

Bacterial communities in a Neotropical full-scale drinking water system including intermittent piped water supply, from sources to taps

 communities from source to tap in a full-scale drinking water system with IWS in Arraiján, Panama.

ABSTRACT

 Understanding the microbial ecology of drinking water systems is crucial to delivering safe water. Intermittent water supply is a substandard water service that is common around the world; however, we do not yet understand how this service influences the communities of microorganisms in distribution systems. We used rRNA gene metabarcoding alongside traditional measurements of water quality to assess bacterial diversity and structure in a Neotropical drinking water system with continuous and intermittent supply. We sampled from source and treated water before distribution at three drinking water treatment plants, household taps across the distribution network, and in an intermittent supply zone immediately after supply restarted and 24 hours after. Each treatment plant had a diverse microbiome, dominated by Proteobacteria; treatment and distribution changed the diversity and composition of bacterial communities. Communities differed at the start of IWS supply and 24 hours after, and several taxa were only found in first flush samples, suggesting intrusion of new bacteria into pipes or regrowth of bacteria between supply cycles. *Pseudomonas* was found to be more common in IWS samples than elsewhere in the network. Unique taxa found only at the restart of IWS service have the potential to be used as indicators of intrusion in future research.

1. INTRODUCTION

 In low- and middle-income countries (LMICs), the consistent delivery of microbiologically safe water remains a challenge for many utilities that face resource limitations and rapid population growth. Despite the increase in access to safe drinking water reported between 2000 and 2017 in

risk are poorly understood and are difficult to study (15,19,20). These pressure events can result

 in intrusion of contaminants if there is an external source of contamination and there is a 77 pathway for that contaminant to enter the distribution (21–23).

 Culture-based techniques using indicator organisms have been widely used to assess microbial water quality in IWS systems and have shown that water quality can deteriorate during distribution and after household storage (15,17,24–27). However, indicator organisms do not represent the behavior of all pathogens nor the entire drinking water microbial community. In addition, the monitoring of chlorine residual and fecal indicators may not be sufficient to characterize water quality microbial risks in such dynamic systems.

 Molecular techniques are useful tools to characterize the whole microbial community in drinking water, but most research has been conducted on water systems in industrialized countries (28– 35) or in laboratory settings (36). Thus, most of our understanding of microbiomes in drinking water comes from drinking water systems with continuous water supply (CWS). Previous microbial community studies have shed light on the links between microbial communities and water source, treatment and distribution. From these systems, we know that drinking water has a relatively diverse bacterial profile dominated by Proteobacteria, Firmicutes, and Actinobacteria (28,37). As source water is treated, a general downward trajectory in bacterial diversity is expected (38); a reduction in diversity has also been found to be coupled with increases of certain bacterial taxa after the filtration step (39,40). In the distribution system, factors such as stagnation, pipe material, disinfectant residuals, and treatment processes can drive significant differences in microbial communities (33,37,41–45). Despite this growing body of literature, microbial communities in drinking water systems in LMIC with IWS are underexplored and they

 To address this knowledge gap, we studied the bacterial communities in a large, full-scale drinking water system, in Panama (Latin América), that includes IWS in a portion of the network as well as other features that are commonly encountered in LMIC (i.e., source water variability, operational, and infrastructure deficiencies) over a 15-month period. By sampling from source to tap, the influence of drinking water treatment and distribution was characterized, including impacts resulting from IWS cycles experienced in a section of the distribution system. We used 16S rRNA gene metabarcoding combined with traditional culture-based methods and water quality metrics to characterize microbial communities. The specific objectives of this study were to: 1) obtain an overview of bacterial diversity and community structure from water sources and along surface water treatment process; 2) compare bacterial communities across multiple locations in the drinking water distribution system; and 3) assess the impacts of IWS on the

bacterial community by comparing first flush water and water after the service had stabilized (24

