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Transmission Routes of the Microbiome and Resistome from Manure to Soil and Lettuce

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Abstract

The land application of animal manure can introduce manure microbiome and resistome to croplands where food crops are grown. The objective of this study was to characterize the microbiome and resistome on and in the leaves of lettuce grown in manured soil and identify the main transmission routes of microbes and antibiotic resistance genes (ARGs) from soil to the episphere and endosphere of lettuce. Shotgun metagenomic results show that manure application significantly altered the composition of the microbiome and resistome of surface soil. SourceTracker analyses indicate that manure and original soil were the main source of the microbiome and resistome of the surface soil and rhizosphere soil, respectively. Manure application altered the microbiome and resistome in the episphere of lettuce (ADONIS $p < 0.05$), and surface soil accounted for ~81% of the microbes and ~62% of the ARGs in episphere. Manure application had limited impacts on the microbiome and resistome in the endosphere (ADONIS $p > 0.05$). Our results show that manure-borne microbes and ARGs reached

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the episphere primarily through surface soil and some epiphytic microbes and ARGs further entered the endosphere. Our findings can inform the development of pre- and postharvest practices to minimize the transmission of manure-borne resistome from food crops to consumers.

Keywords: microbiome, resistome, transmission, manure, soil, lettuce

Introduction

Livestock manure and poultry litter are often applied to croplands as a soil amendment to increase crop yields.¹ While this practice reduces the need of synthetic fertilizers, it also leads to potential risk of introducing fecal bacteria carrying antibiotic resistance genes (ARGs) to soil and crop. For leafy green vegetables that are eaten raw, studies have shown that bacteria associated with both the endosphere (in leaf) and the episphere (on leaf) may survive food processing and get ingested by consumers.² Hence, leafy vegetables have been considered a potential vector of transmitting ARGs from the environment to the human diet.³

Using quantitative polymerase chain reaction (qPCR), studies have reported that land application of manure can increase the diversity and abundance of ARGs in soil and vegetables planted in soil, such as endive,⁴ lettuce,^{5,6} carrot,⁶ radish, and tomato.⁶ For example, the abundance of *sul1* gene was 160-fold greater on the surface of lettuce grown in manure-amended soil than on lettuce grown in soil receiving inorganic chemical fertilizers.⁵ Similarly, the abundance of ARGs was 8-fold higher inside lettuce grown in soil receiving animal manure or manure mixed with crop residues than inside conventionally produced lettuce grown in soil receiving chemical fertilizers.³ Hence, manure application can impact the ARGs associated with crops. The US Food Safety Modernization Act requires animal manure to be land applied in a manner that avoids contact with produce or manure must be composted prior to application.⁷ Better understanding about the transmission of the manure-borne microbiome and resistome in the soil-plant ecosystem can help minimize contamination risk.

Recent studies report overlaps of the microbiome and resistome among different compartments of the plant-soil ecosystem,^{8–12} suggesting the possible transmission of microbes and ARGs from soil to plants. For example, overlaps in microbiome have been found between soil and the leaves and flowers of grapevine;¹² and between the leaf endosphere

and episphere of *Espeletia* plant.⁹ In addition, overlaps in the resistome have been discovered between the root of lettuce and soil amended with poultry litter;¹¹ between the rhizosphere soil and the phyllosphere of *Brassica* planted in struvite-amended soil;⁸ and between the rhizosphere soil and the root of mangrove.¹⁰ These previous studies often investigated a subset of the environmental compartments in the soil-plant ecosystem and focused on either microbiome or resistome. In order to link the potential risk of manure application on the transmission of antibiotic resistance to the general public through vegetable consumption, it is important to characterize both the microbiome and resistome on and in vegetables (i.e., the episphere and endosphere) and determine how manure microbiome and resistome may transmit to the plants through surface soil and rhizosphere soil.

The objective of this study was to characterize the microbiome and resistome on (episphere) and in (endosphere) the leaves of lettuce grown in soil receiving beef cattle manure and identify the main transmission routes of microbes and ARGs from soil to the episphere and endosphere of lettuce. We established the following hypotheses on the transmission of microbiome and resistome to the leaves of a leafy green vegetable following manure application: (1) land application of livestock manure mostly affects the microbiome and resistome of surface soil, not rhizosphere soil; (2) the microbiome and resistome on the surface of lettuce leaves are mostly contributed by surface soil; and (3) the microbiome and resistome inside lettuce leaves are mostly contributed by rhizosphere soil via root. In this study, lettuce was grown in greenhouse under three manure treatment scenarios (i.e., soil receiving no manure or manure equivalent to 5- and 10-year nitrogen needs). DNA was recovered from manure, surface soil of multiple sampling times, rhizosphere soil of multiple sampling depths, root, as well as the episphere and endosphere of lettuce leaves. Shotgun metagenomic approaches were employed to reveal the microbiome and resistome in various sample types under different treatment scenarios. In addition to alpha and beta diversity analyses, the SourceTracker program, which uses a Bayesian approach to estimate the relative contributions from potential sources to a sink environment¹³ based on a probabilistic mixture of the composition of the sources,¹⁴ was used to determine the role of surface and rhizosphere soil on the lettuce associated microbiome and resistome. The transmission pathways revealed in this study can help guide the development of

pre- and postharvest practices to minimize the transmission of manure-born resistome from food crops to consumers.

Materials and methods

Greenhouse Experiments.

Seeds of leaf lettuce (cultivar Green Salad Bowl, *Lactuca sativa*) were planted and grown in Rhizoboxes filled with sandy loam (22.5% silt, 15.0% clay, 62.5% sand) soil in a Biosafety Level 2 greenhouse at University of Nebraska–Lincoln. Rhizoboxes were assembled in-house following a published design.¹⁵ The air temperature was set at 15–18 °C, and the photoperiod was set at 16 h for lettuce. A preliminary experiment showed comparable weight between lettuce grown in pots and in Rhizoboxes, proving no negative impacts of Rhizobox on lettuce growth. The manure used in the greenhouse experiment was collected in the cattle feedlots at Eastern Nebraska Research and Extension Center in Mead, NE. Clean quartz sand was mixed into a silty clay (60% of silt and 40% of clay) from a farm in Lancaster County (40.84° N, 96.66° W) to make a sandy loam soil, which was used for lettuce growth and was referred to as original soil in this study. Original soil was uniformly packed into each Rhizobox, which was 30 cm in height, 20 cm in length, and 5 cm in width, to a depth of 25 cm.

