

**Title:** Microbial diversity associated with the natural spring water of Western Himalayas

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## **Abstract**

Springs in the Himalayan landscape are vital sources of clean, potable water for millions of inhabitants who use it for domestic and farming purposes. The rise in urbanization, pilgrimage and various other anthropogenic activities invariably results in microbial contamination. In this

study, we conducted a microbiological examination of water samples collected from four distinct Himalayan Mountain springs located in the Rudraprayag district. We employed targeted metagenomics, using 16S rRNA and Internal Transcribed Spacer (ITS) gene analysis, to elucidate the bacterial and fungal composition. Cumulatively, the high-throughput sequencing data from all four springs revealed the abundance of *Proteobacteria* (35.38%), followed by *Firmicutes* (22.47%), *Acidobacteriota* (14.73%), and *Actinobacteriota* (5.35%). Genus level analysis of bacterial communities revealed the prevalence of *Tumebacillus* (13.85%) and *Massilia* (12.97%). Mycobiome analysis demonstrated the dominance of the fungal phyla *Ascomycota* (72.11%), followed by *Basidiomycota* (16.04%), *Mortierellomycota* (9.21%), and *Chytridiomycota* (1.2%). We further analysed the functional composition of microbial communities using marker gene (16S rRNA) data through PICRUSt and the KEGG database, identifying the gene abundance associated with carbon metabolism.

**Keywords:** Western Himalayas, Water springs, Targeted metagenomics, 16S rRNA gene, Fungal communities

## Introduction

Natural water springs represent intricate ecosystems formed by groundwater surfacing at the terrestrial landscape interface. They are vital as they fulfil a crucial role in addressing the mounting demand for potable water among millions of people, particularly in rural areas lacking water supply infrastructure (Springer et al., 2009; Sharma et al., 2022; Chhimwal et al., 2022). High-altitude water springs are home to diverse flora and fauna and represent unique ecosystems for various groups of microorganisms. The Indian Western Himalayan (IWH) region encompasses approximately 1.69% of the total area of the country, constituting 10.54% of the Himalayan landscape. The elevation in the IWH region ranges from 90 meters to over 7000 meters above sea level (Kumar et al., 2021). It is known as one of the biodiversity hotspots, with a wide array of ecosystems such as hot springs, glaciers, forests, wetlands, and pristine rivers (Sharma et al., 2014; Rambia et al., 2023; Chaudhari et al., 2020). Springs in the Himalayas are an important source of perennial high-quality freshwater for remote communities. The majority of the population (60-70%) living in the Himalayan region heavily depends on these natural water sources (Verma et al., 2022).

The intensification of water scarcity, driven by climate change and growing global water requirements, presents an escalating concern. Freshwater shortage is acknowledged as a substantial risk to worldwide public health. According to the United Nations, population growth is outpacing water supply, resulting in almost half of the population being deprived of water for at least one month each year, which contributes to the rise in global temperatures due to climate change (Martin, 2023). A recent study has reported that 8-10 major cities and 500 expanding townships in the Himalayas have compromised these essential water resources, creating an extensive water issue (Verma et al., 2022). The water quality of Himalayan rivers and springs

has been deteriorating over time due to several anthropogenic activities, including contamination from untreated and treated effluents, poorly managed drainage systems, agricultural runoff, tourism, pilgrimage, and dilapidated sewerage systems (Sharma et al., 2023; Gupta et al., 2023; Li et al., 2020). Due to the lack of adequate sewage treatment facilities, there is not only an increase in the levels of coliforms but also a rise in antimicrobial-resistant bacteria along downstream reaches, especially those within the lower Jhelum and Dara watershed. This could jeopardize water quality and public health (Qayoom et al., 2023; Sharma et al., 2023; Jani et al., 2021). Given the factors contributing to water quality deterioration and the influx of contaminants, understanding the microbial diversity in natural springs becomes imperative. It is crucial to identify potential pathogens and assess the overall microbial diversity in these ecosystems to mitigate associated risks.

Nowadays, with the emergence of high-throughput sequencing technology, it has become easy to assess the complete microbial diversity structure with unprecedented depth and accuracy. This method not only reveals the richness of microbial diversity but also sheds light on the functional roles of these organisms in the ecosystem (Das et al., 2023). The advancement, cost-effectiveness, and expansive coverage of high-throughput sequencing techniques have significantly facilitated detailed investigations of microbial communities (Devi et al., 2021). Leveraging these advancements, we conducted a targeted metagenomics study to analyze the microbial diversity of four springs in the Indian Western Himalayas. This approach aimed to unveil their overall microbial composition, highlight the presence of indigenous microflora, and assess whether the observed diversity poses potential risks to human health and the environment.

