

# Harnessing *Bacillus* spp. for sustainable production of medicinal plants: from growth promotion and stress protection to specialized-metabolite enhancement

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## Abstract

Plant growth-promoting bacteria (PGPB) play a crucial role in enhancing plant health and productivity. Among PGPBs, the genus *Bacillus* has become a research hotspot due to its diverse beneficial functions. Existing research has predominantly focused on their role in crop growth and stress tolerance, with limited attention given to their relationship with medicinal plants. Unlike general crops, accumulation of specialized metabolites (SMs) is essential for medicinal plant cultivation, and the quality of medicinal plant products is a combined output of both internal and external factors. This review aims to provide a comprehensive overview of recent advancements in understanding the role of *Bacillus* spp. in promoting the growth of medicinal plants, enhancing tolerance to environmental stresses, promoting the accumulation of bioactive compounds, and improving soil fertility. By synthesizing the existing knowledge, this review provides a further background for exploring the potential of *Bacillus* in optimizing growth and specialized metabolism in medicinal plants. It also suggests future research directions to encourage in-depth investigations into the interaction between *Bacillus* spp. and medicinal plants in the artificial intelligence (AI) era, ultimately leading to innovative strategies that prioritize plant health and the yield of medicinal products. Expanding understanding of beneficial interactions will further pave the way for sustainable and efficient medicinal plant production and agricultural practices.

**Citation:** Medison RG, Xing Y, Medison MB, Li Y, Khitov B, et al. 2026. Harnessing *Bacillus* spp. for sustainable production of medicinal plants: from growth promotion and stress protection to specialized-metabolite enhancement. *Medicinal Plant Biology* 5: e007 <https://doi.org/10.48130/mpb-0026-0001>