Greenhouse experiments were conducted under three treatments scenarios (Figure 1): soil receiving no manure (C), soil receiving manure equivalent to 5-yr nitrogen need (T5, with 4 g manure/year $\times$ 5 year = 20 g, based on manure application rates ranging between 0.34–2.2 kg dry wt per m² per year),^{5,16–18} and soil receiving manure equivalent to 10-yr nitrogen needs (T10, with 4 g manure/year $\times$ 10 year = 40 g). The manure was broadcast to the surface of the soil. The entire study was replicated three times (i.e., Sep–Dec 2019, Feb–Mar 2020 and Jun–Jul 2020). Within each round, 15 Rhizoboxes were assigned to the three treatment scenarios, 5 Rhizoboxes per scenario. Three rounds resulted in 15 replicate soil-plant model ecosystems (5 replicates per round $\times$ 3 rounds). Within each round of experiment, the 15 Rhizoboxes were placed randomly on greenhouse benches. The lettuce was watered using an overhead irrigation system with deionized water containing a general purpose 20–10–20 fertilizer by Peters Professional (JR Peters Inc.). Daily

Figure 1. Overview of the experimental design with manure treatment scenarios (a) and sampling strategy (b). Treatment included control (C), manure treatment meeting 5-yr nitrogen needs (T5), and manure treatment meeting 10-yr nitrogen needs (T10). Three rounds of experiments were conducted. Surface soil was sampled at the end of Week 1, Week 3, and Week 6, while the other types of samples were collected only at the end of Week 6.

irrigation occurred at around 10 am. Water was filled about 1 in. deep at the top of the rhizosphere box. Water not utilized by the plants drained out of the Rhizoboxes through the holes at the bottom. Seedlings were thinned to 1 plant per Rhizobox at the end of Week 1 when seedlings were 1–2 in. tall. Lettuce was harvested at the end of Week 6.

Sample Collection and Processing.

Sample types, sampling time and locations are shown in Figure 1 and summarized in Table S1 of the Supporting Information (SI). Leaves of lettuce plants were harvested by cutting below the cotyledonary node at the soil surface using ethanol-sterilized scissors at the end of Week 6. Microbes in the episphere and endosphere of lettuce leaves were separately recovered. For episphere, lettuce leaves were transported into a 50 mL centrifugal tube with 45 mL autoclaved phosphate buffered saline (PBS) containing 0.02% Tween 20. The solutions were mixed on a vortex mixer for 1 min and then were shaken at 200 rpm at 30 °C for 2 h to recover bacteria from leaf surface.¹¹ The washing solution was centrifuged at 2800 rcf for 30 min, and the pellets collected were stored at

–20 °C until DNA extraction.⁴ For the endosphere, the leaf surfaces were sterilized by immersion in 30% hydrogen peroxide (H₂O₂) for 1 min and thoroughly rinsed three times using sterilized water to eliminate the surface bacteria.¹¹ The leaf samples were then treated with 70% ethanol (Ricca Chemical, Arlington, VA) for 1 min and washed in sterilized water three times. Plant tissues were homogenized in a blender jar containing 100 mL of sterilized PBS (Sigma-Aldrich, St. Louis, MO) for 30 s.¹¹ The solution was centrifuged at 2800 rcf for 30 min, and the pellets collected were stored in –20 °C until DNA extraction.

Surface soil (i.e., top 3–4 cm) from each Rhizobox was collected at the end of Weeks 1, 3, and 6. Soil attached to the root were collected as rhizosphere soil samples.^{19,20} After the front panel of Rhizoboxes was opened, rhizosphere soil from different locations of the root zone (top, medium, and bottom) was recovered by cutting the root from these locations. The root segments were transferred to 50 mL tubes using ethanol-sterilized tweezers. After sterilized PBS was added to the tubes, samples were vortexed for 1 min. After roots were removed, the remaining rhizosphere soil particles were centrifuged for 5 min at 2800 rcf. The pellets were stored at –20 °C until DNA extraction. Caution was exercised to avoid surface soil when the rhizosphere soils from the top root zone were recovered.

The roots were sterilized by immersion in 30% H₂O₂ for 30 min to eliminate the bacteria on the surface of roots and washed with sterilized water three times. Samples were then treated with 70% ethanol for 1 min and washed in sterilized water 3 times.¹¹ Washed roots were homogenized using a blender jar containing 100 mL of sterilized PBS for 30 s.¹¹ After centrifuging at 2800 rcf for 30 min, the root particles collected were used for DNA extraction.

DNA Extraction and Bioinformatics Analysis.

Microbial DNA in leaf, root, manure, and soil (i.e., original soil, surface soil, and rhizosphere soil) samples was extracted using a DNeasy PowerSoil Kit (Qiagen, Hilden, Germany) according to the manufacturer's instructions. Among samples from each round, DNA was first recovered from five biological replicates and then pooled together in an equal volume fashion to represent the round. There was a total of 27 DNA samples from surface soil (Table S1, 27 samples = 3 treatments × 3 rounds × 3 sampling times); 27 DNA samples from rhizosphere soil (27 samples = 3

treatments $\times$ 3 rounds $\times$ 3 sampling locations); 9 DNA samples each from root, episphere, and endosphere (9 samples = 3 treatments $\times$ 3 rounds).

