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# Changes in microbial community structure and yield responses with the use of nano-fertilizers of nitrogen and zinc in wheat–maize system

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The growing popularity of nano-fertilization around the world for enhancing yield and nutrient use efficiency has been realized, however its influence on soil microbial structure is not fully understood. The purpose of carrying out this study was to assess the combined effect of nano and conventional fertilizers on the soil biological indicators and crop yield in a wheat-maize system. The results indicate that the at par grain yield of wheat and maize was obtained with application of 75% of recommended nitrogen (N) with full dose of phosphorus (P) and potassium (K) through conventional fertilizers along with nano-N (nano-urea) or nano-N plus nano-Zn sprays and  $N_{100}$ PK i.e. business as usual (recommended dose of fertilizer). Important soil microbial property like microbial biomass carbon was found statistically similar with nano fertilizer-based management (N<sub>75</sub>PK + nano-N, and N<sub>75</sub>PK + nano-N + nano-Zn) and conventional management (N<sub>100</sub>PK), during both wheat and maize seasons. The experimental data indicated that the application of foliar spray of nano-fertilizers along with 75% N as basal is a sustainable nutrient management approach with respect to growth, yield and rhizosphere biological activity. Furthermore, two foliar sprays of nano-N or nano-N + nano-Zn curtailed N requirement by 25%, furthermore enhanced soil microbial diversity and the microbial community structure. The specific microbial groups, including Actinobacteria, Bacteroidia, and Proteobacteria, were present in abundance and were positively correlated with wheat and maize yield and soil microbial biomass carbon. Thus, one of the best nutrient management approaches for sustaining productivity and maintaining sound microbial diversity in wheat-maize rotation is the combined use of nano-fertilizers and conventional fertilizers.

Application of mineral fertilizers is the most common nutrient management practices<sup>1</sup> for improving soil fertility<sup>2</sup> and enhancing crop yield<sup>3</sup>. The use of intensive mineral fertilizers<sup>4</sup> to the soil<sup>5</sup> have been reported to cause environmental degradation<sup>3,6</sup> through biodiversity loss<sup>7,8</sup>, nutrient runoff, leaching losses<sup>9</sup>, and water pollution. Under field conditions, nitrogen use efficiencies (NUE) of conventional fertilizers rarely exceed 30–35%<sup>10</sup>, while micronutrient use efficiency is even low, i.e. 2–5%<sup>11</sup>. Therefore, it is very important to protect and sustain long-term productivity of soils from improper management practices such as excessive and injudicious application of chemicals which lead to loss of soil microbial biodiversity and productivity of crops.

Recently, the Indian Farmers Fertiliser Cooperative (IFFCO) developed nano-fertilizers i.e. nano-N (nanourea) and nano-Zn for foliar spray as a source of N and Zn nutrients, respectively. The developed nano-fertilizers

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was first tested under controlled conditions in laboratory and a few small-scale pot studies were conducted to check its effectiveness<sup>12,13</sup>. The efficacy of nano-N and nano-Zn was tested based on multi-location (11,000 locations) on several crops (94 crops) in different crop seasons, both by the researchers and progressive farmers in India. It was found that the application of nano-urea enhanced yields in wheat<sup>14-16</sup> and maize<sup>17</sup> across the tested locations. Nano-urea discharges nutrients in 40–50 days<sup>18</sup>, and it is applied on the leaves instead of soil; whereas conventional urea is applied in soil and discharges nutrients in 2–7 days<sup>19</sup>. Leaching and volatilization accounts for more than 70% of applied conventional urea and leaving only < 20%<sup>20</sup> of applied amount available for plant uptake and growth. Nano-fertilizers release nitrogen 12 times slower than conventional fertilizers and thus is available for functional metabolic interaction for a longer time, and this can be one of the reasons for increased grain yields of crops<sup>21</sup>. It has also been reported that the uptake mechanism is also triggered by the application of nano-fertilizer after basal N application. Nevertheless, conjoint use of nano-fertilizers with conventional source of minerals fertilizers can also provide a balance between the immediate and long-term availability of N throughout the crop cycle, besides improving soil biodiversity.

Soil biochemical processes are greatly influenced by the microorganisms<sup>24</sup>. Soil microorganisms are responsible for the decomposition of soil organic matter and recycling of nutrients. Therefore, microbial diversity in the soil indirectly indicates the quality and overall health of the soil<sup>25,26</sup>. There are many studies which advocate that fertilizer management greatly influences the soil microbial diversity<sup>1,27,28</sup>.

However, the impact of nano-fertilizers on microbial properties is still elusive. Therefore, in this study, the microbial community structure based on high throughput sequencing technologies (Next Generation Sequencing) was used to study the effect of nano-fertilizers on soil microbial niche under wheat-maize ecosystem. The broader goal of the study was to elucidate the effect of nano-fertilizers on soil microbial biomass carbon (SMBC), microbial community diversity, and its inclusive impact on wheat and maize productivity. The current study involves multi-disciplinary efforts to understand the impact of nano-fertilizers on the composition of soil microbial niches. This study analyses the impact of nano-N and nano-Zn fertilization with variable conventional fertilizer N management on the microbial niches, abundance and diversity which plays pivotal role in nutrient cycling.

