% of life ... making it the singular most biodiverse habitat on Earth.”

Enumerating soil biodiversity

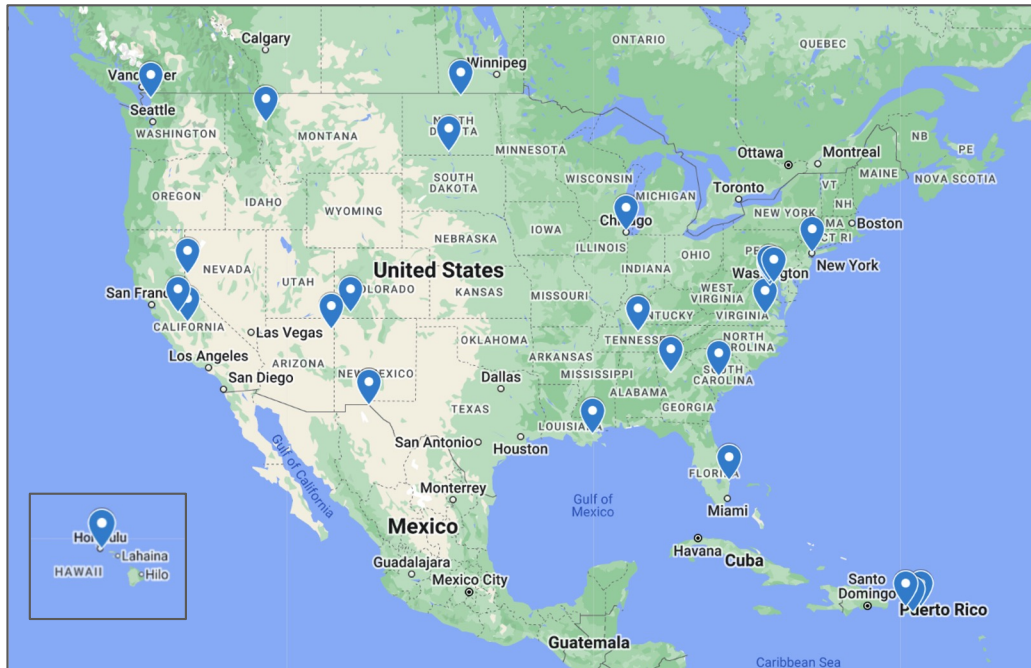
Anthony et al (2023) PNAS.

doi:10.1073/pnas.2304663120

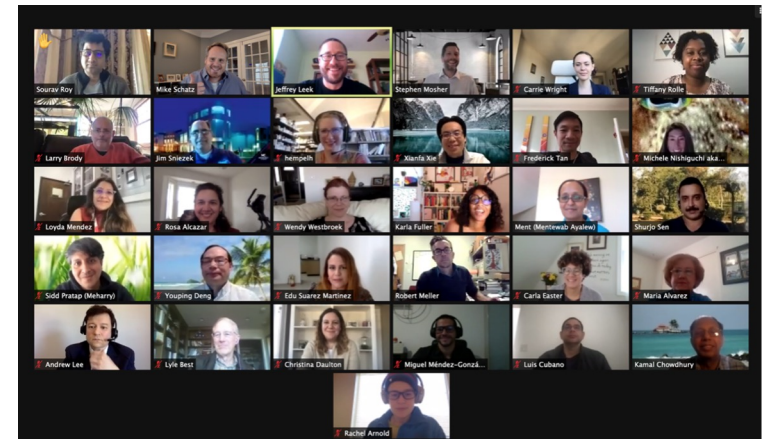
Genomic Data Science Community Network



Promoting education and research in genomic data science at HBCUs, HSIs, TCUs, CCs, and other underserved



<https://www.gdscn.org/>



GDSCN Needs & Resources

Perspective

Diversifying the genomic data science research community

The Genomic Data Science Community Network¹

Over the past 20 years, the explosion of genomic data collection and the cloud computing revolution have made computational and data science research accessible to anyone with a web browser and an Internet connection. However, students at institutions with limited resources have received relatively little exposure to curricula or professional development opportunities that lead to careers in genomic data science. To broaden participation in genomics research, the scientific community needs to support these programs in local education and research at underserved institutions (UIs). These include community colleges, historically Black colleges and universities, Hispanic-serving institutions, and tribal colleges and universities that support ethnically, racially, and socioeconomically underrepresented students in the United States. We have formed the Genomic Data Science Community Network to support students, faculty, and their networks to identify opportunities and broaden access to genomic data science. These opportunities include expanding access to infrastructure and data, providing UI faculty development opportunities, strengthening collaborations among faculty, recognizing UI teaching and research excellence, fostering student awareness, developing modular and open-source resources, expanding course-based undergraduate research experiences (CUREs), building curriculum, supporting student professional development and research, and removing financial barriers through funding programs and collaborator support.

[Supplemental material is available for this article.]

Foundations for justice in genomic data science

Despite growing opportunities in data science careers, systemic barriers have limited the participation of underrepresented groups in genomic data science research and education (Canner et al. 2017). Among bachelor's degree recipients in biological sciences, computer sciences, mathematics, and statistics from 2006–2016, 8.7% were Hispanic or Latinx, 7.8% were Black or African American, and 1.9% were multiracial and/or indigenous American (National Science Foundation 2019a). Meanwhile, these groups represent 16.3%, 12.3%, and 2.5% of the US resident population, respectively (National Science Foundation 2019a). Disparities are more pronounced in graduate education (Wiley et al. 2020). Affinity organizations in which members of underrepresented groups come together are vital to developing a sense of belonging and support system (Supplemental Table S1). However, for true representation in research, science needs inclusive spaces where researchers can communicate actively with educators and where students are supported in developing science, technology, engineering, and mathematics (STEM) identities.

The technological advancements of high-throughput sequencing in the past two decades have enabled the rapid proliferation of genomic data (Goodwin et al. 2016) but they have also led to an even greater access imbalance. Over 60 petabytes of data (National Center for Biotechnology Information 2021), or about a million times the size of the original human genome project (International Human Genome Sequencing Consortium 2001), is currently available within the US National Center for Biotechnology Information (NCBI) genomic sequencing repositories.

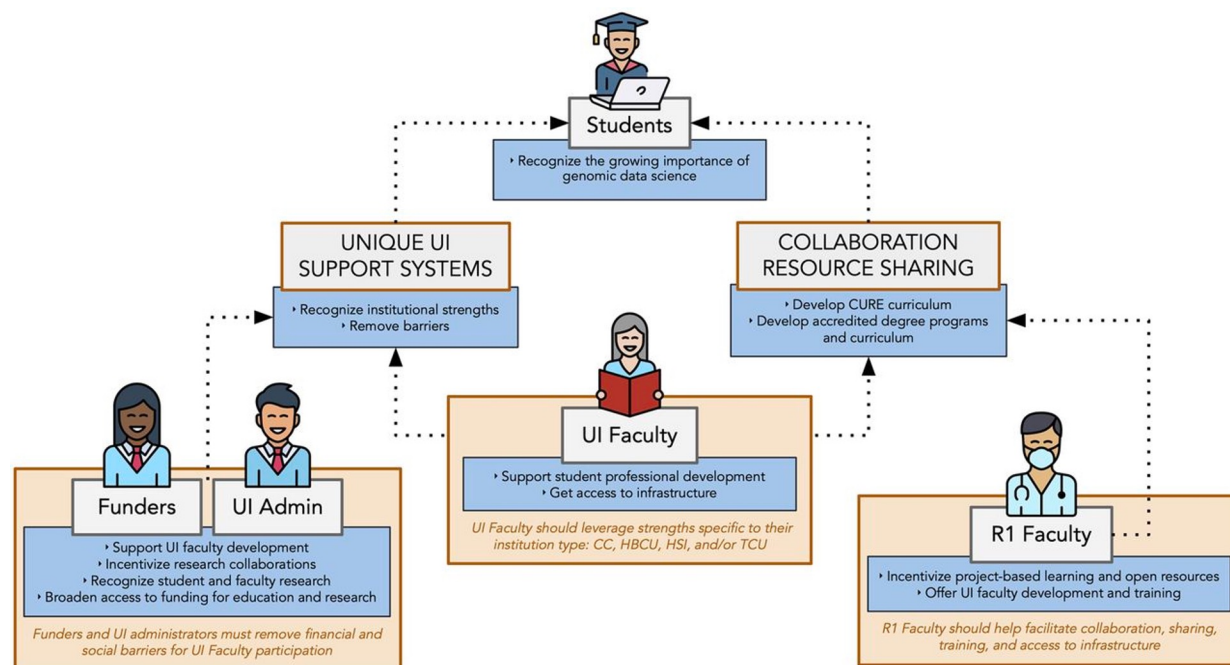
This wealth of data will help scientists determine disease risk, diagnose rare conditions, improve drug safety and efficacy (Manolio et al. 2019), survey pathogens for public health applications (Khouri et al. 2020), and even combat the effects of climate change (Hoffman et al. 2021). Our greatest limitation is personnel to interpret these data. Yet, genomic data science currently lacks a scaffolded mechanism that supports all individuals and provides a hub of intellectual capital, curated genomic data, and the infrastructure required for authentic learning gained through research experiences. Broader, more diverse participation should be the starting point for creating a more inclusive genomic data science field (Mapes et al. 2020). Focusing on participation is not only ethical but desirable for more novel solutions to problems (Hofstra et al. 2020) and is necessary for bringing different perspectives to the table (Zook et al. 2017).

Our vision for a diverse scientific community engaged in genomic data science research is one in which researchers, educators, and students thrive in a just and fair system, not limited by their institution's scientific clout, resources, geographical location, or infrastructure (Fig. 1). Here, we focus on traditionally underserved institutions (UIs) in the United States, which include minority serving institutions (MSIs) defined by the US Department of Education: historically Black colleges and universities (HBCUs), Hispanic-serving institutions (HSIs), and tribal colleges and universities (TCUs) (Li and Carroll 2007). UIs also include community colleges (CCs) and some primarily undergraduate institutions that overlap substantially with MSIs (Nguyen et al. 2015). Collectively, UIs play a critical role in educating ethnically, racially, and socioeconomically underrepresented students despite limited access to resources (Li and Carroll 2007). In addition to the number of traditionally underrepresented students educated at UIs, these colleges and universities possess unique strengths, such as the greater sense of belonging, more positive mentoring relationships, and

¹A complete list of GDSCN participants appears at the end of this paper.

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"Diversifying the Genomic Data Science Research Community." *Genome Research* (2022). [doi:10.1101/gr.276496.121](https://doi.org/10.1101/gr.276496.121)



Foundations of GRADS-4C

Knowledge
Transfer and
Sustainability

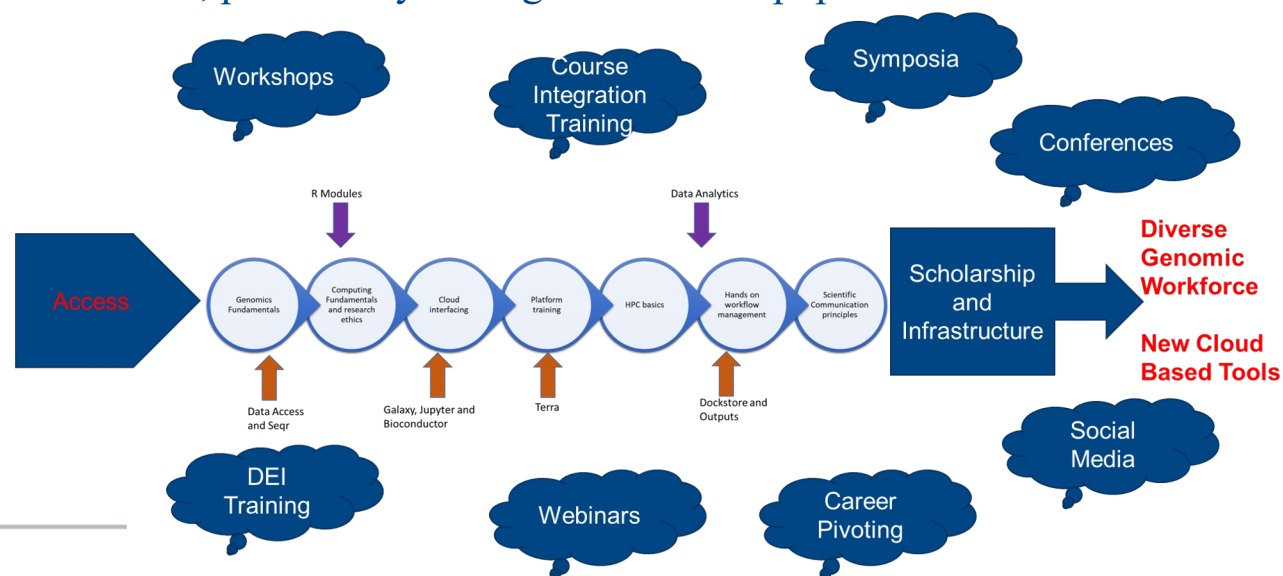
Partnership

Growth Model
Infrastructure Development

Trust

GRADS-4C: Genomic Research and Data Science Center for Computation and Cloud Computing

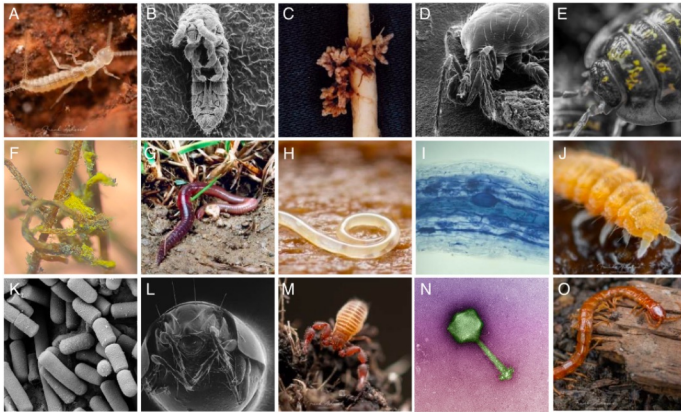
Our Mission is to develop an educational and hands-on research training network with resources in computational genomics, data sciences, and cloud computing (CGDS) to investigate and improve human health, as well as develop the future CGDS workforce, particularly among underserved populations



Website: GRADS4C.ncat.edu

AGGIES **DO**

BioDIGS: What can we learn from the soil?



