Investigation of antibiotic and arsenic resistance gene co-selection over a long-term stressorPersonnel: Ashley Shade, MSU (PI); Tammy Tobin, Susquehanna University (PI); Taylor Dunivin, MSU (Graduate student)

Background: The dissemination of antibiotic resistance genes (ARGs) is a pressing public health concern. By 2050, 10 million people are expected to die annually of infections from antibiotic resistant bacteria. The One Health initiative recognizes the intrinsic link between evolution of bacterial resistance in clinical and environmental settings, but environmental reservoirs of ARGs remain under-characterized. Thus, predictions of the dissemination of ARGs in the environment are impeded by a lack of understanding of their diversification, maintenance, and dissemination. Studies that measure environmental evolution of resistance are necessary to predict and prevent the dissemination of antibiotic resistance.

ARGs are often associated with genes conferring resistance to other microbial stressors, such as heavy metals or pollutants. ^{5–7} Insights into mechanisms of co-selection, dissemination, and diversification can be gained by examining resistance genes that co-occur, have the potential for horizontal gene transfer (HGT), and/or have lengthy evolutionary histories. For example, co-occurrences between resistance genes along an environmental gradient can highlight (co)selection pressures within an environment. Additionally, the presence of resistance genes on plasmids suggests a mechanism for their rapid dissemination and shortens timescales necessary to record evolutionary change. Finally, evolutionarily old resistance genes offer expansive known diversity, so understanding contemporary patterns of resistance gene diversification offers insights into modern selection pressures.

One example of resistance genes that co-occur, exhibit HGT, and are evolutionary old include ARGs and arsenic resistance genes (AsRGs). Like ARGs, AsRGs have important implications for public health, as they impact the biogeochemical cycling of the toxic metalloid arsenic; however, investigations of the forces driving their co-selection are obscured by their ancient evolutionary origins and vertical inheritances: however, investigations of the forces driving their co-selection are obscured by their ancient evolutionary origins and vertical inheritances: however, investigations of the forces driving their co-selection are obscured by their ancient evolutionary origins and vertical inheritances: however, investigations of the forces driving their co-selection are obscured by their ancient evolutionary origins and vertical inheritances: however, investigations of the forces driving their co-selection are obscured by their acceptance expected to have evolved before bacterial and archaeal divergence. hus, and changes in community members may harbor these resistance genes without selective pressure from antibiotics or arsenic, and changes in community structure can impact the abundance of these resistance genes. ARGs and AsRGs have been shown to be correlated through physical linkage on both chromosomes and plasmids, and HGT is known to be widespread. As Further knowledge of the contemporary diversity improves the known evolutionary history of these resistance genes, which is important because they are known to be ancient, and diversification of these resistance genes can therefore offer insights into modern selection pressures.

Long-term environmental disturbances impact multiple generations and provide opportunities to investigate the eco-evolutionary dynamics of resistance genes. Disturbances such as elevated temperature and pollution have been shown to increase diversification, ¹⁴ population-level diversity, ¹⁵ and rates of horizontal gene transfer (HGT)^{16,17} Our model ecosystem is the Centralia, PA, coal mine fire which ignited in 1962 and has advanced along the coal seam ever since, creating a chronosequence (space-for-time proxy) of contemporary and historical fire impact. This multigenerational disturbance exposes soil microbial communities to increased temperatures (21-80°C)¹⁸ as well as coal combustion pollutants like arsenic. ¹⁹ The surface soil microbial communities overlying the underground coal mine fire thus experience a multitude of stressors which are expected to increase the incidence of HGT. ^{16,17,20,21} We will examine evolutionary dynamics of resistance genes along this disturbance gradient by examining their co-occurrence, potential HGT, and diversification. We hypothesize that AsRG and ARG co-occur along the Centralia chronosequence, that AsRG and ARG co-occur on plasmids and that these plasmids are more abundant in fire-affected soils, and that the genetic variation of resistance genes is greater in disturbed soils.

Preliminary data: Clusters of orthologous groups $(COGs)^{22}$ were analyzed from 12 existing Centralia metagenomic datasets that were analyzed through the Joint Genome Institute's Integrated Microbial Genomes (IMG) portal.²³ The abundance of COGs for arsenite efflux pumps (ArsB and ACR3 family) and for aminoglycoside phosphotransferase (kanamycin resistance) were normalized to RNA polymerase β subunit (RpoB). Relative abundance of antibiotic and arsenic resistance COGs had positive Pearson's R correlations with each other (P value = 0.006) and soil temperature (P value = 0.012, 0.013 respectively). This suggests that antibiotic and arsenic resistance genes co-occur in Centralia and are more abundant in fire-affected soils. Additionally, our study of arsenic resistant isolates from Centralia fire-affected soil provides evidence suggesting HGT of three separate AsRGs (Dunivin, *et al.*, *in review*), highlighting HGT as a potentially important evolutionary mechanism for AsRGs in Centralia. These AsRG sequences were identical to others in NCBI on an amino acid level but had divergent nucleotide sequences, showing unique sequence variants in Centralia.