#### Materials and methods Site description

Field experiments were conducted at the research farm (latitude 28°38′0838" north and longitude 77°09′1441" East) of ICAR-Indian Agricultural Research Institute, New Delhi to evaluate the performance of Nano-N (nanourea) and Nano-Zn fertilizers on soil microbial community structure, yield and soil microbial biomass carbon (SMBC). The sandy loam soil of the experimental site was mildly alkaline (pH 8.22) and non-saline (EC 0.24 dS m<sup>-1</sup>). Topsoil (0–15 cm) contained 0.58% organic C, 272 kg ha<sup>-1</sup> available N, 22.3 kg ha<sup>-1</sup> available P, and 311 kg ha<sup>-1</sup> available K. DTPA-extractable Zn contents in the soil was 0.84 mg kg<sup>-1</sup>.

### Experiment details and sample collection

Experiments were conducted with 8 treatments (Table 1) in a randomized complete block design (RCBD) and replicated thrice. Fertilizer P and K were applied uniformly at recommended rates to all plots. Time of application of nano-N and nano-Zn in maize and wheat is given in Table 2. The details of package and practices followed during crop cycle are given in Table 3. Experiment was initiated with wheat crop in November 2019 followed by maize. The sampling was done at flowering stage of second cycle wheat crop (Fig. 1). A sterile shovel was pierced around the wheat plant up to a depth of 15 cm and dug out plant with its roots adhered with soil. Rhizo-sphere soil was collected from the rhizoplane region using sterile brushes. Similar procedures for rhizospheric soil collection were followed in different treatment plots. Soil samples collected from five different plants with 2 replicas of each treatments plot were thoroughly mixed and form a composite soil sample and stored at 4 °C in polypropylene sealed bags for further analysis. Soil microbial biomass carbon in soil samples was estimated as per the method of Ref.<sup>29</sup>.

Symbol	Treatment	Treatment details
W1	N <sub>0</sub> PK	Recommended P and K (no-N)
W2	N <sub>0</sub> PK + Nano-N	Recommended P and K (no-N) + 2 nano-N sprays
W3	$N_0PK$ + Nano-N + Nano-Zn	Recommended P and K (no-N) + 2 nano-N sprays + 2 nano-Zn sprays
W4	N <sub>100</sub> PK	Recommended P, K and 100% of recommended N
W5	N <sub>75</sub> PK+Nano- N	Recommended P, K and 75% of recommended N + 2 nano-N sprays
W6	N <sub>75</sub> PK+Nano- Zn	Recommended P, K and 75% of recommended N + 2 nano-Zn sprays
W7	N <sub>50</sub> PK + Nano- N + Nano-Zn	Recommended P, K and 50% of recommended N+2 nano-N sprays +2 nano-Zn sprays
W8	N <sub>75</sub> PK + Nano-N + Nano-Zn	Recommended P, K and 75% of recommended N + 2 nano-N sprays + 2 nano-Zn sprays

**Table 1.** Treatments details of experiments undertaken in wheat-maize systems. *Note* Recommended fertilizer doses were 150 kg N ha<sup>-1</sup>, 75 kg  $P_2O_5$  ha<sup>-1</sup>, 75 kg  $K_2O$  ha<sup>-1</sup> for maize and 120 kg N ha<sup>-1</sup>, 60 kg  $P_2O_5$  ha<sup>-1</sup>, 60 kg  $K_2O$  ha<sup>-1</sup> for wheat crop.

S.No	Crops	Date of sowing	Nano fertilizer	1st spray	2nd spray
1	Wheat (1st year)	08-11-2019	Nano-N and Zn	07-12-2019	07-01-2020
3	Wheat (2nd year)	05-11-2020	Nano-N and Zn	06-12-2020	11-01-2021
4	Maize (1st year)	11-07-2020	Nano-N and Zn	11-08-2020	04-09-2020
5	Maize (2nd year)	16-07-2021	Nano-N and Zn	16-08-2021	09-09-2021

Table 2. Time of application of nano-N and nano-Zn in different crops.

Operation	Maize	Wheat
Tillage	Ploughing with cultivator (2 times), Double discing (1 time) and planking	Ploughing with cultivator (2 times), Double discing (1 time) and planking
Seed treatment	Thiram was used. Application rate was 2 g per kg seed	Thiram was used. Application rate was 2 g per kg seed
Variety/Hybrid	Pusa Jawahar Hybrid Maize 1	HD 3086
Seed rate	22 kg/ha	100 kg/ha
Weed management	Application of Pendimethaline as pre-emergence (1 l a.i./ha) + one hand weed- ing 22 days after sowing	Pre-emergence application of Pendimethaline @ 1 l a.i./ha + 75% Sulfosulfuron & 5% WG Metsulfuron@40 g a.i./ha
Insecticide	Emamectin benzoate 5 SG (0.4 ml/l) was used for management of fall army worm	-
Fungicide	-	-
Harvesting	Physiological maturity	Physiological maturity

Table 3. Agronomic package followed under different test crops.