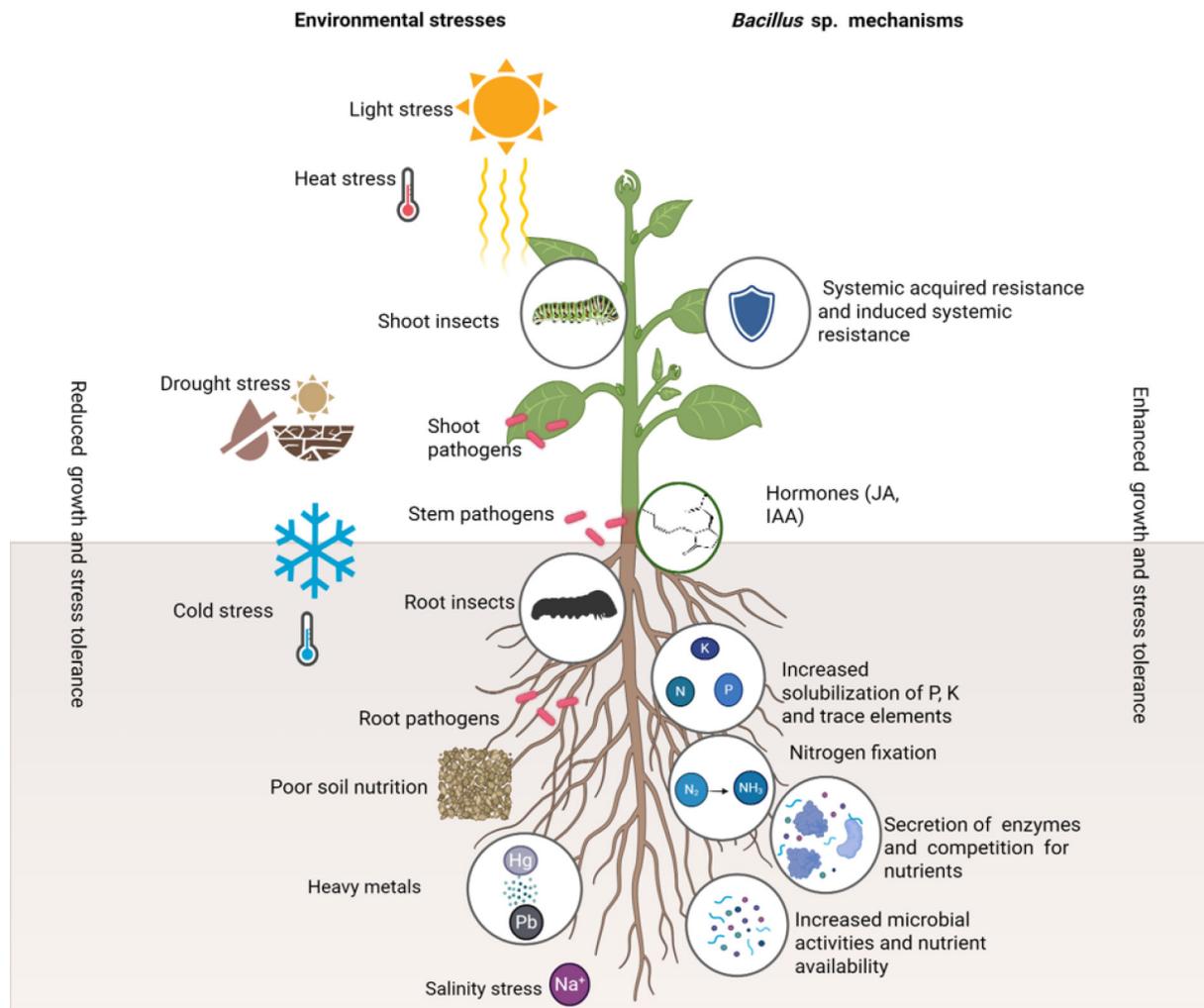
## Introduction

Medicinal plants have long been recognized for their therapeutic potential due to their rich bioactive compounds, playing a crucial role in traditional medicine and increasingly gaining attention in modern healthcare. The World Health Organization reported that 80% of the population depends on herbal medicine for basic health care<sup>[1]</sup>. Furthermore, the diversity of medicinal plants globally reflects their varied applications across different cultures. However, despite their significant contributions, the cultivation and utilization of medicinal plants face a major challenge: the need to increase both yield and the content of specialized metabolites, which makes them different from staple crops. This dual challenge is essential to meet the growing global demand for herbal remedies while ensuring sustainable practices in medicinal plant cultivation and utilization.

The growth of medicinal plants and the accumulation of their bioactive compounds, such as flavonoids, flavones, terpenoids, etc., are significantly influenced by the ecological environment<sup>[2]</sup>. While cultivation of staple crops requires lowered stress levels, a certain amount of stress is usually required for the accumulation of some bioactive compounds in medicinal plants, which is one of the major determinants for their quality. Considering the contradictory effect

of stresses on yield and quality in medicinal plants, it is a forever-research topic to use elicitors from abiotic or biotic factors to enhance growth and specialized metabolites<sup>[3]</sup>. Therefore, it is necessary to review existing research on the application of specific growth regulators in the accumulation of biomass and specialized metabolites to establish a basis for developing efficient and environmentally friendly technologies related to medicinal plant utilization.

The microbiome has gained more and more attention in regulating plant growth, stress responses, and the accumulation of specialized metabolites (SMs). The most commonly used bacteria in green farming are the genus *Bacillus*, which has a variety of beneficial functions and is commonly categorized as plant growth-promoting bacteria (PGPB). These gram-positive bacteria are known for their spore-forming ability, which allows them to survive and thrive in diverse environments<sup>[4]</sup>. They enhance nutrient uptake, promote plant growth, synthesize specialized metabolites, and induce systemic resistance against pathogens<sup>[5]</sup> (Fig. 1). Despite the numerous benefits of using *Bacillus* spp., existing research has primarily focused on their role in the growth of crops with less attention paid to the relationship between *Bacillus* and medicinal plants (Table 1). Therefore, significant gaps still exist in the understanding of the full potential and optimization of their application in medicinal plants. Furthermore, while many studies highlight the potential of *Bacillus*