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Research approach: We will use the Centralia chronosequence as a model disturbance gradient to investigate the coselection of antibiotic and arsenic resistance genes. We have >400 Gbases of existing shotgun metagenomic datasets (13 total) from surface soils in Centralia spanning fire-affected, recovered, and reference sites. We will assemble antibiotic and arsenic resistance genes from these datasets using a gene-targeted metagenome assembler, Xander.²⁴ This advanced assembly method offers multiple advantages for evolutionarily focused genetic studies by improving chances of finding diverse gene sequences, improving assembly of full length genes of interest, and revealing strain level variation.²⁴ Functional gene (FunGene) databases²⁵ will be used to guide the assembly and exist for >50 ARGs, several AsRGs, and single copy genes *gyrB* and *rpoB* which will be used for abundance normalization.²⁶ FunGene databases for remaining AsRG will be constructed. Thus, we will query all metagenomic datasets for each gene ARG and AsRG of interest, to output amino acid and nucleotide sequence, taxonomy, and abundance information for each assembled contig. We will then analyze the co-occurrence, diversity, and potential HGT of these genes.

Co-occurrence: The total gene abundance for all ARGs and AsRGs assembled using Xander will be normalized for each site and compared across the chronosequence. We will employ network analysis, a tool for assessing co-occurrence patterns in complex datasets,²⁷ to test for correlations between the relative abundance of ARGs and AsRGs in Centralia. This work can be further enhanced by repeating the analysis on individual sequence variants. While many co-occurrence patterns are possible, we will target co-selection by emphasizing positive correlations between these resistance genes and temperature. Correlations between specific sequence variants could be due to multiple evolutionary mechanisms: selection for these sequence variants, selection for organism(s) harboring these sequences, or HGT of physically linked variants.

HGT: The presence of resistance genes on plasmids or phages highlights their potential to be transferred in the environment. To test for HGT as a mechanism of co-occurrence, we will examine the potential transfer of co-occurring ARGs and AsRGs. We will use Recycler, ²⁸ a recently developed tool to extract circular contigs from metagenomic datasets, to assemble plasmids and phages from along the Centralia chronosequence. These small circular elements will then be tested for presence of ARGs and AsRGs. We hypothesize that plasmids with resistance genes are more abundant in fire affected soils. We will estimate the abundance of plasmids or phages containing ARGs and AsRGs across the chronosequence by measuring both the number of contigs assembled and their coverage.

Diversity: The diversity of each resistance gene will be compared both within and across soils using phylogenetic diversity metrics. Phylogenetic trees will be constructed for all assembled genes. Using Xander, we can detect strain level variation; this genetic diversity in assembly data along with extensively characterized genes of interest allows for calculation of rates of synonymous to nonsynonymous substitutions. Comparing these rates along the Centralia chronosequence will offer insights into selection pressures on these resistance genes. Furthermore, Xander's assembly in amino acid space (rather than nucleotide) allows for assembly of diverse (and potentially novel) resistance gene sequences. Thus, this analysis will contribute to the known diversity of ARGs and AsRGs and therefore to evolutionarily ancient genes.

Co-selection: While this approach offers a space-for-time proxy of disturbance, the analysis pipeline can be subsequently applied to future Centralia datasets to permit true time-series analysis of the evolution of

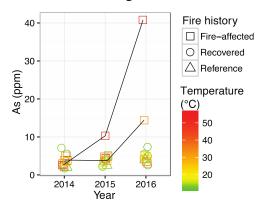


Figure 1. Soil arsenic concentrations in Centralia. Total arsenic was measured in 18 Centralia soil samples with ICP-MS over three sampling years. Black lines connect samples with continued arsenic increase.

resistance genes in the face of a multigenerational disturbance. We have continued collecting Centralia soils and see changes in geochemical data, including a gradual increase in arsenic in two fire-affected soils (**Figure 1**). This initial assessment of resistance genes in Centralia would provide preliminary data for future funding to sequence Centralia metagenomes over time, which would allow more specific characterization of co-selection of resistance genes. Additionally, the final analysis pipeline as well as the manually curated reference databases will be publicly available so that others may examine evolution of resistance genes in different environments, broadening the scope of this work.

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