# Nano fertilizers

Nano-fertilizers, nano-N (nano-urea) and nano-Zn were developed by the Indian Farmers Fertilizer Cooperative for use as an alternative to commercial fertilizers. Nano-urea contains functional nutrients derived primarily from urea which are treated with non-ionic surfactants and further stabilised in polymer matrices to produce nano clusters of less than 100 nm size. The fertilizer nano-urea has a size of particle in nanometre (nm) in one dimension (minimum 50% of the material), physical particle size ranging between 20 and 50 nm, and hydro-dynamic particle size varying from 20 to 80 nm<sup>18</sup>. Nano-urea contains 4% N, has a shelf-life of about 2 years, and has a zeta potential > 30<sup>18</sup>. Nano-zinc (nano-Zn) is manufactured from the precursor salts of zinc which are further stabilised in polymer matrices to produce size less than 100 nm. It contains 10,000 ppm or 1% zinc.

### Soil DNA extraction, sequencing and preprocessing

The sample data was collected by using Power Soil DNA Isolation kit from each plot as per the manufacturer's instructions. The quality and concentration of the soil DNA was measured by a Nano Drop 1000 spectrophotometer. The quality of the quantified DNA was then confirmed on the 1% agarose gel. The sequence libraries were prepared using Qubit 4.0 fluorometer using DNA HS assay kit, followed by PCR amplification of library. The samples were then sequenced on Ion 540 chip using 16S Ion Torrent Read Sequencing technique. Further, generated raw reads were quality checked using Fast QC v.0.11.9<sup>30</sup> and summarized using Multi QC v.1.9<sup>31</sup>. The

trimming (quality and adapter), filtering and masking of low quality of reads are performed using BB duk tool. The read data was reassessed post filtering using Fast QC and used in the downstream analysis.

# Processing and analysis of metagenomics sequence data

The merged metagenomics sequence reads were imported into QIIME2<sup>32</sup> environment and de-replicated. These de-replicated sequences were clustered against SILVA database (available in QIIME2) at a similarity threshold of 99 percent, using closed-reference algorithm. Features that were present only in a single sample, annotated as mitochondria or chloroplast and remaining features were discarded. Further, maximum taxonomic abundance was estimated by the aid of the marker data profiling module of "MicrobiomeAnalyst"<sup>33</sup>. Here, the differential abundance analysis is performed using metagenome Seq v. 1.28.2. It is based on Moderated t test to study the difference of abundance.

### **Microbial diversity analysis**

The sequence number in the smallest library was used to narrow the filtered OTU (Operational Taxonomic Unit) table for analysis of Alpha and Beta diversity. Chao1 and abundance based coverage estimator (measure the species richness), and Shannon and Simpson (measure richness and distribution of taxa) indices were used for the estimation of alpha diversity using Ampvis2 R package (https://madsalbertsen.github.io/ampvis2/index. html). Principal co-ordinate analysis (PCoA) on bray–curtis distance matrics generated from the operational taxonomic units was used for the assessment of beta diversity. Microbial diversity is broadly categorized into six biological classification hierarchy of taxonomic groups i.e., phylum, class, order, family, genus and species to study their diversity in response to the different fertilizers and nano treatments. The microbial taxon is then used for detailed statistical analysis. The overall analysis workflow is given in Fig. 2.

## Differential microbial abundance analysis

The differential abundance analysis is used to identify highly significant microbes present in the samples. The 16S rRNA gene sequencing technique is the most common form of profiling of microbes and to study the relative abundance of different taxa present across different samples. The statistical assessment of functional profiles is carried out using STAMP (Statistical Analysis of Metagenomics Profile)<sup>34</sup> software v 2.1.3. It is a Graphical User Interface (GUI) based software package implemented in python. It provides a range of statistical data analysis from simple exploratory plots to major statistical hypothesis testing. To study the conjoint effect of conventional fertilizers and nano-fertilizers (nano-N and nano-Zn) eight treatment combinations were taken (Table 1), and further we have divided them into four groups *v.i.z.* in first group, recommended phosphorous (P) & potassium (K) (No application of Nitrogen) (N<sub>0</sub>PK); and recommended P and K, and 100% of recommended N (N<sub>100</sub>PK). In the second group, recommended P and K (No application of N) + spray of nano-N (N<sub>0</sub>PK + Nano-N); and recommended P and K, and 75% of recommended N + spray of nano-N (N<sub>0</sub>PK + Nano-N + Nano-Zn); recommended P and K, and 75% of recommended N + spraying of nano-N and nano-Zn (N<sub>0</sub>PK + Nano-N + Nano-Zn); recommended P and K, and 75% of recommended N + spraying of nano-N and nano-Zn (N<sub>0</sub>PK + Nano-N + Nano-Zn); recommended P and K, and 75% of recommended N + spraying of nano-N and nano-Zn (N<sub>0</sub>PK + Nano-N + Nano-Zn); recommended P and K, and 50% of recommended N + spraying of nano-N and nano-Zn (N<sub>10</sub>PK + Nano-N + Nano-Zn); recommended P and K, and 50% of recommended N + spraying of nano-N and nano-Zn (N<sub>10</sub>PK + Nano-N + Nano-Zn); recommended P and K, and 50% of recommended N + spraying of nano-N and nano-Zn (N<sub>10</sub>PK + Nano-N + Nano-Zn); recommended P and K, and 50% of recommended nitrogen + spraying of nano-N and nano-Zn (N<sub>10</sub>PK + Nano-N).