## **Materials and Methods**

### **Sampling points**

Water samples were collected in triplicate from four distinct springs at different altitudes. These samples were maintained within a cold chain until transported to the laboratory for community DNA extraction. The details of the samples, along with their geographical locations, are provided in Table 1.

### **Community DNA extraction and amplicon sequencing.**

To perform community DNA extraction of the water samples, 500 mL of collected spring water was filtered through 0.22- $\mu$ m sterile filter paper (Jani et al., 2021). These filters were then used for community DNA extraction using the DNeasy PowerSoil Kit (Qiagen) according to the manufacturer's guidelines. The V4 region of the 16S rRNA gene was amplified using the 515F/806R primer set, as used in the study by Jani et al. (2022). The ITS1 region was amplified using the ITS1F/ITS2R primer set, as mentioned by Jiya et al. (2023). Template and library preparation were performed following Illumina 16S and ITS-targeted amplicon sequencing protocols. Subsequently, barcoded libraries were equimolarly pooled and sequenced on the

1 Illumina MiSeq platform using  $2 \times 250$  bp paired-end reads with v2/v4 chemistry. The sequences  
2 are available on the NCBI SRA portal under BioProject ID PRJNA1048161.

### 3 **Bioinformatics analysis**

4 Initial quality assessment of Illumina-generated raw paired-end reads was conducted using the  
5 FastQC tool. Sequence analysis was carried out using the DADA2 package (version 1.8),  
6 involving filtering, trimming, denoising, dereplication, and chimera removal, which resulted in  
7 amplicon sequence variants (ASVs) (Callahan et al., 2016). Taxonomic classification of ASVs  
8 was done using the SILVA (v1.38) (Quast et al., 2013) and UNITE (Abarenkov et al., 2023)  
9 reference databases for bacterial and fungal communities, respectively. The resulting ASVs and  
10 taxonomic tables were used for diversity and compositional analyses. Statistical analyses were  
11 conducted in R, leveraging relevant bioinformatics packages such as phyloseq (McMurdie and  
12 Holmes, 2013), ggplot2 (Wickham, 2016), corrplot, and vegan (Oksanen et al., 2013). A Venn  
13 diagram was constructed using Venny (v.2.1a), a web-based tool, to represent common and  
14 unique ASVs within the samples (Oliveros, 2007-2015).

### 15 **Phylogenetic Investigation of Communities by Reconstruction of Unobserved States** 16 **(PICRUST)**

17 To discern metabolic pathways, metagenomic functional genes, and enzymatic reactions  
18 potentially associated with the spring samples, PICRUST2 analysis was conducted on the 16S  
19 rRNA gene dataset. The ASV dataset underwent pre-processing to eliminate rare ASVs and  
20 singletons that could introduce noise into the analysis, along with the removal of low-depth  
21 samples. The PICRUST2 pipeline (version 2.3.0\_b) was subsequently executed on the resulting  
22 16S rRNA sequence data table following the methodology outlined in Douglas et al. (2020). The  
23 data obtained was analysed at the KEGG (Kyoto Encyclopedia of Genes and Genomes), with  
24 primary focus on Carbon, Nitrogen, Sulphur and Methane utilisation pathways.

### 25 26 **Results and discussion**

27 Water is crucial for life, yet accessing it in the Himalayan regions is challenging due to uneven  
28 landscapes, limited infrastructure, and remote communities. The increasing population and  
29 pilgrimage not only lead to water scarcity but also raise concerns about the safety and hygiene of  
30 these water bodies, necessitating continuous monitoring. Therefore, it is important to perform  
31 microbiological examinations to identify bacterial communities that pose potential safety threats.  
32 Significant volumes of human-associated waste can lead to the emergence of pathogens, making  
33 such examinations critical. In the current study, targeted metagenomics sequencing yielded a  
34 total of 359,473 and 107,408 raw reads for bacterial and fungal sequences, respectively.  
35 Following quality checks, trimming, and chimera removal, 266,443 (74.12%) and 82,356  
36 (76.67%) reads were retained for bacterial and fungal sequences, respectively (Sup Table 1).

