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# Enhanced understanding of nitrogen fixing bacteria through DNA extraction with polyvinylidene fluoride membrane

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The rhizobiota, particularly nitrogen-fixing bacteria, play a crucial role in plant functioning by providing essential nutrients and defense against pathogens. This study investigated the diversity of nitrogen-fixing bacteria in a relatively understudied habitat: technosols developed from industrial soda production. To analyze the bacterial diversity in the rhizosphere soils of wheat (*Triticum aestivum* L.) and aster (*Tripolium pannonicum* Jacq.), regions of the *nifH* gene were amplified and sequenced from the resident bacterial communities. A polyvinylidene fluoride (PVDF) membrane was employed for metagenomic DNA extraction, enhancing the detection of nitrogen-fixing bacteria. Prior to standard DNA extraction, an enrichment step was conducted in nitrogen-free JMV medium at 26 °C for 24 h, with a modification that replaced soil with the PVDF membrane. This approach enabled a more comprehensive analysis of the rhizosphere bacterial community, revealing that unique amplicon sequence variants (ASVs) in aster and wheat membrane samples accounted for a notable proportion of all ASVs in the dataset (8.5% and 23%, respectively) that were not captured using the standard method. Additionally, our findings demonstrated higher alpha diversity of nitrogen-fixing bacteria in the wheat rhizosphere compared to the aster rhizosphere. In wheat, the dominant genus was *Insolitispirillum* (38.80%), followed by unclassified genera within Gammaproteobacteria (9.76%) and *Rhodospirillaceae* (4.74%). In contrast, the aster rhizosphere was predominantly occupied by *Azotobacter* (95.69%).

**Keywords** Bacterial diversity, Nitrogen-fixing bacteria, *nifH*, PVDF membrane, Rhizosphere

Polyvinylidene fluoride (PVDF) is a hydrophobic, thermally stable material that possesses great mechanical strength. It is resistant to chemical corrosion, oxidation, and pollution and is low-cost to produce. These qualities make it a popular membrane material in various industrial fields<sup>1,2</sup>. PVDF membranes are integral parts of seawater desalination, and wastewater microfiltration processes<sup>3,4</sup>. However, biofilm formation contributes to the blocking of the pores, reduction of filtration efficiency, shortens the lifespan of the membrane and increases energy consumption in membrane technologies in wastewater treatment applications. It has been reported that the PVDF membrane possesses a high affinity towards various bacteria due to its high hydrophobicity, roughness, and the accumulation of trace organic nutrients at the solid-liquid interface<sup>5,6</sup>.

The adhesion of bacteria to the membrane results from a combination of bacterial and material characteristics. Bacteria, like other microorganisms, have a charged cell wall due to acid-based groups on their surface. Their cell walls are mostly hydrophobic, a crucial factor in strong adherence to the material's hydrophobic surfaces<sup>7</sup>. However, hydrophobicity isn't the sole factor influencing adhesion. Surface charge, roughness, chemical composition, pH, temperature, and ionic strength of the membrane surface and surrounding environment can significantly impact bacterial attachment<sup>8</sup>.

The results of research by Kumar et al.<sup>5</sup> indicate that the bacterial community recovered from the PVDF membrane dipped in sample water was more diverse compared to the community obtained directly from the same water samples. This discovery served as the foundation for developing distinct sampling tools i.e. membrane-

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based kits in the form of strips for the detection of *E. coli*<sup>9</sup> and *Vibrio* species (*V. cholerae*, *V. parahaemolyticus*, *V. campbellii*, *V. harveyi*, and *V. proteolyticus*) in water samples<sup>10</sup>.

In this study, we aimed to evaluate the effectiveness of PVDF membranes in the pre-treatment step to enhance bacterial detection in soil environments. DNA extraction from soil generally involves isolating genetic material from microorganisms within the soil matrix using a combination of physical, chemical, and enzymatic methods. Common approaches include direct methods, which lyse soil cells to maximize yield, and indirect methods, which separate cells before lysis to minimize contaminants, such as humic acids, that can interfere with downstream analyses<sup>11</sup>. The use of a PVDF membrane, which concentrates bacteria and allows them to proliferate before conventional DNA extraction, may improve the detection of rare taxa present in small quantities within the soil. To assess bacterial diversity, amplicon sequencing of the *nifH* gene on the Illumina platform was employed. Our focus was specifically on nitrogen-fixing bacteria from the rhizosphere, which have been extensively studied for their unique ability to fix atmospheric nitrogen and convert it into a plant-available form, offering potential to reduce agriculture's chemical dependence<sup>12–14</sup>.