Figure 2. Overall analysis workflow.

 $(N_{50}PK + Nano- N + Nano-Zn)$ ; and recommended P and K, and 75% of recommended N + spraying of nano-N and nano-Zn  $(N_{75}PK + Nano-N + Nano-Zn)$  combination were taken and this group was created to analyze the effect of microbial diversity in 25% reduced nitrogen (N). To find significant microbes in the contrasting groups, two-sided Welch's t-Test<sup>35</sup> and Benjamini–Hochberg False Discover Rate (FDR) criteria were used, which is implemented in STAMP. Here, two group tests are taken to study the difference in mean proportion within the contrasting group. After running the Welch's t-Test, specific features like significant microbes are filtered out by using p-value threshold of 0.05 (5% Level of Significance).

# **Predictive functional analysis**

Phylogenetic investigation of communities by reconstruction of unobserved stage 2 (PICRUSt2) was used for the analysis of predictive function of bacterial community<sup>36</sup>. The representative sequences were placed into a reference tree to predict the function of the bacterial communities. Castor was used for gene family prediction and further, multiple 16S rRNA gene copies were then normalized<sup>37</sup>. The predicted gene families were subsequently collapsed into MetaCyc pathway using MinPath<sup>38</sup>.

### Results

### Productivity of wheat and maize

Conjoint application of conventional fertilizers (full dose of phosphorus and potassium, and graded level of nitrogen) along with nano fertilizers (nano-N and nano-Zn) significantly influenced the grain yield of wheat and maize during both the years (Fig. 3). Application of 75% of recommended N with full dose of PK along with nano-N and nano-Zn ( $N_{75}PK$  + Nano-N + Nano-Zn) registered significantly higher yield of wheat (5.18 and 5.15 t ha<sup>-1</sup> during first year and second year, respectively) over control [ $N_0PK$  (2.81 and 2.75 t ha<sup>-1</sup> during first year and second year, respectively) over control [ $N_0PK$  (2.81 and 2.75 t ha<sup>-1</sup> during first year and second year, respectively),  $N_0PK$  + Nano-N (3.28 and 3.23 t ha<sup>-1</sup> during first year and second year, respectively)] (Fig. 3). However,  $N_{75}PK$  + Nano-N + Nano-Zn was statistically at par with  $N_{100}PK$  and  $N_{75}PK$  + Nano-N + Nano-Zn was statistically at par with  $N_{100}PK$  and  $N_{75}PK$  + Nano-N with respect to grain yield of wheat during both the years. The reduction in the yield was 46.2, 37.0 and 35.1% in  $N_0PK$ ,  $N_0PK$  + Nano-N and  $N_0PK$  + Nano-Zn treatments over  $N_{75}PK$  + Nano-N + Nano-Zn. It indicates application of nano-N and nano-Zn ( $N_0PK$ ) have advantage over  $N_0PK$  with respect to grain yield. Although, application of nano-N and nano-Zn ( $N_0PK$ ) have advantage over  $N_0PK$  with respect to grain yield.

Application of 75% recommended N (112.5 kg N ha<sup>-1</sup>) + PK along with two sprays of Nano-N and nano-Zn recorded significantly higher grain yield over control [N<sub>0</sub>PK (3.35 and 3.24 t ha<sup>-1</sup> during first year and second year, respectively), N<sub>0</sub>PK + Nano-N (3.83 and 3.75 t ha<sup>-1</sup> during first year and second year, respectively), N<sub>0</sub>PK + Nano-N (3.94 and 3.81 t ha<sup>-1</sup> during first year and second year, respectively)] and remained at par with N<sub>100</sub>PK and N<sub>75</sub>PK + nano-N (Fig. 3). Results revealed that application of nano-N, and nano-N and nano-Zn with conventional fertilizers have advantage over alone application of conventional fertilizers. Further, there is possibility of curtailing up to 25% of the recommended dose of N by application of nano-N and nano-Zn with conventional fertilizer.



(Values of means followed by different capital letter(s) (based on Duncan's multiple range tests) under different treatments within the year and crop are significantly different at  $p \le 0.05$ )

Figure 3. Effect of nano-N and nano-Zn on grain yield (t ha<sup>-1</sup>) of wheat and maize.

# Soil microbial biomass carbon (SMBC)

Soil microbial biomass carbon (SMBC) was monitored in soil at the flowering stage of both crops. Application of recommended N doses ( $N_{100}$ PK) registered significantly higher SMBC in soil at flowering stage of wheat (274 and 283 µg g<sup>-1</sup> of soil during 2019–20 and 2020–21, respectively) and maize (254 and 283 µg g<sup>-1</sup> of soil during 2020 and 2021, respectively) compared with application of 50% of recommended N doses with Nano-N + Nano-Zn application (Fig. 4). On the other hand, treatments with application of 75% of recommended N doses with Nano-N + Nano-Zn nano-N + Nano-Zn registered similar values of SMBC as compared with  $N_{100}$ PK treatments. Under nano-N or nano-n + nano-Zn spraying treatments with  $N_{75}$ PK recorded significantly higher SMBC than that under  $N_0$ PK + Nano-N and  $N_0$ PK + Nano-N + Nano-Zn during both the years in wheat and maize crops.

