

## RESEARCH ARTICLE

# Infection of *Plasmodiophora brassicae* changes the fungal endophyte community of tumourous stem mustard roots as revealed by high-throughput sequencing and culture-dependent methods

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## Abstract

Diverse fungal endophytes live in plants and are shaped by some abiotic and biotic stresses. Plant disease as particular biotic stress possibly gives an impact on the communities of fungal endophytes. In this study, clubroot disease caused by an obligate biotroph protist, *Plasmodiophora brassicae*, was considered to analyze its influence on the fungal endophyte community using an internal transcribed spacer (ITS) through high-throughput sequencing and culture-dependent methods. The results showed that the diversity of the endophyte community in the healthy roots was much higher than the clubroots. Ascomycota was the dominant group of endophytes (*Phoma*, *Mortierella*, *Penicillium*, etc.) in the healthy roots while *P. brassicae* was the dominant taxon in the clubroots. Hierarchical clustering, principal component analysis (PCA), principal coordinates analysis (PCoA) and analysis of similarities (ANOSIM) indicated significant differences between the endophyte communities in the healthy roots and clubroots. Linear discriminant analysis effect size (LefSe) analysis showed that the dominant genera could be regarded as potential biomarkers. The endophyte community in the healthy roots had a more complex network compared with the clubroots. Also, many plant pathogenic *Fusarium* were isolated from the clubroots by the culture-dependent method. The outcome of this study illustrates that *P. brassicae* infection may change the fungal endophyte community associated with the roots of tumourous stem mustard and facilitates the entry of soil pathogen into the roots.

## Introduction

Fungal endophytes have a close relationship with the host plants and they live in their tissues [1,2]. They provide many ecological and physiological advantages to their hosts, such as

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growth promotion [3], resistance to plant pathogens and adaptability to various abiotic stresses such as temperature, pH, and osmotic pressure as well as biotic stresses [4–6]. Similarly, the fungal endophyte communities are also affected by abiotic and biotic stresses [7]. Plant disease as particular biotic stress results in significant changes in the physiology of the plant. These changes and pathogen itself may affect the diversity and composition of the fungal endophyte inhabiting the plant tissues and their interactions with their host plant [8–10].

Clubroot is a severe disease of cruciferous crops such as cabbage and cauliflower, which is caused by the biotrophic *Plasmodiophora brassicae* Woronin [11]. The infected root cells undergo abnormal cell division and enlargement resulting in the formation of spindle-like, spherical, knobby or club-shaped swellings [12]. The root galls significantly alter the morphology, development, and physiology of the diseased plants [13]. Moreover, *P. brassicae* consumes carbohydrates from the viable cells in gall, and make gall into a sink for nutrient substances [14,15].

Tumourous stem mustard (*Brassica juncea* var. *tumida*) is an economically and nutritionally important vegetable crop widely grown in Fuling County, a district in Chongqing Municipality, China. Clubroot is one of the most harmful diseases of tumourous stem mustard causing substantial economic damage [16]. The diseased tumourous stem mustard shows small plants and swollen roots and finally dies due to root rot during the late plant growth stage in the field, although *P. brassicae* is an obligate parasite. Generally, only *P. brassicae* infection does not cause root rot, while the rot symptom might be derived from the infection of others pathogens. The previous study showed that many pathogenic fungi such as *Fusarium* sp. were observed from the clubroots of *Brassica napus* [17]. Therefore, we assume that the infection of *P. brassicae* might alter the community of fungal endophyte in tumourous stem mustard.

To reveal how plant pathogen influence on the fungal endophyte community, the objectives of this study are, (1) to examine the diversity and composition of the fungal endophyte community in the roots of tumourous stem mustard (2) to demonstrate the changes in the community of fungal endophyte in the clubroots of tumourous stem mustard caused by *P. brassicae* compared to healthy roots. Such a study will assist in understanding the response of fungal endophyte community to pathogen infection.

## Materials and methods

### Sample collection

*P. brassicae*-infected tumourous stem mustard roots were obtained from three fields (February 2, 2017) in Fuling (29.21°N, 106.56°E) where clubroot disease was observed during the last 20 years. Roots were collected from the plants at the harvest-stage. The roots were classified as either R (healthy roots, no clubroot symptoms) or C (diseased roots, swollen clubroot symptoms). From one field, 30 plants including 15 R and 15 C samples were randomly selected and formed as one group. By this, three groups contained 90 plants from three fields and were referred to R1, C1, R2, C2, R3, and C3. The roots were washed with tap water to remove the soil particles. The healthy roots with a diameter of 0.5 cm from undiseased plants and clubroot galls with a diameter of 1 cm from diseased plants were cut off, and then sterilized by 70% (v/v) ethanol for 40 s, followed by 4% (w/v) sodium hypochlorite for 60 s, and finally washed three times using sterile distilled water. The surface sterilized healthy roots and galls peeled with a sterilized razor were divided into three portions. One portion was used to extract genomic DNA by cetyltrimethylammonium ammonium bromide (CTAB) DNA extraction method. The concentration and purity of DNA were monitored on 1% agarose gel. One portion was made into paraffin section, dyed with safranin and observed under an optical

microscope. Another portion was used to isolate endophytic fungi by the culture-dependent method.

### Isolation of endophytic fungi and its taxonomic identification

Three types of media, i.e. potato dextrose agar (BD Difco), rose bengal medium (BD Difco), and Czapek medium (BD Difco) were used for the isolation of endophytic fungi. The surface sterilized healthy roots, or clubroot samples were cut into tissue blocks of 5 mm × 5 mm and were planted on a medium at 25°C in the dark. When mycelia appeared, they were transferred into another medium for purification. A total of 156 fungal isolates were then identified based on the ITS sequence data. Mycelia of the fungal isolates were ground with liquid nitrogen in a sterile mortar, and Genomic DNA from all the fungal isolates was extracted using DNA extraction kit (TIANGEN Co. Ltd., Beijing, PR China). The internal transcribed spacer (ITS) region was amplified with universal primers (ITS1 and ITS4) [18]. PCR mixture contained 12 µL of 2 × Taq PCR Mix (TIANGEN Co. Ltd., Beijing, PR China), 1 µL DNA template, 1 µL of each primer and 8 µL double distilled water. The PCR reaction conditions were as follows: initial pre-heating at 94°C for 3 min, 30 cycles of 94°C for 30 s, 58°C for 30 s, 72°C for 30 s, and a final extension at 72°C for 10 min. PCR products were sequenced by 3730 sequencer (Majorbio Tech Co. Ltd., Beijing, PR China). The ITS sequence was aligned in the NCBI database (<http://www.ncbi.nlm.nih.gov/>) using the BLAST program. The highest hits (identity values higher than 97%) were regarded as the taxonomy of fungal isolates. The relative abundances were calculated according to the taxonomy of fungal isolates.

### High-throughput ITS sequencing

ITS fragments as marker genes were amplified by thermocycler PCR system (GeneAmp 9700, ABI, USA) for barcoded pyrosequencing using the primers ITS1F and ITS2R [19], which targeted ITS1 region of the nuclear ribosomal coding cistron. The sequences were ITS1F: 5' - CTTGGTCATTT AGAGGAAGTAA-3' and ITS2R: 5' - GCTGCGTTCTTCATCGATGC-3'. Forward ITS1F primers linked with A-adaptor, a specific 8-bp multiplex identifier (MID) barcode, while the reverse primer carried the B-adaptor. The employed PCR conditions were: 95°C for 2 min (one cycle), 95°C for 30 s, 55°C for 30 s, and 72°C for 30 s (25 cycles), and 72°C for 5 min (one cycle). PCR reactions were performed in triplicate of 20 µL mixture containing 4 µL of 5 × FastPfu Buffer, 2 µL of 2.5 mM dNTPs, 0.8 µL of each primer (5 µM), 0.4 µL of FastPfu Polymerase and 10 ng of template DNA. The resulted PCR products were extracted from a 2% agarose gel and further purified using the AxyPrep DNA Gel Extraction Kit (Axygen Biosciences, Union City, CA, USA) and quantified using QuantiFluorST (Promega, USA) according to the manufacturer's protocol. Purified amplicons were pooled in equimolar and paired-end sequenced (2 × 300) on an Illumina MiSeq platform (Illumina, San Diego, USA) according to the standard protocols by Majorbio Bio-Pharm Technology Co. Ltd. (Shanghai, China).