Recent microbiological research has been extensively conducted in northern Poland to investigate how environmental parameters influence microbial abundance, structure, diversity, and, in particular, specific guilds involved in the nitrogen cycle in saline soils affected by the soda industry<sup>15</sup>. Our findings indicated that salinity had less impact on microorganisms responsible for nitrogen fixation and denitrification compared to the nitrifying guild. Notably, the diversity of nitrogen-fixing communities had not been previously explored in this region. Therefore, a secondary goal of our study was to uncover the diversity of nitrogen-fixing bacteria in technosols from Inowrocław. The research hypotheses were as follows: (i) Soil DNA extraction using a PVDF membrane during the enrichment step is more efficient, resulting in higher bacterial diversity compared to the standard method without enrichment. (ii) Nitrogen-fixing bacteria in soda-impacted technosols form a unique community when compared to those in other saline soils.

## Materials and methods

### Sampling and experimental design

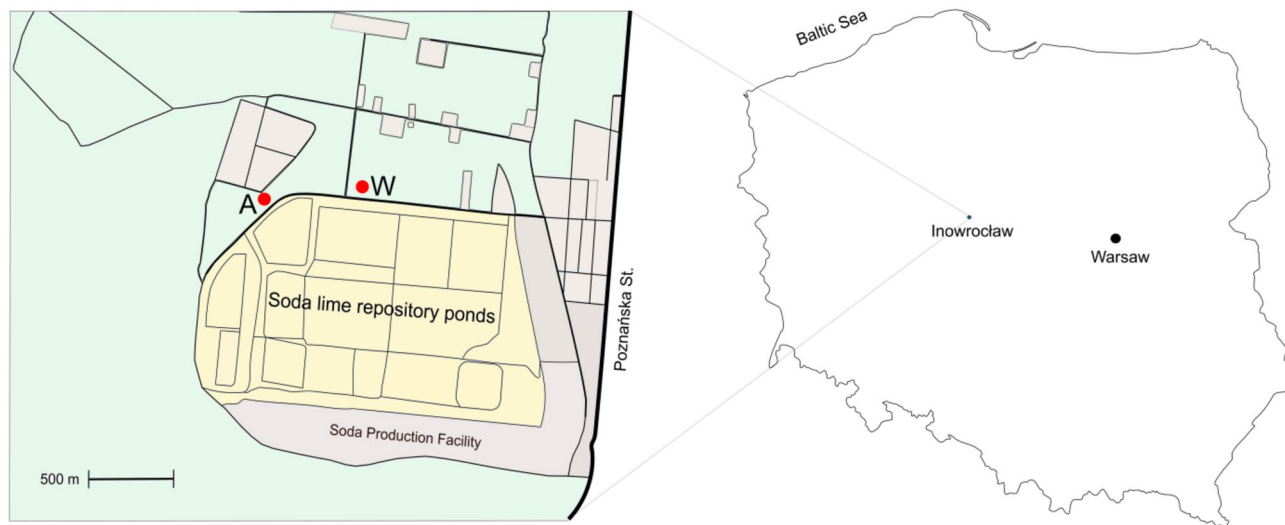
Aster (*Tripolium pannonicum* (Jacq.)), and wheat (*Triticum aestivum* L.) plants were collected in April 2023 from two distinct locations: a saline wasteland for Aster, and an arable field for wheat (Fig. 1).

The samples were obtained in Inowrocław, Poland, close to the soda lime repository ponds of the CIECH Soda company with four replicates for each species. Plants were placed in sterile polyethylene bags and stored in a portable travel refrigerator at 4 °C before laboratory analyses. The time from sampling to analysis did not exceed 90 min. Soil samples were collected from the root surface of each plant using a sterile spatula, and then transferred into sterile Eppendorf tubes for subsequent studies (four replicates per root system of the given species).

The experiment consisted of three stages: pretreatment, in which samples were enriched with bacterial cells; genomic DNA extraction; amplification and next-generation sequencing (NGS) analysis. Additionally, soil basic parameters, including ECe, pH, Corg, CaCO<sub>3</sub>, Ntot, and C/N were characterized.

### Soil characteristics

The soil samples for physicochemical analysis were dried and sieved through a 2.0 mm mesh screen and immediately stored at 4 °C for further analysis. Soil properties were analysed as described in Hulisz et al.<sup>16</sup>.



**Fig. 1.** Outlook of the sampling sites. Figure 1. A - saline wasteland site with aster (*Tripolium pannonicum* Jacq.), W - arable field site with wheat (*Triticum aestivum* L.).

### Pretreatment, PVDF membrane preparation

Five grams of rhizosphere soil and four pieces of PVDF membrane were placed into 45 ml of sterile JMV medium in Simax bottles (100 mL) to enrich samples in nitrogen-fixing bacteria during the 24-hour incubation at 20 °C. The second set of bottles with 5 g of soil without any liquid served as a control.