 hour after supply restart). The results provide insights into the unique impacts of IWS on the bacterial community in drinking water, and ultimately can contribute to developing effective strategies to improve the design and management of water quality and public health. **2. MATERIALS AND METHODS** *2.1 Study location* This study was conducted in Arraiján, Panama, a rapidly growing peri-urban area west of the Panama Canal and Panama City, Panama (**Figure 1.a**). Arraiján's drinking water system served approximately 283,500 inhabitants and was supplied by three drinking water treatment plants (DWTP A, B and C, **Figure 1.b,c**) (12,17,49). These treatment plants sourced their water from the Panama Canal Watershed, primarily from Lake Gatún, which is recharged by the Chagres River, and lake Miraflores (both artificial lakes used in the operations of the Panama Canal). Conventional surface water treatment was practiced, with slight differences between plants (**Supplemental Table 1**; at DWTP A and B, free chlorine was applied upstream of filtration). While most of the DWDS in Arraiján provided continuous water supply, several zones operated intermittently (12,17). In addition, the DWDS suffers from around 40% water loss due to pipe failures, illegal connections, and other factors (e.g., loose fittings) (15). To assess the effects of treatment, piped distribution, and IWS, the drinking water system of

total of 118 samples were collected. Locations in the distribution system were divided into three

Arraiján was sampled between December 2016 and February 2018 (**Supplemental Table 2)**. A

regions (A-C) that corresponded to the DWTP from which the water supply originated (**Figure**

 1.c). All three DWTPs drew their source water from different locations (**Figure 1.c, Supplemental Table 1**). Seven different types of samples were collected, following the flow of water from source to tap: i) source water samples at each DWTP intake (labeled Source); ii) filter effluent from within each DWTP (Filtration); iii) finished, disinfected drinking water before distribution (Disinfection); and iv) locations in the distribution system which are commonly used to monitor water quality in the network (Distribution) (**Figure 1.b,c**). Three sample types were collected to assess the effect of IWS on bacterial communities: v) upstream samples were taken at a pump station near the entrance of the IWS zone where the water supply was continuous (Entrance); vi) downstream, first-flush samples were taken immediately after supply restarted (First Flush); and vii) at the same downstream location, samples were taken 24 hours after restart when supply had stabilized (Stable) (**Figure 1.d**). The number of samples collected during the wet and dry seasons was insufficient to discern the effects of seasonality; in addition, precipitation events occurred during the dry season.

 This IWS zone within the Arraiján distribution network has been previously described in Erickson et al. (2017) and is located within our sampling Region B. Due to insufficient supply capacity, this zone received water intermittently and supply was managed by the utility with a 162 valve located at the entrance to the zone (17). The zone had approximately 232 connections, which were primarily residential, and was scheduled to receive water for three of every six days (i.e. alternating three days with water supply and three days without). This schedule was carried out by manually opening and closing the control valve at the entrance of the area. Sanitation consisted of flush toilets connected to septic systems or pit latrines, which were typically located in the back of the houses. Because the drinking water supply pipes were typically located in

front of the houses, it was unlikely that sewage could enter the drinking water pipes. Samples

were collected from two monitoring stations that were previously installed in this zone (17); an

upstream location at the pump station supplying the IWS zone, and the IWS location which was

approximately 1.5 kilometers downstream of this entrance/pump station (**Figure 1.d**).

2.2 Sample collection

 Water samples were collected between the hours of 6 a.m. and 3 p.m. on 89 unique sampling days. Because of the long travel times between laboratory and sample sites, and the time required to process samples in the field and in laboratory, only one or two sites could be visited on each sampling day. Samples from within a DWTP were always collected on the same day. In the DWTPs, grab samples were collected directly from sampling ports. For Filtration samples, a composite sample was generated by combining aliquots from all working filters (excluding those in maintenance or that were being cleaned). Samples taken at the 18 locations in the DWDS were collected after 3-5 minute flushing of the sampling line (except first-flush samples). For the collection of first-flush samples, we arrived at the sampling location when the supply was off and waited until supply began. Once supply started, the line was flushed for only 1 minute, to allow stagnant water in the sampling line to flush out. Then, water was collected during the first 1.5 - 2 hours of supply; the collection time (volume) was larger than used in previous studies (8,32) so that sufficient biomass could be concentrated for 16S rRNA amplicon sequencing (see below).

2.3 Water quality parameters

 Several parameters were analyzed at the time of sampling at all locations: free and total chlorine (Hach Portable Colorimeter II), turbidity (Hach Portable Turbidimeter 2100Q), pH, temperature,

monitoring stations at the upstream and downstream locations (Points 1 and 2 in **Figure 1.d**).