**Fig. 1** The proposed model illustrating the role of *Bacillus* spp. in promoting medicinal plant growth, and enhancing environmental stress tolerance.

spp, there is still a lack of standardized methods for their incorporation into cultivation practices, particularly for medicinal plants that require specific growth conditions. This review aims to explore the current understanding of utilizing *Bacillus* species to enhance growth, stress tolerance, and the accumulation of specialized metabolites in medicinal plants. Furthermore, it highlights existing gaps and proposes a way forward to improve the comprehension of the relationship between *Bacillus* species and medicinal plants.

## Application of *Bacillus* spp. in medicinal plant growth

*Bacillus* spp. have long been used as PGPB in sustainable agriculture. Field and greenhouse studies show that single strains increase the yield of medicinal crops such as *Artemisia annua*, *Cannabis sativa*, *Stevia rebaudiana*, and *Mentha arvensis* through parallel processes: solubilization of bound P, biological N<sub>2</sub> fixation, and secretion of Fe<sup>3+</sup>-chelating siderophores<sup>[27–29]</sup>. Genomes of model strains (*B. cereus* TS4, *B. thuringiensis*, *B. subtilis*) harbor complete gene clusters for these functions, ensuring activity even in nutrient-depleted soils<sup>[30]</sup>.

Beyond nutrition, *Bacillus* spp. colonizes roots, and continuously releases auxin (IAA), cytokinins, gibberellins and volatile organic compounds (VOCs) that enlarge root surface area and activate

systemic stress tolerance. Whole-genome scans and in-planta assays confirm the presence of indole-3-pyruvate decarboxylase (ipdC) and related IAA operons in *B. megaterium* BRN1, *B. aryabhatai* BRN3, and *B. velezensis* CLA178; corresponding treatments raise essential-oil biomass and phytochemical content by 20%–45%<sup>[31–33]</sup>. VOCs emitted by *B. subtilis* GB03 further stimulate carbon allocation to oils without extra fertilizer<sup>[34]</sup>. Root-associated *Bacillus* spp. also restructure the rhizosphere microbiome, enriching phosphate-mobilising and disease-suppressive taxa<sup>[35]</sup>. Therefore, a single *Bacillus* strain simultaneously supplies nutrients, delivers phytohormones, and engineers a beneficial root microbiome, offering an integrated bio-inoculant strategy for low-input cultivation of high-value medicinal crops.

## Application of *Bacillus* spp. in abiotic stress tolerance in medicinal plants

*Bacillus* spp., particularly those classified as plant growth-promoting rhizobacteria, have been shown to confer various benefits to plants under stressful environments, such as drought, salinity, and heavy metal toxicity. *Bacillus* spp. consistently enhances plant tolerance to drought, salinity, and heavy metal stresses. Under 200 mM NaCl, *B. flexus* KLBMP4941 increased *Limonium sinense* survival by

**Table 1.** Some of the medicinal plants associated with *Bacillus* spp. that result in growth promotion and environmental stress tolerance.