1 These high-quality sequences were further assigned to 3,232 bacterial and 1,828 fungal ASVs.  
2 Alpha and beta diversity analyses were conducted to assess the microbial diversity and richness  
3 of spring water samples collected from different altitudes. Bacterial communities exhibited the  
4 highest richness in Sp3 with a Chao1 index of 1298, whereas Sp4 had the lowest at 469 (Fig. 1a).  
5 The Shannon and Simpson indices ranged from 4.57 to 6.66 and 0.97 to 1.00, respectively. Sp3  
6 exhibited the highest Shannon and Simpson index values (6.66 and 1.00), followed by Sp2, Sp1,  
7 and Sp4, which had the lowest (4.67 and 0.98). Conversely, the mycobiome diversity was  
8 highest in Sp1, followed by Sp2, Sp4, and Sp3. The Chao1 estimator was highest in Sp1 (1207)  
9 and lowest in Sp3 (87) (Sup Table 2). Shannon and Simpson index values for fungi were: Sp1  
10 (5.34, 0.98), Sp2 (4.2, 0.94), Sp4 (1.99, 0.69), and Sp3 (1.29, 0.42) (Fig. 1b).

11 Notably, among spring water samples from different altitudes, Sp3 exhibited the highest bacterial  
12 diversity, while fungal diversity was lowest in Sp3. The alpha diversity indices highlighted these  
13 differences across the samples. Furthermore, the NMDS plot effectively portrays beta diversity  
14 (Sup Fig. 1), illustrating the dissimilarities in microbial community composition. The dispersion  
15 and proximity of the samples depict the greater dissimilarity between the bacterial and fungal  
16 communities (Sup Fig. 1(a) and (b)). Alpha and beta diversity analyses unveiled the  
17 heterogeneity within spring water samples, providing valuable insights into the unique ecological  
18 characteristics of microbial communities at different altitudes. Detailed sequence analysis  
19 revealed the dominance of bacterial phyla *Proteobacteria* (35.38%), *Firmicutes* (22.47%),  
20 *Acidobacteriota* (14.73%), *Actinobacteriota* (5.35%), *Chloroflexi* (4.75%), *Bacteroidota*  
21 (3.80%), and *Planctomycetota* (2.24%) (Fig. 2a). *Proteobacteria* were dominant across all  
22 springs, comprising 44.92% in Sp1, 40.73% in Sp2, 19.12% in Sp3, and 36.78% in Sp4.  
23 *Firmicutes* showed notable presence, particularly in Sp1 (31.82%) and Sp4 (46.03%).  
24 *Acidobacteriota*, *Actinobacteriota*, and *Chloroflexi* displayed diverse abundance patterns,  
25 highlighting the intricate microbial composition within these high-altitude Himalayan springs.

26 These phyla play crucial roles in nutrient cycling, soil health, and overall ecosystem functioning,  
27 contributing significantly to various ecological functions and essential environmental processes  
28 (Wang et al., 2024). The dominance of *Acidobacteriota*, *Bacteroidota*, *Chloroflexota*,  
29 *Gemmatimonadota*, and *Planctomycetota* in high-altitude regions was consistent with previous  
30 reports (Rambia et al., 2023). *Gemmatimonadota*, reported by Chee-Sanford et al. (2019) and  
31 Park et al. (2017) for its potential role in N<sub>2</sub>O reduction and greenhouse gas emissions, suggests  
32 similar ecological relevance in the current study. Furthermore, the presence of heavy metal  
33 resistance and arsenic metabolizing genes in the uncultured candidate phylum MBNT15,  
34 distantly related to *Desulfobacterota*, and the presence of mercury (Hg) pollution bioindicators in  
35 *Desulfobacterota* in specific spring samples (Sp1, Sp2, and Sp3) underscore the environmental  
36 challenges posed by heavy metals. This raises concerns about the potential toxicity of the springs  
37 for living organisms and highlights the importance of monitoring and addressing heavy metal  
38 pollution in Himalayan spring ecosystems (Begmatov et al., 2022; Rincón-Tomás et al., 2023).