- *Microbiology & Metagenomics*

- What's there? How does the genomic composition change in time and space?

- *Genomics & Bioinformatics*

- Optimal approaches for metagenome assembly and classification? Merits of short- vs long-read sequencing?

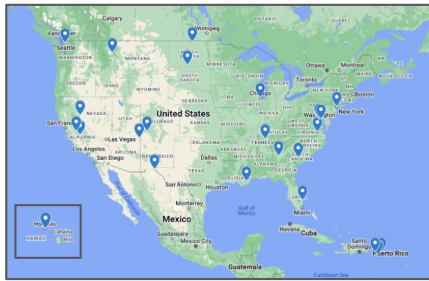
- *Agriculture & Environment*

- How do characteristics of the soil & soil microbiome modulate plant & animal development?

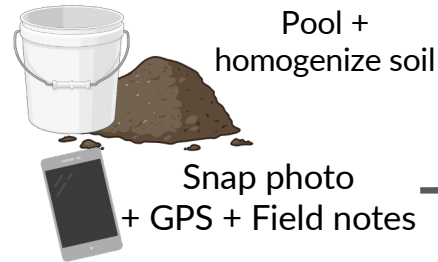
- *Public Health*

- How does the soil microbiome influence the human microbiome & human health outcomes?

BioDIGS Sampling Protocol



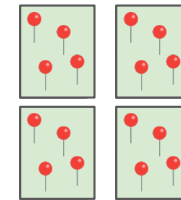
Apply for permit



Select Site



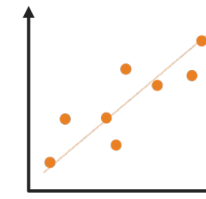
Gather Test Samples



**Repeat:
+4 Sites**

Lead
Cadmium
Arsenic
Organics
pH

**Soil Testing
DNA Sequencing**



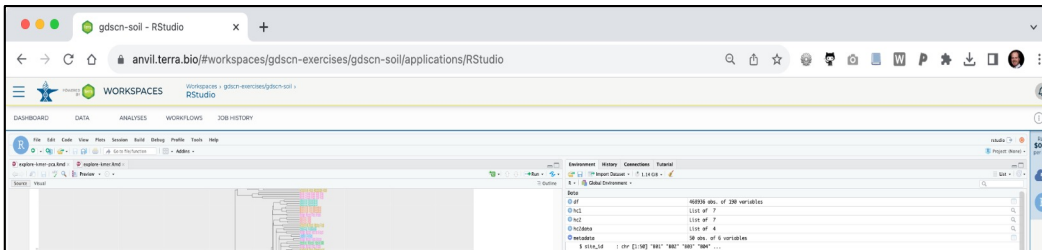
AnVIL

Galaxy

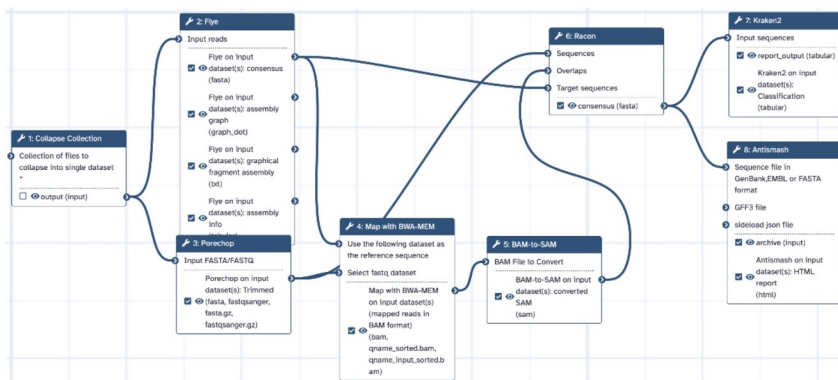
Bioconductor
OPEN SOURCE SOFTWARE FOR BIOINFORMATICS

Analysis

BioDIGS Analysis



Galaxy Workflow



1. Flye (assembly)
2. Porechop (trim & QC)
3. BWA-MEM (align reads)
4. Racon (polish contigs)
5. Kraken2 (classify contigs)
6. AntiSMASH (BGC annotation)
7. Kallisto (BGC abundance)



Katherine Ulbricht



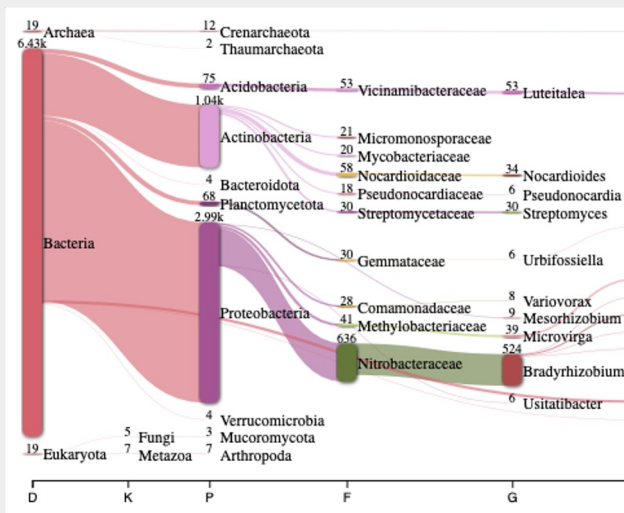
Nia Davis



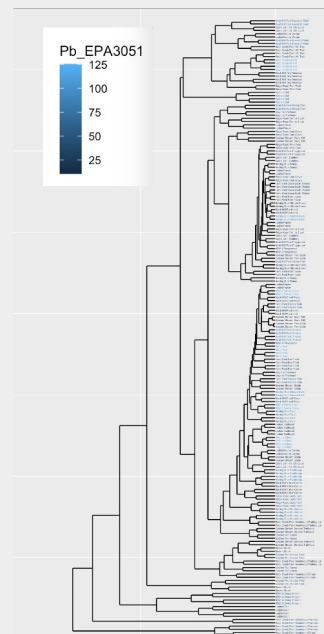
Ayalew lab
Spelman College

BioDIGS Analysis

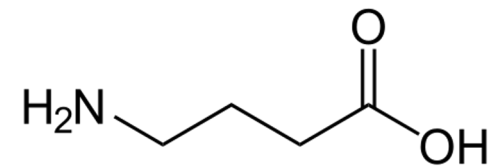
Genomic Diversity



Environmental Associations

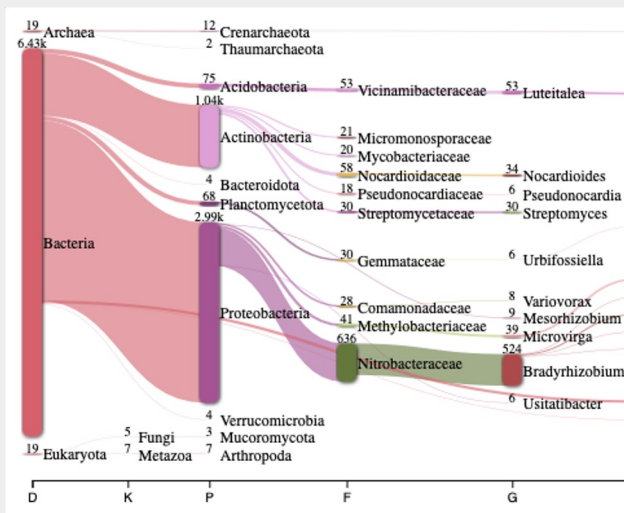


Human Health & Disease

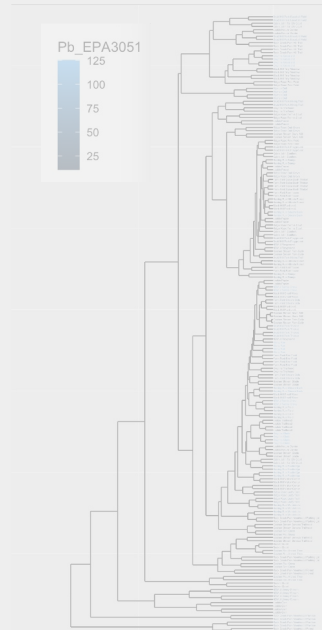


BioDIGS Analysis

Genomic Diversity



Environmental Associations

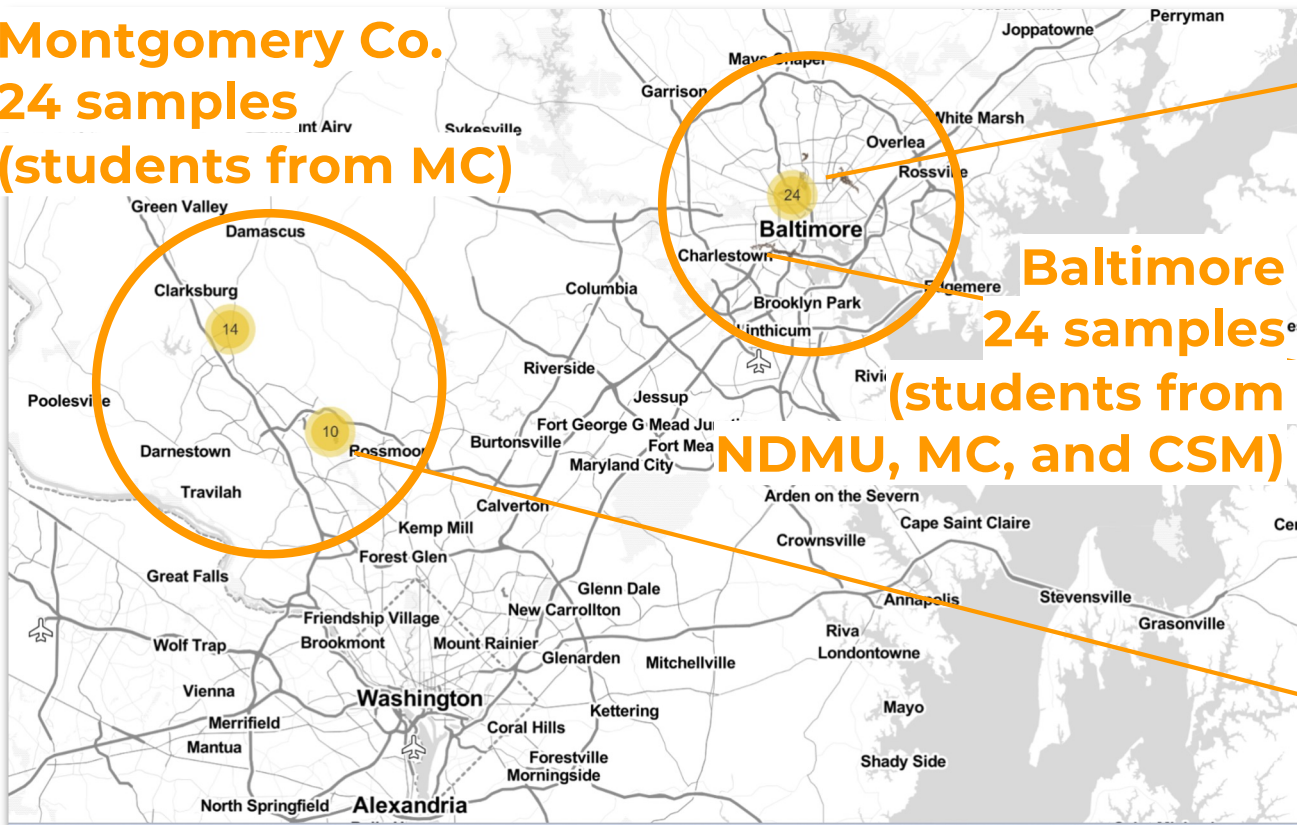


Human Health & Disease



DC+Baltimore pilot study sampling

**Montgomery Co.
24 samples
(students from MC)**



Stony Run (near JHU)