Each monitoring station was equipped with Q46/76 turbidity sensors, Q45H/62 chlorine sensors

(Analytical Technology Inc., Collegeville, PA), ECO-3 RTU or LPR-3li pressure monitors

(AQUAS Inc., Taipei, Taiwan and Telog Instruments Inc. Victor, NY, respectively).

2.4 Culture-based indicator bacteria

 Samples for bacterial enumeration were collected from all sampling locations in sterile 100-mL bottles with sodium thiosulfate to neutralize residual chlorine and transported on ice to the research institute INDICASAT-AIP in Panama City, Panama. These samples were processed within 3 hours of collection to measure heterotrophic plate count (HPC) by the most probable number (MPN) method using Colilert Quanti-tray 2000 (IDEXX laboratories Inc, Westbrook, ME, USA). Samples were incubated at 37°C and counted after 38-44 hours. Field and laboratory blanks were collected every five samples. Total coliform bacteria and *E. coli* indicators were not measured in this study as the utility conducted routine monitoring of these indicators at the sample locations and a prior study found that they were below the detection limit in the vast majority of samples (17).

2.5 16S rRNA gene metabarcoding

 To characterize the bacterial communities, large bulk water volumes were collected to concentrate the microbial biomass for DNA extraction and 16S rRNA gene sequencing. Sample volumes ranged from 15 - 20 L for source water samples, 100 L for filtration samples, 170 - 200 L for first flush samples, and 450 - 500 L for samples after disinfection and in the continuous supply portions of the DWDS. These volumes were chosen after a preliminary analysis using16S rRNA gene sequencing was carried out, testing different water volumes for the different sample types. For volumes greater than 100 L, the biomass was concentrated on-site from each water sample by dead-end ultrafiltration (DEUF) using REXEED 25S ultrafiltration membrane cartridges (Asahi Kasei, Tokyo, Japan) as described by Smith and Hill (50). Ultrafilters were transported at 4°C to the Smithsonian Tropical Research Institute (STRI) molecular laboratory and processed within five hours of collection. Backflushing of ultrafilters was performed as described in Smith and Hill, 2009, and backflush sample volumes ranged between 600 – 800 mL. After backflushing, further concentration of bacterial cells was carried out by vacuum filtering 227 200 mL of the backflush sample sequentially through 5-um and 0.22-um pore size mixed cellulose filters (EDM Millipore, Burlington, MA, USA). Final filter samples were stored at -80 degrees C until DNA isolation, which was performed using the DNeasy PowerSoil Kit 230 (QIAGEN, Hilden, Germany) with the following adjustments: The $5-\mu m$ and $0.22-\mu m$ mixed cellulose filters were cut into pieces under sterile conditions and combined in 5-mL low-bind tubes with bead-beat solution and Solution C1. Bead-beating and subsequent steps in the DNA extraction protocol were performed according to the manufacturer's recommendations. The isolated DNA was eluted in a final volume of 60 µL. DNA extractions were stored at -20 degrees C prior to the preparation of sequencing libraries. Amplification of the V4 variable region of the

 16S rRNA gene and subsequent sequencing was performed following the protocols described in Chavarria et al. (2021) (51).

2.6 Data analysis

 Bacterial detection by HPC and analysis of water quality parameters was performed as described in Kumpel & Nelson (2014) (52). One half of the lower detection limit was substituted for values below the detection limit and the upper detection limit was substituted for values above the upper detection limit. Statistical tests for HPC data were performed on their rank values using Kruskal- Wallis to avoid assumptions about the distribution of the data. Untransformed data were used for water quality parameters. Statistical analysis and plotting were performed using the statistical 246 software R (R Core Team, 2012). Values were considered significant at $p < 0.05$.