Medicinal plant	<i>Bacillus</i> strain	Function	Ref.
<i>Zingiber officinale</i> (Ginger)	<i>B. paralicheniformis</i> , <i>B. velezensis</i> ATR2	Plant growth promotion, biological control	[6,7]
<i>Ocimum gratissimum</i> L.	<i>B. subtilis</i> Tc1	Plant growth promotion, biological control	[8]
<i>Duranta plumeri</i>	<i>B. amyloliquefaciens</i> D41	Plant growth promotion, biological control	[8]
<i>Lilium leucanthum</i>	<i>B. velezensis</i> L1e-9	Plant growth promotion, biological control	[9]
<i>Camelia sinensis</i>	<i>B. megaterium</i> TRS-4	Plant growth promotion, biocontrol, secondary metabolites	[10]
<i>Abelmoschus esculentus</i>	<i>B. thuringiensis</i>	Plant growth promotion	[11]
<i>Solanum surattense</i>	<i>B. subtilis</i> SSR21	Biological control	[12]
<i>Abutilon indicum</i>	<i>B. flexus</i> AIKDL	Biological control	[12]
<i>Glycyrrhiza uralensis</i> Fisch	<i>B. pumilis</i> G5, <i>Bacillus</i> spp.	Plant growth promotion	[13,14]
<i>Curcuma longa</i> L.	<i>B. endophyticus</i> TSH42, <i>B. cereus</i> TSH77	Plant growth promotion	[15]
<i>Withania somnifera</i>	<i>B. amyloliquefaciens</i> (MPE20)	Plant growth promotion, secondary metabolism	[16]
<i>Vinca rosea</i>	<i>B. megaterium</i> MCR-8	Plant growth promotion	[17]
<i>Limonium sinense</i>	<i>B. flexus</i> KLBMP 4941	Plant growth promotion, stress alleviation	[18,19]
<i>Aster tripolium</i> L.	Various <i>Bacillus</i> spp.	–	[20]
<i>Fagonia indica</i>	<i>B. tequilensis</i> MOSEL-FLS3	Biological control of plant diseases	[21]
<i>Caralluma tumerculata</i>	<i>B. flexus</i> MOSEL-MIC5	Biological control of diseases	[21]
<i>Solanum surattense</i>	<i>B. subtilis</i> SSL2	Biological control of diseases	[22]
<i>Oxytropis merkensis</i> Bge	<i>B. amyloliquefaciens</i> MR4	Plant growth promotion and biological control of diseases	[23]
<i>Echinacea purpurea</i> (L.)	<i>Bacillus</i> sp. EpSL5	Plant growth promotion	[24]
<i>Origanum heracleoticum</i> L.	Various <i>Bacillus</i> strains	Biological control	[25,26]

65%<sup>[19]</sup>; *B. amyloliquefaciens* augmented *Glycyrrhiza uralensis* biomass 40% under field drought and restored leaf relative water content (RWC) to 90% of well-watered controls<sup>[36]</sup>. In cadmium-spiked soils, two *B. atrophaeus* (WL1210 and CD303) isolates raised perennial ryegrass shoot dry weight 1.8-fold while lowering root Cd up to 34%<sup>[37]</sup>. Co-inoculation of *B. subtilis* with arbuscular mycorrhiza further doubled *Artemisia annua* artemisinin contents under water deficit conditions<sup>[38]</sup>.

Protection is exerted mainly through three complementary mechanisms. First, antioxidant priming: *Bacillus*-colonized roots rapidly up-regulate SOD, CAT, and the AsA-GSH cycle, suppressing reactive oxygen species (ROS) bursts that typically damage membranes and photosystems<sup>[39,40]</sup>. Second, osmolyte and hormone tuning: *Bacillus* strains accumulate proline, sucrose, and glycine-betaine, while secreting ABA to close stomata and ACC-deaminase to cleave stress-induced ethylene, jointly maintaining water status and chlorophyll content<sup>[41,42]</sup>. Third, molecular signaling: the bacterial  $\sigma$ B regulon and plant salt-overly-sensitive module (SOS) and C-repeat binding factor module (CBF) pathways are synchronously activated. Published transcriptome results show that *B. amyloliquefaciens* SQR9 up-regulates host genes, including RBCS, RBCL, HKT1, NHX1, NHX2, NHX3, etc, for osmo-protectant synthesis, an induced systemic tolerance (IST) response that persists<sup>[43]</sup>.