Gwynns Falls Trailhead



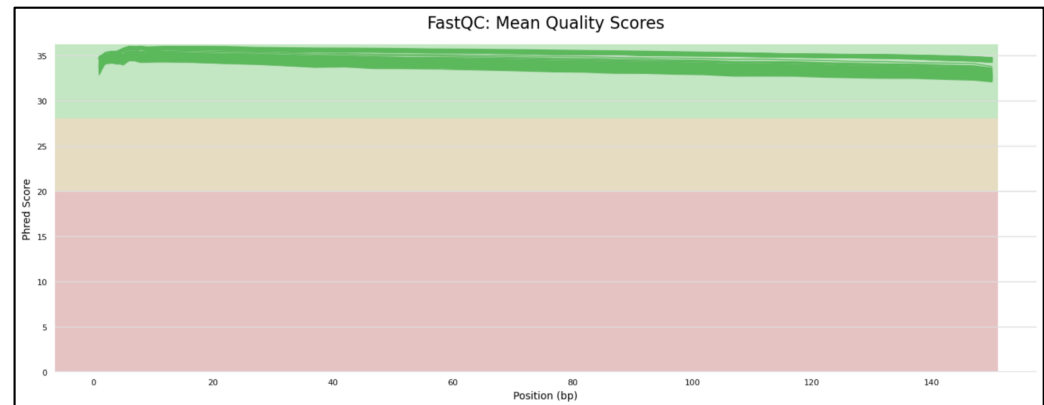
Lake Needwood

Interactive map at: <http://biodigs.org>

DC+Baltimore Data

Sampling & Sequencing

- Zymo DNA/RNA shield
- Qiagen DNeasy PowerSoil Pro kit
- 2x150bp @ NovaSeq SP
- ~20M reads / site

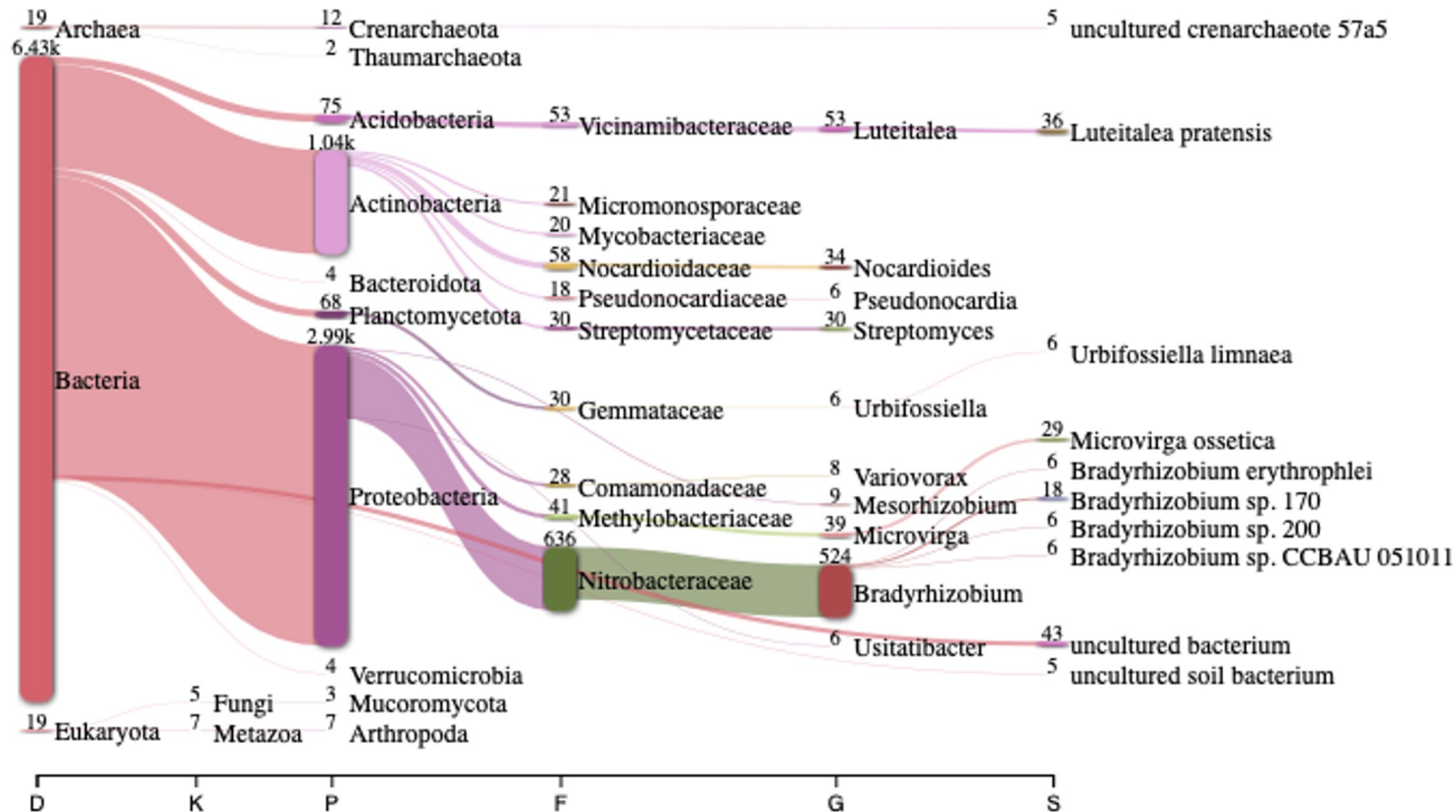


UNIVERSITY OF DELAWARE
**COOPERATIVE
EXTENSION**

Soil Testing

- Routine soil testing: Soil pH, Organic matter, Mehlich 3 extractable nutrients (P, K, Ca, Mg, Mn, Zn, Cu, Fe, B, S, Na and Al), Phosphorus Saturation Ratio
- Heavy metals: Arsenic, Cadmium, Chromium, Copper, Nickel, Lead, Zinc

Taxonomic classification

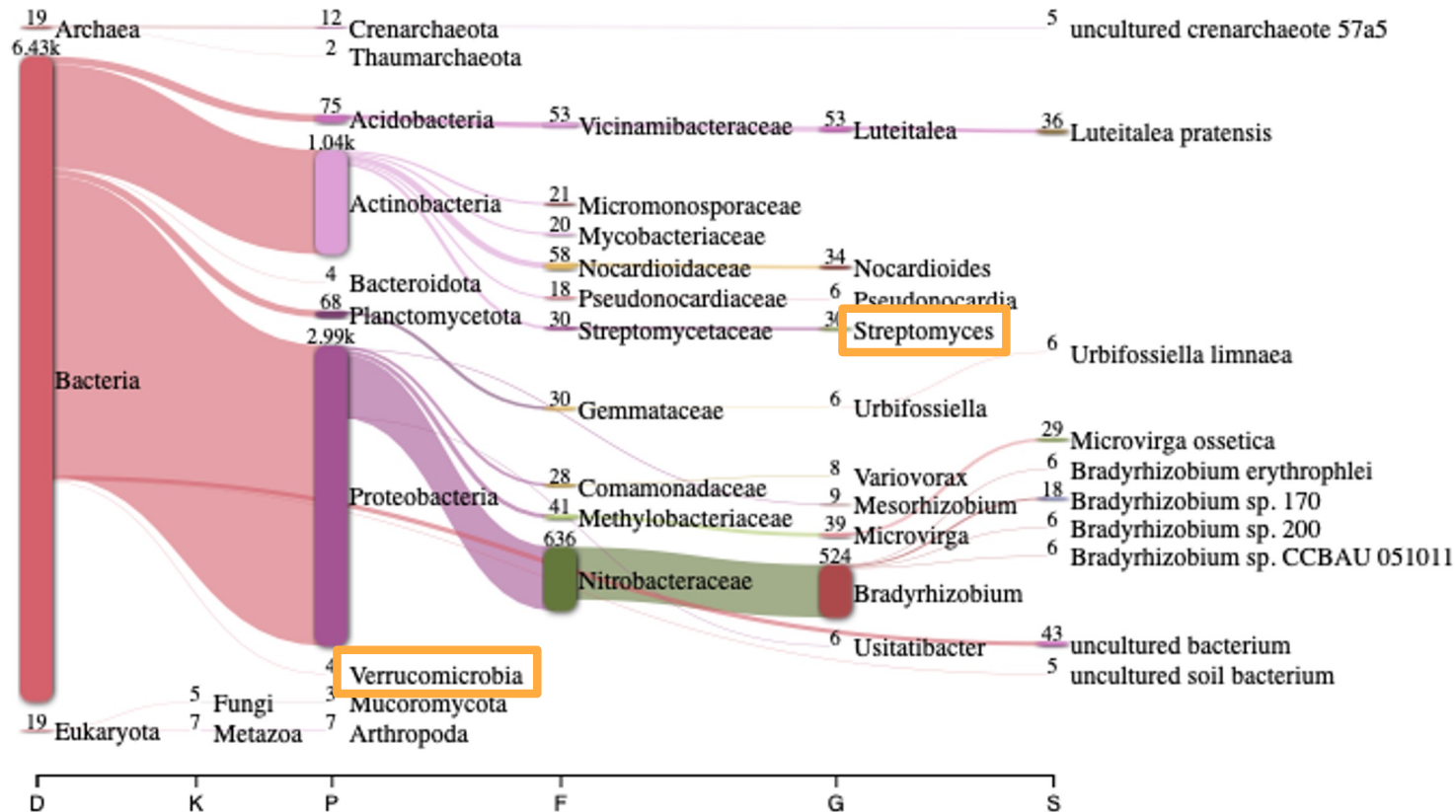


- Mostly common soil microbes; Several species associated with nitrogen fixation

Improved metagenomic analysis with Kraken 2

Wood, Lu, Langmead (2019) Genome Biology do:10.1186/s13059-019-1891-0

Taxonomic classification



- Mostly common soil microbes; Several species associated with nitrogen fixation
- Several hits to the genus *Streptomyces*, which produce many naturally occurring antimicrobials
- Certain species of *Verrucomicrobia* are important human probiotics for GI metabolism (*Akkermansia*)