 Quantitative Insights Into Microbial Ecology 2 (QIIME2) platform v2020.11 and the statistical software R were used for data analysis of 16S rRNA gene data analysis of paired-end sequence reads (53) following Chavarria et al. (2021). Alpha- and beta- diversity were calculated using the diversity core-metrics function in QIIME2 from the resulting ASV table, standardized to a sequencing depth of 2200 sequences per sample. Differences in alpha diversity (Shannon diversity) by categorical metadata variables were tested by Kruskal-Wallis, with pairwise differences between types of sample also tested in QIIME2 using pairwise Wilcox tests with Benjamini-Hochberg corrections. Statistical significance in beta diversity of the different types of supply was determined by permutation-based ANOVA (PERMANOVA) tests with 999 permutations on weighted UniFrac distances (54,55). To explore the structure of microbial communities and visualize beta-diversity dissimilarity, an ordination approach was adopted

 From our HPC results it is not possible to determine whether the high concentrations in first flush samples are the result of intrusion or re-growth in the stagnant water, biofilm, and loose deposits. *E. coli* data from an earlier study at the same site also did not provide insight, as most first flush samples were negative (17). It should be noted, however, that at a different study site in another IWS system it was concluded that high concentrations of *E. coli* in first flush samples

different from the filtration step (**Supplemental Figure 3**, **4a)**. This finding could potentially be

due to the persistence of DNA from microorganisms that have been inactivated(67) as water

samples were taken immediately after disinfection and before any water storage. Overall,

Disinfection sample at DWTP B had the lowest diversity which corresponded to higher overall

chlorine (total and residual) compares to Disinfection samples from the other two DWTPs. In the

DWDS, samples with higher mean diversity corresponded to sampling locations with the lowest

chlorine concentrations (locations 4C and 5C) (**Supplemental Figure 4b**).

 Using PCoA based on Weighted UniFrac distance, clustering by sample type revealed differences in community structure between source water samples and the DWDS (**Figure 4**). There was a general transition in microbial community structure from untreated source water to the DWDS; samples from the DWTP that contained some chlorine (chlorinated Source samples and Filtration samples) clustering between unchlorinated Source samples and samples from the DWDS. Disinfection samples from DWTP B and C exhibited much larger shifts in community structure than those from DWTP A. In the DWDS, bacterial community structure was found to be significantly different across regions ; however R values were low, likely due to outlier 369 samples driving these differences (ANOSIM, A/B: $R = 0.29$ $p < 0.01$; A/C: $R = 0.29$ $p < 0.01$, 370 B/C: $R = 0.13$ $p < 0.05$) and this significance could be overestimated due to dispersion within 371 sample types (PERMDISP, F-value = $0.10, p > 0.05$). The bacterial community composition found in certain locations was very different than in the rest of the DWDS. In particular, the bacterial community found in location 5C, which is the location with the lowest chlorine concentrations, was significantly different from all other locations in this study and more similar to water still undergoing treatment than other sites in the distribution network (**Figure 4**).

 Bacterial communities found across all samples were classified into 43 bacterial phyla, 433 families, and 780 genera. Fifteen bacterial phyla comprised over 98% of the bacterial community (except in IWS samples) (**Supplemental Table 4**). Four phyla represented over 95% 380 of the total ASVs for all samples combined: Proteobacteria (70.6% \pm 6.36%), followed by 381 Cyanobacteria (12.6% \pm 7.81%), Bacteroidetes (5.4% \pm 3.18%) and Actinobacteria (3.6% \pm 1.62%). These results are generally consistent with studies that have investigated bacterial communities in drinking water systems in temperate climates (28,32,68,69). When looking at each DWTP independently, we observed several differences between bacterial phyla (**Supplemental Table 4**). As previously mentioned, a general downward trajectory in bacterial diversity is expected as water moves along the treatment train. This is the general pattern that we observed with a decrease in diversity with treatment while the relative abundance of some phyla increased with treatment (**Supplemental Table 4**). While the sample numbers are too small to draw conclusions about the impact of specific treatment steps on specific phyla, differences in filtration practices (media, backwashing, chlorination) and chlorination practices (chlorination dosage and contact times) are expected to influence the bacteria that are present in the finished treated water that enters the distribution system (33,45,70).