Shotgun metagenomic sequencing was performed at the University Nebraska Medical Center Genome Sequencing Core facility on an Illumina NextSeq 500 (Illumina, Inc. San Diego, CA). About 2 Gb reads (2 $\times$ 150 paired end reads) per sample were generated. Raw reads were trimmed and filtered using Trim Galore! and FASTQC to remove low quality reads and adapter sequences.²¹ Trimmed paired-end reads were analyzed for taxonomic classification using MetaPhlAn 3.0 using the coverage of clade-specific marker genes from the ChocoPhlAn database.²² MetaPhlAn 3.0 was conducted with 75% of nucleotide identity threshold using default parameter settings. The relative abundance of microbial populations was calculated from MetaPhlAn 3.0 results as a local clade abundance (i.e., the number of reads mapping to the clade was estimated by multiplying the local clade abundance by the clade's average genome size) divided by the sum of all local clade abundances. Also, trimmed paired-end reads were analyzed for ARG using ARGs-OAP 2.0 with the comprehensive antibiotic resistance database (CARD), Structured Antibiotic Resistance Genes database (SARG), and the Greengenes database.²³ ARGs-OAP 2.0 was conducted with an alignment length cutoff of 75%, alignment e-value cutoff of 10^{-7} , and alignment identity of 80%. ARG abundance generated from ARG-OAP 2.0 were quantified using the following equation (expressed as copy of ARG per copy of 16S rRNA gene):²⁴

$$\text{abundance} = \sum_1^n \frac{N_{\text{ARG like sequence}} \times L_{\text{reads}} / L_{\text{ARG reference sequence}}}{N_{16S \text{ sequence}} \times L_{\text{reads}} / L_{16S \text{ sequence}}}$$

where $N_{\text{ARG-like sequence}}$ is the number of the ARG-like sequence annotated as one specific ARG reference sequence; $L_{\text{ARG reference sequence}}$ is the sequence length of the corresponding specific ARG reference sequence; $N_{16S \text{ sequence}}$ is the number of the 16S sequence identified from the metagenomic data; $L_{16S \text{ sequence}}$ is the average length of the 16S sequence in the Greengenes database; and L_{reads} is the sequence length of the Illumina reads. In this work we did not specifically attempt to exclude potential chloroplast sequences in bioinformatic analyses.

Illumina sequencing generated a total of 3756.9 million reads after quality-filtered across 87 samples, with an average of 19.3–23.3

million reads per sample (Table S2). The numbers of quality-filtered sequences for original soil, manure, surface soil, rhizosphere soil, root, episphere, and endosphere samples were 16.5–20.1, 14.3–23.0, 15.6–35.7, 15.5–35.8, 11.9–28.4, 11.9–40.8, and 12.1–24.8 million reads per DNA sample, respectively (Table S2). The raw sequencing reads were deposited in the NCBI database with the BioProject number PRJNA725852.

Statistical Analysis.

The taxonomic results from Meta-PhlAn 3.0 and ARG results from ARGs-OAP 2.0 were analyzed for alpha and beta diversity using the *vegan* package in R (v. 4.0.5). Principal coordinates analysis (PCoA) using Bray-Curtis distance was carried out with the *vegan* and *ggplot2* packages in R. Heatmap was visualized with the *pheatmap* package in R. Analysis of Variance (ANOVA) and Tukey's honest significance difference (HSD) were performed in R to determine statistically significant differences. *t* tests were used to determine if the mean difference between two variables was statistically significant. The effects of manure treatment on microbiome and resistome were tested using the function "ADONIS" of the *vegan* package in R with the Bray-Curtis dissimilarity distance matrices as inputs for 1000 permutations.

The SourceTracker function of QIIME was used to quantify the relative contributions of environmental sources to the microbiome and resistome in soil and lettuce.¹³ Five independent runs were conducted to reduce the effect of false predictions. The SourceTracker analysis was carried out using the taxon data at the genus level and ARG family defined in ARGs-OAP. Procrustes analysis was performed to test the correlations between microbiome and resistome using the *vegan* package in R with 999 permutations. Procrustes Sum of Squares M^2 (i.e., sum of squared distances between paired points in the ordination space) and correlation coefficient *r* in a symmetric Procrustes rotation were reported.

Results

Microbiome Composition in Soil and Lettuce.

Actinobacteria, Bacteroidetes, and Proteobacteria dominated the original soil, manure, surface soil, rhizosphere soil, and episphere (Figure S1). Proteobacteria dominated the endosphere and root (Figure S1). The

Figure 2. A heatmap showing the top 30 most abundant genera based on average abundance across all sample type and treatment combinations (a). Principal coordinates analysis plots depicting the Bray–Curtis dissimilarity matrices on microbiome composition at the genus level for various sample type and treatment combinations (b–d) with ellipses represent 95% confidence intervals according to treatment (b) or sample type (c and d). In the heatmap, T/M/B represent top, medium, and bottom of rhizosphere soil.

top 30 most abundant genera across sample types are reported as a heatmap in Figure 2a. *Pseudomonas* and *Sphingopyxis* were the abundant genera across all sample types (Figure 2a). Compared to control, manure application (T5 and T10) significantly increased the abundance of *Agromyces*, *Rhodanobacter*, and *Sorangium* in surface soil and episphere (t test, p values <0.05). The effects of manure treatment on the alpha diversity of the microbiomes in various compartments are described in the SI file and results are shown in Tables S3 and S4. In short, manure treatment had no significant effects on the alpha diversity indexes of sample collected (ANOVA, $p > 0.05$).

Beta Diversity of the Microbiome.

Principal coordinate analysis (PCoA) was conducted to examine the beta diversity among the microbiomes of various sample types under different treatment scenarios using the Bray–Curtis dissimilarity distance calculated at the genus level. First, the effects of manure treatment on the microbiome of surface soil were examined (Figure 2b). The two principal coordinates captured 30.23% and 20.95% of the total variations, respectively. Microbiomes in surface soil of control clustered separately from those in surface soil of T5 and T10. Adonis analyses confirmed that manure treatment had significant effects on the microbiomes of surface soil ($R^2 = 0.14$, $p = 0.004$). In addition, the microbiomes in surface soil differed significantly from those in original soil and in manure ($R^2 = 0.18$, $p = 0.001$). The microbiomes of the surface soil from the control overlap with those of original soils, while the microbiomes of the surface soil from treatment (T5 and T10) overlapped with those of manure (Figure 2b).

Second, we examined the microbiomes of surface soil and episphere under different treatment scenarios (Figure 2c). Results show that 38.47% and 18.84% of variation could be explained by PCo1 and PCo2, respectively. Adonis analyses show that manure treatment had significant effects on the microbiomes of surface soil and episphere ($R^2 = 0.15$, $p = 0.003$). In addition, there was a significant difference in the microbiome between the surface soil and episphere ($R^2 = 0.13$, $p = 0.001$), although of the microbiomes from these two sample types overlapped.