#### Abundance analysis

The abundance analysis was performed using metagenome Seq package and the results were given in Figs. 5, 6, 7, 8, 9, and 10 for phylum, class, order, family, genus, and species levels respectively.

The actual abundance of different microbes at phylum level was represented in Fig. 5. It was noticed that relative abundance of *Actinobacteriota* and *Proteobacteria* were significantly higher in comparison to other microbes present across eight soil samples. But its actual abundance varies from sample to sample. It was found that *Actinobacteriota* was more in case  $N_{75}PK + Nano- N$  as compared to other treatments. The next most abundant microbe was *Proteobacteria* followed by *Bacteroidota, Acidobacteriota* etc. It was found that the actual abundance of *Actinobacteria* was the highest with respect to other organisms across all eight soil microbial samples at class level. But the most abundant *Actinobacteria* was found in  $N_{75}PK + Nano- N$  (Fig. 6). The next three most abundant microbes at class levels were *Gammaproteobacteria* followed by *Alphaproteobacteria, Bacteroidia* etc.

Similarly at order level, it was noted that the actual abundance of *Streptomycetales* was found to be the highest among other microorganisms across all eight soil microbial samples (Fig. 7). But the abundance of *Streptomycetales* was found under  $N_{75}PK + Nano- N$  as compared to other treatments. The Other most abundant microbes after *Streptomycetales* are *Burholderiales*, *Sphingomonadales* etc. respectively. At family level, *Streptomycetaceae* was the most abundant microbe found across all the soil microbial samples as shown in Fig. 8. Apart from *Strptomycetaceae*; *Sphingomonadaceae*, uncultured microbes, and *Nitromonadaceae* are other three abundant microbes found in abundant in chronological order. In Fig. 9, the most abundance microbe was *Streptomyces* followed by uncultured microbes, *Sphingomonas* and *MND1* microbes at genus level. At species level, uncultured bacterium followed by *Streptomyces roseochromogenus* and others were most abundantly organisms as shown in the Fig. 10.

#### Microbial alpha diversity

For each specimen, alpha diversity was estimated based on Shannon, Simpson, Chao1 and ACE indices, which measure the richness and distribution of taxa. All this was computed using the Ampvis-2 R package (https://madsalbertsen.github.io/ampvis2/index.html). Results of the same were presented in the Fig. 11. The microbial diversity as well as richness of several samples were quantified, and significant differences were observed among treatments. It was found that treatments  $N_{100}$ PK (W4) and N75PK + Nano-N + Nano-Zn (W8) do not have much



(Values of means followed by different capital letter(s) (based on Duncan's multiple range tests) under different treatments within the year and crop are significantly different at  $p \le 0.05$ )

Figure 4. Effect of nano-N and nano-Zn on soil microbial biomass carbon (SMBC) under wheat and maize.

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Figure 5. Actual abundance of different microbes at phylum level.







variation in comparison to other treatments based on all the indices. Whereas the treatments  $N_0PK$  + Nano-N + Nano-Zn (W3) and  $N_{50}PK$  + Nano-N + Nano-Zn (W7) are showing comparatively larger diversity and richness. These results indicate that application of Nano-Nitrogen and Nano-Zinc has significant impact on microbial diversity and their richness.

# Microbial beta diversity

Beta diversity (Fig. 12) was assessed using principal co-ordinate analysis (PCoA) on bray-curtis distance matrices generated using Operational Taxonomic Unit (OTU). The microbial beta diversity was calculated by using microbial communities present in the soil rhizosphere of wheat under different fertilizer treatments. Results indicate that PC1 explain most of the variations (84.7%) whereas PC2 explains (13.8%) present in the data. The







#### Figure 8. Actual abundance of different microbes at family level.

analysis further confirmed that the microbial group of W1, W7, W8 and W2, W4, W6 treatments have similar pattern of microbial diversity in their respective groups. However, treatments W3 and W5 were clustered far apart from the other treatments indicating W3 and W5 have different microbial diversity pattern from remaining treatments (Fig. 12).

# Correlation among soil chemical properties and microbial community

The significant microbes which were found exclusively by the application of the nano-urea and nano-zinc are described in Table 4. It can be observed that, microbes found in the taxonomic groups were followed an upward



Figure 9. Actual abundance of different microbes at genus level.



Figure 10. Actual abundance of different microbes at species level.

triangle with highest number of microbes at the species level which was at the base of the triangle and lowest

number of microbes classified at the phylum level. The bacteria of W2 were found to be significant at phylum level with the application of nano-urea. Similarly, at class level, polyangia, and cyanobactera were significant. The order level of taxonomic group has one significant microbes called *Micrococcales* which was found to be significant when comparing  $N_0PK$  + Nano-N with  $N_{75}PK$  + Nano- N. The family taxonomic group showed significant microbes at two combination of fertilizer application when  $N_0PK$  + Nano-N vs  $N_{75}PK$  + Nano-N and  $N_{50}PK$  + Nano-N + Nano-Zn, the significant microbes present like *Micrococcalees*, *Microscillaceae*, and *Xanthomonadaceae* respectively. Similar trend was seen at same two combination of fertilizer applications made between  $N_0PK$  + Nano-N vs  $N_{75}PK$  + Nano-N and



**Figure 11.** Alpha-diversity index measured using ACE, Chao1, Shannon, Simpson and Observed parameters in clockwise direction.