The nitrogen-free JMV medium<sup>17</sup> had the following composition (g L<sup>-1</sup>): mannitol, 5.0; K<sub>2</sub>HPO<sub>4</sub>, 0.6; KH<sub>2</sub>PO<sub>4</sub>, 1.8; MgSO<sub>4</sub>·7H<sub>2</sub>O, 0.2; NaCl, 10; CaCl<sub>2</sub>·2H<sub>2</sub>O, 0.02; micronutrient solution 2 mL (CuSO<sub>4</sub>·5H<sub>2</sub>O, 0.04; ZnSO<sub>4</sub>·7H<sub>2</sub>O, 0.12; H<sub>3</sub>BO<sub>3</sub>, 1.40; Na<sub>2</sub>MoO<sub>4</sub>·2H<sub>2</sub>O, 1.0; MnSO<sub>4</sub>·H<sub>2</sub>O, 1.175); bromothymol blue 2 mL (5 g L<sup>-1</sup> in 0.2 N KOH); vitamin solution 1 mL (biotin, 0.1 g L<sup>-1</sup>). The pH was adjusted with KOH to 8.5 ± 0.2. The JMV medium was selected based on our prior experience, which demonstrated its effectiveness in the isolation of a diverse range of putative nitrogen-fixing bacteria from technogenic soil<sup>18</sup>. The JMV medium is highly selective for nitrogen-fixing bacteria due to several factors: a nitrogen-free environment, mannitol as a carbon source (which is favoured by nitrogen-fixing bacteria), an alkaline pH that supports exopolysaccharide production and stress resistance, essential micronutrients (especially molybdenum for nitrogenase activity), and salinity. This makes it particularly useful in saline or degraded soils, where other microbes may struggle due to osmotic stress, nutrient imbalances, or high pH<sup>17,18</sup>.

A polyvinylidene fluoride (PVDF) solution in dimethyl formamide (20% w/w) was prepared through slow dissolution by heating at 45 °C overnight. Based on previous studies, this concentration was selected as the optimal one for maximizing bacterial attachment<sup>5</sup>. The viscous polymeric solution was then cast onto a sheet of non-woven polyester fabric (Novatexx 2470, Freudenberg Filtration Technologies, Weinheim, Germany), taped to a glass plate, and evenly spread using a 100 µm casting roller (MeSep, Kraków, Poland). The membrane was immediately immersed in water and left to air-dry. Once dried, the membrane was cut into small pieces (~1 cm<sup>2</sup>), autoclaved, and prepared for use in the experiment.

### Genomic DNA extraction

A volume of 250 µl of the 10-fold soil suspension in JMV medium (control samples) or four pieces of PVDF membrane (membrane samples), retrieved from the JMV medium, were used for DNA extraction following the Qiagen protocol for soil samples (DNeasy PowerSoil Kit, Qiagen). These samples were designated as C\_A or C\_W (control aster and control wheat, respectively) and M\_A or M\_W (membrane aster and membrane wheat, respectively). The experiment was performed in four replicates for each of the two types of rhizosphere.

### NGS analysis

Metataxonomic analysis of nitrogen-fixing biota was evaluated by amplifying the *nifH* gene with the following primers: 5' TGCGAYCCSAARGCBGACTC 3' (PolF forward, without overhangs) and 5' ATSGCCATCATYTCRCCGGA 3' (PolR reverse, without overhangs) according to Poly et al.<sup>19</sup>.

The libraries were prepared following the Illumina Support Centre (ISC) protocol with a minor modification (2 × Phanta Max Master Mix, Vazyme Biotech, Nanjing City, China was applied instead of Kapa HiFi Hot Start Ready mix). Sequencing was performed by the Biobank (University of Łódź, Poland) on a MiSeq platform (Illumina, San Diego, CA, USA) using MiSeq Reagent Kit v2 (500 cycles) in paired-end mode (2 × 250 bp).

Data analysis of *nifH* gene amplicons with a yield of 1,626,305 raw reads was processed using the DADA2 R package<sup>20</sup> based on the DADA2 Pipeline Tutorial 1.16<sup>21</sup>. The filter and trim step was performed using the filterAndTrim command with maxN = 0, maxEE = c(2,2), trimLeft = c(20,20), truncQ = 2, rm.phix = TRUE, compress = TRUE, multithread = FALSE parameters. The *nifH* dada2 v2.05 database<sup>22</sup> has been used as a reference dataset in the taxonomy assignment. Data was normalized using subsampling to 20,896 reads per sample.