Third, we examined the microbiomes of endosphere, root, and rhizosphere soil under different treatment scenarios (Figure 2d). Results show that the two principal coordinates captured 30.83% and 17.31% of the total variations, respectively. Adonis analysis indicates significant differences in microbiome among sample types ($R^2 = 0.32$, $p = 0.001$), as evidenced by the separation of the rhizosphere microbiomes from the microbiomes in root and endosphere (Figure 2d). In addition, there was no significant impacts of manure treatment on microbiome composition ($R^2 = 0.017$, $p = 0.932$).

Resistome Composition and Abundance in Soil and Lettuce.

ARGs identified across all sample types conferred resistance to 19 antibiotic families with abundance ranging from 10^{-6} to 10^{-1} copy ARG per copy of 16S rRNA gene (Figure 3a). Bacitracin, fosmidomycin,

Figure 3. A heatmap showing the abundance of ARG families across different sample types and treatment scenarios (a). PCoA plots depicting the Bray–Curtis dissimilarity matrices on resistome composition at the ARG family level for various sample type and treatment combinations (b–d) with ellipses represent 95% confidence intervals according to treatment (b) or sample type (c and d). In the heatmap, T/M/B represent top, medium, and bottom of rhizosphere soil.

macrolide-lincosamidestreptogramin (MLS), multidrug, and vancomycin resistance genes were the most abundant ARG families across all sample types. All ARG families were present in manure, while ARG families such as chloramphenicol, fosfomycin, sulfonamide, and Trimethoprim were only sporadically present in the original soil.

For all types of samples tested, the total abundance of ARGs ranged from 3×10^{-4} – 8×10^{-1} copy of ARG per copy of 16S rRNA gene. The total ARG abundance in the five sample types (i.e., surface soil, rhizosphere soil, root, episphere, and endosphere) was not affected significantly by manure treatment (ANOVA, $p = 0.211$ – 0.851 in the last row of Table S5). The total abundance of ARGs in surface soil (1.7×10^{-1} – 4.0×10^{-1} ARG per 16S rRNA gene), rhizosphere soil (1.9×10^{-1} – 2.4×10^{-1}), and

episphere (1.3×10^{-1} – 2.1×10^{-1}) was significantly higher (ANOVA and Tukey's HSD, p values <0.05) than that in root (9.0×10^{-3} to 1.9×10^{-2}) and endosphere (5.0×10^{-4} to 1.7×10^{-3}).

ANOVA analysis shows that manure treatment had significant effects on the abundance of select ARG families in surface soil (Table S5, i.e., aminoglycoside, chloramphenicol, fosmidomycin, MLS, rifamycin, sulfonamide, and tetracycline). Tukey's HSD analysis shows that manure application significantly increased the abundances of these seven ARG families in surface soil receiving manure (Figure S2, p values <0.05). Besides, the abundances of these seven ARG families in surface soil of T5 and T10 generally decreased over time (Figure S2). A significant interaction between manure treatment and sampling time existed for tetracycline resistance genes, showing significantly lower abundance in Week 6 than in Week 1 for T5 and T10 (Figure S2, Turkey's HSD p values <0.05).

Manure treatment had a significant impact only on the abundance of sulfonamide resistance genes in rhizosphere soil (Table S5, $p = 0.026$). In comparison, the sampling location had a significant effect on the abundance of aminoglycoside, chloramphenicol, fosmidomycin, rifamycin, and sulfonamide resistance genes in rhizosphere soil (Table S5, ANOVA, $p = 0.008$ – 0.020). ARGs belonging to these antibiotic families, except for sulfonamide resistance genes, exhibited significantly higher abundance (ANOVA and Turkey's HSD, p values <0.05) in top rhizosphere soil than in middle and bottom rhizosphere soil, respectively (Figure S3).

Manure treatment had no significant impact on the abundance of any of the resistance gene families in root or episphere (Table S5). In comparison, manure treatment exhibited significant impacts on abundances of bacitracin, fosmidomycin and rifamycin resistance genes in endosphere (Table S5). Manure application caused significantly higher (Turkey's HSD, p values <0.05) abundance of bacitracin resistance genes in T5 and T10 than in C, of fosmidomycin resistance genes in T10 than in T5 and C, and of rifamycin resistance genes in T5 than in T10 and C (Figure S4). Sample type had significant impacts (ANOVA, p values <0.05) on the abundance of nearly all the ARG families tested, except for carbomycin, fosfomycin, and polymyxin resistance genes (Table S5, ANOVA, p values >0.05). Finally, the effects of manure treatment on the alpha diversity of the resistome in various compartments

is described in the SI file, and the results are summarized in Tables S6 and S7. In short, both manure treatment and sample type had significant effects on the alpha diversity indexes for the resistomes characterized (Table S7, ANOVA, $p < 0.05$), with significantly higher values for T5 and/or T10 than for Control in surface soil and in episphere (Table S6, Tukey's test, $p < 0.05$).

Beta Diversity of Resistome.

PCoA plots were established to examine the beta diversity of resistomes in various sample types under different treatment scenarios based on the Bray–Curtis dissimilarity distance calculated at the ARG family level. First, the effects of manure treatment on the resistome of surface soil were examined (Figure 3b). The two principal coordinates captured 39.32% and 22.26% of the total variations among ARG compositions. Although the resistome in the surface soil of control overlaps with that in the surface soil of T5 and T10, Adonis analysis shows a significant effect of manure treatment on the ARG composition among three treatment scenarios (Figure 3b, $R^2 = 0.13$, $p = 0.016$). According to Adonis analyses, sample type had no significant effects on the resistome ($R^2 = 0.10$, $p = 0.100$).

Second, we examined the resistomes of surface soil and episphere under different treatment scenarios. A PCoA plot was established for surface soil and episphere under the three treatment scenarios (Figure 3c). Adonis analysis shows that manure treatment had significant impacts on the resistome compositions for both sample types (Figure 3c, $R^2 = 0.11$, $p = 0.023$). There was an overlap between the resistomes of surface soil and the episphere, however, Adonis analyses shows that sample type had significant impacts on resistome composition (Figure 3c, $R^2 = 0.07$, $p = 0.026$).