## Application of *Bacillus* spp. in biotic stress management

Medicinal plants are susceptible to many diseases that can significantly impact their growth, yield, and medicinal properties. Among sustainable approaches to managing these diseases, the use of *Bacillus* spp. as biocontrol agents has emerged as a promising strategy for controlling medicinal plant diseases<sup>[44]</sup>. *Bacillus* spp. serves as a broad-spectrum biocontrol agents that protect medicinal crops from pathogens and insect pests while preserving yield and bioactive metabolite content. As for pathogen resistance, *B. velezensis* CLA178 reduced the incidence of crown gall on *Rosa multiflora* by 70% via induced systemic resistance (ISR)<sup>[33]</sup>, and *B. amyloliquefaciens* HK34 curtailed *Phytophthora* root rot in *Panax ginseng* by

60%<sup>[45]</sup>. Consortia containing *B. subtilis*, *B. thuringiensis*, and *B. toyonensis* decreased *Verticillium wilt* severity in *Cotinus coggygia* from 58% to 12% and elevated leaf terpene content 1.4-fold<sup>[46]</sup>. As for insect control, *B. thuringiensis* formulations expressing Cry1/3 proteins cause > 90% mortality of lepidopteran and coleopteran larvae on *Salvia miltiorrhiza* without affecting pollinators<sup>[47]</sup>, while lipopeptides from *B. amyloliquefaciens* cut aphid fecundity on *Chrysanthemum* by 55%<sup>[48]</sup>.

The underlying mechanisms operate simultaneously and function through three mechanisms: antibiosis, ISR, and microbiome engineering for pathogen resistance. Genome mining reveals eight–12 gene clusters for lipopeptides (fengycin, surfactin), polyketides, and lytic enzymes that disrupt pathogen membranes and cell walls<sup>[44,49]</sup>. Colonization triggers plant NPR1- and MAPK-dependent signalling, up-regulating pathogenesis-related genes within 24 h, resulting in a three-fold increase in phenolics and pathogenesis-related proteins<sup>[50]</sup>. *Bacillus* exudates such as bacillibactin and acetoin, restructure the rhizosphere, enriching *Streptomyces* and *Pseudomonas* populations that out-compete *Fusarium* and *Alternaria* for Fe and niche space<sup>[51]</sup>. As for insect control, *Bacillus* spp. generates insect-specific toxins. Alkaline activation of Cry protoxins forms pores in the mid-gut epithelium of target larvae, whereas secreted lipopeptides interfere with aphid feeding and reproduction, providing complementary pest suppression with negligible non-target impact<sup>[28]</sup>. Collectively, these traits position *Bacillus*-based biopesticides as effective, low-resistance components of integrated disease and pest management programs for high-value medicinal plants.

## Application of *Bacillus* spp. in the accumulation of plant-specialized metabolites

*Bacillus* endophytes and rhizosphere strains act as ecologically benign elicitors that raise the concentration of pharmaceutically active terpenoids, flavonoids, and alkaloids in medicinal crops, which is essential for the quality of medicinal crops. Under normal or

saline conditions, *B. cereus* elevates glycyrrhizic acid, liquiritigenin, and total flavonoids in *G. uralensis*<sup>[52]</sup>, while nitrogen-fixing *Bacillus* J1 and *Bacillus*. G4 increases astragaloside, calycosin, and polysaccharide contents in *Astragalus mongholicus* by a similar margin<sup>[29]</sup>. Comparable increments have been recorded for ginsenosides in *P. ginseng*<sup>[53]</sup>, artemisinin in *A. annua*<sup>[54]</sup>, stevioside in *Stevia rebaudiana*<sup>[55]</sup>, and withanolides in *Withania somnifera*<sup>[16]</sup>, demonstrating broad taxonomic efficacy (Fig. 2).