### Statistical analyses

The rarefaction curves for the obtained reads, canonical correspondence analysis (CCA), principal coordinate analysis (PCoA), analysis of similarities (ANOSIM), and calculations of alpha diversity metrics, were done using vegan in R v. 4.1.0<sup>23</sup>. Differences in the α-diversity metrics between groups of samples were tested with analysis of variance (ANOVA) using Past v. 3.08<sup>24</sup>. In CCA the nitrifying biota at the ASV level was used as the dependent variable. The DNA extraction method and plant species were used as independent variables. The permutation test was applied to test the significance of constraints in the CCA model. Venn diagrams were generated in R using the limma package.

## Results

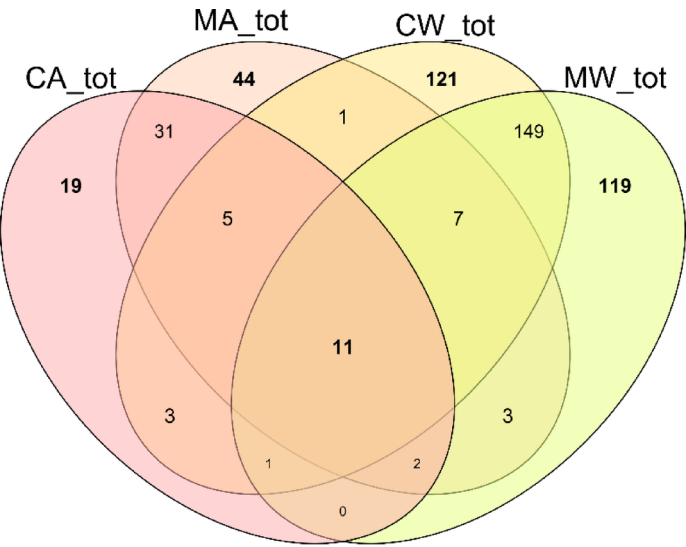
### Rhizosphere samples and sequencing efficiency

The most crucial physicochemical properties of the rhizosphere soil are presented in Table S1. This soil is classified as Mollic gleysol<sup>16</sup>, originating from alluvial sands and sandy loams. It is influenced by aeolian processes and the influx of technogenic materials rich in iron and CaCO<sub>3</sub> from highly saline groundwater. The soil from the wasteland (aster rhizosphere) exhibited higher salinity (ECe 20.01 dS/m) compared to the soil from the arable field (wheat rhizosphere, ECe 0.86 dS/m). Both soils were characterized by a slightly alkaline pH (7.2–7.5), a high content of calcium carbonate (23.5 and 18.5 mg/g, respectively), and a similar C to N ratio (9–11). This ratio is typical for agricultural soils, indicating rapid organic matter mineralization.

Next-generation sequencing of amplicons from PCR products of the *nifH* gene resulted in 1,626,305 raw reads. Out of these, 424,033 reads were high-quality sequences. The mean read depth for the membrane samples was significantly higher at 65.6 Mbases (± 9.2 Mb) compared to the control samples at 51.0 Mbases (± 5.5 Mb) (t-test, t = 3.62, p = 0.005). The rarefaction curves of the *nifH* samples flattened at around 10,000 sequences in all types of samples, suggesting that high coverage of the sample's diversity was captured (Fig.S1).

| Target | Variable              | Df | Chi <sup>2</sup> | F     | Pr(> F)  |
|--------|-----------------------|----|------------------|-------|----------|
| nifH   | DNA extraction method | 1  | 0.225            | 0.839 | 0.686    |
|        | Plant species         | 1  | 0.987            | 3.685 | 0.001*** |
|        | Residual              | 11 | 2.947            |       |          |

**Table 1.** Significance of parameters used in this study, affecting bacterial community composition in rhizosphere soil samples, as revealed by CCA. \**p* < 0.05; \*\* *p* < 0.01; \*\*\**p* < 0.001.



**Fig. 2.** Venn diagrams presenting the number of unique elements (ASVs) in the rhizosphere of aster (A) and wheat (W) in control (C) and membrane (M) samples.

| Target |       |   | Sobs     | Shannon-Wiener H' | Simpson 1-D   |
|--------|-------|---|----------|-------------------|---------------|
| nifH   | Aster | C | 30 ± 16  | 1.8 ± 0.6         | 0.730 ± 0.175 |
|        |       | M | 44 ± 27  | 1.9 ± 0.5         | 0.747 ± 0.162 |
|        | Wheat | C | 143 ± 60 | 2.8 ± 0.7         | 0.830 ± 0.093 |
|        |       | M | 144 ± 47 | 2.9 ± 0.9         | 0.785 ± 0.192 |

**Table 2.** Alpha diversity metrics in rhizosphere soil samples. Differences between control and membrane samples were not significant (*p* > 0.05).