### Processing of bioinformatics and data analysis

The raw sequences obtained from Illumina MiSeq run were assigned to the appropriate sample based on both barcode and primer sequences. Subsequently, they were processed using the QIIME package (v1.8) [20] to remove low-quality sequences with the following criteria: (i) The reads were truncated at any site receiving an average quality score <20 over a 50 bp sliding window. (ii) Sequences whose overlap being longer than 10 bp were merged according to their overlap with mismatch no more than 2 bp. (iii) Sequences of each sample were separated according to barcodes (exactly matching) and primers (allowing 2 nucleotide mismatching),

and reads containing ambiguous bases were removed. The quality-filtered sequences were used to perform diversity analyses by the bioinformatics analysis pipeline on Majorbio I-Sanger Cloud Platform (<http://www.i-sanger.com>). The taxonomy of each operational taxonomic unit (OTU) representative sequence was performed using Unite (Release 7.2) and ITS of *P. brassicae* under the threshold of 97% identity [21,22]. The Shannon index, Simpson index, and rarefaction curves were calculated to evaluate the  $\alpha$ -diversity. The relative abundance of endophyte was calculated at phylum, genus and OTU levels. Analysis of variance (ANOVA) of the Shannon index, Simpson index and the observed OTUs richness were obtained by SPSS 16.0 and the relative abundance was used to assess the differences in the endophyte communities between the healthy roots and clubroots. For the evaluation of  $\beta$ -diversity, hierarchical cluster dendrograms (Bray-Curtis distance dissimilarities) were constructed according to the composition of OTU [23]. An unweighted UniFrac principal component analysis (PCA), Principal coordinates analysis (PCoA) and Analysis of Similarity (ANOSIM) were performed using R 3.1.1 statistical software to analyze significant differences in the communities between the healthy roots and clubroots [24]. The differentially abundant genera between the healthy roots and clubroots were identified for finding the biomarker by Discriminant Analysis Effect Size (LEfSe) software [25]. To analyze the co-occurrence of OTUs with relatively high abundance, network analysis was conducted to reveal the relationship among the top 30 OTUs within the endophyte communities by Networkx software based on Pearson's rank correlation coefficients [26].

## Results

### Symptoms of clubroot and detection of *P. brassicae*

Healthy roots were not swollen, and the lateral roots appeared normal, whereas clubroots were swollen and few lateral roots were observed (Fig 1A). Abundant resting spores were found to be in the cells of clubroots (Fig 1B), but no resting spores were observed in the healthy roots (Fig 1C).

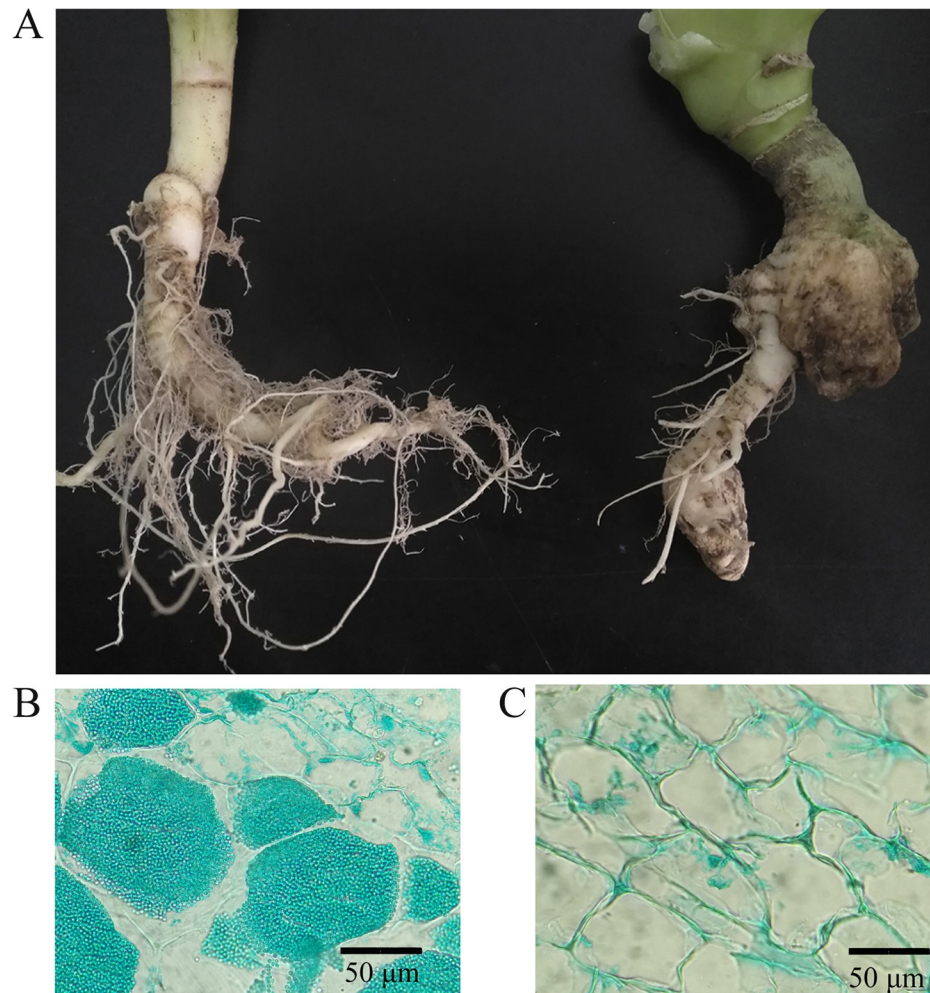
### Analysis of $\alpha$ -diversity

High-quality sequences of ITS were produced by the Miseq platform. The raw sequencing data for ITS sequencing were deposited at the Sequence Read Archive (SRA, <https://www.ncbi.nlm.nih.gov/sra>) under an accession number, SRP136514. The number of sequences ranged from 30448 to 60474, and the mean length of sequences ranged from 200.842 to 277.035 (S1 Table). According to the taxonomy of the sequence and abundance (S2 Table), the composition of the endophyte communities was analyzed. Rarefaction curves analysis confirmed that the number of observed OTUs increased asymptotically with an increase in the reads (Fig 2A). The higher Shannon index, Simpson index and the observed OTUs richness of the endophyte community were observed in the healthy roots than that in the clubroots (Fig 2B, 2C and 2D), suggesting a higher diversity of the endophyte community in the healthy roots.

Ascomycota was the dominant fungal group (a relative sequence abundance ranging from 76.3 to 78.5%) in the endophyte community within the healthy roots followed by Zygomycota (RSA, 15.5 to 19.9%). Cercozoa (RSA, 92.0 to 94.3%) not belonged to fungi but was the majority of the sequences from the clubroots, followed by Ascomycota (RSA, 5.6 to 7.6%) (Fig 3A). The abundance of Basidiomycota and unclassified endophytic fungi was higher in the healthy roots compared to clubroots.

At the genus level, a total of 35 and 23 genera were detected in the healthy roots and clubroots, respectively. In the healthy roots, *Phoma* was the dominant genus with an RSA of 19.15%, followed by *Mortierella* (17.09%), *Penicillium* (11.49%), *Pseudallescheria* (10.75%),





**Fig 1. Healthy roots and clubroots of tumorous stem mustard caused by the infection of *P. brassicae*.** (A) roots of a healthy plant (left) and a diseased plant (right) (B) resting spores (pots) in the root cells of clubroots coloured with fast green (C) the cell of healthy roots.