Improved metagenomic analysis with Kraken 2

Wood, Lu, Langmead (2019) Genome Biology doi:10.1186/s13059-019-1891-0

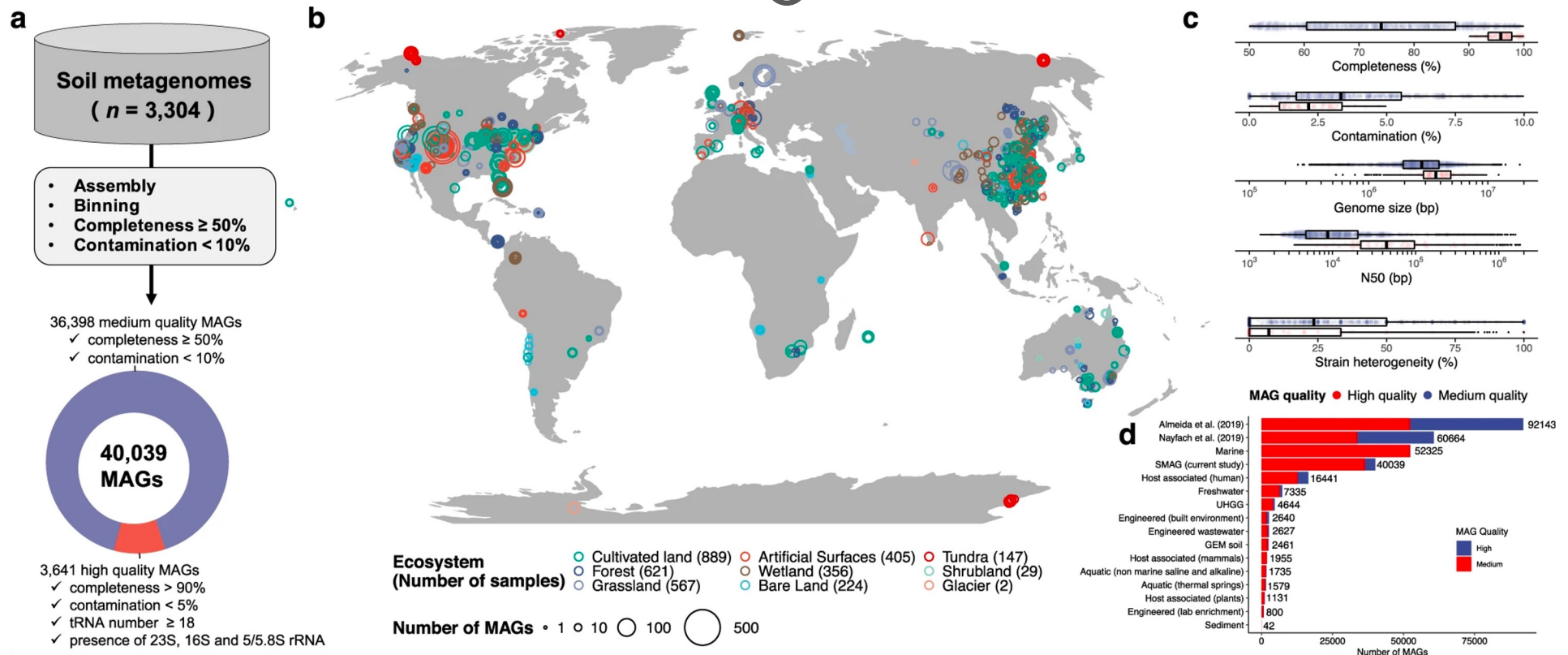
Species classification

Name	Number of raw reads	Classified reads	Chordate reads	Artificial reads	Unclassified reads	Microbial reads	Bacterial reads	Viral reads	Fungal reads	Protozoan reads
HHGCVDRX3-1-ACTCGGCAAT-TTCAGTTGTC_S41_L002	5,779,462	15.5%	0.00114%	0%	84.5%	12.5%	8.79%	0.00147%	0.0535%	0.00019%
HHGCVDRX3-1-ACTCGGCAAT-TTCAGTTGTC_S41_L001	5,501,528	15.4%	0.002%	0%	84.6%	12.4%	8.7%	0.00129%	0.0515%	0.000309%
HHGCVDRX3-1-CAATCGGCTG-TTCCTACAGC_S39_L002	5,857,162	13.3%	0.00099%	0%	86.7%	11.3%	9.08%	0.00082%	0.0453%	0.000137%
HHGCVDRX3-1-CAATCGGCTG-TTCCTACAGC_S39_L001	5,617,529	13.2%	0.00141%	0.0000178%	86.8%	11.2%	8.96%	0.000819%	0.0445%	0.000196%
HHGCVDRX3-1-GAACTGAGCG-CGCTCCACGA_S1_L002	5,315,099	12.9%	0.00122%	0%	87.1%	10.9%	8.6%	0.000978%	0.0396%	0.000263%
HHGCVDRX3-1-GAACTGAGCG-CGCTCCACGA_S1_L001	5,087,303	12.7%	0.001%	0%	87.3%	10.8%	8.5%	0.00106%	0.0392%	0.000216%
HHGCVDRX3-1-GATCAAGGCA-ATTAACAAGG_S8_L001	7,260,595	11.8%	0.00169%	0%	88.2%	9.51%	7.06%	0.000689%	0.0122%	0.0000826%
HHGCVDRX3-1-GATCAAGGCA-ATTAACAAGG_S8_L002	7,676,877	11.8%	0.00168%	0%	88.2%	9.56%	7.12%	0.000391%	0.0122%	0.0000912%
HHGCVDRX3-1-ACCGGCCGTA-AATATTGCCA_S36_L002	7,379,576	11.5%	0.000474%	0.0000136%	88.5%	10.8%	9.31%	0.0011%	0.0394%	0.0000813%
HHGCVDRX3-1-CGTCTCATAT-AGCTACTATA_S3_L002	5,157,206	11.5%	0.000756%	0%	88.5%	10.7%	8.93%	0.0014%	0.0358%	0.000427%
HHGCVDRX3-1-ACCGGCCGTA-AATATTGCCA_S36_L001	6,918,535	11.4%	0.000795%	0%	88.6%	10.7%	9.19%	0.00116%	0.041%	0.0000434%
HHGCVDRX3-1-CGTCTCATAT-AGCTACTATA_S3_L001	4,917,122	11.4%	0.000936%	0%	88.6%	10.6%	8.82%	0.00122%	0.0348%	0.000285%
HHGCVDRX3-1-CTAGTGCTCT-TACTGTTCCA_S7_L002	5,701,275	11.4%	0.0016%	0%	88.6%	8.31%	6.55%	0.000368%	0.0175%	0.0000526%
HHGCVDRX3-1-GGTTGCGAGG-TTGCTCTATT_S26_L002	9,214,523	11.4%	0.00158%	0%	88.6%	11%	9.57%	0.0014%	0.0435%	0.000184%
HHGCVDRX3-1-CTAGTGCTCT-TACTGTTCCA_S7_L001	5,464,649	11.3%	0.00135%	0%	88.7%	8.22%	6.46%	0.000421%	0.0161%	0.000146%

Showing 1 to 15 of 96 entries

Previous 1 2 3 4 5 6 7 Next

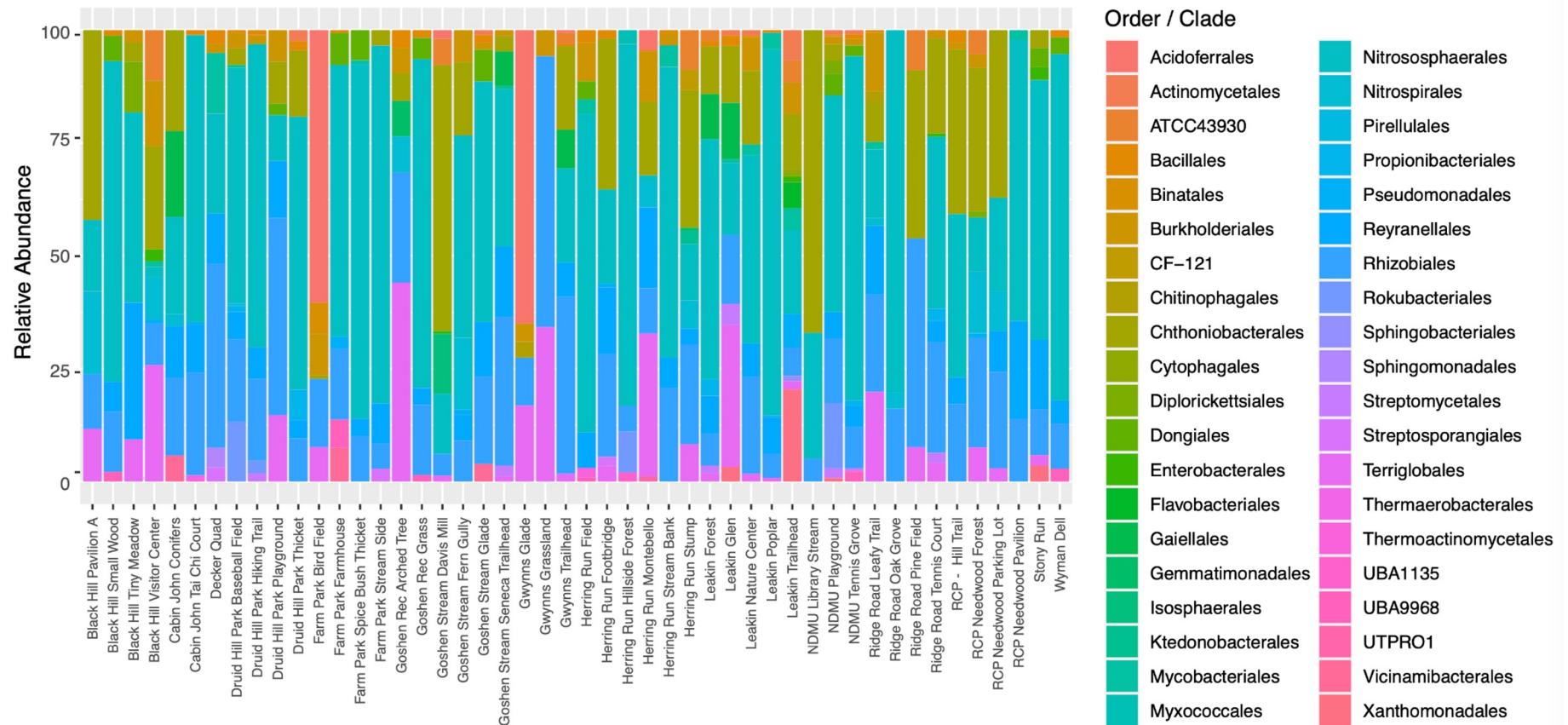
SMAG catalogue: 40,039 soil MAGs



A genomic catalogue of soil microbiomes boosts mining of biodiversity and genetic resources

Ma *et al* (2023) Nat Communication <https://doi.org/10.1038/s41467-023-43000-z>

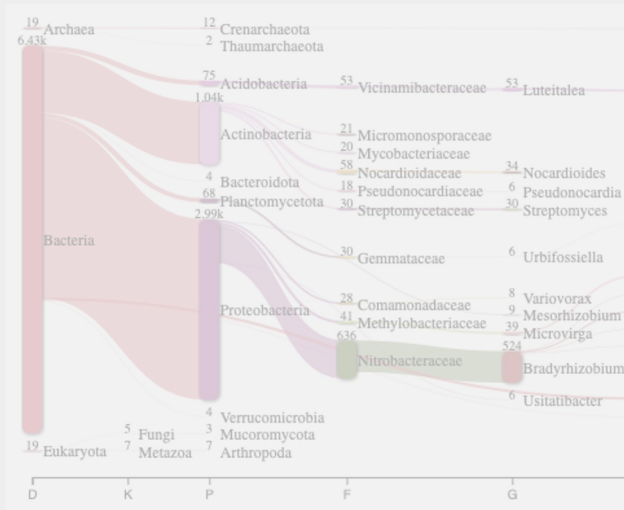
Genomic Diversity



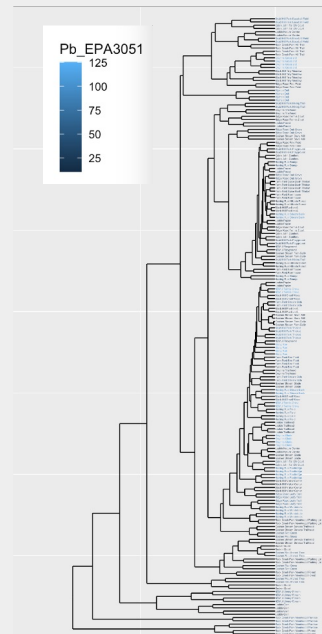
Metagenome profiling and containment estimation through abundance-corrected k-mer sketching with sylph
Shaw and Yu (2023) bioRxiv. doi:10.1101/2023.11.20.567879

BioDIGS Analysis

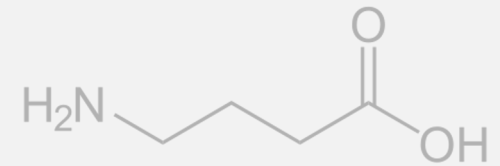
Genomic Diversity



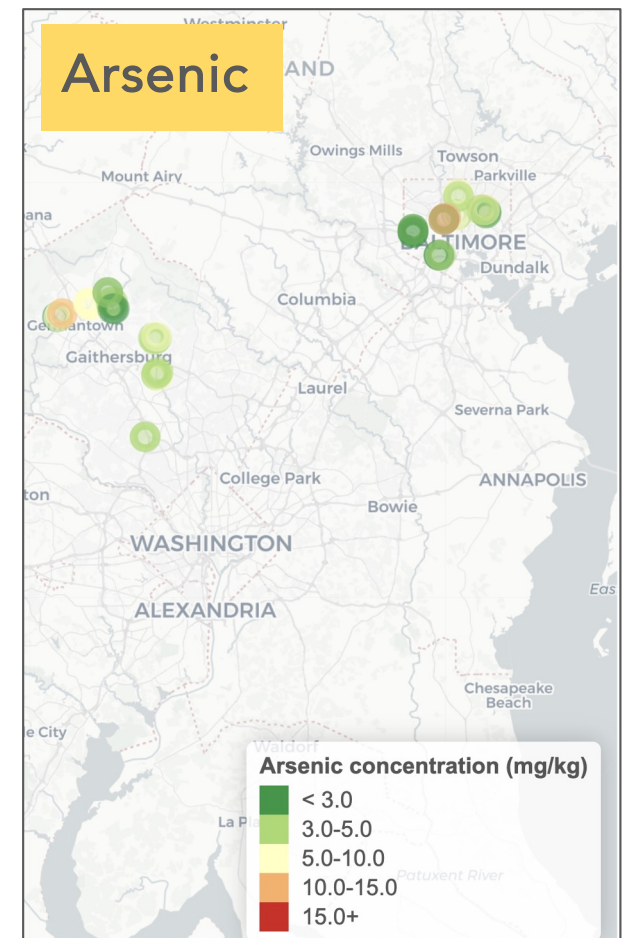
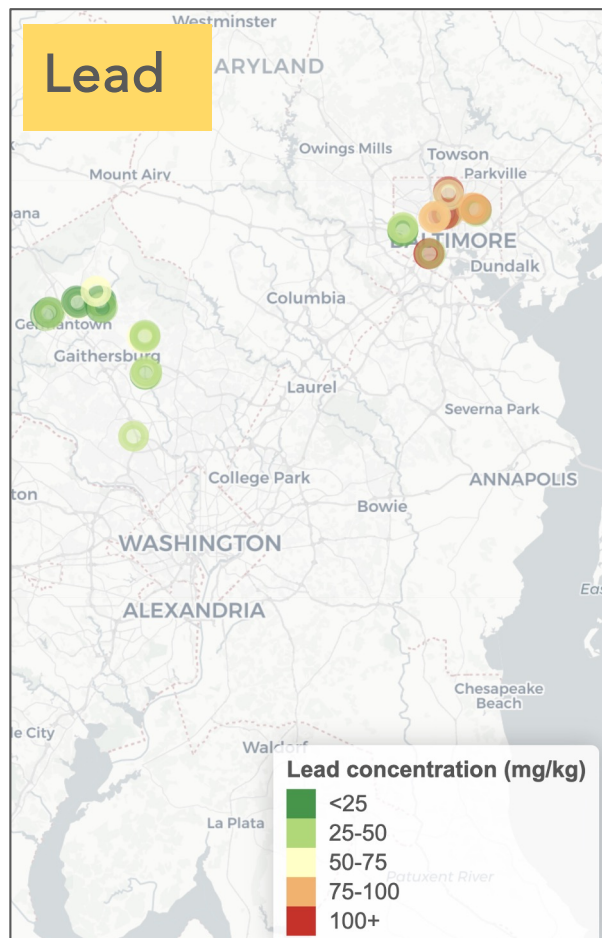
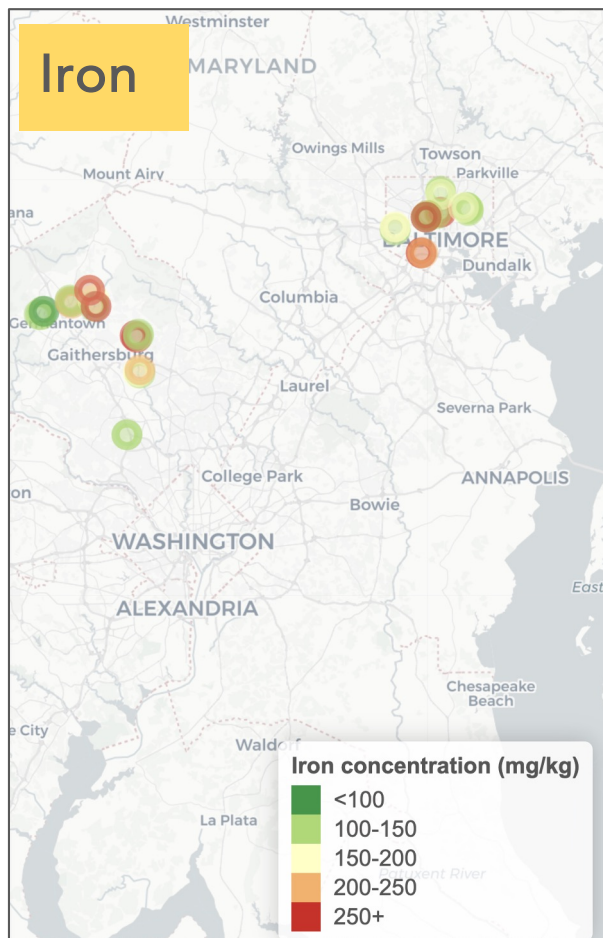
Environmental Associations