**DNA extraction method and plant species as potential drivers of community structure in rhizosphere soil**

The results obtained from CCA revealed that, among the two factors that might have influenced the structure of nitrogen-fixing bacteria in the rhizosphere, plant species composition had a significant impact (Table 1).

The method of DNA extraction did not affect the composition of the nitrogen-fixing bacteria. This was supported by the PCoA analysis (Fig. S2) and the ANOSIM results. PCoA showed a clear separation of samples based on plant species but no separation based on the DNA extraction method. The ANOSIM statistic was *R* = 0.2 (*p*-value 0.971) for aster and *R* = 0.1 (*p*-value 0.6) for wheat.

Venn diagrams (Fig. 2) unveiled distinctions in the number of amplicon sequence variants (ASVs) between control and PVDF membrane treatment for *nifH* gene amplicons.

The median value of the unique elements in aster membrane samples was significantly higher than in control samples (22 vs. 11; Mann-Whitney *U* = 98.5, *p* = 0.026). The number of unique elements in wheat rhizosphere samples did not differ between membrane samples and controls (mean value 84 vs. 81; *t*-test: *t* = 0.12, *p* = 0.903). Unique ASVs in aster and wheat membrane samples constituted 8.5% and 23%, respectively, of all ASVs in the dataset. Further analysis showed that there were no significant differences in diversity metrics in soil rhizosphere samples between the methods of DNA extraction (Table 2).

### Structure of bacterial communities – nitrogen-fixing bacteria

At the phylum level, nitrogen-fixing bacteria were dominated by reads assigned to Pseudomonadota (Fig. 3; Table S2). The Aster rhizosphere exhibited a nearly complete dominance of this phylum compared to the wheat rhizosphere (median 99.91% versus 86.11%). Representatives of the phyla Thermodesulfobacteriota and Bacillota were present in both types of rhizosphere; however, they were more abundant in the wheat rhizosphere compared to the aster (median 8.20% versus 0.08%, respectively, and 0.87% versus 0.00%). Phylotypes assigned to Bacteroidota, Cyanobacteria, Verrucomicrobiota, Desulfobacterota, and Elusimicrobiota were exclusively present in the wheat rhizosphere.

In terms of class-level taxonomy, the majority of reads in aster samples belonged to Gammaproteobacteria (median value of 99.48%). In wheat rhizosphere samples, Alphaproteobacteria was the most abundant class (51.48%), with Desulfuromonadia ranking second (6.65%). Representatives of other top ten bacterial classes, namely Alphaproteobacteria, Betaproteobacteria, and Desulfuromonadia, were more abundant in the wheat rhizosphere compared to the aster rhizosphere. Phylotypes assigned to Bacteroidia, Clostridia, Desulfobulbia, and Desulfobacteria were exclusively detected in the wheat rhizosphere.

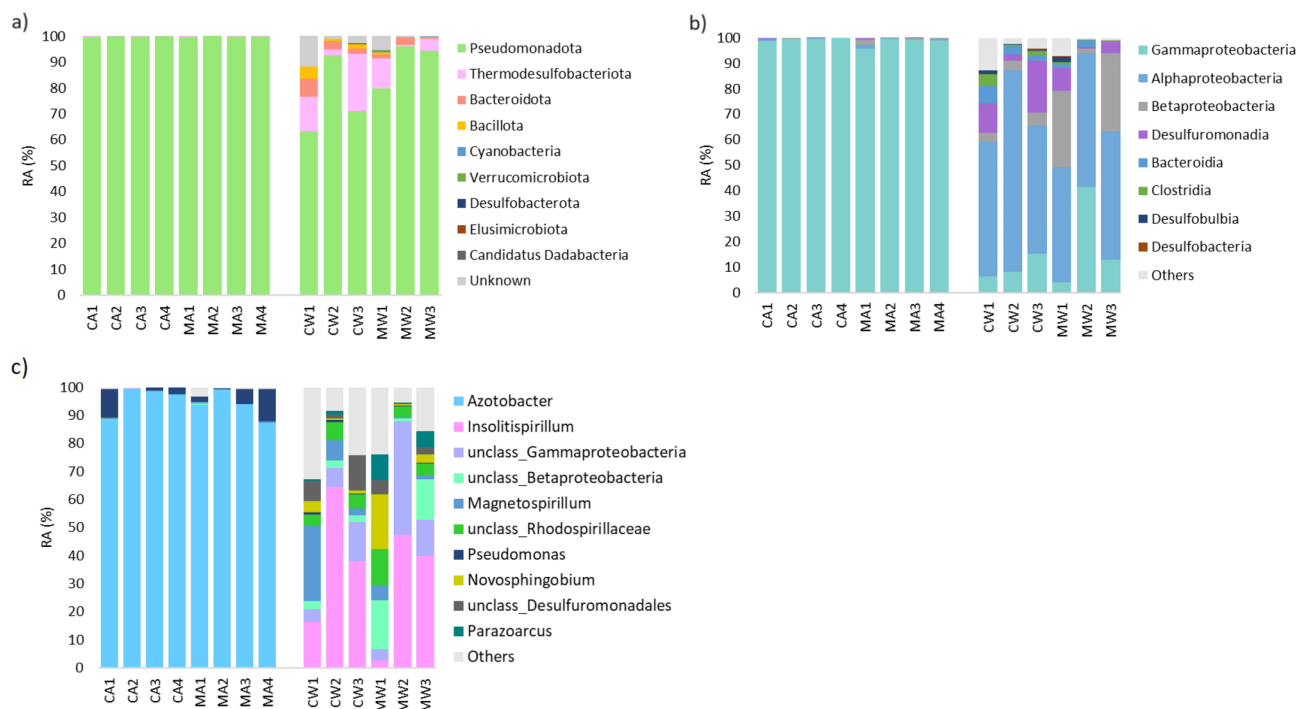
The rhizosphere of Aster was predominantly occupied by *Azotobacter* reads, accounting for a median value of 95.69%. The second most abundant genus was *Pseudomonas*, constituting 2.02% of the community. In the wheat rhizosphere, the most prevalent genus was *Insolitispirillum* with 38.80%, followed by unclassified ASVs within the class Gammaproteobacteria (9.76%) and the family *Rhodospirillaceae* (4.74%), respectively.