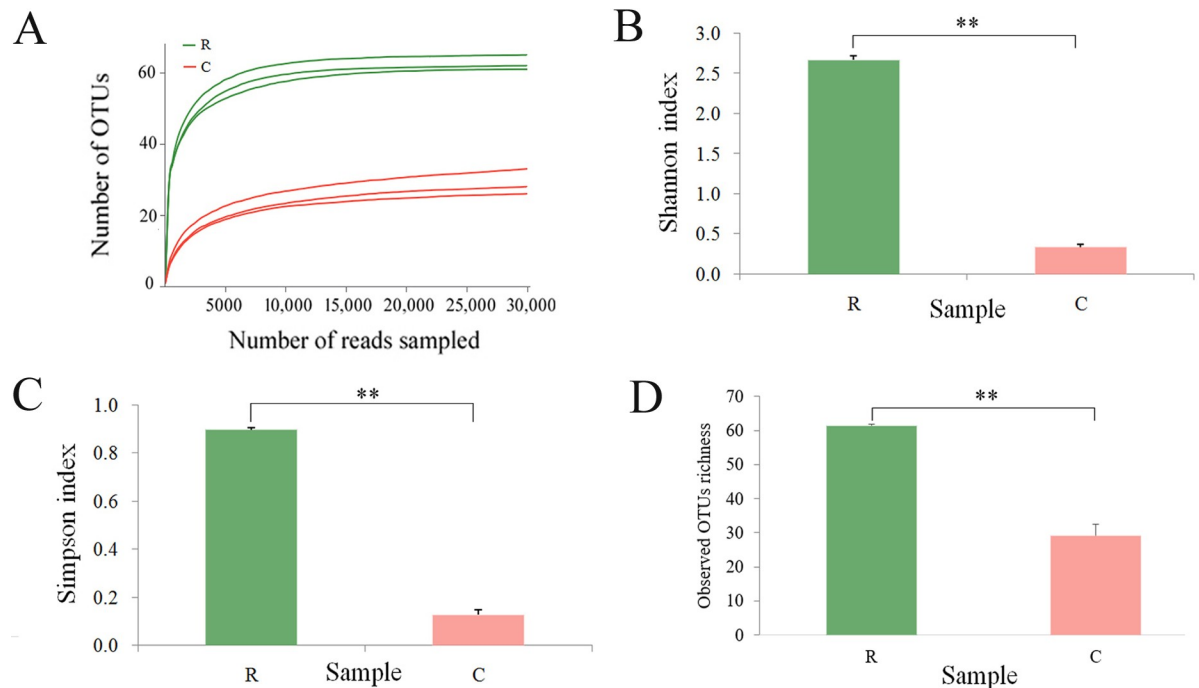
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*Tetracladium* (9.98%), and *Fusarium* (7.88%) (Fig 3B). In the clubroots, *Plasmodiophora* was the dominant taxon with 93.28% (Fig 3B). Circos figure confirmed that *Plasmodiophora* was the most abundant and was found to be only in the clubroots, whereas *Phoma*, *Mortierella*, and *Penicillium* were predominant in the healthy roots (Fig 3C).

A total of 63 and 36 OTUs were observed in the healthy roots and clubroots, respectively. Heatmap showed that OTU268 (*Plasmodiophora*) was dominant in the endophyte community associated with clubroots, whereas OTU106 (*Phoma*), OTU153 (*Mortierella*), OTU192 (*Penicillium*), OTU197 (unclassified Ascomycota), OTU114 (*Tetracladium*), OTU126 (*Pochonia*), and OTU185 (*Fusarium*) dominated in the healthy roots (S1 Fig).

### Analysis of $\beta$ -diversity

Hierarchical clustering analysis based on Bray-Curtis distance dissimilarities revealed that the endophyte communities in the healthy roots and clubroots clustered in the two branches (Fig 4A). UniFrac-weighted PCA based on the composition of OTU showed variations between the healthy roots and clubroots with the first two axes indicating 81.08 and 11.71% of the total



**Fig 2. Rarefaction curves (A), Shannon index (B), Simpson index (C) and observed OTUs richness (D) of the endophyte communities associated with the healthy roots and clubroots of tumorous stem mustard infected with *P. brassicae*.** R, healthy roots. C, clubroots. \*\* differences at 0.01 level.

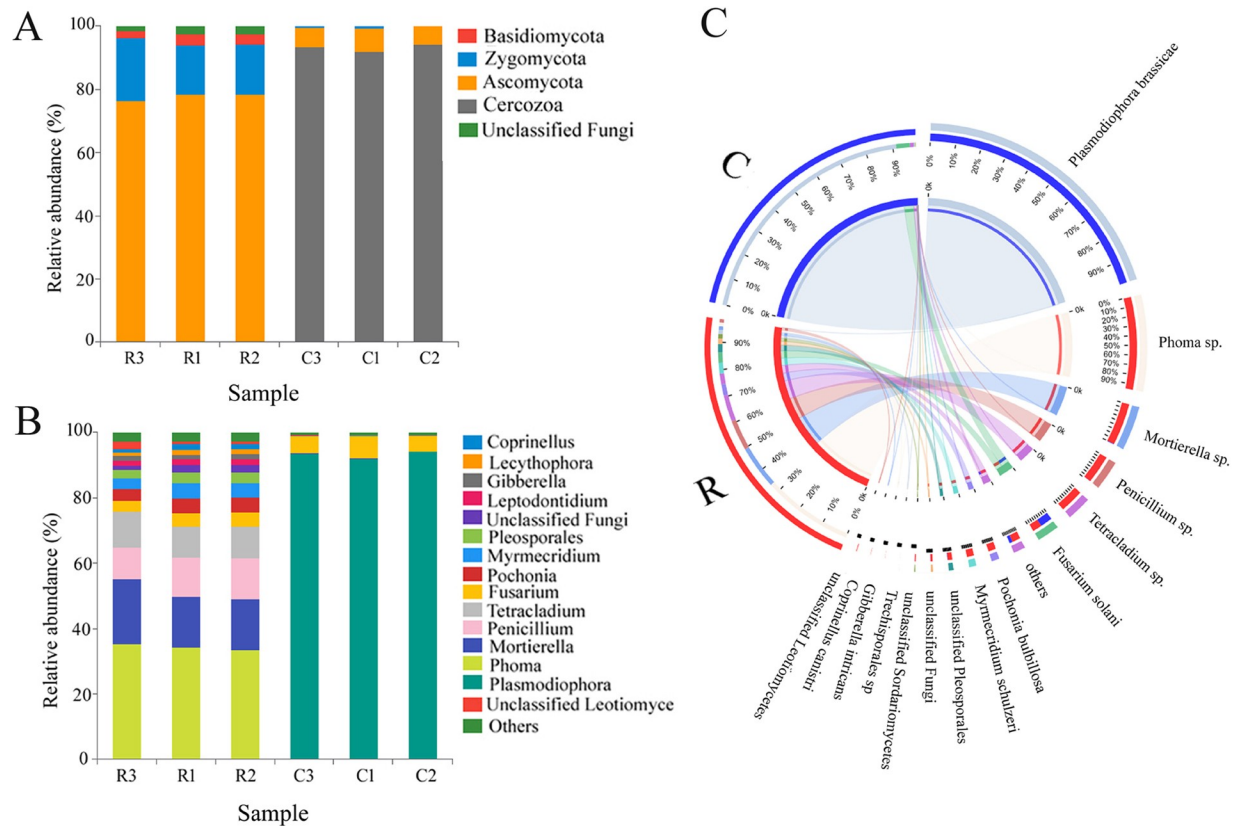
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variations (Fig 4B). PCoA plot also clearly demonstrated similar results of PCA with the first two axes showing 99.34 and 0.62% of the total variations (Fig 4C). The endophyte community in the healthy roots was clustered on the right side of the PCA and PCoA plot while the endophyte community in the clubroots was clustered on the left side, indicating a clear separation between the endophyte community in R and C samples. ANOSIM results confirmed that the endophyte community in R and C samples were significantly different ( $R = 0.946$ ,  $P = 0.012$ ; Fig 4D).