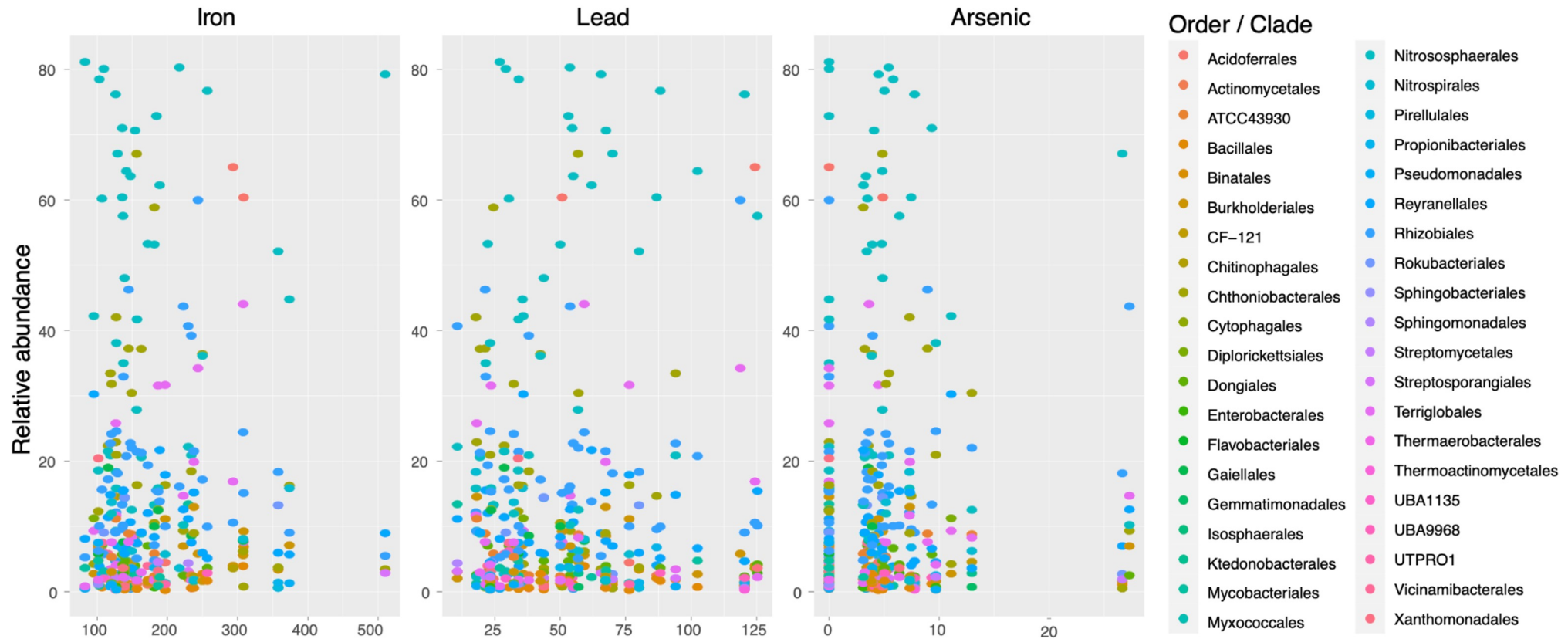
Human Health & Disease



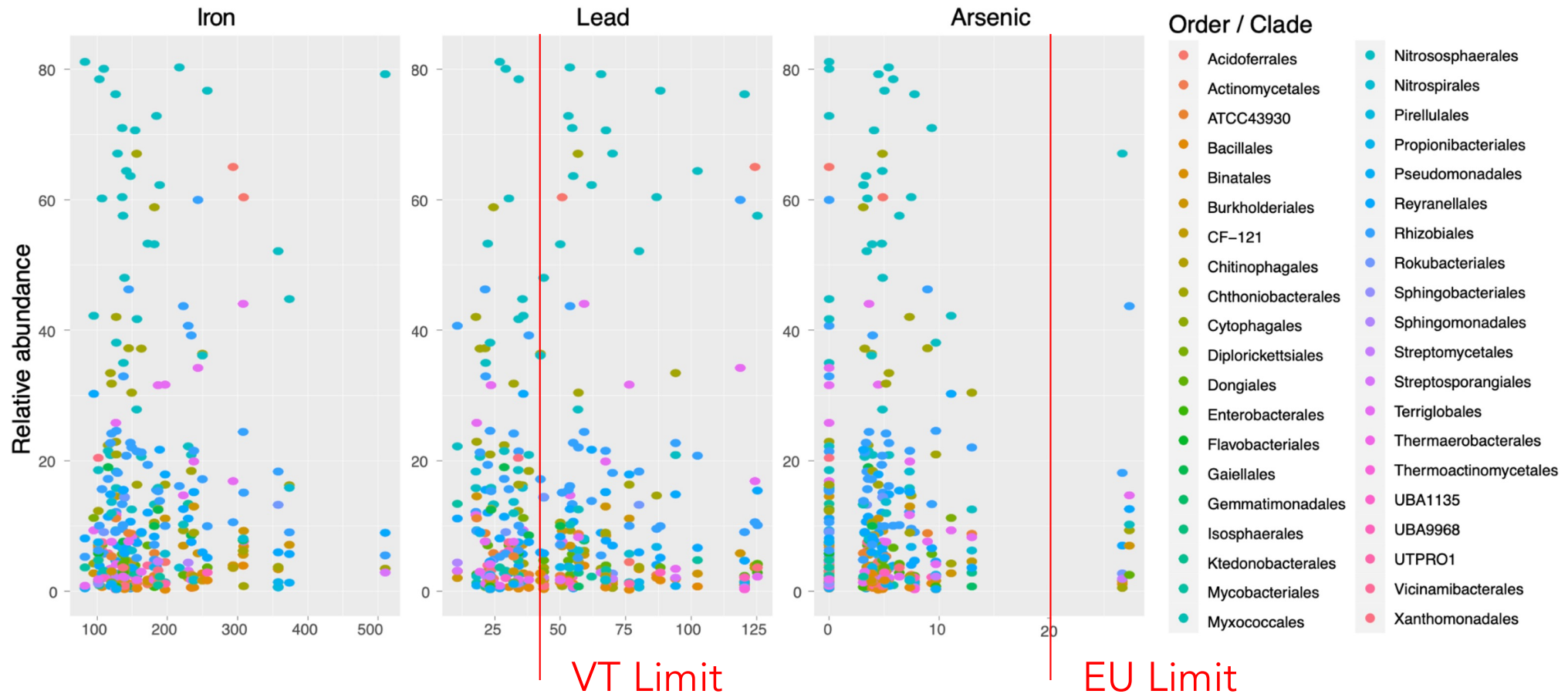
Heavy metal concentration



Heavy metal associations

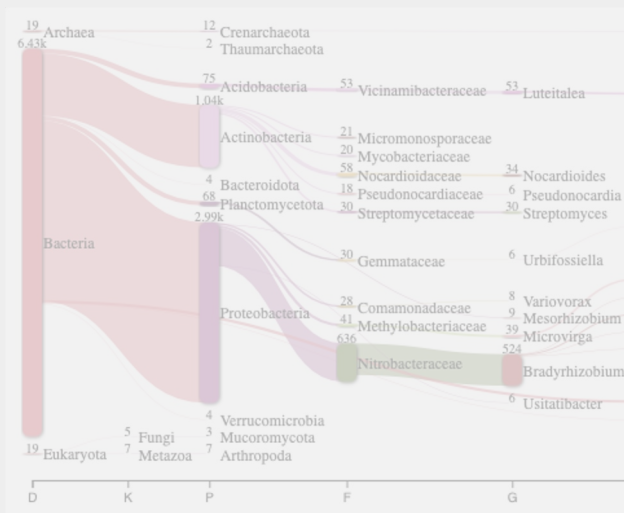


Heavy metal associations

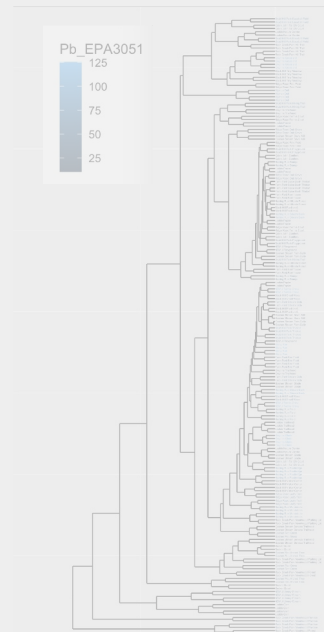


BioDIGS Analysis

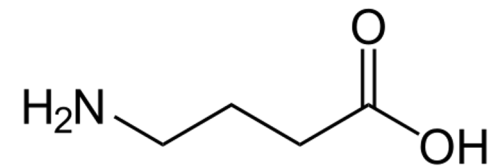
Genomic Diversity



Environmental Associations



Human Health & Disease



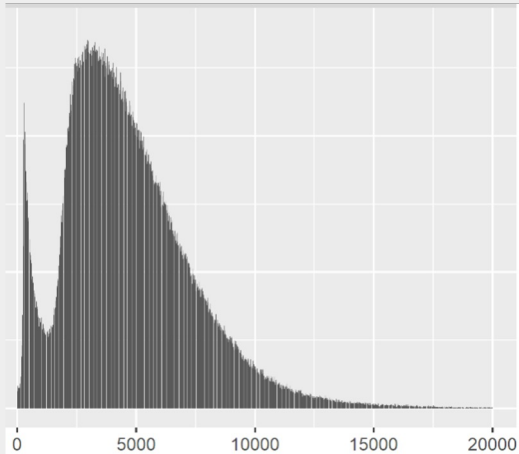
Soil metagenomes and human health



Enter long reads...