The rare, putative nitrogen-fixing bacteria, constituting less than 0.01% of the relative abundance in a given sample and found exclusively in the membrane samples, are presented in Table 3.

### Discussion

Assessing nitrogen-fixing microbial community composition through amplicon sequencing of the *nifH* gene is a widely used technique in microbial ecology. However, several inherent challenges and limitations can affect the accuracy and reliability of the results. The most important encompass primer bias, PCR amplification bias, and sequencing errors<sup>25,26</sup>.

Rare species are often present in very low abundances (< 0.01% RA), making their detection highly dependent on the sequencing depth. Insufficient sequencing depth may fail to capture these low-abundance taxa, leading to an incomplete picture of the community diversity<sup>27</sup>. During PCR amplification, rare species may be disproportionately underrepresented compared to more abundant taxa. This is due to the stochastic nature of PCR, where low-abundance sequences are less likely to be amplified consistently across cycles, especially when starting from a small number of template molecules<sup>28</sup>. The results of the sequencing of the *nifH* gene appeared successful in capturing the diversity of the putative nitrogen fixers. This indicates that the sequencing approach was well-designed and performed reliably. The method of DNA isolation, as indicated by CCA, PCoA, ANOSIM, and analysis of alpha diversity metrics, did not significantly affect the overall community composition.



**Fig. 3.** Structure of the putative nitrogen-fixing bacterial communities at the phylum (a), class (b) and genus (c) levels in the rhizosphere of aster (A) and wheat (W) in control (C) and membrane (M) samples.



| Target | ASV    | Taxonomy                                |
|--------|--------|---|
| Aster  | ASV402 | <i>Parazoarcus</i>                      |
|        | ASV455 | unclassified <i>Hydrogenophilales</i>   |
|        | ASV467 | <i>Geobacter</i>                        |
|        | ASV487 | unclassified <i>Geminicoccaceae</i>     |
|        | ASV522 | <i>Caenispirillum</i>                   |
|        | ASV143 | <i>Halorhodospira</i>                   |
|        | ASV366 | <i>Parazoarcus</i>                      |
|        | ASV469 | unclassified <i>Anaerolineae</i>        |
|        | ASV435 | <i>Leptolyngbya</i>                     |
| Wheat  | ASV461 | <i>Citri fermentans</i>                 |
|        | ASV470 | <i>Anabaena</i>                         |
|        | ASV474 | <i>Geobacter</i>                        |
|        | ASV477 | unclassified <i>Desulfuromonadaceae</i> |
|        | ASV493 | unclassified <i>Chromatiales</i>        |
|        | ASV496 | <i>Geobacter</i>                        |
|        | ASV524 | unclassified <i>Elusimicrobiota</i>     |
|        | ASV525 | unclassified <i>Terasakiellaceae</i>    |
|        | ASV411 | <i>Methyloferula</i>                    |
|        | ASV441 | <i>Candidatus 'Dadabacteria'</i>        |
|        | ASV491 | <i>Methylocystis</i>                    |
|        | ASV492 | <i>Desulfovibrio</i>                    |
|        | ASV513 | <i>Desulfofipila</i>                    |
|        | ASV515 | <i>Desulfovibrio</i>                    |
|        | ASV516 | <i>Geobacter</i>                        |
|        | ASV517 | <i>Geobacter</i>                        |

**Table 3.** Rare (< 0.01% RA) nitrogen-fixing bacteria exclusively present in membrane samples of aster and wheat in Inowroclaw technosoil.