Our mycobiome analysis depicted the presence of *Ascomycota*, *Basidiomycota*, and *Mortierellomycota* phyla across all samples. *Ascomycota* was the most dominant phylum, with a relative abundance of 72.11%, followed by *Basidiomycota* (16.04%), *Mortierellomycota* (9.21%), and *Chytridiomycota* (1.2%) (Fig. 2 (b)). When examining specific springs, Sp1 showed a higher abundance of *Ascomycota* (58.72%), followed by *Basidiomycota* (25.05%), *Mortierellomycota* (11.64%), and *Chytridiomycota* (2.5%). Sp2 exhibited a higher abundance of *Ascomycota* (40.05%), with notable contributions of *Basidiomycota* (32.14%) and *Mortierellomycota* (23.85%). The phylum *Ascomycota* is dominant in Sp3 and Sp4, constituting 99.73% and 89.9%, respectively. *Ascomycota* abundance showed variations with higher altitude, attributed to lower temperatures and pH conditions in the mountainous regions of the Himalayas. *Ascomycota* is well-known to thrive in diverse environments owing to its stress-tolerant capacity (Egidi et al., 2019). Its prevalence is particularly favored in higher altitude mountainous regions with acidic soils and cold temperatures. *Basidiomycota* is the second most abundant phylum observed in the study. It is known as wood-decaying fungi and is involved in breaking down complex organic materials, contributing to nutrient cycling (Yadav et al., 2023). *Ascomycota*, *Basidiomycota*, and *Mortierellomycota* are the key phyla in the high altitude regions of the Himalayas (Rambia et al., 2023). *Ascomycota* and *Basidiomycota* are referred to as the “dynamic duo” of the fungal world, playing a crucial role in organic matter decomposition and the carbon cycle (Wang et al., 2017). *Chytridiomycota*, known as chytrids, are predominantly water-dwelling organisms. These aerobic zoosporeic fungi exhibit dual roles as saprotrophs and pathogens, thriving in freshwater, brackish, and marine environments, and displaying abundance in soil ecosystems (Volk TJ, 2013).

At a lower taxonomic rank, the analysis unveiled the dominance of the bacterial genera *Tumebacillus* (13.85%), *Massilia* (12.97%), *Brevibacillus* (7.02%), *HSB OF53-F07* (3.67%), *Rhodanobacter* (3.08%), *Acidibacter* (2.8%), and *Alicyclobacillus* (2.78%) (Fig. 2(c)). Distinct variations in genera abundance were observed among the springs, with *Brevibacillus* exhibiting a higher prevalence in Sp1 (26.14%) compared to Sp2 (1.94%), however, it was not found in other higher altitude springs, i.e., Sp3 and Sp4. This is particularly noteworthy due to its significant role in the bioremediation of heavy metals, attributed to its metal-resistant nature and participation in the biodegradation of hydrocarbons (Wani et al., 2021). *Acidibacter* demonstrated significantly higher representation in Sp2 (3.77%) and Sp3 (6.65%), suggesting the acidic nature of these specific springs. Sp4 displayed different genera abundance in comparison to other springs, with *Rhodanobacter* (11.93%), *Alicyclobacillus* (6.92%), *Dokdonella* (5.69%), and *Pseudolabrys* (5.52%) emerging as dominant over other genera. *Massilia* is found across all spring samples; however, their prevalence is significantly higher in lower altitude springs, i.e. Sp1 and Sp2 and is also reported in the Himalayan geothermal springs (Mahato et al., 2019). The presence of genus *Massilia* is of concern as it causes nosocomial infections in immunocompromised patients and co-infections in humans and animals (Gupta et al., 2023).

1 Previous studies have revealed that genera *Dokdonella* and *Rhodanobacter* are key players in  
2 bioremediation and biogeochemical cycling, which provides a significant importance of these  
3 groups of microorganisms in ecological functioning (Figueroa-González et al., 2016; Green et  
4 al., 2012).