 Within the DWDS, differences in relative abundances of top phyla were also observed. In region A, a decrease (although not significant) in Proteobacteria was observed between samples from Disinfection and samples in the distribution system. This decrease in Proteobacteria was coupled with a significant decrease of Firmicutes and an increase of Cyanobacteria (Kruskal-Wallis, *p <* 0.05), suggesting sunlight exposure during storage. In regions B and C, Proteobacteria represented over 84 % of relative abundance with minor differences between other phyla (**Supplemental Table 4**). Top bacterial families according to sampling location were observed to have differences even when supplied by the same DWTP (**Figure 5**). Among locations in region A, the family Obscuribacteraceae (Cyanobacteria) and specifically the genus *Obscuribacter* was particularly abundant*.* The families Silvanigrellaceae (Proteobacteria) and Pseudomonadaceae (Proteobacteria) were abundant across region B, and Oxalobacteraceae (Proteobacteria) was abundant across region C (**Figure 5**). The genus *Phreatobacter* (Proteobacteria) was common across all regions, indicating that although significant differences existed in bacterial communities after treatment and distribution, some bacteria (i.e., *Phreatobacter, Undibacterium*, *Pedobacter*) can be prevalent across the network. Although a recent discovery, the genus *Phreatobacter* has now been identified in several DWDSs (32,71–74), and has been found in distribution systems with chlorine residual. In Arraiján's DWDS, chlorine residual was well above 0.2 mg/L for most samples; however, it is still unclear what role *Phreatobacter* plays in the drinking water microbiome of these systems.Other enriched genera in the DWDS included: *Methylobacterium, Obscuribacter, Acinetobacter* in region A*; Pseudomonas*, *Nevskia*, and *Silvanigrella* in region B and C.

3.2.2 Influence of IWS on drinking water bacterial communities

 Our analysis of the IWS zone showed high variability in bacterial community composition and structure as water flow initiated and stabilized over time. First flush samples tended to have higher diversity compared to samples taken from the same location after supply had stabilized and samples from the entrance where supply was continuous, although these differences were not significant (Shannon, Kruskal-Wallis, p > 0.05; **Supplemental Figure 5**). Community analysis using weighted UniFrac also did not reveal a strong pattern of clustering of community structure by sample type but samples from the entrance (continuous supply) differed from IWS samples

 However, interpretation of these results is limited by differing sample sizes, as we had more first 433 flush samples (n=14) compared to stable supply (n=7) and entrance (n=4) samples. Thus, an additional analysis was conducted comparing only the first flush and stable IWS samples that were sampled within 24 hours of each other (n=6 pairs, **Figure 6a,b**). Paired first flush and stable supply samples also showed high variability in bacterial composition and community structure, with some sample pairs showing similar communities within pairs (e.g. pairs 2 and 6) and others showing large shifts in community composition. All sample pairs were unique suggesting that each IWS cycle impacted the water microbiome. However, pairs collected during consecutive weeks (e.g. pairs 2, 3, and 4) were more similar to each other than those collected at other times in the year (**Figure 6 a,b**). Although the water quality metrics during first flush events differed from other supply samples, the high degree of variability among first flush samples (and among stable supply samples) was not evident from analysis of traditional water quality metrics (e.g. free chlorine residual in stable supply was consistent) (**Supplemental Table 3)**. In addition to the unique features of intermittent supply, other factors likely influenced the bacterial communities in these samples, including seasonal effects on the water source and

 conditions in the distribution system, as well as operational changes at the treatment plant and in the distribution system. Seasonal differences are likely to significantly affect microbial communities in IWS systems, specifically in regions with drastically different dry and rainy seasons and where water sources are limited (5,75–77). Some systems supply only a few hours per day during the dry season and switch to continuous supply during the wet season (5). Several studies have looked at water source seasonality and enteric pathogens and infections in water systems known to have deficiencies, including likely intermittency (75,78–80); however, the specific relationship between IWS features such as first flush and stable IWS, seasonality, and microorganisms is not well documented, and likely system-dependent. It is also important to note that although our sampling strategy was designed to capture differences between the first flush samples and their corresponding stable supply, sensor monitoring data revealed that water quality could vary even after 24 hours of continuous supply, which was not captured by our grab sampling (**Figure 2**, **Supplemental Figure 7).**