 $N_{50}$ PK + Nano- N + Nano-Zn vs  $N_{75}$ PK + Nano-N + Nano-Zn treatment combinations where significant microbes were Pseudarthrobacter and Opitutus, respectively. As the species level was the base level of the microbial taxonomic classification, therefore at all combination of the fertilizer application shows at least one significant microbe. Janthinobacterium\_sp was found to be significant at N<sub>0</sub>PK + Nano-N vs N<sub>75</sub>PK + Nano- N combination; Arthrobacter\_sp, and Stenotrophomonas\_sp were found at  $N_0PK$  + Nano-N vs  $N_{75}PK$  + Nano-N fertilizer combinations; Flavobacterium sp, and Janthinobacterium sp were significantly associated to N<sub>0</sub>PK + Nano-N + Nano-Zn vs N<sub>75</sub>PK + Nano- Zn fertilizer combination. Unidentified species were most abundant in the N<sub>50</sub>PK + Nano- N + Nano-Zn vs N75PK + Nano-N + Nano-Zn treatment combinations. These microbes were then used to construct the heat map along with other microbes. The heat maps at three important levels like phylum, genus, and species were given in the Figs. 5, 9, 10, respectively. From Fig. 5, it was observed that actinobacteria and proteobacteria were amply present at phylum level but cyanobacteria whose abundance was less as compared to other two discussed above found to be significant when there was a 50% reduction of chemical nitrogen fertilizer, and that gap was filled by nano-urea. At genus level, Streptomyces bacteria was most abundantly found across all the wheat soil metagenome samples (Fig. 9). Other genus which were also abundantly found at genus level were Sphingomonas, MND1, Nocardiodes, and Vicinamibacteraceae etc. whereas, subgroup-2 followed by Acidobacteria were the most abundantly present under the treatment N<sub>75</sub>PK+Nano- N (W5). At Species level, Streptomyces roseochromogenus and some uncultured bacterium were most abundantly present in the soil microbial niche (Fig. 10).

# Discussion

### Productivity of wheat and maize

Application of 75% recommended dose of N + PK along with two sprays of nano-N or nano-N + nano-Zn recorded statistically at par results with  $N_{100}$ PK for the yields of wheat and maize during both the years (Fig. 2). Hence, up to 25% of recommended N dose can be curtailed without any yield penalty, with nano-urea application. Whereas, the application of nano-N or nano-N + nano-Zn with full dose of PK had advantage over no application of nano-fertilizers ( $N_0$ PK). In the current study, nano-N and nano-Zn were sprayed on leaves, leading to



Figure 12. Beta Diversity Plot 3D at Genus Level.

direct penetration through stomatal pores, and transportation through plasmodesmata<sup>13</sup>. Diminutive surface property and size of nano-urea enable its penetration into the plants via leaves. After entry in plant systems, nano-urea releases N in a controlled manner. Nano-urea boosts speedy nutrients availability to growing plant parts, ensuing increased dry matter accumulation, chlorophyll production, plant growth, development (data not reported) and yield. The yield of maize and wheat enhanced ideally owing to the synchronous release of nutrient from the nano-N and nano-Zn following crop's demand<sup>22</sup>. Our results are consistent with<sup>18</sup> who reported that foliar sprays of nano-fertilizer at critical crop growth stages either in isolation or in combination with fertilizers increases crop yields even at reduced levels of application of their conventional analogues. Al-Juthery et al. (2019)<sup>15</sup> and Abdel-Aziz et al. (2016)<sup>39</sup> indicated that foliar spray of nano-fertilizers significantly improved the plant growth characteristics and yield of wheat. Yield attributes viz., number of effective tillers per metre row length, ear length (cm), grains per ear, test weight etc. of crop were also higher in nano-fertilizer applied plots<sup>40</sup>. Nano-NPK applications were reported to stimulate the porphyrin molecules present in metabolic compounds, in turn, increasing plant biomass, yield and yield attributes of maize<sup>23,23</sup>. The yield enhancement due to Nano-fertilizers were reported in wheat<sup>1,26,27</sup> and maize<sup>17</sup> across the locations.

A complex relationship between soil microbial biomass carbon, wheat and maize yield, and microbial diversity, including the abundance of specific groups of microbes like *Actinobacteria*, *Bacteroidia*, *Streptomycetes*, and *Proteobacteria* was observed. Studies have shown that microbial biomass carbon, which represents the living fraction of organic matter in the soil, plays a crucial role in soil fertility and plant growth. This is because soil microorganisms are responsible for nutrient cycling and soil organic matter decomposition, making essential nutrients available to plants. Studies have revealed a positive correlation between wheat yield and microbial biomass carbon, as well as the abundance of specific microbial groups. For instance, *Actinobacteria*—known for producing antibiotics and stimulating plant growth, and *Bacteroidia*—involved in breaking down complex organic matter, have been found to be positively correlated with wheat and maize yield. Similarly, *Streptomycetes*, involved in the production of antibiotics and plant-growth promoting compounds, and *Proteobacteria*, involved in nitrogen fixation, also contribute to higher crop yields. In general, greater diversity of soil microbes, including the groups mentioned, is associated with improved soil fertility and higher crop yields<sup>41</sup>, highlighting the importance of microbial communities in sustainable agriculture<sup>42</sup>.