5 The mycobiome analysis showed the predominance of fungal genera, including *Aspergillus*,  
6 *Fusarium*, *Hygrocybe*, *Mortierella*, *Solicoccozyma*, *Trichosporiella*, *Linnemannia*, *Podila*,  
7 *Lachnellula*, *Penicillium*, *Archaeorhizomyces*, *Phialea*, and *Scutellinia*, collectively having an  
8 average relative abundance >1% across spring samples. Interestingly, distinct genera with  
9 substantial abundance were observed across samples (Fig. 2(d)). Water sample (Sp1) from  
10 Baniyakund spring showed the presence of *Aspergillus* (12%), *Trichosporiella* (8%), and other  
11 taxa affiliated with *Linnemannia* (6.81%), *Lachnellula* (6.13%), and *Mortierella* (6.12%). In  
12 contrast, Sp2 displayed the presence of *Hygrocybe* (25%), *Mortierella* (18%), *Podila* (5.65%),  
13 and *Solicoccozyma* (5.61%). Sp3 showed a significantly higher abundance of *Aspergillus*  
14 (91.24%), while Sp4 was dominated by *Fusarium* (82.04%). These findings highlight the  
15 intriguing fungal diversity in extreme environments, where certain genera seem to thrive and  
16 dominate while some are getting eliminated across higher elevations. In this study, *Aspergillus*  
17 emerged as the most dominant group, contrasting with a previous study in the alpine forests of  
18 the Himalayan region, where its abundance was minimal (Rambia et al., 2023). The presence of  
19 *Aspergillus* is attributed to its adaptability across various habitats. It is one of the most resilient  
20 groups of fungi and thrives in diverse environmental conditions. *Aspergillus* and *Penicillium* spp.  
21 are found in diverse habitats, including underground water, surface water, and tap water, and  
22 have been reported as opportunistic pathogens (Babič et al., 2017). Additionally, the presence of  
23 *Fusarium* species at the altitude of 3480m in the Himalayas is noteworthy. These filamentous  
24 fungi are known to cause various fungal plant diseases, which also pose risks to animal and  
25 human health by producing harmful mycotoxins (Perincherry et al., 2019). *Hygrocybe* belongs to  
26 the agaric family *Hygrophoraceae* and is commonly found in grassland habitats, avoiding areas  
27 dominated by *Ectomycorrhizal* fungi. Our observations, aligning with previous studies, reveal  
28 the exclusive presence of the *Hygrocybe* genus in Sp2, where *Ectomycorrhiza* dominance is  
29 notably low compared to Sp1, Sp3, and Sp4. Despite its unique habitat preferences, the  
30 ecological role of *Hygrocybe* remains unexplored, necessitating further studies for a  
31 comprehensive understanding of its contribution to ecosystems (Halbwachs et al., 2013).

32 For comparative analysis of the ASVs, a Venn diagram (Fig. 3 (a) and (b)) showing the shared  
33 bacterial and fungal genera among the spring samples was performed to understand the  
34 variations in the diversity across different altitudinal gradient. The analysis revealed that 49  
35 bacterial and 278 fungal genera were unique to the Sp1 spring, 23 bacterial and 103 fungal  
36 genera were unique to the Sp2, 43 bacterial and 10 fungal genera were unique and 50 bacterial  
37 and 24 fungal genera were found to be unique in the Sp4. This highlights the unique microbial  
38 composition at different altitudes within each spring.

1 An in-depth analysis of the KEGG pathways revealed a diverse range of bacterial abundance  
2 across various metabolic pathways. The priority pathways to study the presence and relative  
3 abundance of bacteria involved in the metabolic processes were Carbon metabolism, Nitrogen  
4 metabolism, Sulphur metabolism and Methane metabolism. All the targeted metabolism  
5 pathways revealed a multimodal curve where the most abundance was observed in Carbon  
6 metabolism followed by Nitrogen, Sulphur and Methane utilisation (Sup Fig 2). Members of  
7 phyla *Proteobacteria*, *Methyloirabilota*, and *Gemmatimonadota* play crucial roles in methane  
8 metabolism, contributing significantly to the global carbon cycle (Zhu et al., 2022). At the genus  
9 level, some nitrifying and denitrifying bacteria were present, such as *Rhodanobacter*,  
10 *Bryobacter*, *Nitrospira*, and *Dokdonella*. Notably, *Bryobacter* was consistently detected across  
11 all sites and is a representative denitrifying bacterium (Pang et al., 2021). However, *Nitrospira*  
12 and *Rhodanobacter* exhibited variations across sites, i.e., absence in Sp1 and Sp4, respectively.  
13 *Rhodanobacter* and *Nitrospira*, known as aerobic nitrite-oxidizing bacteria, can reduce nitrate to  
14 nitrite and thus play a crucial role in the nitrogen cycle (Green et al., 2012; Mehrani et al., 2020).  
15 Within the *Proteobacteria* phylum, *Dokdonella* predominant in Sp4, has been reported for its  
16 significant role in nitrogen-containing organic pollutant removal. Additionally, sulphur bacteria  
17 contained *Tumebacillus* and *Alicyclobacillus* which have been previously reported to oxidize  
18 sulphur (Duan et al., 2020; Jiang et al., 2009). Sulphur metabolism was evident through the  
19 presence of *Tumebacillus* and *Alicyclobacillus* in Sp4, where sulphur-related metabolism  
20 appeared higher as compared to other sites. Furthermore, there is intricate interconnection  
21 between microorganisms involved in nitrate reduction and sulphur oxidation. Nitrate-reducing  
22 sulfide-oxidizing bacteria, crucial in these processes, were found in diverse ecological niches,  
23 including soil, rhizosphere, and freshwater habitats (Duan et al., 2020). This underscores the  
24 ecological versatility and significance of these microorganisms in biogeochemical cycles.