From the results of LEfSe, significantly different taxa were found out between the two communities. At the genus level, *Phoma*, *Mortierella*, *Penicillium*, unclassified Pleosporales, etc. were enriched in the healthy root samples (Fig 5A), and abundant *Plasmodiophora* in the clubroot samples possessed high values of linear discriminant analysis (LDA) (Fig 5B). These taxa with different abundance can be regarded as potential biomarkers ( $LDA > 3$ ,  $P < 0.05$ ). Furthermore, 15 most abundant genera of the two endophyte communities were compared by Student's t-test, where significant differences were observed (S2 Fig). For instance, *Plasmodiophora* was significantly more abundant in the clubroots while all other genera except *Fusarium* were significantly more abundant in the healthy roots.

### Network analysis

The endophyte community in the healthy roots had two centers with a complex network structure (28 nodes and 336 edges) (Fig 6A) while the endophyte community in the clubroots had three centers with a less complex network structure (18 nodes and 161 edges) (Fig 6B). Most of the nodes belonged to Ascomycota in both the healthy roots and clubroots networks and had the highest number of correlations with other taxa. The node of the Cercozoa (i.e., *Plasmodiophora*) only appeared in the clubroot network and had the highest percentage. When the



**Fig 3. Relative sequence abundance (%) of the endophyte at phylum (a), genus (B) and Circos figure at the genus level (C) in the healthy roots and clubroots of tumorous stem mustard infected with *P. brassicae*.** R, healthy roots. C, clubroots.

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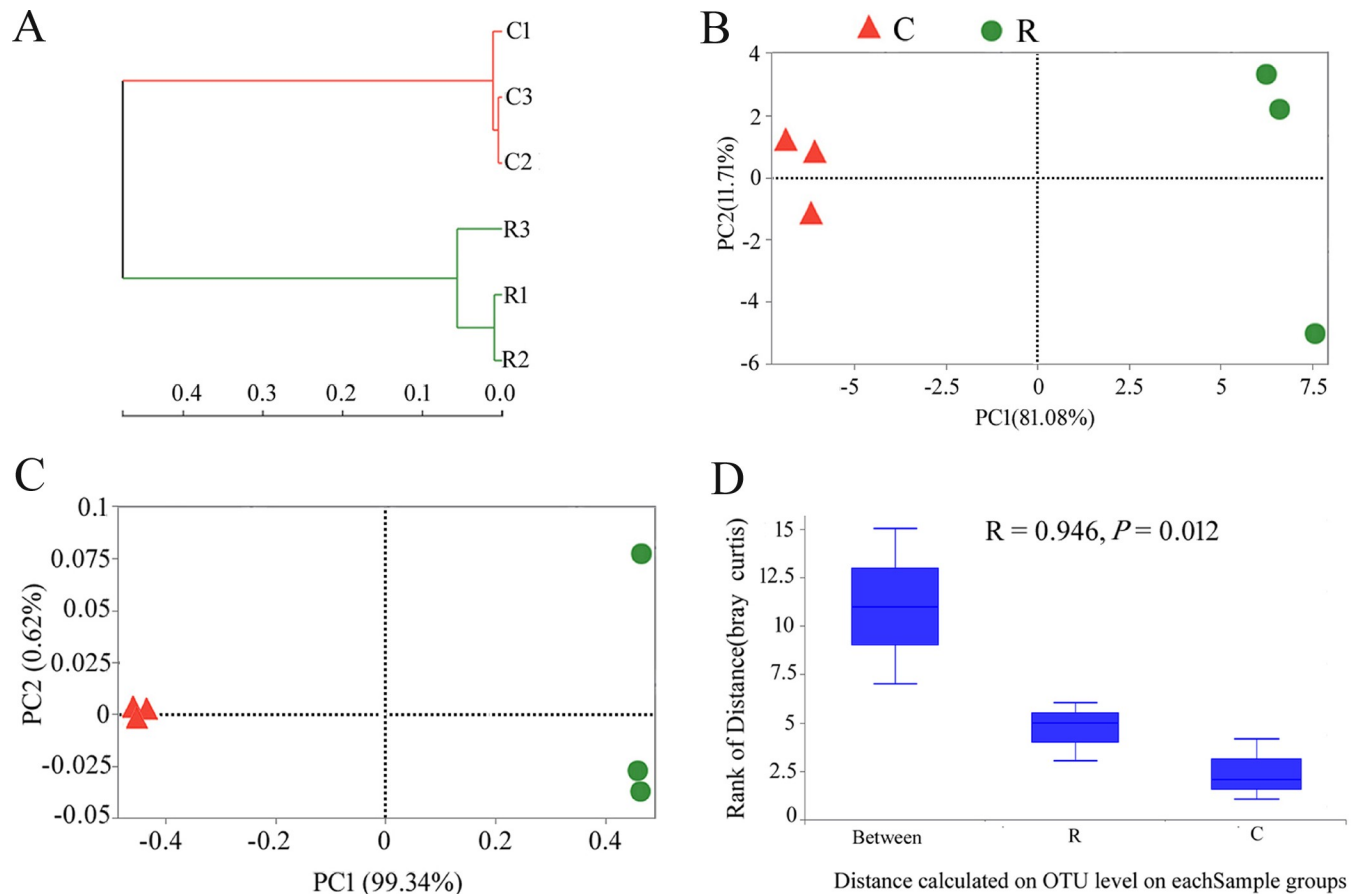
relationship between *Plasmodiophora* and other fungi was analyzed, it was found that 10 OTUs had a significant correlation with *Plasmodiophora* (3 OTUs had a positive correlation, and 7 OTUs had negative correlation) (S3 Table).

### Culturable endophytic fungi

The same samples for Miseq sequencing were also used to isolate endophytic fungi by the culture-dependent method. At the genus level, *Mortierella*, *Sarocladium*, *Phoma*, *Penicillium*, *Plectosphaerella*, and *Fusarium* were obtained (Fig 7A). *Fusarium* (a relative abundance of 81.4%) was the predominant group in the clubroots, among which the following were present: *F. graminearum* (RA, 5.5%), *F. oxysporum* (RA, 28.8%), *F. solani* (RA, 24.0%), *F. asiaticum* (RA, 8.2%), and *Fusarium* sp. (RA 14.4%). In the healthy roots, *Mortierella* was the leading group with an RA of 36.2% followed by *Phoma*, *Penicillium*, *Fusarium*, etc. (Fig 7B).

### Discussion

In this study, a high diversity of fungal endophyte in the healthy roots of tumorous stem mustard has been found out using high-throughput sequencing. Our results agree with the early reports that the plants can harbor a diversity of endophytic fungi in their healthy tissues, especially in the root system which is considered to be the most suitable habitat for endophytic fungi [27,28]. Ascomycota is reported to be the most common group of endophytic fungi [29], suggesting that they are suitable for the ecological niche of plant tissue. Zhao also reported