 Bacterial communities in the IWS zone clearly differed from those found at the entrance of the IWS zone where the bacterial communities were similar to other locations in region B of the DWDS (**Supplemental Table 5, Supplemental Figure 6**). Four taxa, *Silvanigrella* (Oligoflexia)*, Undibacterium* (Proteobacteria) and an uncultured Obscuribacter (Cyanobacteria) and *Burkholderia* (Proteobacteria) were the most common taxa (with > 4.5% relative abundance) at the entrance. Downstream, the most abundant genera among first-flush samples were an unclassified species of *Sphingomonas* (22.1%) followed by *Pseudomonas* (Proteobacteria, 12.9%), *Rheinheimera* (Proteobacteria, 11.9%), and *Undibacterium* (Proteobacteria, 7.0%). Although stable IWS supply samples contained similar phyla as first-flush samples

primarily in biofilm drinking water samples and thus could be an indicator of biofilm detachment

during first flush and/or microbial growth inside pipes between IWS cycles (32,81). While also

 found elsewhere in the network, *Pseudomonas* was most prevalent in samples from IWS, both in our first flush and stable sampling. *Pseudomonas* can be pathogenic and can survive in many different environments due in part to its minimal nutritional requirements(83). In addition, *Pseudomonas* spp. Have a tremendous ability to form biofilms which makes them a model for biofilm-forming organisms(83). Prior research has shown that their ability to grow on a wide range of organic compounds and their resistance to chlorine allows them to colonize distribution networks, including premise plumbing (84,85). Our results suggest that IWS provides conditions for the proliferation of *Pseudomonas* in this distribution system. The high relative abundance of *Pseudomonas* in downstream samples could be due to detachment of biofilm during supply cycles in IWS (86). In addition to detachment as pipes fill, the high relative abundance in stable supply samples suggest that detachment or migration from the biofilm could be occurring during the entire supply cycle, possibly due to fluctuations in pressure (**Figure 2 and Supplemental Figure 7**) (36,87,88).

 The origin of unique ASVs found only in first-flush samples remains a key question for future research. While it is possible that these taxa are present elsewhere in the network but at low enough frequencies that we were not able to detect them, further investigation as to whether any taxa could be used to determine the source of organisms would be of value, in particular to distinguish between intrusion versus in-situ growth between supply cycles (e.g., in stagnant water, biofilms, or loose deposits). Further, based on the higher number of observed ASVs in some first-flush samples, ASV number may also hold promise as a signal for intrusion and growth between supplies (**Supplemental Figure 8**). However, more studies are needed to determine if higher ASVs are consistently observed during first flush compared to stable supply.

3.3 Relationship between water quality parameters and bacterial community composition

 Pearson correlations were used to determine water quality parameters that were associated with microbial community structure and were plotted using a canonical correspondence analysis plot 519 (CCA; **Figure 7a**). Among all water quality parameters measured, chlorine (Pearson's $R = 0.24$, 520 p < 0.01), turbidity (Pearson's R = 0.16, p < 0.05), conductivity (Pearson's R = 0.20, p < 0.05), 521 TDS (Pearson's $R = 0.26$, $p < 0.01$) and pressure (Pearson's $R = 0.11$, $p < 0.05$) were significantly associated with differences in microbial community composition.

 In IWS, significant correlations were also found between community structure and free chlorine residual (Spearman's R=0.28, *p <* 0.01), total chlorine (Spearman's R=0.23, *p <* 0.01), temperature (Spearman's R=0.24, *p <* 0.05), and pressure (Spearman's R=0.35, *p <* 0.01), whereas turbidity, pH, conductivity, and TDS were not statistically correlated. CCA also revealed relationships between these water quality metrics and bacterial community structure (**Figure 7b)**. Although these correlations were weak, they demonstrated the importance of water quality parameters on microbial community structure. Similar results have been found between water quality parameters and bacterial structure in CWS systems (89–91). It is important to note that collinearity exists between water quality parameters which can confound these results. Nonetheless, factors such as chlorine concentration, turbidity, and pressure are of particular importance when assessing microbiomes in drinking water and water quality in general.