However, Venn diagrams revealed notable differences in the number of bacterial ASVs uniquely detected in samples where metagenomic DNA was isolated using a membrane. In wheat membrane samples, unique ASVs accounted for 23% of all ASVs in the dataset, suggesting that the PVDF membrane method enabled the detection of a substantial portion of the bacterial community not captured by the standard method. Similarly, in aster membrane samples, unique ASVs constituted 8.5% of all ASVs. Although less pronounced than in wheat samples, this still highlights the membrane method's ability to uncover additional bacterial diversity compared to conventional approaches.

Alpha diversity metrics, such as the Shannon and Simpson indices, evaluate both the richness and evenness of taxa<sup>29</sup>. If the unique ASVs detected in membrane samples are primarily rare and of low abundance, their contribution to these metrics may be minimal. In contrast, control samples with a more even distribution of taxa, despite having fewer unique ASVs, could exhibit similar or even higher alpha diversity values. In this study, both membrane and control samples were dominated by a few highly abundant taxa, which likely constrained the ability of alpha diversity metrics to capture differences arising from rare, unique ASVs. Consequently, the additional diversity detected in membrane samples may have been masked by the dominance of a few taxa. Furthermore, both CCA and PCoA analyses are heavily influenced by the most abundant taxa, as these methods aim to explain the largest variation in the dataset<sup>30</sup>. Rare taxa, which contribute minimally to overall variation, have a limited impact on ordination results. This limitation is common in community ecology, as rare taxa typically represent a small fraction of the data matrix and do not significantly influence the patterns highlighted by ordination methods.

It is well established that nonspecific interactions or without the involvement of any particular stereospecific macromolecular binding sites mediate the attachment between membrane and bacteria. Therefore, the attachment is not substrate-specific which leads to the easy attachment of various kinds of bacteria on the membrane surface<sup>31</sup>. The deposition and accumulation of microorganisms onto the membrane surface involves a series of mechanisms causing irreversible attachment of the bacteria at the surface and inside the pores of the membrane<sup>32</sup>. Secondly, the amount of samples collected for any microbial studies comprises a very small amount which might not represent all types of bacteria<sup>5</sup>. Therefore, the membrane helps to concentrate/enrich different types of bacteria from the surrounding sample. Subsequently, it results in the isolation of bacteria representing diverse groups. Also, among several polymeric membranes, PVDF attached more diverse bacteria according to several studies conducted previously<sup>5,33</sup>. In those specific studies, the PVDF (20% W/W) membrane effectively and successfully isolated diversified bacteria from seawater samples. However, the studies were based on biochemical methods and identification (16 S rRNA) of bacteria recovered from the membrane compared to the surrounding water samples. The present study was an approach to validate those findings with the help

of molecular-based studies and whether this applies to soil samples too. Interestingly, the results of the present study accompany the fact that membranes especially PVDF (20% W/W) can concentrate diverse bacteria from the soil samples.

Plants profoundly influence the soil microbiome through root exudates, which are complex mixtures of sugars, amino acids, carboxylic acids, and secondary metabolites. These compounds serve as signalling molecules, attractants, stimulants, or inhibitors that shape the microbial community structure. The rhizobiome, or the microbial community in the rhizosphere, is shaped by plant-specific exudates, whose composition is under genetic control and varies across plant species<sup>34,35</sup>. Additionally, the rhizobiome is influenced by soil type and geographical distance<sup>36</sup>.

Aster, a halophytic plant, thrives in natural and anthropogenic environments near saline water sources, such as coastal areas or soda factory waste ponds<sup>37,38</sup>. Halophytes like aster possess salinity-responsive genes and proteins that enable survival in high-salt environments. Their rhizospheres host plant growth-promoting rhizobacteria (PGPR) which enhance salinity tolerance and mitigate environmental stress<sup>39</sup>.

In saline technogenic soils, the nitrogen-fixing bacterial community in the aster rhizosphere was characterized by a predominance of halotolerant bacteria, including members of the *Azotobacter* genus. These bacteria exhibit adaptations such as increased energy capacity to withstand saline conditions, which otherwise suppress microbial biomass and nitrogenase activity<sup>40,41</sup>. Previous studies from the same area identified a halotolerant strain, *Azotobacter chroococcum* W4ii, with plant growth-promoting properties, suggesting a vital role for such bacteria in supporting aster growth in saline technogenic soils<sup>18</sup>. Rare putative nitrogen-fixing bacteria, including *Parazoarcus*<sup>42</sup>, *Geobacter*<sup>43</sup>, and *Halorhodospira*<sup>44</sup>, were identified using the membrane-based approach. Despite their low abundance, these bacteria appear to be key members of the aster rhizosphere community, given their documented roles in nitrogen fixation and adaptation to saline environments.