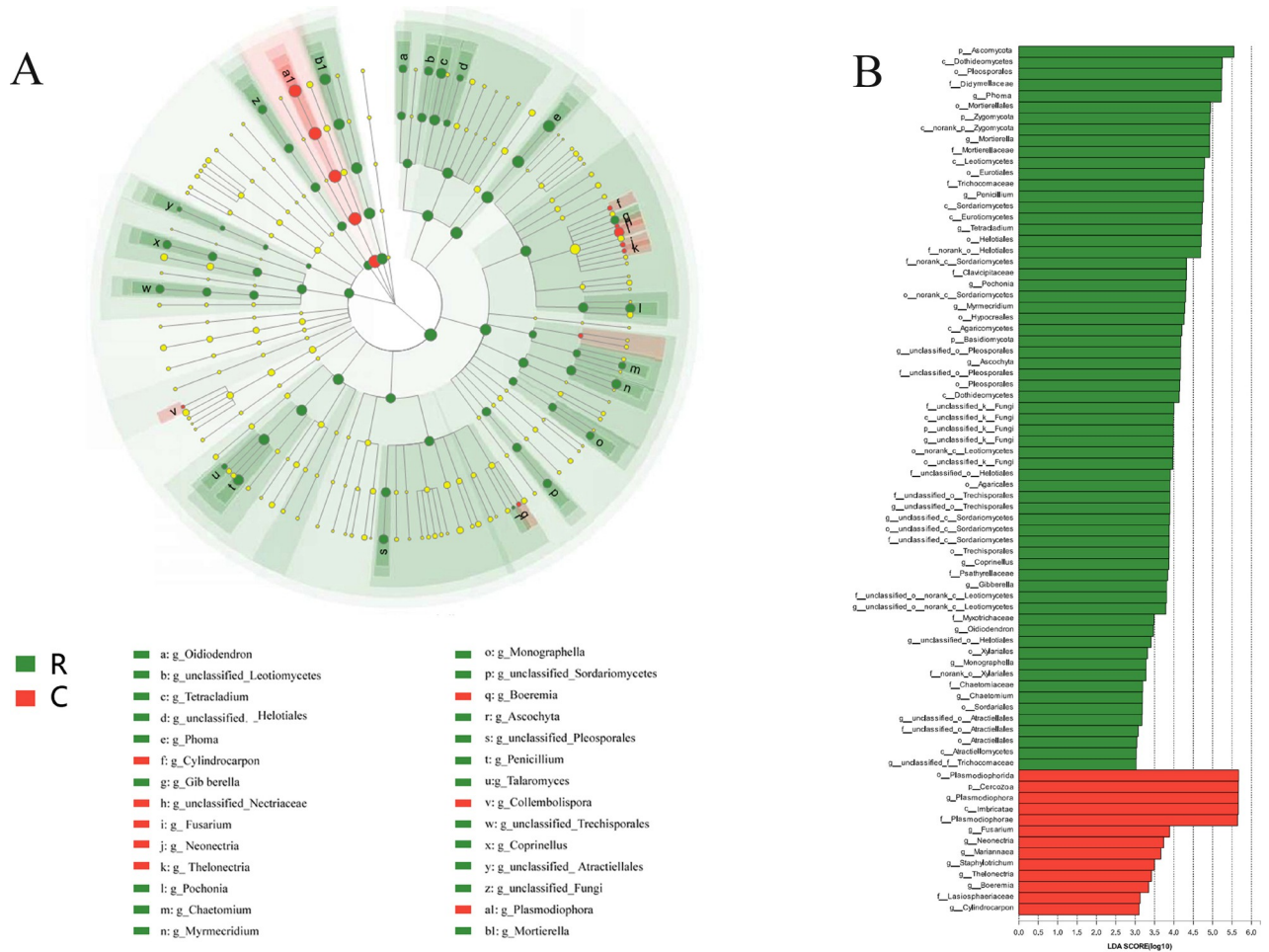
**Fig 4. Hierarchical clustering analysis (A), UniFrac-weighted PCA (B), PCoA (C) and ANOSIM (D) of the endophyte communities associated with the healthy roots and clubroots of tumourous stem mustard infected with *P. brassicae*. R, healthy roots. C, clubroots.**

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Ascomycota as the dominant group of endophytic fungi in the roots of oilseed rape (*Brassica napus*) [17]. Also in this study, Ascomycota is the dominant taxon in the healthy roots of tumourous stem mustard. In the phylum Ascomycota, *Phoma*, *Mortierella*, *Penicillium*, and *Fusarium* were the common fungal genera in the healthy roots of tumourous stem mustard. Arie et al. reported that *Phoma glomerata* produces epoxydon and inhibits clubroot disease, demonstrating that *Phoma* in the healthy roots of tumourous stem mustard may accomplish a similar function [30,31]. *Mortierella* was also detected in the roots of oilseed rape using high-throughput sequencing [17]. Melo et al. confirmed that the endophytic *M. alpina* in the moss *Schistidium antarctici* produces antibiotics, antioxidants, and polyunsaturated fatty acids, which improve the environmental suitability of the plant host [32]. Wani et al. also found that endophytic *M. alpina* promotes the biosynthesis of Crocus apocarotenoid and enhances environmental stress tolerance [33]. These results reflect that the endophytic *Mortierella* is a benefit to the plant, which indicates that *Mortierella* in tumourous stem mustard is beneficial to the host. Marinho et al. and Lin et al. both reported that endophytic *Penicillium* produces active polyketides [34,35], reflecting that *Penicillium* in tumourous stem mustard may produce similar substances.

Worldwide *Fusarium* is considered to be one of the most ubiquitous groups of fungi which can survive in a wide range of plants, environments, and climates [36]. In this study, some OTUs identified as *Fusarium* had a relatively high abundance in both the healthy roots and

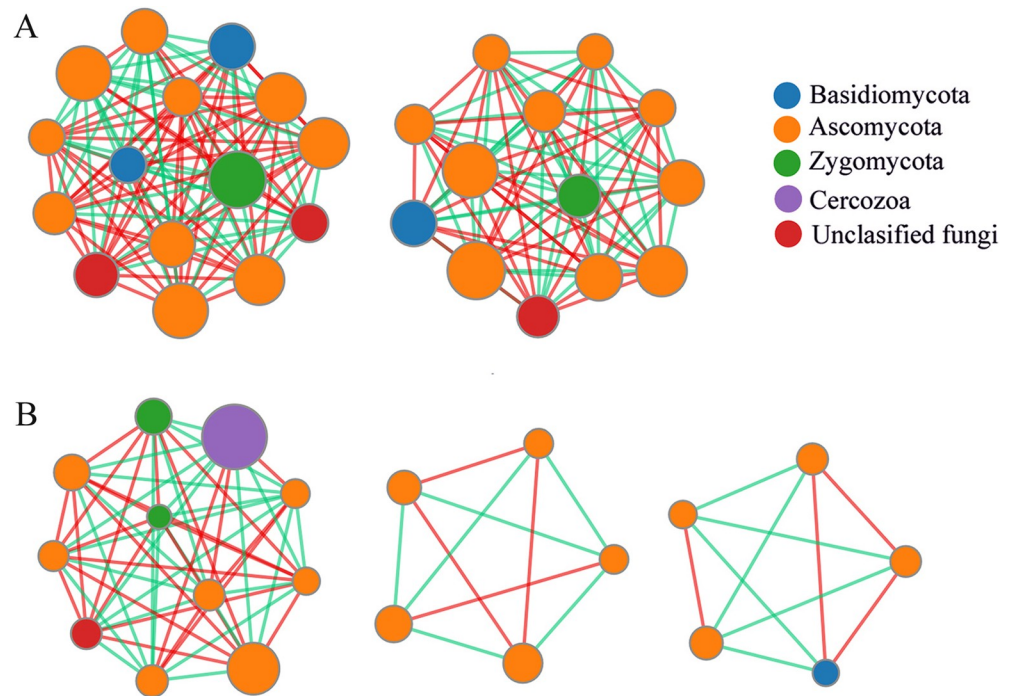




**Fig 5. LefSe analysis (A) The cladogram diagram shows the taxa with marked differences in the two endophyte communities. Red and green indicate different groups, with the classification of taxa at the level of phylum, class, order, family, and genus shown from inside to the outside. The red and green nodes in the phylogenetic tree represent taxa that play an important role in the two endophyte communities, respectively. Yellow nodes represent taxa with no significant difference. (B) Species with the significant difference that have an LDA score higher than the estimated value; the default score is 3.0. The length of the histogram represents the LDA score; i.e., the degree of influence of taxa with a significant difference between different groups. R, healthy roots. C, clubroots.**