Third, we examined the resistome of endosphere, root, and rhizosphere soil under different treatment scenarios. A PCoA plot was established for the resistomes in three sample types under different treatment scenarios (Figure 3d). Results show significant difference in the resistome composition among the sample types (Adonis, $R^2 = 0.67$, $p = 0.001$), consistent with the separate clustering of three sample types in Figure 3d. Manure treatment had no significant impact on the resistome composition in the three sample types (Figure 3d, Adonis $R^2 = 0.017$, $p = 0.335$).

Figure 4. Box plots showing the results of SourceTracker analysis (five runs) on the relative contribution of various sources to the microbiome of surface soil (a, $n = 16$), rhizosphere soil (b, $n = 16$), episphere (c, $n = 6$), and endosphere (d, $n = 6$) following manure treatment (i.e., T5 and T10). Box group with different letter represents statistically significant group (one-way ANOVA, $p < 0.05$).

Attribution of Sources to the Lettuce Associated Microbiome and Resistome.

Conceptual models were established to test the three hypotheses by assigning the source and sinks of the microbiome and resistome in the soil–plant ecosystem. To test Hypothesis 1, surface soil (Figures 4a and 5a) and rhizosphere soil (Figures 4b and 5b) were each defined as an environmental sink, while manure and original soil were defined as

Figure 5. Box plots showing the results of SourceTracker analysis (five runs) on the relative contribution of various sources to the resistomes of surface soil (a, $n = 18$), rhizosphere soil (b, $n = 18$), episphere (c, $n = 6$), and endosphere (d, $n = 6$) following manure treatment (i.e., T5 and T10). Box group with different letter represents significant group (one-way ANOVA, $p < 0.05$).

environmental sources. To test Hypothesis 2, episphere was defined as an environmental sink, while surface soil and rhizosphere soil as environmental sources (Figures 4c and 5c). To test Hypothesis 3, endosphere was defined as an environment sink, while episphere and root were defined as environmental sources (Figures 4d and 5d).

Manure was a significant source of the microbiome (average 65.6% to 66.2%) in surface soil over the 6-week growth period (Figure 4a).

The contribution of the original soil to the surface soil was minimum, while unknown sources attributed 27.2% to 28.3% to the microbiome in surface soil. In comparison, original soil was the main contributor to the microbiome in rhizosphere soil (average 60.0% to 61.0%) (Figure 4b). Manure contributed on average 10.8% to 11.4% of the microbiome in the rhizosphere soil, while unknown sources contributed again for 28.1% to 29.1%.

Surface soil was a significant source of the microbiome (78.8% to 83.9%) in episphere (Figure 4c). The unknown sources attributed 10.2% to 10.7% to the microbiome in surface soil. Episphere was a significant contributor to the microbiome (58.9% to 59.7%) in the endosphere. The root contributed on average 14.0% to 14.6%, while unknown sources contributed for 26.2% to 26.6% (Figure 4d).

The SourceTracker analyses focusing on the resistome yielded strikingly similar results to those for microbiome. Manure was estimated to be the biggest contributor of resistome (83.2% to 85.2%) in surface soil (Figure 5a), compared to original soil (12.5% to 14.6%) and unknown sources (2.2% to 2.6%). Original soil was the biggest contributor of resistome (70.4% to 75.6%) in rhizosphere soil (Figure 5b). Additionally, compared to rhizosphere soil (28.3% to 34.8%) and unknown sources (4.3% to 6.2%), surface soil was the most significant source of resistome (58.9% to 66.1%) in episphere (Figure 5c). For resistome in endosphere, episphere (58.9% to 76.1%) was a more significant source than root (22.7% to 40.0%, Figure 5d).

Discussion

Overall Results from Hypothesis Testing.

Manure application clearly affects the microbiome and resistome of both soil and lettuce (Figures 2–5). Our results support Hypothesis 1, that is, manure application mostly affected the microbiome and resistome of surface soil, not rhizosphere soil. We also proved Hypothesis 2: the microbiome and resistome associated with lettuce episphere were mainly contributed from surface soil. However, contrary to our original idea, our findings disproved Hypothesis 3. According to our results, the microbiome and resistome associated with lettuce endosphere were mainly attributed from those on episphere, not those in root.

Microbiome and Resistomes in Surface and Rhizosphere Soil.

Manure application significantly altered the composition (Figure 3c) and increased the diversity (Tables S4 and S6) of the microbiome and resistome in surface soil. In particular, manure application introduced sulfonamide and tetracycline resistance genes to surface soil (Figure S5). Increases in sulfonamide resistance genes (*sul1* and *sul2*) was also reported for soils receiving swine²⁵ and dairy manure²⁶ due to the introduction of manure-borne ARGs. Studies have reported that manure-borne ARGs could persist in surface soil for more than a year.^{26,27} The persistence of manure-borne microbes in soil leads to their potential transmission to crop plants.

Surface applied manure had limited impacts on the microbiome and resistome of rhizosphere soil. The vertical transport of manure borne microbes in soil is affected by soil characteristics such as moisture content, nutrient level, bulk density, and soil pore size.²⁸ The soil used in the present study is sandy loam containing 22.5% silt, 15.0% clay, and 62.5% sand. The maximum concentration of manure-borne microbes was found at 5 cm depth of sandy soil and manure-borne microbes significantly decreased at 10 cm soil depth due to adsorption to soil particles.²⁹ Our previous work showed that most of the ARGs tested were not quantifiable using qPCR beneath the top 10 cm layer of silty clay loam following swine manure application.³⁰ In addition, most of the microbes that travel vertically are expected to transport through the bulk soil, not the rhizosphere soil.³¹

Microbiome and Resistome in Episphere.

Similarities in the microbiome between the surface soil and episphere have been reported. The episphere microbiome of *Brassica* grown in soil amended with struvite⁸ and the episphere of grapevine¹² show overlaps with the soil microbiome. The manure microbiome can impact the surface soil microbiome and persist for an extended period of time,^{32–34} making them a potential source of the microbiome on the episphere.³⁵

The transmission of microbes from surface soil to episphere may be accomplished through splashing and direct contact. During overhead irrigation and rainfall events, microbes in surface soil may get splashed onto the plant episphere.⁶ William et al.³⁶ reported that overhead irrigation resulted in more bacterial cells in the episphere of Romaine lettuce than did drip-irrigation. In addition, direct contact between vegetables

and surface soil can occur during the entire growth period. For example, *Escherichia coli* O157:H7 can adhere to the surface of germinating lettuce seeds,³⁷ and appear on cotyledons and hypocotyls of lettuce seedlings grown in manured soil when the seedlings grow and break through the soil surface.³⁸

Microbiome and Resistome in Endosphere.