#### Soil microbial biomass carbon

Application of recommended N doses promoted plant growth and biomass production. Greater root biomass under 100% N plots, paved the way for enhancement in biomass and activity of soil microbes in the vicinity of roots. The MBC varied in accordance with crop biomass yield. Improved biomass under N75PK + Nano-N, which was similar compared with 100% N plots, yielded similar values of MBC. On the other hand, there were no negative effect of nano-fertilizer spray on microbiological population, as often questioned upon.

Taxonomic group	Combination of fertilizer application	Number of significant microbes	Scientific name
	N <sub>0</sub> PK vs N <sub>100</sub> PK	0	-
	N <sub>0</sub> PK + Nano-N vs N <sub>75</sub> PK + Nano- N	1	WS2
Phylum	$N_0PK$ + Nano-N + Nano-Zn vs $N_{75}PK$ + Nano-Zn	0	-
	N <sub>50</sub> PK + Nano- N + Nano-Zn vs N <sub>75</sub> PK + Nano- N + Nano-Zn	1	Cyanobacteria
	N <sub>0</sub> PK vs N <sub>100</sub> PK	0	-
	N <sub>0</sub> PK+Nano-N vs N <sub>75</sub> PK+Nano- N	2	Polyangia, WS2
Class	$N_0PK$ + Nano-N + Nano-Zn vs $N_{75}PK$ + Nano-Zn	1	OM190
	N <sub>50</sub> PK + Nano- N + Nano-Zn vs N <sub>75</sub> PK + Nano- N + Nano-Zn	2	Cyanobacteria, JG30_KF_CM66
	N <sub>0</sub> PK vs N <sub>100</sub> PK	0	-
	N <sub>0</sub> PK+Nano-N vs N <sub>75</sub> PK+Nano- N	1	Micrococcales
Order	$N_0PK$ + Nano-N + Nano-Zn vs $N_{75}PK$ + Nano-Zn	0	-
	N <sub>50</sub> PK + Nano- N + Nano-Zn vs N <sub>75</sub> PK + Nano- N + Nano-Zn	0	-
	N <sub>0</sub> PK vs N <sub>100</sub> PK	0	-
	N <sub>0</sub> PK+Nano-N vs N <sub>75</sub> PK+Nano- N	1	Micrococcaceae
Family	$N_0PK$ + Nano-N + Nano-Zn vs $N_{75}PK$ + Nano-Zn	0	-
	N <sub>50</sub> PK + Nano- N + Nano-Zn vs N <sub>75</sub> PK + Nano- N + Nano-Zn	2	Microscillaceae, Xanthomonadaceae
	N <sub>0</sub> PK vs N <sub>100</sub> PK	0	-
	N <sub>0</sub> PK + Nano-N vs N <sub>75</sub> PK + Nano- N	1	Pseudarthrobacter
Genus	$N_0PK$ + Nano-N + Nano-Zn vs $N_{75}PK$ + Nano-Zn	0	-
	N <sub>50</sub> PK + Nano- N + Nano-Zn vs N <sub>75</sub> PK + Nano- N + Nano-Zn	1	Opitutus
	N <sub>0</sub> PK vs N <sub>100</sub> PK	1	Janthinobacterium_sp
	N <sub>0</sub> PK + Nano-N vs N <sub>75</sub> PK + Nano- N	2	Arthrobacter_sp, Stenotropho- monas_sp
Species	N <sub>0</sub> PK + Nano-N + Nano-Zn vs N <sub>75</sub> PK + Nano- Zn	2	Flavobacterium_sp, Janthinobacte- rium_sp
	N <sub>50</sub> PK + Nano- N + Nano-Zn vs N <sub>75</sub> PK + Nano- N + Nano-Zn	1	Unidentified_sp

 Table 4. Effect of treatments on microbial diversity as per different taxonomic group.