<https://doi.org/10.1371/journal.pone.0214975.g005>

clubroots, reflecting the dominant presence of *Fusarium* in tumorous stem mustard. Previous studies show that most of the *Fusarium* species are nonpathogenic while only a small number are pathogenic [37]. Some OTU identified as *Fusarium* in the healthy roots perhaps were non-pathogenic because of the absence of wilt symptoms. OTU244 and OTU287 assigned as *F. solani*, a common soil-borne pathogen, were only and mainly found in the clubroots and these populations may be pathogenic. Moreover, *F. solani* is the most fungal isolate obtained by the culture-dependent method (Fig 7A). Also, other pathogenic *Fusarium* such as *F. graminearum*, *F. oxysporum*, and *F. asiaticum* also isolated from the clubroots rather than the healthy roots, suggesting that *Plasmodiophora* infection many facilitate *Fusarium* to enter into the diseased roots. The presence of a plenty of pathogenic *Fusarium* in the clubroots maybe the reason for the death of tumorous stem mustard during the late plant growth stage in the field. In clubroots, *Plasmodiophora* was the extremely abundant genus, although not belonging to fungi, amplified by PCR with ITS primers for fungi and other eukaryotes. Zhao et al. also found that



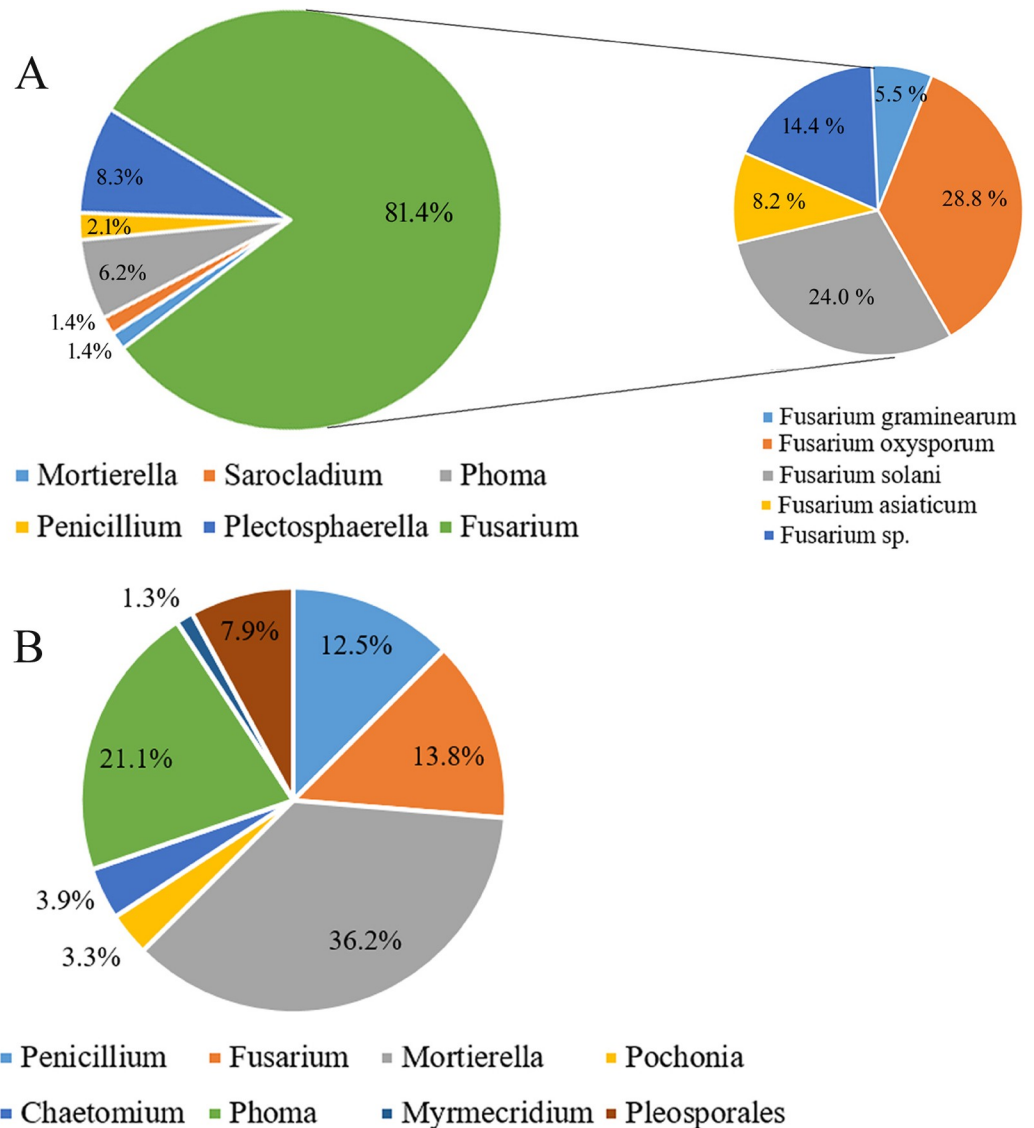
**Fig 6. Co-occurrence network analysis of the two endophyte communities within the healthy roots and clubroots of tumorous stem mustard infected with *P. brassicae* (A) Healthy roots (B) Clubroots.** Each node represents taxa affiliated at the OTU level, and the size of the nodes represents an average abundance of OTU. The lines represent the connections between each OTU. A red line indicates a positive correlation, whereas a green line indicates a negative correlation.

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*Plasmodiophora* mainly enriched in the clubroots of *Brassica napus* by high throughput sequencing using the same primers [17].

In general, the healthy plant tissues harbor a more diverse community of endophytic fungi than diseased plant tissues [17,38]. Also, the endophyte community in the healthy roots of tumorous stem mustard had significantly higher Shannon and Simpson indices compared with the clubroots. Also, a higher number of genera and OTUs were obtained from the healthy roots than from the clubroots. The endophyte communities in the healthy roots and clubroots also differed in the  $\alpha$ - and  $\beta$ -diversity. The marked difference in the composition of the endophyte community at the genus level between the healthy roots and clubroots as revealed by LEfSe and Student's t-test showed that the dominant genera as biomarkers caused differences in the two communities. This substantial discrimination in the dominant genera was derived from the infection of *P. brassicae*. Pathogens may compete with the endophytic fungi for space and nutrients in the same niche within the plant tissue [39]. We presume that a decrease in the diversity of the fungal endophyte community in the clubroots of tumorous stem mustard has two causes. First, the physiological changes and the formation of clubroots induced by *P. brassicae* may affect the availability of nutrients for endophytes. Second, in clubroots, the resting spores of *P. brassicae* are produced in the galls of diseased plants and may fill the gall cells. This may restrict the available space for the endophytes. The phenomenon of a decrease in the diversity of endophytic fungi has been observed in many diseased plant species [17,40,41].

In this study, some plant pathogenic fungi were detected from the clubroots, such as *F. solani*, but not from the healthy roots of tumorous stem mustard. Similarly, Zhao et al. isolated many soil-borne pathogenic fungi, including *Fusarium*, *Gibberella*, *Alternaria*,



**Fig 7. The endophytic fungi isolated from the clubroots (A) and healthy roots (B) by the culture-dependent method.**  
<https://doi.org/10.1371/journal.pone.0214975.g007>

*Sclerotinia*, *Leptosphaeria*, and *Cylindrocarpon*, from the oilseed rape roots infected with *P. brassicae* [17]. This multi-species aggregation involving *P. brassicae* and other pathogenic fungi is similar to disease complexes containing plant-parasitic nematodes and soil-borne pathogens [42]. The cuticle of clubroots is cracked, thereby providing entry points for pathogens, even for opportunistic pathogens. Additionally, the cracked cuticle aggravates the leaking of nutrients, such as amino acids and carbohydrates, into the rhizosphere soil which may attract soil-borne pathogens and increase the risk of infection by these pathogens [43]. Root-knot nematodes may form disease complexes with *Fusarium* species such as *F. oxysporum* and *F. solani* [44]. In this study, the abundant presence of *F. solani* in the clubroots indicates that this pathogen and *P. brassicae* may form a disease complex, which may make it more difficult to control the clubroot disease. Further studies are necessary to clarify the possible existence of this disease complex. Besides, fungi such as *C. cupreum*, *Phoma* sp. *Pochonia* sp. and

*Myrmecridium schulzeri* were harvested and were reported as biocontrol fungi [45–47], reflecting that these fungi may help the host to resist the infection of *P. brassicae*.