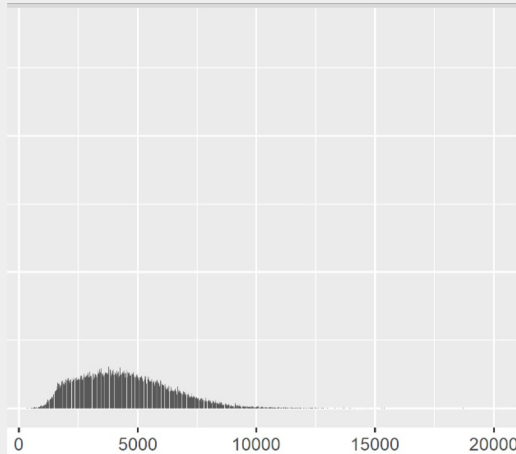
Oxford Nanopore PromethION



N: 14.82M
Total Yield: 70.2Gb
10kbp+: 8.3Gb
Read N50: 5,788bp



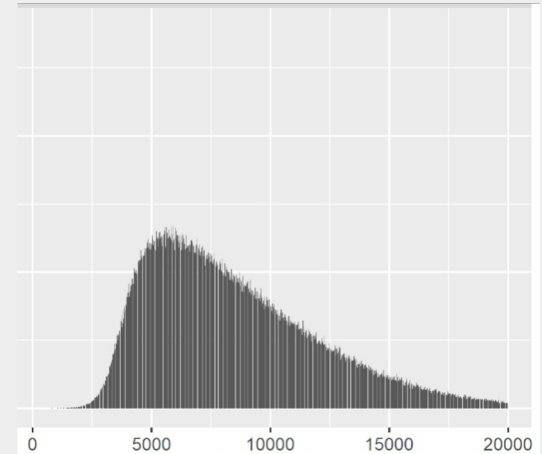
PacBio HiFi Sequel IIe



N: 1.31M
Total Yield: 5.9Gb
10kbp+: 0.1Gb
Read N50: 5,180bp

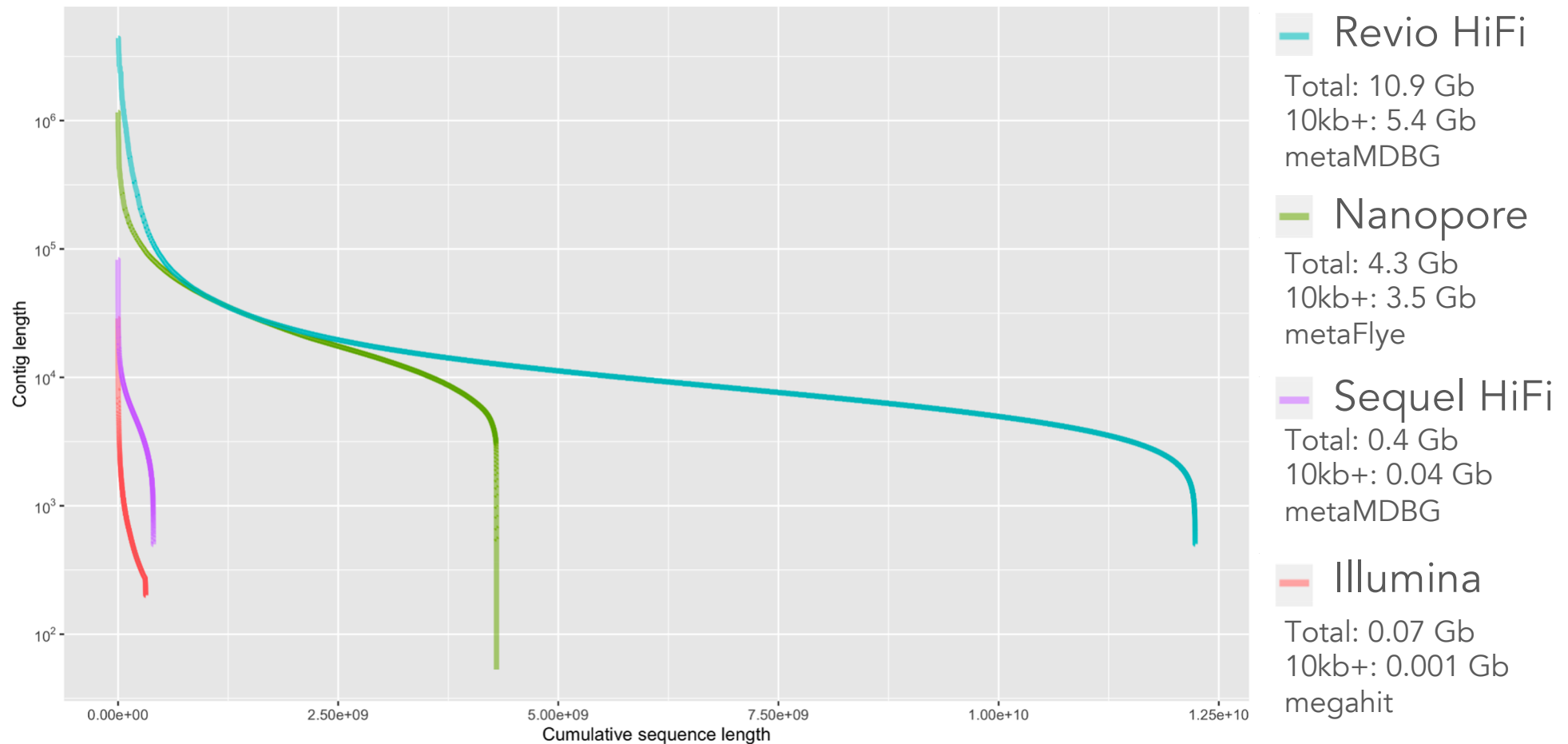


PacBio HiFi Revio

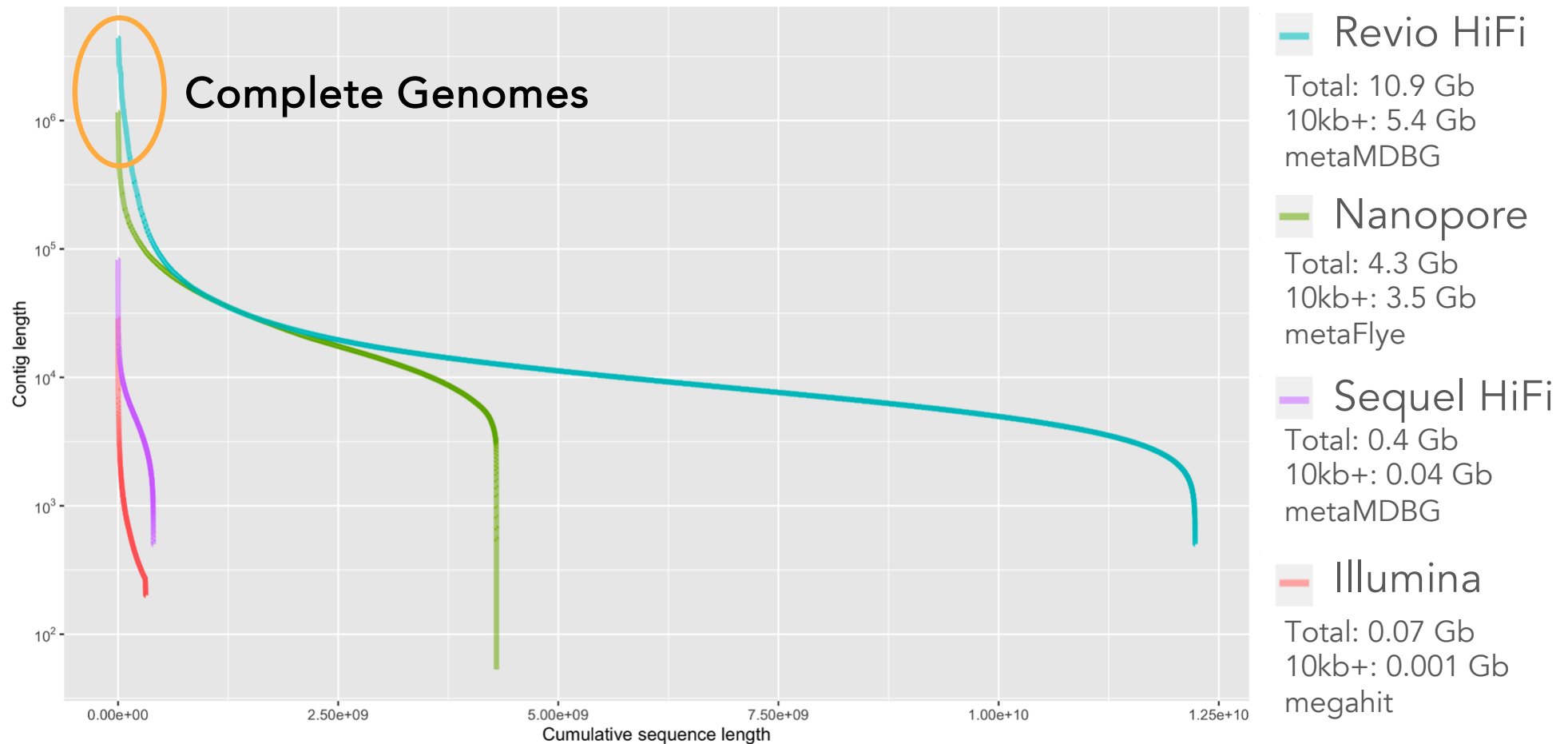


N: 9.97M
Total Yield: 85.2Gb
10kbp+: 39.5Gb
Read N50: 9,600bp

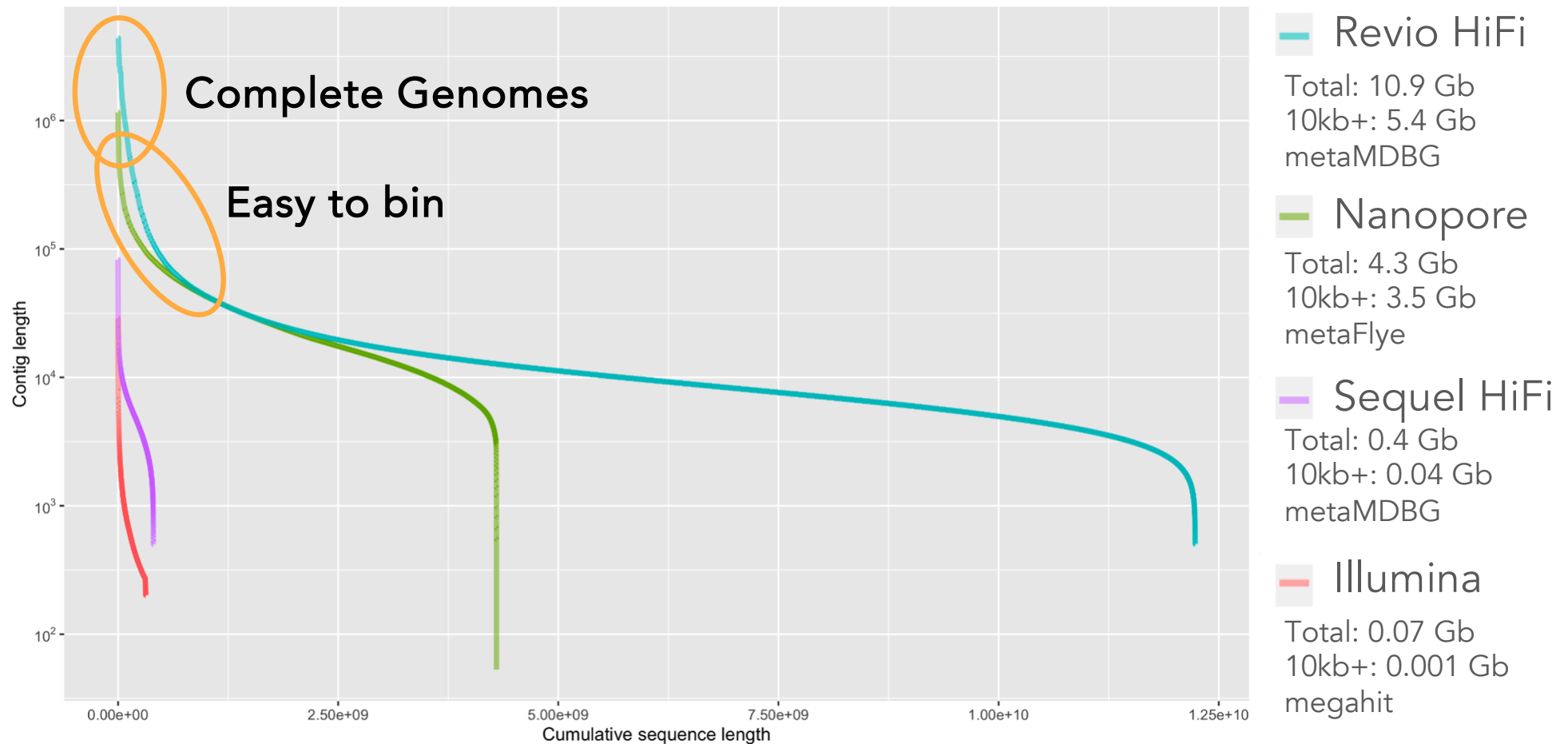
Assembly Results



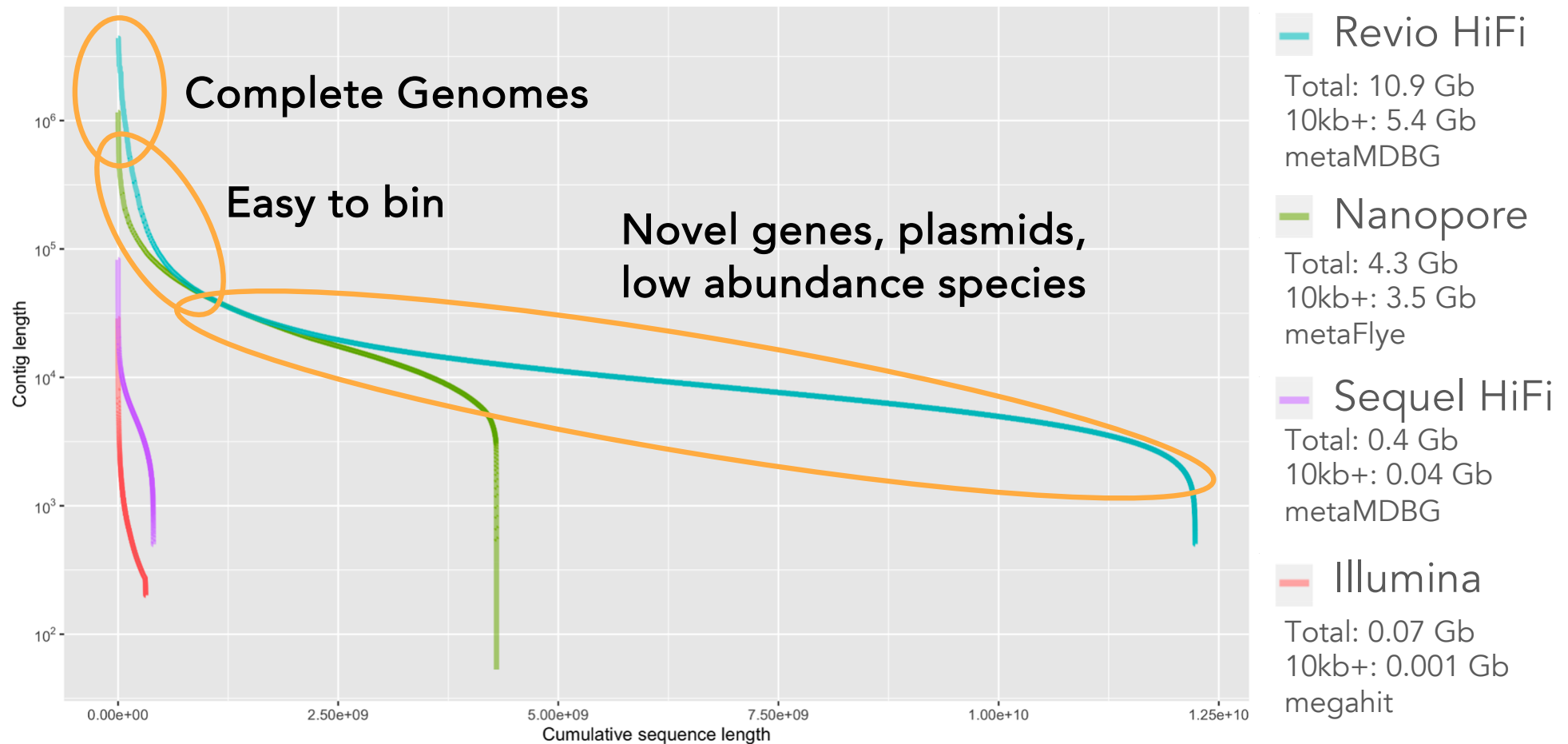
Assembly Results



