

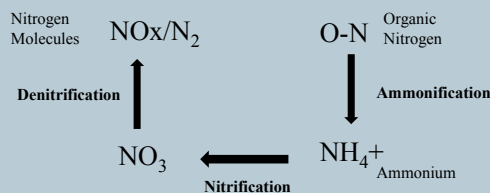
## Abstract

Nitrogen (N) cycling is a key ecosystem service carried out by microbes in the soil<sup>1</sup>. Metagenomes, which represent genetic material from an entire microbial community, have been used to infer the rates of processes like nitrification and mineralization, but past studies have been limited by small geographical scales and/or lack of ecosystem diversity<sup>1</sup>. We built a fast and simple pipeline to download and analyze bioinformatic and ecological data from the National Ecological Observatory Network (NEON), which collects yearly data from 81 U.S. sites<sup>2</sup>. We use the R statistical environment, command line tools, and the Sunbeam extensible data pipeline to automate the steps in our metagenomic sequence analysis. We built software extensions to quantify a variety of genes related to the N cycle so that correlations between N-cycle genes and other environmental phenomena can be made. Our pipeline has produced a valuable, accessible dataset that will allow for the identification of continental-scale N-cycle patterns related to agricultural runoff, root exudates, biogeochemical fluxes and more.

## Background

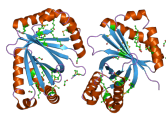
- Humans are adding immense amounts of nitrogen (N) into terrestrial ecosystems through industrial agriculture and fossil fuel combustion<sup>4</sup>.
- N pollution poses a threat to public health so it is important to understand how N-cycling microbes - key players in the N cycle - are affected by other ecological phenomena
- N-cycling bacteria contain genes that indicate the ability to transform N, but links between specific N-cycling genes and other environmental processes have not been solidified across ecosystems.
- We developed a data analysis pipeline to explore relationships between N-cycling genes and available NEON data.

### Nitrogen Transformations



### Questions:

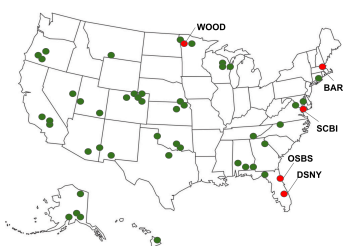
- Can our pipeline accurately profile nitrogen cycling genes within metagenomic data?
- Do N-cycling genes vary across different environments?



## Methods

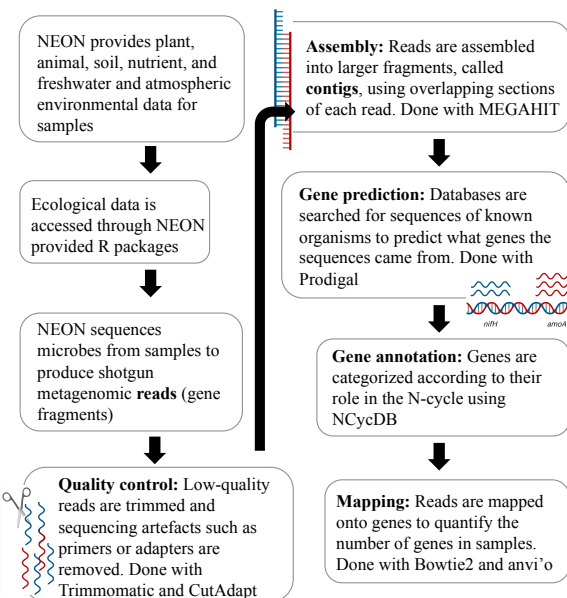
### Data

- This study used metagenomic data from soil cores from 5 different NEON sites (highlighted in red)
- Metagenomic data can be coupled to NEON ecological data allowing for analysis on a large spatial scale and a wide temporal scale.
- In the future, NEON will release 2017 metagenomic data from 1000+ soil samples across the United States



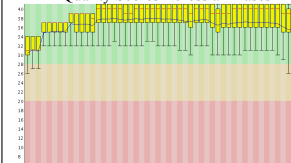
**Figure 1.** Visual representation of NEON sites across the United States. Sites used in this study are in red.

### Metagenome Bioinformatics Pipeline

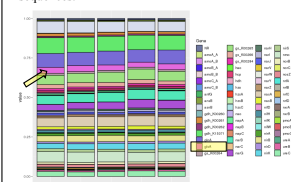


## Results and Conclusions

### Quality Scores Across all Bases



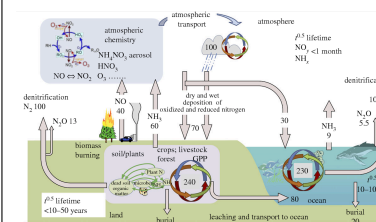
**Figure 2.** Per base sequence quality of SCBI site raw sequences.



**Figure 3.** Normalized gene abundance plotted by sample site. 68 genes were annotated by the NCyc gene profiler.

- A Sunbeam report showed NEON fastq files had high per base sequence quality, normal sequence and GC content, and few duplicated and overrepresented sequences
- Accurate gene annotation is attainable with high-quality raw sequences from NEON data
- Normalized relative gene abundances show that N-cycling genes vary slightly among different ecosystems
- Specific genes like *glsA* (highlighted) present more variation

## Future Directions



**Figure 4.** Nitrogen processes in terrestrial and marine ecosystems and in the atmosphere.

- Download 2017 NEON data with nitrification and N-mineralization rates for samples. Analyze relationships between these rates and N-cycling gene presence in data samples.

## References and Acknowledgments

- <sup>1</sup>Dorthe Groth Peterson, S. J. (2012). Abundance of microbial genes associated with nitrogen cycling as indices of biogeochemical process rates across a vegetation gradient in Alaska. *Environmental Microbiology*, Volume 12, 993-1008.
- <sup>2</sup>Magdalena A. Dytze, K. L. (2008). Activated sludge operational regime has significant impact on the type of nitrifying community and its nitrification rates. *Water Research*, Volume 42, Issues 8-9, 2320-2328.
- <sup>3</sup>Qichao Tu, L. L. (2019). NCycDB: a curated integrative database for fast and accurate metagenomic profiling of nitrogen cycling genes. *Bioinformatics*, Volume 35, Issue 6, 1040-1048.
- <sup>4</sup>Fowler, David R. et al. "The global nitrogen cycle in the twenty-first century." *Philosophical transactions of the Royal Society of London. Series B, Biological sciences*
- <sup>5</sup>National Ecological Observatory Network. 2016. Provisional data downloaded from <http://data.neonscience.org> 2019. Battelle, Boulder, CO, USA

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