There are several pathways through which bacteria can enter plants and become endophytes. Bacteria from the episphere can enter the endosphere via stomata,³⁹ scar tissue,⁴⁰ and surface wounds⁴¹ on the leaf of various kinds of vegetable. Alternatively, bacteria can also become endophytes after entering the root from the rhizosphere soil through breaks in the epidermis and translocate to the edible parts of the plant.³⁸

In this study, we specifically compared the relative contributions of the episphere and root to the microbiome and resistome in the endosphere using SourceTracker analysis. We found that endospheric resistomes are transmitted chiefly from the episphere and partially from the root (Figure 5d). This reinforces the notion that the resistome in lettuce leaves might transmit from both the exterior (through the episphere) and interior (through the root) of lettuce tissue.^{3,4,10,11,42,43} In our study, manure had a more significant impact on the microbiome and resistome in surface soil than rhizosphere soil. Therefore, we propose that the transmission route of manure– surface soil–episphere is more important than the transmission route of manure–rhizosphere soil–root in shaping the microbiome and resistome in endosphere.

Plant-Associated Microbiomes.

The microbiome in the soil, manure, surface soil, rhizosphere soil, and episphere were dominated by Actinobacteria, Bacteroidete, and Proteobacteria, which have been reported as the dominant members in the microbiomes of lettuce grown in soil irrigated with wastewater,²⁰ and in soil receiving manure¹¹ or biosolids.⁴² *Pseudomonas* and *Sphingopyxis* were the dominant Proteobacteria genera across all the sample types, especially in the root, episphere, and endosphere. These two genera appeared in the soil, leaves, flowers, and grapes of planted grapevine,¹² suggesting their ability to survive a broad range of environments. Indeed, *Pseudomonas* has been recovered from the root,⁴⁴ episphere,^{45,46} and endosphere⁴⁷ of lettuce. Some species within *Pseudomonas* were known for their beneficial effects to plants by solubilizing inorganic phosphate⁴⁸

and enhancing nutrient uptake.⁴⁹ Pathogenic *Pseudomonas* species carrying ARGs such as *sul1* and *sul2* were also reported in manured soils,^{50,51} and are presumably able to transmit ARGs from the soil/manure to lettuce. *Sphingopyxis* was commonly found in the soils around poultry and livestock operations⁵¹ and in lettuce root.⁵² Some *Sphingopyxis* isolates recovered from soil contained sulfonamide resistance genes.⁵¹

Microbiome vs Resistome.

The microbiome and the resistome of the soil-plant ecosystem are likely correlated.⁵³ Procrustes test results show significant correlations between the resistome and microbiome in the episphere and surface soil (Figure S7a, $M^2 = 0.36$, $r = 0.80$, $p = 0.001$) and in the endosphere, rhizosphere soil, and root (Figure S7b, $M^2 = 0.40$, $r = 0.77$, $p = 0.001$). This finding is consistent with previous studies reporting significant correlations between ARGs and the microbiome in the rhizosphere soil of *Brassica*⁸ and soil with manure application⁵⁴ using Procrustes analysis.

Environmental Significance.

We tested three hypotheses on the transmission of manure-borne microbiome and resistome in the soil-plant ecosystem. Compared to the rhizosphere soil, the surface soil in croplands receiving manure via broadcasting appears to be a more important source of crop-associated microbiome and resistome. This highlights the importance of prior aging to control the transmission of the manure-borne resistome to crops. Furthermore, reduction of transmission from the surface soil to leaf surface is recommended, as the leaf episphere is also an important source of the microbiome and resistome of leaf endosphere. Hence, irrigation practices such as subsurface drip and trickle irrigation are recommended to reduce the overall transmission of manure-borne microbes and ARGs to crops.

Supporting Information Supporting Information (PDF) follows the **References**, including:

- alpha diversity of microbiome and resistome
- sampling scheme; ANOVA analyses for ARG abundance
- relative abundance of phyla
- abundance of ARG families and the top 100 ARGs
- numbers of ARGs shared
- Procrustes test between resistomes and microbiomes

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Supplementary Information

Transmission Routes of Microbiome and Resistome from Manure to Soil and Lettuce

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RESULTS

Alpha diversity of microbiome

Alpha diversity indexes for microbiome varied across sample types, with significantly lower (ANOVA and Turkey's HSD, p values < 0.05) average number of genera and Shannon index in root (7 – 15 and 1.29 – 1.44, respectively) and endosphere (2 – 4 and 0.63 – 0.81) than those in other sample types, such as surface soil (40 – 58 and 2.48 – 3.11, Table S3). ANOVA tests show that the manure treatment factor had no significant impacts on the alpha diversity indexes of the microbiomes (Table S4). In comparison, ANOVA tests show that sample type had significant impacts on the alpha diversity indexes of the microbiomes (Table S3 and S4).

Alpha diversity of resistome

A total of 359 ARG types were detected, with the average number ranging 21 – 145 for each sample type (Table S6). Two-way ANOVA indicates significant differences in the number of ARG types across different sample types (p values < 0.05) and treatment scenarios (Table S7, p values < 0.05). Manure treatment had significant effects on the Shannon index and the number of ARG types in surface soil and episphere (Table S6). For example, manure application (T5 and T10) caused the detection of sulfonamide (e.g., *sul1* and *sul2*) and tetracycline resistance genes (e.g., *tet(A)* and *tet(X)*) in surface soil and episphere, while these ARGs were not detected in the original soil (Figure S5).

Compared to control, T10 had a significantly higher (t-test, p values < 0.05) number of shared ARGs between surface soil and episphere, and among endosphere, rhizosphere and root (Figure S6); T5 had a significant higher (t-test, $p < 0.05$) number of shared ARGs between surface soil and episphere (Figure S6A). These results imply the pivotal role of manure

application in modulating resistome composition (especially in surface soil, episphere and endosphere samples) and transmission from manured soil to lettuce.

Table S1. Overall sampling scheme.