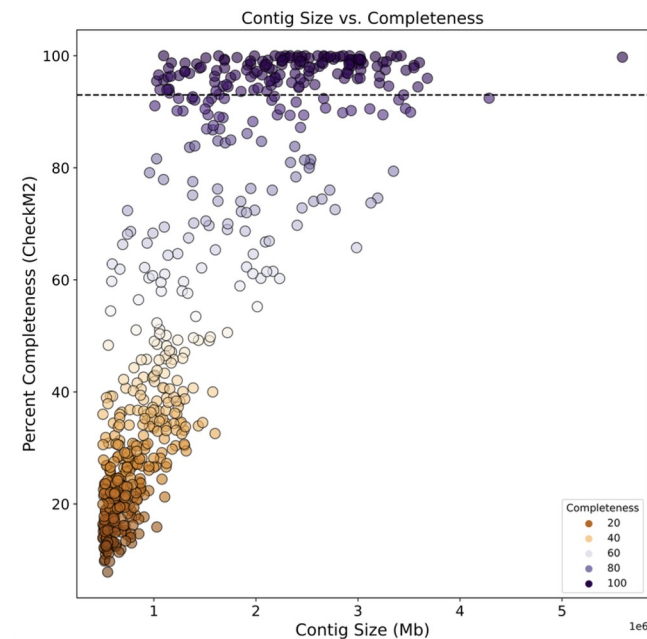
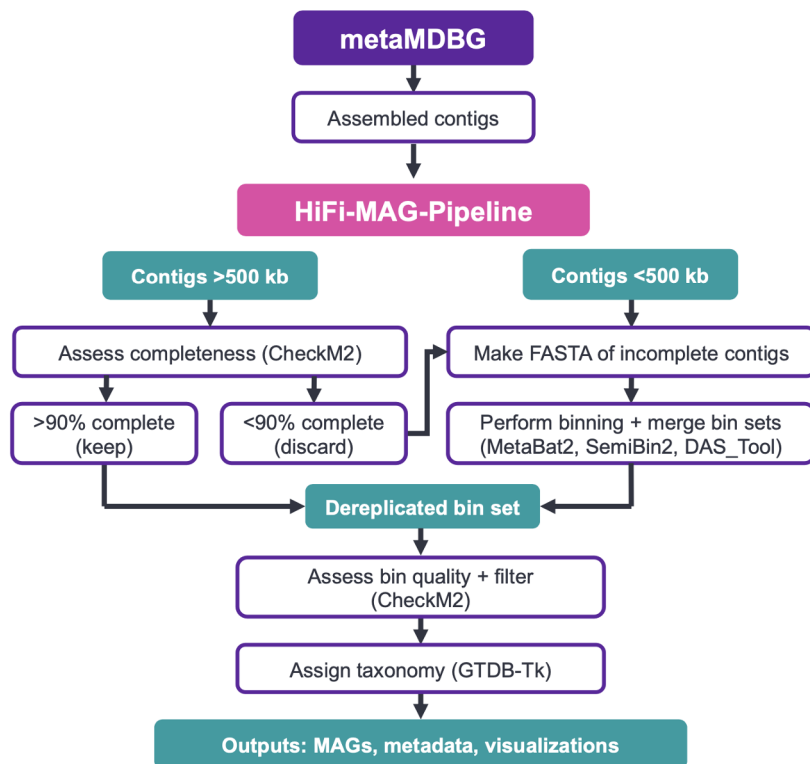
Assembly Results



Assembly Results



PacBio HiFi - MAG Analysis



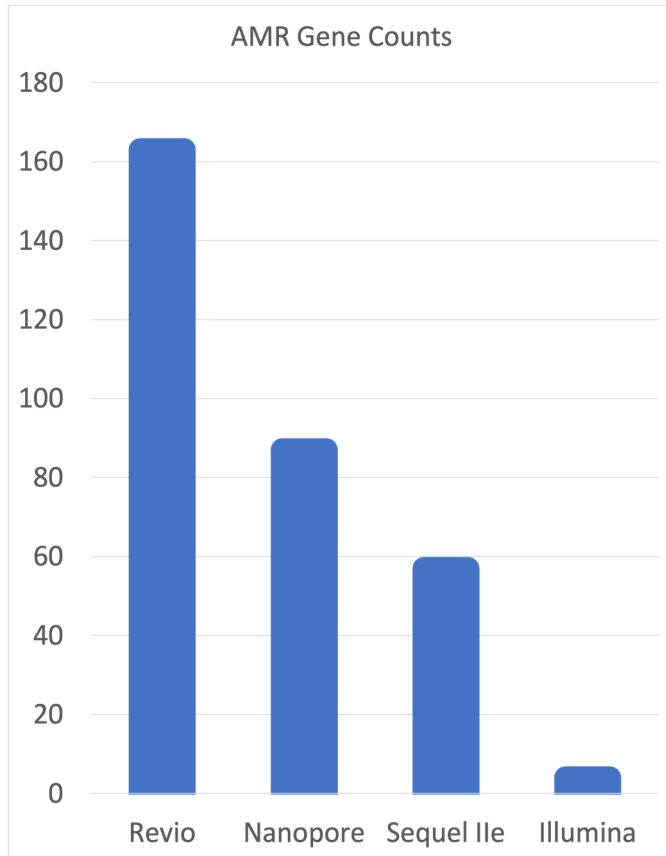
Out of 158 MAGs (55 HQ), only 1 could be assigned to a known species

- 27 single contig genomes!
- ~25x more HQ MAGs / site than short reads
- Archaea are highly represented

Analysis: Dan Portik, PacBio

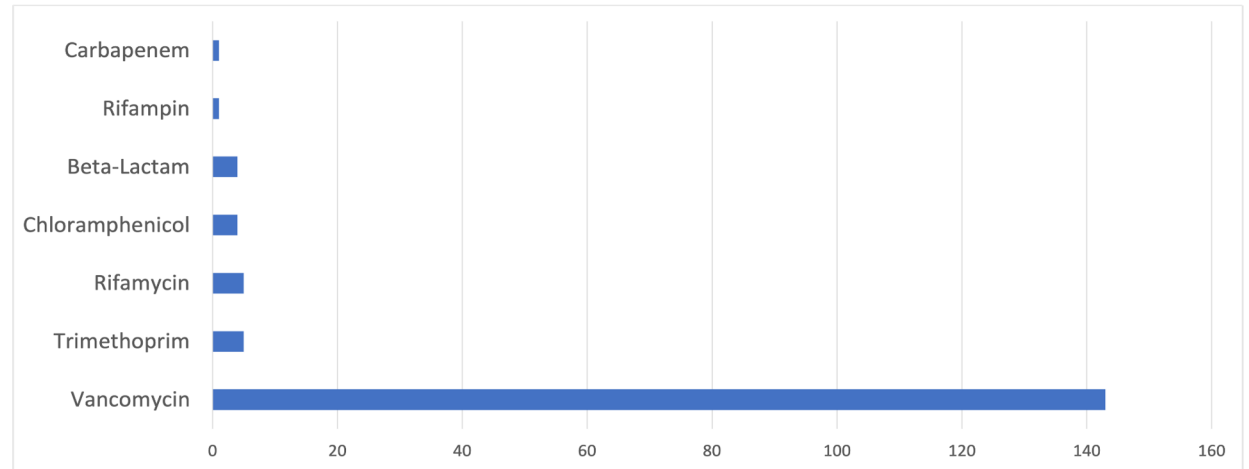
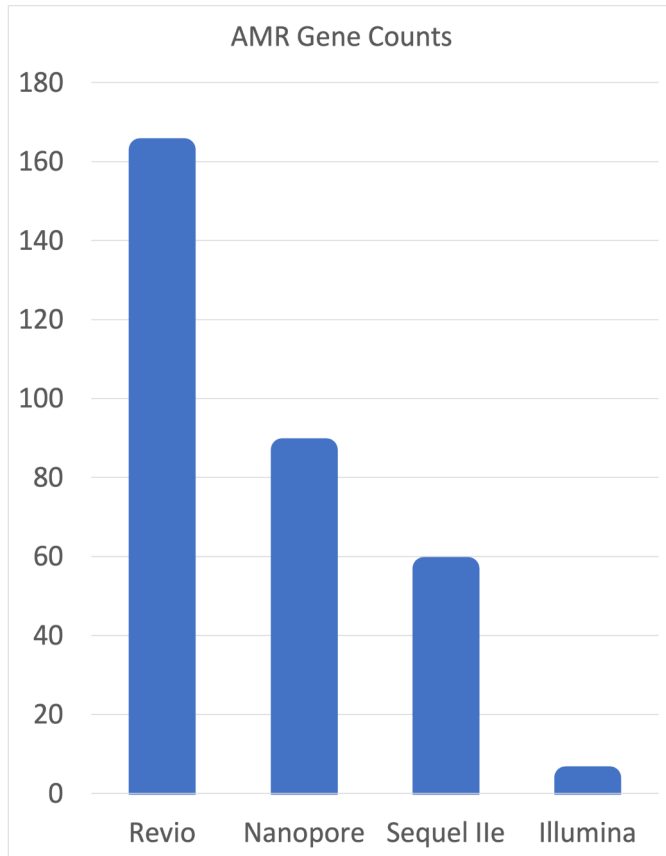
<https://github.com/PacificBiosciences/pb-metagenomics-tools>