25 It is essential to understand that climate change, road construction, urbanization and other  
26 anthropogenic activities have a substantial impact on the quality of natural water. Also, it is  
27 crucial to emphasize the importance of studying the microbial diversity of springs as a  
28 continuous surveillance and identifying threats in the era where there is an increasing number of  
29 infections and developing AMR (Sharma et al., 2023). The assessment of the water quality in  
30 two natural springs, Raj Naula and Badi Naula, located in the Kosi River catchment area of  
31 Almora city in the Kumaon Himalaya region of Uttarakhand, unveiled a notable decline in both  
32 water quantity and quality. Notably, both springs exhibited contamination by coliform bacteria,  
33 signalling the presence of organic pollutants (Sati and Paliwal, 2008, Panwar, 2020). Other  
34 studies conducted in the Uttarakhand Himalayan region in the springs of the Sumari village of  
35 the Pauri Garhwal district and Raikholi village at Bageshwar reported faecal matter  
36 contamination (Chauhan, Badwal, and Badola 2020, Chhimwal et al., 2022). The observed  
37 bacteriological contamination, attributed to local drains, runoff, and unhygienic open defecation  
38 practices, poses a significant health risk to the village population, leading to ailments such as  
39 dysentery, diarrhoea, and typhoid. Additionally, tourism also contributes to the water quality in  
40 the springs, polluting the pristine water. Reports by Rashid & Romshoo showed a deterioration



of water quality in the Kashmir Lidder valley due to an influx of pilgrim tourists visiting Amarnath Cave (Rashid & Romshoo, 2013).

Fewer studies have explored the bacterial communities in spring samples in IWH; however, their ecological functions and metabolic potential remain largely unexplored. The present study provides valuable insights into the diverse bacterial and fungal communities across the altitudinal gradient. Nevertheless, there were certain limitations to our study, which included a lack of temporal data on physicochemical parameters, organic matter content and sulphur concentrations. Future investigations should delve into the impact of environmental variations on the microbial composition of spring samples. Special emphasis should be placed on unravelling the ecological and metabolic potential of microbial communities, considering their role as reservoirs of biodegrading, bioremediation, and metal-resistant microbes.

In conclusion, our study underscores the importance of understanding microbial diversity and its functional roles within natural water springs of the Himalayan regions. Through targeted metagenomics, we identified the detailed microbial dynamics associated with the springs. Our findings, supported by high-throughput sequencing data, emphasize the prevalence of Proteobacteria and highlight key genera like *Thermobacillus* and *Massilia*. Additionally, functional analysis revealed insights into carbon metabolism, which is crucial for assessing ecosystem health. This study provides valuable insights for effective water resource management and underscores the need for sustainable conservation efforts in the fragile Himalayan ecosystem. Furthermore, continuous monitoring of Himalayan springs is vital to protect human health and preserve indigenous microflora in microbial repositories amidst unique environmental challenges.

## **Funding**

This work was supported by the Department of Biotechnology (DBT), Government of India (by Grant No. BT/Coord.II/01/03/2016), under the project Establishment of Centre for Excellence, National Centre for Microbial Resource (NCMR).

## **Data Availability**

The sequences obtained from the high throughput sequencing effort were submitted to the NCBI database using the sequence read archive (SRA) submission with the project number PRJNA1048161

## **Author contribution**

YO: MS writing, 16S rRNA gene sequencing data analysis, MK: MS writing, Fungal data analysis; RG: community DNA extraction, purification and PCR amplification; JMR, SP: Sample collection, MS writing; AZ: MS writing, data interpretation; BSR: conceptualization and

MS writing; AS: conceptualization, Project administration, Funding acquisition, Supervision,  
MS writing.

### **Ethics approval and consent to participate**

Not applicable.

### **Consent for publication**

All authors approved the manuscript.

### **Competing interests**

The authors declare no competing interests.

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## 20 **Figure legend**

21 **Figure 1** Alpha diversity parameters of spring samples (a) Bacterial (b) Fungal

22 **Figure 2** Relative abundance of bacterial and fungal communities of spring samples: (a) Top  
23 20 bacterial phyla (b) fungal phyla (c) bacterial genera (d) fungal genera

24 **Figure 3** Venn Diagram representing the common (a) Bacterial and (b) Fungal genera among  
25 spring samples