Sample type	Treatment	Sampling time	Sampling location	# of replicates per combination
Soil		Week 0		3 replicates
Manure		Week 0		3 replicates
Surface soil	C, T5, T10	Week 1 (W1)		3 pooled replicates
	C, T5, T10	Week 3 (W3)		3 pooled replicates
	C, T5, T10	Week 6 (W6)		3 pooled replicates
Rhizosphere soil	C, T5, T10	Week 6	Top (T)	3 pooled replicates
	C, T5, T10	Week 6	Middle (M)	3 pooled replicates
	C, T5, T10	Week 6	Bottom (B)	3 pooled replicates
Root	C, T5, T10	Week 6		3 pooled replicates
Episphere	C, T5, T10	Week 6		3 pooled replicates
Endosphere	C, T5, T10	Week 6		3 pooled replicates

Table S2. Total reads and trimmed reads for shotgun metagenomic sequencing.

Sample type	Treatment	Sampling Time	Sampling location	Round					
				1		2		3	
				Total reads × 2	Trimmed reads × 2	Total reads × 2	Trimmed reads × 2	Total reads × 2	Trimmed reads × 2
Soil		W0		16935474	16523066	22255771	21075470	18712521	18398870
Manure		W0		14562266	14250739	23675425	23028860	24931240	24435344
Surface soil	C	W1		25808954	25694705	21274749	20577005	19494638	19091880
		W3		18461872	17760637	32363833	30742031	20961219	20494428
		W6		18383498	17872941	21551647	20652821	28538760	27690754
	T5	W1		28298479	27479742	21315840	20652821	15761754	15470069
		W3		17079039	16799841	17646825	17274068	18905149	18509825
		W6		19722875	19228899	25048543	24150337	29086141	28244532
	T10	W1		15923384	15617345	22035976	21357693	21382195	20929791
		W3		30335850	29542821	24248108	23587006	28785181	28072923
		W6		20825475	20239646	37529771	35733904	20380093	19969219
Rhizosphere soil	C	W6	T	17093537	16779841	23951738	22789792	19848363	19412445
			M	24321049	23490165	31939959	30448574	19657877	19205181
			B	20001952	19503312	25891618	24497597	21013741	20388738
	T5		T	20255196	19746318	20167674	19741777	29064444	28209725
			M	19735775	19218269	31785831	30270390	40032608	38728078
			B	24079488	23380364	19939361	19133978	15720659	15451562
	T10		T	22361166	21605414	37139566	35836685	25376247	24779814
			M	24739753	23891261	22665021	21779661	23032153	22359571
			B	25440600	24405457	20244211	19502000	21774836	21257240
Root	C	W6		18974274	18041989	18869812	18058139	27977283	26564217
	T5			12217629	11865603	27431727	25866078	21087159	20167839
	T10			15122307	14568416	30173319	28436839	21859894	20907222
Episphere	C	W6		17652359	16993401	21471307	21025417	17027900	16733055
	T5			12204532	11857844	24303575	23699086	16679820	16368401
	T10			19425250	18517271	31000122	30099358	42313842	40830779
Endosphere	C	W6		25593188	24777294	17178884	16669714	22205485	21422488
	T5			12400938	12127887	16155839	15481786	14067593	13744787
	T10			19522061	18986575	15068954	14686058	13326235	13002836

Table S3. The alpha diversity, Shannon Index and the number of genera, of the microbiome in various sample types.

Sample type	Treatment	Time/Location	Shannon index	Number of Genera
Soil		Week 0	2.75 ± 0.33	38 ± 8
Manure		Week 0	2.51 ± 0.54	50 ± 6
Surface soil	C	Week 1	2.84 ± 0.08	40 ± 5
		Week 3	2.75 ± 0.37	51 ± 5
		Week 6	3.06 ± 0.40	56 ± 19
	T5	Week 1	2.55 ± 0.06	50 ± 7
		Week 3	2.38 ± 0.29	40 ± 10
		Week 6	3.11 ± 0.29	55 ± 8
	T10	Week 1	2.48 ± 0.15	47 ± 1
		Week 3	2.80 ± 0.23	58 ± 9
		Week 6	2.81 ± 0.17	48 ± 2
Rhizosphere soil	C	Bottom	2.97 ± 0.21	47 ± 15
		Middle	3.04 ± 0.11	47 ± 2
		Top	2.75 ± 0.52	43 ± 6
	T5	Bottom	3.19 ± 0.13	53 ± 13
		Middle	3.14 ± 0.20	50 ± 11
		Top	2.64 ± 0.75	53 ± 12
	T10	Bottom	2.83 ± 0.45	49 ± 12
		Middle	2.97 ± 0.06	47 ± 14
Root	C	Week 6	1.41 ± 0.64	15 ± 4
	T5	Week 6	1.29 ± 0.26	9 ± 4
	T10	Week 6	1.44 ± 0.59	7 ± 4
Episphere	C	Week 6	1.82 ± 0.26	44 ± 4
	T5	Week 6	2.29 ± 0.81	49 ± 6
	T10	Week 6	2.34 ± 0.74	50 ± 9
Endosphere	C	Week 6	0.63 ± 0.16	2 ± 1
	T5	Week 6	0.68 ± 0.48	2 ± 1
	T10	Week 6	0.81 ± 0.34	4 ± 2

Table S4. The p and F values of the two-way ANOVA analyses, on manure treatment and sample type, for the alpha diversity indexes of the microbiome at the genus level.

Factors	Number of Genera		Shannon index	
	p value	F value	p value	F value
Manure Treatment	0.701	0.357	0.677	0.407
Sample Type	<2e-16	68.515	<2e-16	52.615
Treatment×Type	0.929	0.377	0.918	0.667

Table S5. The p -values from the ANOVA analyses on ARG abundance among sample types, treatments, sampling times, sampling locations. Significance is indicated by asterisks, with $p < 0.05$, $p < 0.01$ and $p < 0.001$ indicated by *, ** and ***, respectively. For surface soil samples, manure treatment was defined as main treatment while time as a repeated-measure.