Antimicrobial Resistance



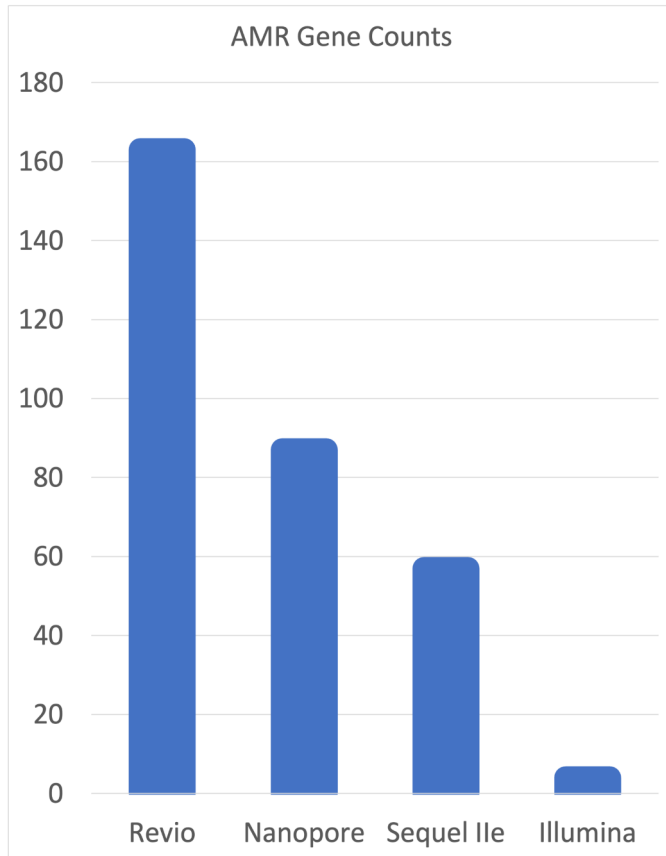
<https://github.com/tseemann/abricate>

Antimicrobial Resistance

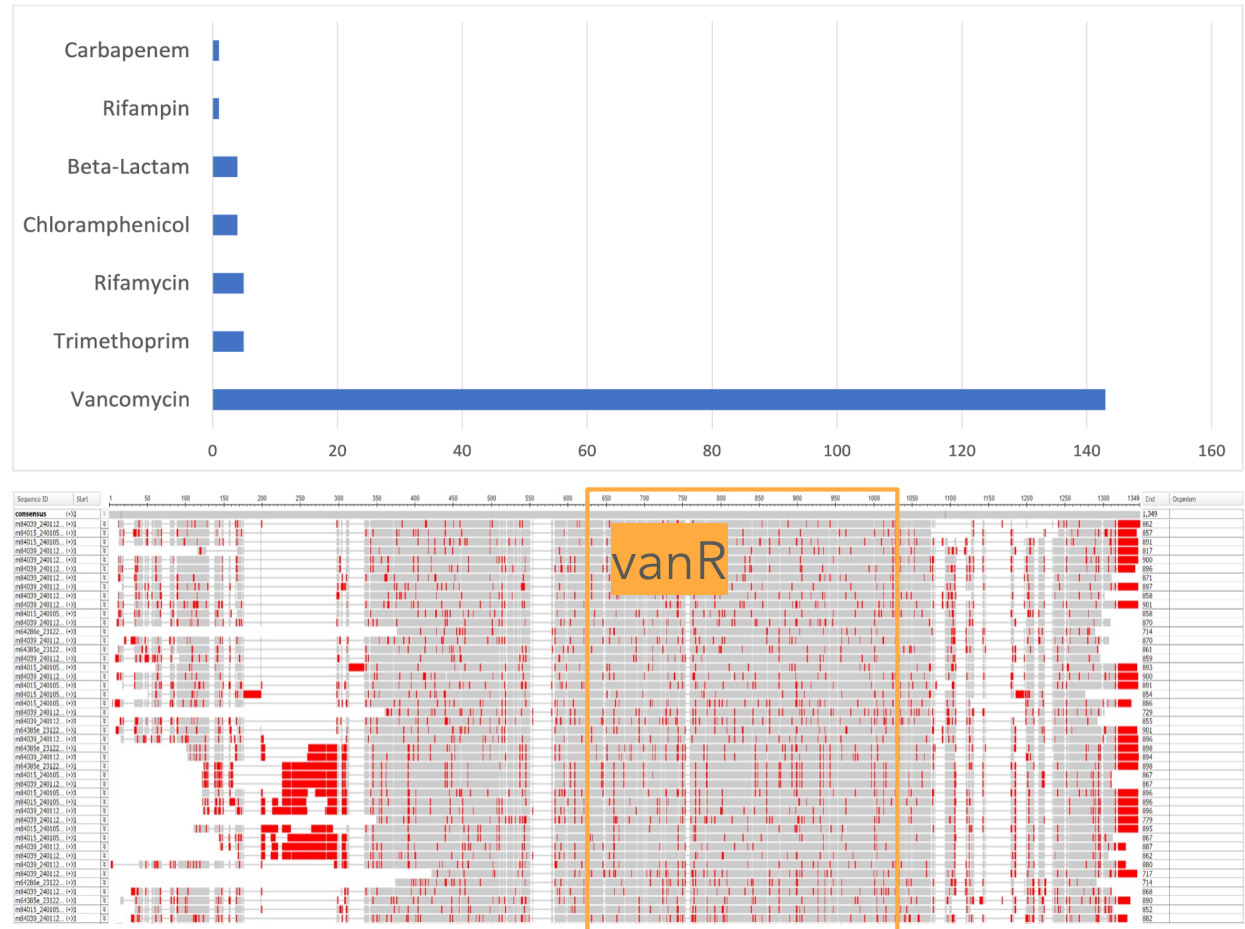


<https://github.com/tseemann/abricate>

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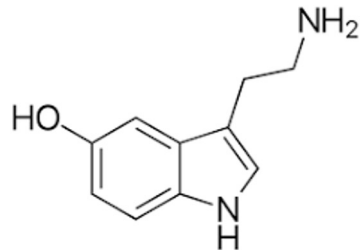


Metabolites in Humans & Microbes



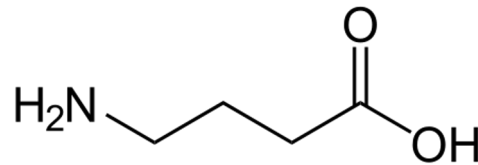
The neuroactive potential of the human gut microbiota in quality of life and depression
Valles-Colomer et al. (2019) Nature Microbiology. doi:10.1038/s41564-018-0337-x

Metabolites in Humans & Microbes



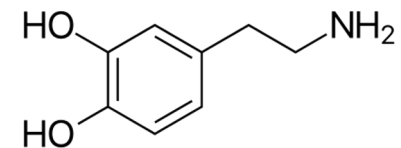
Serotonin

mood, digestion, and sleep



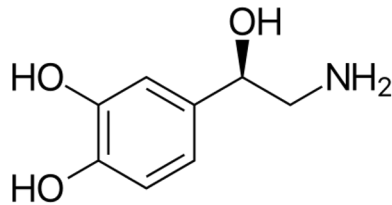
GABA

chief inhibitory neurotransmitter



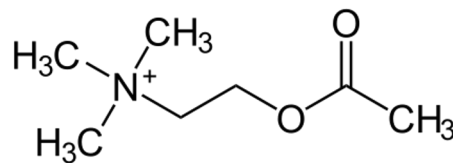
Dopamine

neurotransmitter for "pleasure"



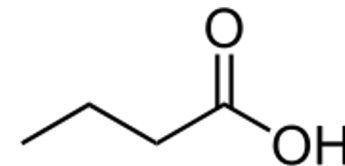
Norepinephrine

Fight or flight response



Acetylcholine

Motor neuron neurotransmitter



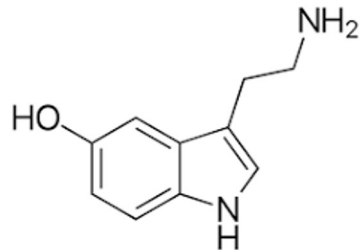
Butyrate

host immune homeostasis

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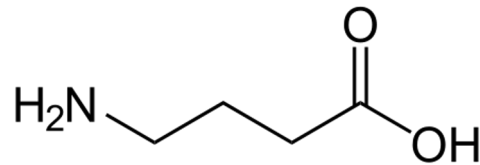
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Metabolites in Humans & Microbes



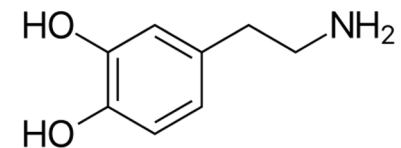
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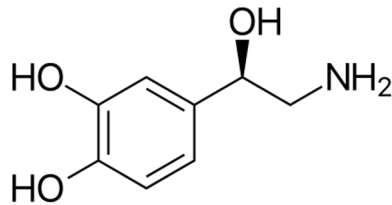
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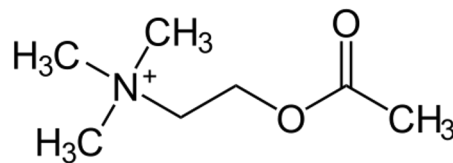
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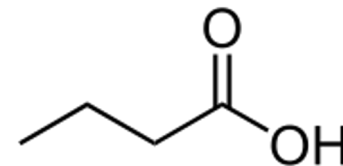
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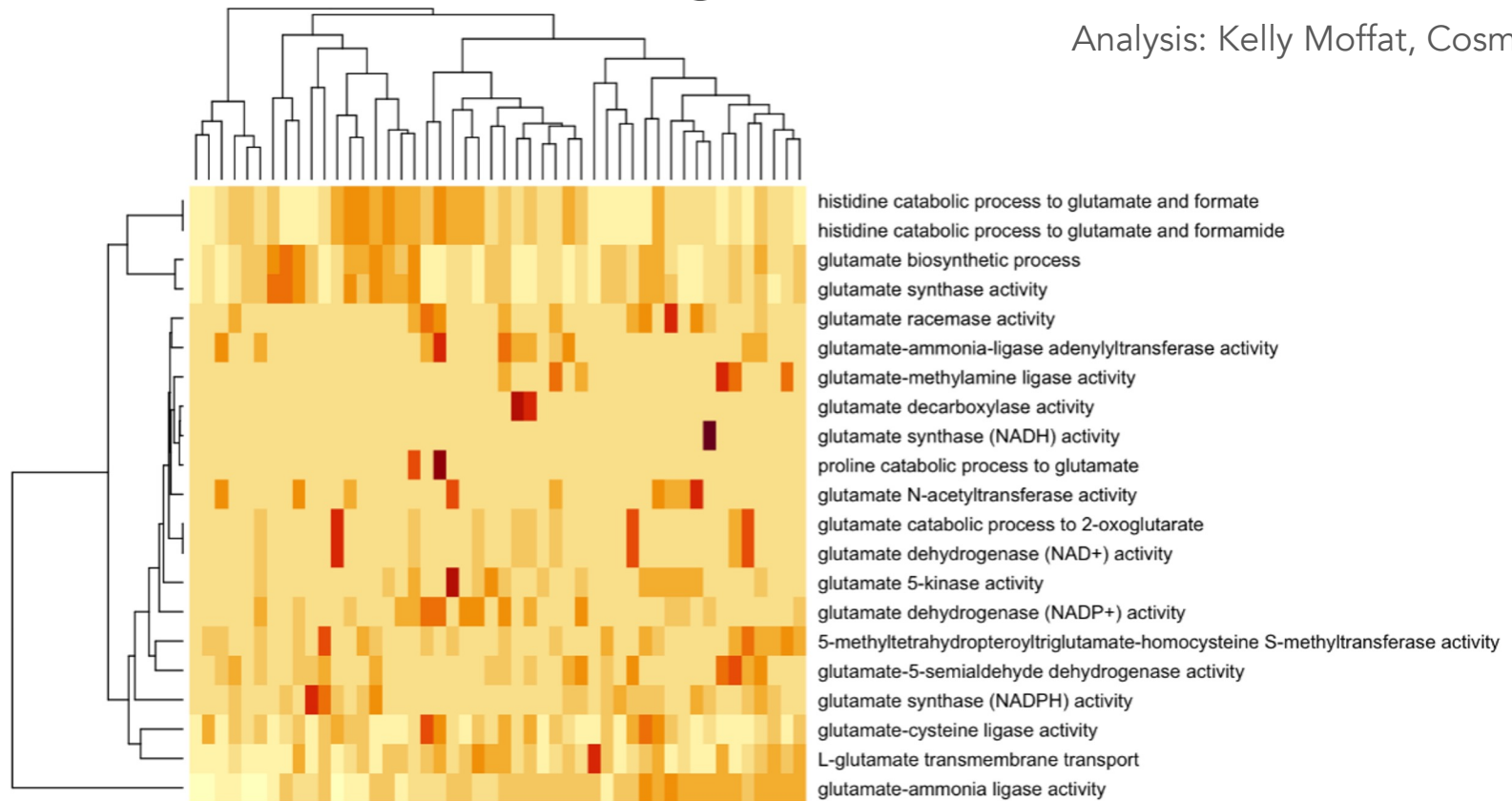
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GABA pathway abundances

Analysis: Kelly Moffat, CosmosID



Species-level functional profiling of metagenomes and metatranscriptomes (HUMAnN 2.0)

Franzosa et al (2018) Nature Methods. doi: doi.org/10.1038/s41592-018-0176-y

Summary

- Exploring the interaction between soil, metagenomic diversity, and human health
 - Discover new genomes and genes
 - Discover new antimicrobial resistance genes, neurotransmitters present in the soil
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- Next Steps: Dynamics across space & time!
 - More institutions, longitudinal analysis
 - Exposures, Climate, Health data, etc
 - Training materials



**We
need
your
help!**



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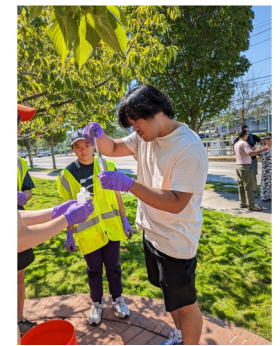
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faculty is to mentor junior faculty
and students.” — @jxtx

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