Endophytic fungi in the plants must deal with many interactions and build a balanced network [48]. In this study, the endophyte community network in the healthy roots of tumourous stem mustard was observed to be more complicated than in the clubroots, indicating a balanced network of interactions among the fungal endophyte community in the healthy roots. In the clubroots, *P. brassicae* dominated the endophyte community which was out of balance showing a weak network of interactions. In general, endophytes are more diverse and abundant than the pathogens in a healthy plant microbiome, and *vice versa* in a diseased plant microbiome [49].

## Conclusions

In conclusion, the obtained data from this study showed that the fungal endophyte community in the clubroots are markedly different from the healthy roots in terms of alpha and beta diversity, suggesting that the infection of *P. brassicae* changes the fungal endophyte community in tumourous stem mustard roots. Future work should involve identifying the pathogenicity of *F. oxysporum* and *F. solani* on tumourous stem mustard. Moreover, in the evaluation some endophytic fungi with biocontrol activity against *P. brassicae* could also be considered in the evaluation.

## Supporting information

**S1 Fig. Heatmap of the 50 most abundant OTU from R and C samples.** R, healthy roots; C, clubroots.

(JPG)

**S2 Fig. Student's t-test bar plot of the endophyte communities at the genus level in the healthy roots and clubroots of tumourous stem mustard infected with *P. brassicae*.**

$p < 0.05^*$ ,  $p < 0.01^{**}$ ,  $p < 0.001^{***}$ . R, healthy roots. C, clubroots.

(JPG)

**S1 Table. Sequence information of each sample.** R, healthy roots. C, clubroots.

(DOCX)

**S2 Table. Taxonomy and distribution of the OTUs.** Taxonomy at Phylum, Class, Order, Family, Genus, Species, and OTU level. R, Healthy roots. C, Clubroots. The number in the table cell is the number of sequences of each OTU.

(XLSX)

**S3 Table. Pearson's correlation relationships between *Plasmodiophora* and OTUs showed in network.**

(DOCX)

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## References

1. Douanla-Meli C, Langer E. Diversity and molecular phylogeny of fungal endophytes associated with *Diospyros crassiflora*. *Mycology*. 2012; 3(3):175–187.
2. Tadych M, Bergen M, Johnson-Cicalese J, Polashock J, Vorsa N, White J. Endophytic and pathogenic fungi of developing cranberry ovaries from flower to mature fruit: diversity and succession. *Fungal Diversity*. 2012; 54:101e16.
3. Waqas M, Khan AL, Kamran M, Hamayun M, Kang S-M, Kim Y-H, et al. Endophytic fungi produce gibberellins and indoleacetic acid and promotes host-plant growth during stress. *Molecules*. 2012; 17:10754–10773. <https://doi.org/10.3390/molecules170910754> PMID: 22960869
4. Rodriguez RJ, Henson J, Van Volkenburgh I, Hoy M, Wright L, Beckwith F, et al. Stress tolerance in plants via habitat-adapted symbiosis. *The ISME Journal*. 2008; 2:404–416. <https://doi.org/10.1038/ismej.2007.106> PMID: 18256707
5. Hanada R, Pomella A, Costa H, Bezerra JL, Loguercio L, Pereira J. Endophytic fungal diversity in *Theobroma cacao* (cacao) and *T. grandiflorum* (cupuaçu) trees and their potential for growth promotion and biocontrol of black-pod disease. *Fungal Biol*. 2010; 114:901–910. <https://doi.org/10.1016/j.funbio.2010.08.006> PMID: 21036333
6. Strobel GA, Daisy B, Castillo U, Harper J. Natural products from endophytic microorganisms. *Journal of natural products*. 2004; 67:257–268. <https://doi.org/10.1021/np030397v> PMID: 14987067
7. Saikkonen K, Faeth S, Helander M, Sullivan T. Fungal endophytes: a continuum of interactions with host plants. *Appl Microbiol Biotechnol*. 1998; 29:319–343.
8. Ghimire S, Charlton N, Bell J, Krishnamurthy Y, Craven K. Biodiversity of fungal endophyte communities inhabiting switchgrass (*Panicum virgatum* L.) growing in the native tallgrass prairie of northern Oklahoma. *Fungal Diversity*. 2011; 47:19e27.
9. Kriel WM, Wijnand JS, Pedro WC. Foliar endophytes and their interactions with host plants, with specific reference to the gymnospermae. *Advances in Botanical Research*. 2000; 33:1–34.
10. Zhang D, Nagabhyru P, Schardl C. Regulation of a chemical defense against herbivory produced by symbiotic fungi in grass plants. *Plant Physiology* 2009; 150:1072e82.
11. Dixon GR. The occurrence and economic impact of *Plasmodiophora brassicae* and clubroot disease. *Journal of Plant Growth Regulation*. 2009; 28(3):194–202.
12. Kageyama K, Asano T. Life cycle of *Plasmodiophora brassicae*. *Journal of Plant Growth Regulation*. 2009; 28(3):203–211.
13. Malinowski R, Smith JA, Fleming AJ, Scholes JD, Rolfe SA. Gall formation in clubroot-infected Arabidopsis results from an increase in existing meristematic activities of the host but is not essential for the completion of the pathogen life cycle. *The Plant Journal*. 2012; 71(2):226–238. <https://doi.org/10.1111/j.1365-3113.2012.04983.x> PMID: 22394393
14. Ludwig-Müller J, Prinsen E, Rolfe SA, Scholes JD. Metabolism and plant hormone action during clubroot disease. *Journal of Plant Growth Regulation*. 2009; 28(3):229–234.