# Soil microbial community structure

Application of Nano fertilizer on crops has both beneficial and deleterious effects on microorganisms which directly and indirectly affect the growth and development of plants<sup>43</sup>. The effect of nano fertilizer application on soil microbial diversity was studied by 16S soil metagenome through Ion torrent platform. Obtained sequences were analyzed through QIIME 2. Analysis revealed soil microbial diversity from genus to species level using Shanon index (species diversity), Simpson Index (Species diversity along with evenness of OTU), Chao-1 and ACE indices. Current study showed that crops exhibited more diverse soil microbes along the different combination of treatments. Treatment  $N_0PK$  [W1],  $N_{100}PK$  [W4],  $N_{75}PK$  + Nano-N [W5],  $N_{75}PK$  + Nano-Zn [W6], N<sub>50</sub>PK + Nano-N + Nano-Zn [W7] had no significant differences. On the contrary N0PK + Nano-N [W2], N0PK + Nano-N + Nano-Zn [W3] and N<sub>75</sub>PK + Nano-N + Nano-Zn [W8] had significantly different microbial population as compared to other counterparts. Chao-1 and ACE are non-parametric methods in order to identify rare species. In this observation what it could mean is "what are species that are rare compared to other treatments and uniquely enriched in a specific treatment". A minor observation here was found that in case of samples rhizospheric soil, treatment N100PK [W4] showed more rare species identification by Chao-1 as compared to ACE index. In this study Actinobacteriota significantly differ along the different combination of treatment and similar study was reported by<sup>44</sup> where they found that after the application of single walled carbon nanotube the relative abundance of Proteobacteria and Bacteroidetes increase, whereas abundance of Actinobacteria and Chloroflexi decrease. Similarly, most abundant microbes at class levels were Gammaproteobacteria followed by Alphaproteobacteria, Bacteroidia which is relevant with the findings of You et al. (2018). They concluded that after the application of Zinc oxide (ZnO) nanofertilizers (0.5-2 mg/g), the relative abundance of  $\gamma$ -Proteobacteria, a-Proteobacteria and Bacilli increase. Moreover, the actual abundance of Streptomycetales was also vary across the different combination of treatment at order level. In treatment combination of N75PK + Nano-N [W5], the abundance of Actinobacteria and Streptomycetes was found to be the highest as compared to other treatment combinations. Contrary to above findings Salas-Leiva et al. (2021) revealed that after the application of copper oxide (CuO) nano fertilizer (10-1000 mg/ kg) abundance of Actinobacteria and Acidobacteria were decreases. While after (50 mg/ kg) application of same nano fertilizer the population of Sphingobacterium, Devosia, Pseudomonas, Rhizobium, Pseudoxanthomonas, Shinella, Dyadobacter and Pantoea were increased. These microorganisms improved the nitrogen fixation and reduced denitrification process, resulting in an increase in the photosynthetic activity of plants. Similar contrast study was also reported in metallic silver<sup>45,46</sup>, Copper oxide (CuO)<sup>47,48</sup>, Titanium dioxide (TiO2)<sup>49,50</sup> and Zinc oxide (ZnO)<sup>51,52</sup> nano fertilizers. These study revealed that optimization of these nano fertilizers is very important prior to application in agriculture field.

Cyanobacteria, a gram negative bacteria which was significantly found at phylum level and at class level when there was a reduction of 50% nitrogen and that gap was filled by nano-urea. They actively participate in oxygenic photosynthesis, has a high biomass yield, growth on non-arable lands and a wide variety of water sources (con-taminated and polluted waters), generation of useful by-products and bio-fuels, enhancing the soil fertility<sup>53,54</sup>.

A culture based approach was studied by Dhayalan et al.<sup>55</sup> where they also found the similar result of increased microbial population in the treatment STCR (soil test crop response) based N as Urea (50%) and nano urea (2 sprays) as compared to rest of treatments. Further, effect of Zinc oxide nanofertilizers on microbial community structure was studied by You et al.<sup>56</sup>, and they revealed that after application of this nano fertilizers the relative abundance of *Proteobacteria* and *Bacilli* increased. In contrast to these studies, after the application of copper oxide (CuO)<sup>57</sup> and titanium di oxide (TiO<sub>2</sub>)<sup>49</sup> the relative abundance of *Actinobacteria* and *Acidobacteria* were decreased. Therefore, it is better to optimize these nanofertilizers prior to its application in agriculture fields.

### Conclusion

While fertilizers have greatly aided in increasing food production, their indecorous use has led to a decline in soil biodiversity. Combining nano-N/nano-Zn with traditional NPK fertilizers has been the subject of this research, and it has been found that this strategy can increase soil microbial biomass carbon and change the composition of the soil microbial communities by making it more diverse, all while reducing N usage by about 25% compared to the recommended dosage. These findings imply that nano-fertilizers may be a viable choice for sustainable agriculture due to their potential to cut down on nutrient loss, increase soil microbial diversity, and boost crop yield.

### Data availability

The datasets generated and/or analysed during the current study are available in the [SRA data: PRJNA992358, submission ID: SUB13640894, release date: 2025-07-31] repository, [https://www.ncbi.nlm.nih.gov/sra/PRJNA 992358]".

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# **Author contributions**

P.K.U.: Methodology, statistical analysis, investigation, writing—original draft. A.D.: Methodology, statistical analysis, writing—original draft. V.K.S.: Conceptualization, supervision, writing—review & editing, funding acquisition. B.S.D.: Conceptualization, supervision, writing—review & editing, funding acquisition. R.K.S.: Writing—review & editing, G.A.R.: Statistical analysis and writing—original draft. S.B.: Investigation, formal analysis and writing—original draft. S.B.: Investigation, formal analysis and writing—original draft. S.S.R.: Writing—review & editing. K.S.: Writing—review & editing. P.K.R.: Investigation, writing—original draft. N.K.C.: Statistical analysis of data. N.B.: Review & editing, statistical analysis of data. D.C.M.: Data tabulation and statistical analysis. A.R.: Review & editing. A.S.: Editing. A.K.B.: Review and editing and G.S.: Data tabulation and statistical analysis.

# **Competing interests**

The authors declare no competing interests.

# Additional information

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