ARG family	Surface Soil		Rhizosphere soil		Root	Episphere	Endosphere	Sample Type
	Treatment	Time	Treatment	Location	Treatment	Treatment	Treatment	
aminoglycoside	0.009 *	0.2360	0.1240	0.0198*	0.6870	0.7760	0.5730	1.96e-07 ***
bacitracin	0.2790	0.3790	0.5840	0.6580	0.3330	0.5260	0.0438 *	0.0001 ***
carbomycin	0.1660	0.5170	0.0844	0.0819		0.4220		0.1690
chloramphenicol	0.006 *	0.3700	0.2402	0.0033 **	0.5990	0.4520	0.5950	2.56e-07 ***
fosfomycin	0.1840	0.6240	0.6140	0.3420	0.7150	0.3950		0.0957
fosmidomycin	0.029 *	0.0949	0.2171	0.00789 **	0.4400	0.9570	0.0246 *	3.93e-14 ***
kasugamycin	0.8710	0.2110	0.9660	0.6590	0.6290	0.4470		1.05e-06 ***
MLS	0.015 *	0.2760	0.1470	0.9840	0.2720	0.3130	0.6100	< 2e-16 ***
multidrug	0.4180	0.3360	0.9030	0.3850	0.3500	0.3330	0.1800	0.0004 ***
polymyxin	0.1560	0.2922	0.7564	0.0557		0.3260	0.4420	0.4560
puromycin	0.0788	0.4150	0.3600	0.6780	0.2760	0.4560		0.0327 *
quinolone	0.3500	0.5310	0.2020	0.2280	0.4990	0.3940	0.4420	5.21e-07 ***
rifamycin	0.0296 *	0.8310	0.7590	0.0126 *	0.4450	0.7870	0.0490 *	1.65e-09 ***
sulfonamide	0.0003 **	0.5360	0.0200 *	0.0185 *	0.5350	0.5290	0.5760	3.98e-09 ***
tetracycline	0.0143 *	0.0290*	0.5050	0.9510	0.7060	0.6280	0.5530	1.23e-05 ***
vancomycin	0.0643	0.1700	0.4370	0.1380	0.9220	0.6370	0.8860	0.0038 **
trimethoprim	0.1160	0.8040	0.4020	0.5910		0.4020		1.09e-05 ***
tetracenomycin_C	0.4410	0.3070	0.7400	0.9540	0.4570	0.7300	0.4220	0.0168 *
total	0.4900	0.2420	0.7730	0.8510	0.3200	0.5850	0.2110	7.84e-10 ***

Table S6. The alpha diversity, Shannon Index and the number of ARGs, of the resistome in various sample types. Items with different letters represent significant differences at the $p < 0.05$ level according to Tukey's HSD tests.

Sample type	Treatment	Time/Location	Shannon index	Number of ARGs
Soil		Week 0	2.72 ± 0.33	75 ± 8
Manure		Week 0	3.79 ± 0.09	145 ± 9
Surface soil	C	Week 1	2.92 ± 0.27	88 ± 3
		Week 3	3.19 ± 0.17	103 ± 5
		Week 6	3.24 ± 0.10	105 ± 19
	T5	Week 1	3.76 ± 0.13	137 ± 21
		Week 3	3.39 ± 0.16	102 ± 9
		Week 6	3.47 ± 0.09	111 ± 2
	T10	Week 1	3.74 ± 0.07	127 ± 9
		Week 3	3.56 ± 0.10	130 ± 17
		Week 6	3.51 ± 0.13	110 ± 15
Rhizosphere soil	C	Bottom	3.09 ± 0.16	83 ± 4
		Middle	3.04 ± 0.21	90 ± 8
		Top	3.20 ± 0.09	89 ± 17
	T5	Bottom	3.02 ± 0.12	85 ± 6
		Middle	3.10 ± 0.12	93 ± 10
		Top	3.34 ± 0.05	105 ± 15
	T10	Bottom	3.24 ± 0.13	93 ± 17
		Middle	3.12 ± 0.07	89 ± 11
		Top	3.35 ± 0.08	107 ± 5
Root	C	Week 6	3.14 ± 0.23	45 ± 15
	T5	Week 6	2.97 ± 0.11	35 ± 11
	T10	Week 6	3.17 ± 0.48	39 ± 16
Episphere	C	Week 6	3.10 ± 0.31	93 ± 15 a
	T5	Week 6	3.72 ± 0.28	123 ± 11 ab
	T10	Week 6	3.62 ± 0.07	134 ± 4 b
Endosphere	C	Week 6	2.77 ± 0.10	21 ± 2
	T5	Week 6	2.84 ± 0.18	23 ± 4
	T10	Week 6	2.83 ± 0.11	24 ± 4

Table S7. The p and F values of the two-way ANOVA analyses, on manure treatment and sample type, for the alpha diversity indexes of the resistome at the ARG level.

Factors	Number of ARGs		Shannon index	
	p value	F value	p value	F value
Treatment	0.00443	5.855	8.81e-05	10.680
Sample Type	< 2e-16	67.714	1.04e-11	16.317
Treatment*Type	0.03115	2.368	0.0156	2.695

Figure S2. Abundance of ARG families in surface soil that were significantly impacted by manure treatment. Different letters represent significant differences according to Tukey's HSD at $p < 0.05$. Two-way interactions between treatment and time on the abundance of ARG families are shown. Error bars represent standard deviations ($n = 3$).

Figure S3. Abundance of ARG families in rhizosphere soil that were significantly impacted by sampling locations. Error bars indicate standard deviation ($n = 3$).

Figure S4. Abundance of ARG families in endosphere that were significantly impacted by manure treatment. Column with different letter indicates significant difference according to Tukey's HSD with $p < 0.05$. Error bars indicate standard deviation ($n = 3$).

Figure S5. Abundance of the top 100 ARGs (i.e., average abundance higher than 10^{-5} copy of ARG per copy of the 16S rRNA gene across all samples) among different sample types and treatments. Red frames represent genes detected following manure application.

Figure S6. Numbers of ARGs shared between surface soil and episphere (A), and shared among endosphere, rhizosphere soil, and root (B). Column with different letters indicate significant difference (*t*-test, $p < 0.05$). Error bars indicate standard deviation ($n = 3$).

Figure S7. Procrustes test depicting the significant correlations between resistomes and microbiomes of surface soil and episphere (a), and of rhizosphere soil, root, and endosphere (b). Bray-Curtis distance with 9999 permutations were applied.