15. Ludwig-Müller J, Schuller A. What can we learn from clubroots: alterations in host roots and hormone homeostasis caused by *Plasmodiophora brassicae*. *European Journal of Plant Pathology*. 2008; 121(3):291–302.
16. Chai AL, Xie XW, Shi YX, Li BJ. Research status of clubroot (*Plasmodiophora brassicae*) on cruciferous crops in China. *Canadian Journal of Plant Pathology*. 2014; 36(sup1):142–153.
17. Zhao Y, Gao Z, Tian B, Bi K, Chen T, Liu H, et al. Endosphere microbiome comparison between symptomatic and asymptomatic roots of *Brassica napus* infected with *Plasmodiophora brassicae*. *PLoS one*. 2017; 12(10):e0185907. <https://doi.org/10.1371/journal.pone.0185907> PMID: 29065162
18. Gardes M, Bruns T. ITS primers with enhanced specificity for basidiomycetes—application to the identification of mycorrhizae and rusts. *Molecular Ecology* 1993; 2: 113–118. PMID: 8180733
19. Adams RI, Miletto M, Taylor JW, Bruns TD. Dispersal in microbes: fungi in indoor air are dominated by outdoor air and show dispersal limitation at short distances. *The ISME Journal*. 2013; 7:1262–1273. <https://doi.org/10.1038/ismej.2013.28> PMID: 23426013
20. Bokulich NA, Subramanian S, Faith JJ, Gevers D, Gordon JI, Knight R, et al. Quality-filtering vastly improves diversity estimates from Illumina amplicon sequencing. *Nat Methods*. 2013; 10(1):57–59. <https://doi.org/10.1038/nmeth.2276> PMID: 23202435
21. Fish J, Chai B, Wang Q, Sun Y, Brown CT, Tiedje J, et al. FunGene: the functional gene pipeline and repository. *Frontiers in Microbiology*. 2013; 4:291. <https://doi.org/10.3389/fmicb.2013.00291> PMID: 24101916
22. Rieko N, Ai K, Hiroharu M, Shuhei T, Tatsuhiro E. Complete structure of nuclear rDNA of the obligate plant parasite *Plasmodiophora brassicae*: intraspecific polymorphisms in the exon and group I intron of the large subunit rDNA. *Protist*. 2011; 162(3):423–434. <https://doi.org/10.1016/j.protis.2011.02.005> PMID: 21497131
23. Wang Q, Garrity G, Tiedje J, Cole J. Naive Bayesian classifier for rapid assignment of rRNA sequences into the new bacterial taxonomy. *Appl Environ Microbiol*. 2007; 73:5261–5267. <https://doi.org/10.1128/AEM.00062-07> PMID: 17586664
24. Yu Z, He Z, Tao X, Zhou J, Yang Y, Zhao M, et al. The shifts of sediment microbial community phylogenetic and functional structures during chromium (VI) reduction. *Ecotoxicology*. 2016; 25(10):1759–1770. <https://doi.org/10.1007/s10646-016-1719-6> PMID: 27637513
25. Segata N, Izard J, Waldron L, Gevers D, Miropolsky L, Garrett WS, et al. Metagenomic biomarker discovery and explanation. *Genome biology*. 2011; 12(6):R60. <https://doi.org/10.1186/gb-2011-12-6-r60> PMID: 21702898
26. Andrew E, Elizabeth L, Alan W, Gesine R, Felix R-T. Exploring network structure, dynamics, and function using NetworkX. *Bioinformatics*. 2018 34(1):64–71. <https://doi.org/10.1093/bioinformatics/btx419>
27. Chadha N, Mishra M, Prasad R, Varma A. Root endophytic fungi: research update. *Journal of Biology and Life Science*. 2014; 5(2):135–158.
28. Glynou K, Ali T, Buch AK, Haghi Kia S, Ploch S, Xia X, et al. The local environment determines the assembly of root endophytic fungi at a continental scale. *Environmental microbiology*. 2016; 18(8):2418–2434. <https://doi.org/10.1111/1462-2920.13112> PMID: 26530450
29. Angelini P, Rubini A, Gigante D, Reale L, Pagiotti R, Venanzoni R. The endophytic fungal communities associated with the leaves and roots of the common reed (*Phragmites australis*) in Lake Trasimeno (Perugia, Italy) in declining and healthy stands. *Fungal Ecol*. 2012; 5(6):683–693.
30. Arie T, Kobayashi Y, Kono Y, Gen O, Yamaguchi I. Control of clubroot of crucifers by *Phoma glomerata* and its product epoxydon. *Pestic Sci*. 1999; 55:602–604.
31. Arie T, Kobayashi Y, Okada G, Kono Y, Yamaguchi I. Control of soilborne clubroot disease of cruciferous plants by epoxydon from *Phoma glomerata*. *Plant Pathol*. 1998; 47:743–748.
32. Melo IS, Santos SN, Rosa LH, Parma MM, Silva LJ, Queiroz SC, et al. Isolation and biological activities of an endophytic *Mortierella alpina* strain from the Antarctic moss *Schistidium antarctici*. *Extremophiles*. 2014; 18(1):15–23. <https://doi.org/10.1007/s00792-013-0588-7> PMID: 24126742
33. Wani ZA, Kumar A, Sultan P, Bindu K, Riyaz-Ul-Hassan S, Ashraf N. *Mortierella alpina* CS10E4, an oleaginous fungal endophyte of *Crocus sativus* L. enhances apocarotenoid biosynthesis and stress tolerance in the host plant. *Scientific reports*. 2017; 17(1):8598.
34. Lin Z, Zhu T, Fang Y, Gu Q, Zhu W. Polyketides from *Penicillium* sp. JP-1, an endophytic fungus associated with the mangrove plant *Aegiceras corniculatum*. *Phytochemistry*. 2008; 69(5):1273–1278. <https://doi.org/10.1016/j.phytochem.2007.10.030> PMID: 18067932
35. Marinho AM, Rodrigues-Filho E, Moitinho MDL, Santos LS. Biologically active polyketides produced by *Penicillium janthinellum* isolated as an endophytic fungus from fruits of *Melia azedarach*. *Journal of the Brazilian Chemical Society*. 2005; 16(2):280–283.

36. Summerell BA, Laurence MH, Liew EC, Leslie JF. Biogeography and phylogeography of *Fusarium*: a review. *Fungal Diversity*. 2010; 44(1):3–13.
37. Lori G, Edel-Hermann V, Gautheron N, Alabouvette C. Genetic diversity of pathogenic and nonpathogenic populations of *Fusarium oxysporum* isolated from carnation fields in Argentina. *Phytopathology*. 2004; 94:661–668. <https://doi.org/10.1094/PHYTO.2004.94.6.661> PMID: 18943491
38. Douanla-Meli C, Langer E, Mouafo FT. Fungal endophyte diversity and community patterns in healthy and yellowing leaves of *Citrus limon*. *Fungal Ecol*. 2013; 6:212–222.
39. Kayano Y, Tanaka A, Takemoto D. Two closely related Rho GTPases, Cdc42 and RacA, of the endophytic fungus *Epichloë festucae* have contrasting roles for ROS production and symbiotic infection synchronized with the host plant. *PLoS pathogens*. 2018; 14(1):e1006840. <https://doi.org/10.1371/journal.ppat.1006840> PMID: 29370294
40. Mefteh FB, Daoud A, Chenari Bouket A, Alenezi FN, Luptakova L, Rateb ME, et al. Fungal root microbiome from healthy and brittle leaf diseased date palm trees (*Phoenix dactylifera* L.) reveals a hidden untapped arsenal of antibacterial and broad spectrum antifungal secondary metabolites. *Frontiers in microbiology*. 2017; 8:307. <https://doi.org/10.3389/fmicb.2017.00307> PMID: 28293229
41. Rodríguez-Echeverría S, de la Peña E, Moens M, Freitas H, van der Putten WH. Can root-feeders alter the composition of AMF communities? Experimental evidence from the dune grass *Ammophila arenaria*. *Basic and Applied Ecology*. 2009; 10(2):131–140.
42. Back MA, Haydock PPJ, Jenkinson P. Disease complexes involving plant parasitic nematodes and soil borne pathogens. *Plant pathology*. 2002; 51(6):683–697.
43. Haase S, Ruess L, Neumann G, Kandeler E. Low-level herbivory by root-knot nematodes (*Meloidogyne incognita*) modifies root hair morphology and rhizodeposition in host plants (*Hordeum vulgare*). *Plant and Soil*. 2007; 301(1–2):151–164.
44. Wanjohi WJ, Wafula GO, Macharia CM. Integrated management of *Fusarium* wilt-root knot nematode complex on tomato in central highlands of Kenya. *Sustainable Agriculture Research*. 2018; 7(2):8.
45. Hung P, Wattanachai P, Kasem S, Poaim S. Biological control of *Phytophthora palmivora* causing root rot of Pomelo using *Chaetomium* spp. *Mycobiology*. 2015; 43(1):63–70. <https://doi.org/10.5941/MYCO.2015.43.1.63> PMID: 25892917
46. Jadson D, Carlos C, Renan do N, Dianny CdS, Virgínia M, Eliane B, et al. Endophytic fungi from medicinal plant *Bauhinia forficata*: Diversity and biotechnological potential. *Braz J Microbiol*. 2015; 46(1):49–57. <https://doi.org/10.1590/S1517-838246120130657> PMID: 26221088
47. Larriba E, Jaime M, Nislow C, Martín NJ, Lopez LL. Endophytic colonization of barley (*Hordeum vulgare*) roots by the nematophagous fungus *Pochonia chlamydosporia* reveals plant growth promotion and a general defense and stress transcriptomic response. *J Plant Res*. 2015; 128(4):665–678. <https://doi.org/10.1007/s10265-015-0731-x> PMID: 25982739
48. Schulz B, Haas S, Junker C, Andréé N, Schobert M. Fungal endophytes are involved in multiple balanced antagonisms. *Curr Sci*. 2015; 109:39–45.
49. Ganley R, Brunsfeld S, Newcombe G. A community of unknown, endophytic fungi in western white pine. *PNAS*. 2004; 101(27):10107–10112. <https://doi.org/10.1073/pnas.0401513101> PMID: 15220484