Wheat, a crop with moderate sensitivity to salinity, experiences significant reductions in growth and yield under saline conditions. This sensitivity arises from ionic and osmotic stress that disrupts water uptake and nutrient balance<sup>45</sup>. Various strategies, including salt-tolerant endophytes and genetic modifications, have been employed to enhance wheat's salinity tolerance<sup>46,47</sup>. Wheat requires a balanced supply of nutrients, particularly nitrogen, for optimal growth. Over-application of nitrogen fertilizers, a common practice in wheat cultivation, alters soil microbial activity and ecological functions<sup>48</sup>. This dynamic impacts the rhizosphere microbiome, with wheat root exudates potentially attracting diverse nitrogen-fixing bacteria to compensate for nitrogen deficiencies<sup>49</sup>.

The nitrogen-fixing bacterial communities in the rhizospheres of aster and wheat differed significantly. The aster rhizosphere, dominated by halotolerant *Azotobacter* and *Pseudomonas* species, reflected its adaptation to high-salinity environments. In contrast, wheat exhibited a broader spectrum of nitrogen-fixing bacteria, likely influenced by its nutrient demands and sensitivity to saline stress. This distinction underscores the role of root exudation in shaping rhizosphere composition, though further research is needed to elucidate how domestication and metabolic specialization drive these interactions<sup>50</sup>. Among the nitrogen-fixing bacteria in wheat rhizosphere soil, *Insolittispirillum* emerged as a dominant genus. Though relatively understudied<sup>51</sup>, its prevalence suggests a significant ecological role within the *Rhodospirillaceae* family, which includes many known nitrogen-fixing species<sup>52</sup>. Rare taxa in wheat rhizosphere revealed with the improved detection method assigned to the genera *Anabaena* and *Leptolyngbya* are both well-known diazotrophic cyanobacteria<sup>47</sup> that convert atmospheric nitrogen into ammonium, making it available for plant uptake. Their ability to form biofilms may also help to retain moisture and nutrients in saline soils. Additionally, *Methyloferula* and *Methylocystis*, methane-oxidizing bacteria capable of nitrogen fixation<sup>48</sup>, were identified. These bacteria may play a dual role in the rhizosphere by contributing to both nitrogen and carbon cycling, further supporting soil health and plant growth. At the broader taxonomic level, Gammaproteobacteria and Alphaproteobacteria were the dominant diazotrophic bacteria in coastal saline soils<sup>47</sup>, a trend mirrored in the rhizospheres of both plants. However, variations in salinity levels significantly influenced community structure. For instance, higher salinity in our samples (approximately three times higher than coastal saline soils) likely shifted diazotrophic bacterial dominance, as observed in the relative abundance of Betaproteobacteria and *Burkholderia* in Polish arable soils<sup>48</sup>.

## Conclusions

The findings of this study confirm that PVDF membranes are an effective tool for gaining insights into nitrogen-fixing communities and rare taxa. The interaction between plants and their rhizosphere microbiomes is highly dynamic, shaped by root exudates, soil conditions, and environmental stressors. In saline soils, aster supports a specialized, halotolerant nitrogen-fixing community, while wheat relies on a more diverse set of nitrogen-fixing bacteria to meet its nutrient needs.

The presence of rare nitrogen fixers, including cyanobacteria and methane-oxidizing bacteria, highlights the complex ecological interactions that sustain plant health and soil fertility. Further research is needed to understand how plant-specific factors, domestication, and environmental pressures influence the assembly of these microbial communities. Future studies should also focus on optimizing sequencing and analytical approaches to better integrate the contributions of rare taxa into broader ecological analyses.

PVDF membranes offer significant advantages for microbial diversity studies, particularly in challenging environments. Their unique properties, such as high chemical resistance and durability, may enable efficient microbial cell capture in extreme conditions, including highly saline and alkaline soils.

## Data availability

Sequencing data were deposited in NCBI under accession number PRJNA1049880 (<https://www.ncbi.nlm.nih.gov/bioproject/PRJNA1049880/>).

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## Author contributions

AK - conceptualization, investigation, funding acquisition, writing - original draft, methodology, validation, visualization, writing - review and editing, supervision, resources, project administration; IK - writing - original draft, software, formal analysis, data curation; SRT - formal analysis, writing - original draft; AS - formal analysis, writing - original draft; SBK - methodology, writing - original draft.

## Declarations

## Competing interests

The authors declare no competing interests.

## Additional information

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