3.4 Limitations and future research

This study exemplifies a number of limitations related to the difficulty investigating a large, full-

scale, dynamic, intermittent water supply system. Although we selected an IWS sampling

 location that was supposed to operate on a schedule (three days on and three days off, managed by a manual valve), the actual supply was often unpredictable (mainly due to upstream pump failures). In addition, in several instances, the supply stopped a few hours after starting, which prevented the collection of a sample after 24 hours of supply restart (and was a significant burden for consumers). We chose to collect samples from a large number of sites and sample large volumes, and as a result could only collect a relatively small number of samples for each sampling location. While this approach provided a descriptive picture of the different sources of variability found in this large full-scale system with IWS, it reduced the statistical power of our findings. With the limited resources and logistical constraints in this low-resource setting, we were able to collect 118 samples, of which 113 of those were successfully sequenced and analyzed. Overall, the sequencing samples represent a total volume of 2,590 L of first flush water and 36,100 L of water sampled across the whole network. (For comparison, this volume is equivalent to that of 361,000 grab samples of 100 mL each). Building on the findings from this study, future research can be designed to better understand and isolate specific factors that influence the water microbiome.

 For example, in future studies it would be insightful to collect pore water and soil samples from areas surrounding IWS drinking water pipes to identify microbial taxa that could be used to distinguish intrusion from other mechanisms that cause changes in the microbial community (14). This approach has been used in continuous water systems to a limited extent to assess intrusion contamination (22). Combining sequencing data with a measure of total bacterial cells, such as by flow cytometry or qPCR, would allow comparison of absolute abundance and provide more insight into whether differences between entrance, first flush, and stable supply samples

 were due to growth or intrusion of cells. Future studies could also focus on smaller portions of a single distribution system and aim to collect even numbers of samples from each location. To complement studies in dynamic real-world systems that contain IWS, it may be necessary to develop a model IWS system that can be operated under more consistent conditions (e.g., buried pipe that is operated on a supply schedule with consistent pressure and chlorine residuals). Furthermore, household water storage is a key feature of IWS that can change the microbial composition of drinking water; yet little is known about the microbial composition of stored water in IWS settings (92,93). Future research should also consider incorporating other types of sequencing and sequencing approaches that can distinguish nucleic acids from viable and non- viable cells, provide higher resolution to detect pathogens of concern, or to elucidate function (70,90). Overall, to further our understanding of IWS microbiomes and translate this knowledge into strategies to manage health risks, more laboratory and field studies are necessary that incorporate a range of scenarios and methodological approaches.

4. CONCLUSIONS

 The water system in Arraiján is dynamic and composed of three DWTPs and a distribution network with both continuous and intermittent supply. Here, we used DNA metabarcoding alongside traditional methods to characterize water quality and investigate bacterial abundance, diversity and taxonomy throughout the three centralized surface DWTPs and distribution network and highlight the influence of IWS. A unique but diverse microbiome existed within each of the three DWTPs, dominated by Proteobacteria but with differences at the family and genus level. Treatment processes were found to have varied effects on bacterial diversity and structure at the different DWTPs, likely driven by DWTP operations and different water sources.

 In addition, similar treatment processes enriched different bacterial taxa at different DWTPs. Diversity and bacterial community composition did not vary between Filtration and Disinfection samples for regions A and B but did for Region C. In addition, bacterial communities in the DWDS varied significantly from those in the finished water at the DWTPs. The abundance of the genera *Obscuribacter* (Cyanobacteria) and *Phreatobacter* (Proteobacteria) and the increase in the number of unique ASVs in the DWDS across all regions suggests a strong influence from the pipe network on bacterial communities in drinking water. In the IWS zone, several taxa were detected in first flush samples that were not present upstream or after 24 hour of stable supply, which could indicate intrusion and/or growth of microorganisms between supply cycles. *Pseudomonas* was among the most abundant taxa in IWS; yet, further research is needed to assess how IWS conditions may be conducive to the proliferation of *Pseudomona*s and other potential opportunistic pathogens and which factors are key for this proliferation to occur.

 Our results provide useful context for assessing the impacts of IWS alongside other factors that shape the water microbiome. While the study is primarily descriptive, the results demonstrate important changes in the bacterial communities found across different stages in the water delivery chain and specifically in IWS, and we provide recommendations for future research that aim to describe the impacts of IWS. Ultimately, a deeper understanding of the microbial communities in piped, centralized drinking water systems in low- and middle-income countries, and how the unique features of IWS impact their water microbiomes, will provide a better characterization of the potential risks of IWS. This knowledge can be used to improve the design and management of drinking water infrastructure to protect water quality and public health.

DATA AVAILABILITY

 Raw sequence files and metadata, are available on Figshare at: <https://figshare.com/s/841335a0a1bcb5cee7a2>

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