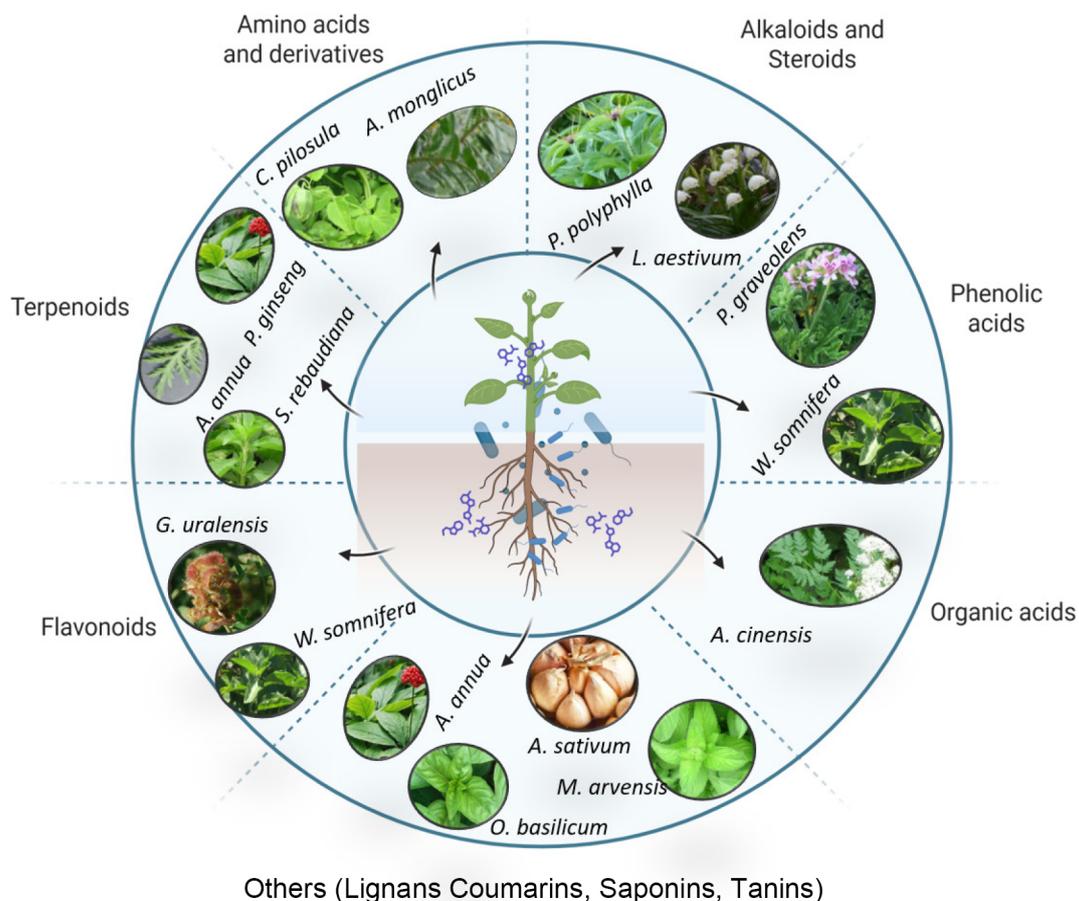
The metabolic upshift is triggered by low-molecular signals (surfactants, fengycins, volatiles) secreted by *Bacillus* spp. that are perceived as microbe-associated molecular patterns. Within hours, mitogen-activated protein-kinase (MAPK) and WRKY/MYB transcriptional cascades are activated, leading to sustained over-expression of gateway genes for secondary metabolism. Examples include up-regulation of *HMGR*, *DXS*, *CYP7AV1*, and *bZIP* TFs that control sesquiterpene and artemisinin biosynthesis<sup>[54]</sup>; induction of *SQS*, *CYP88D6*, and  $\beta$ -AS governing glycyrrhizic acid formation<sup>[52]</sup>; and enhanced transcription of *VDC* for alkamide assembly in *Echinacea purpurea*<sup>[24]</sup> (Fig. 3).

## Balancing stress tolerance and production of specialized metabolites by *Bacillus* spp.

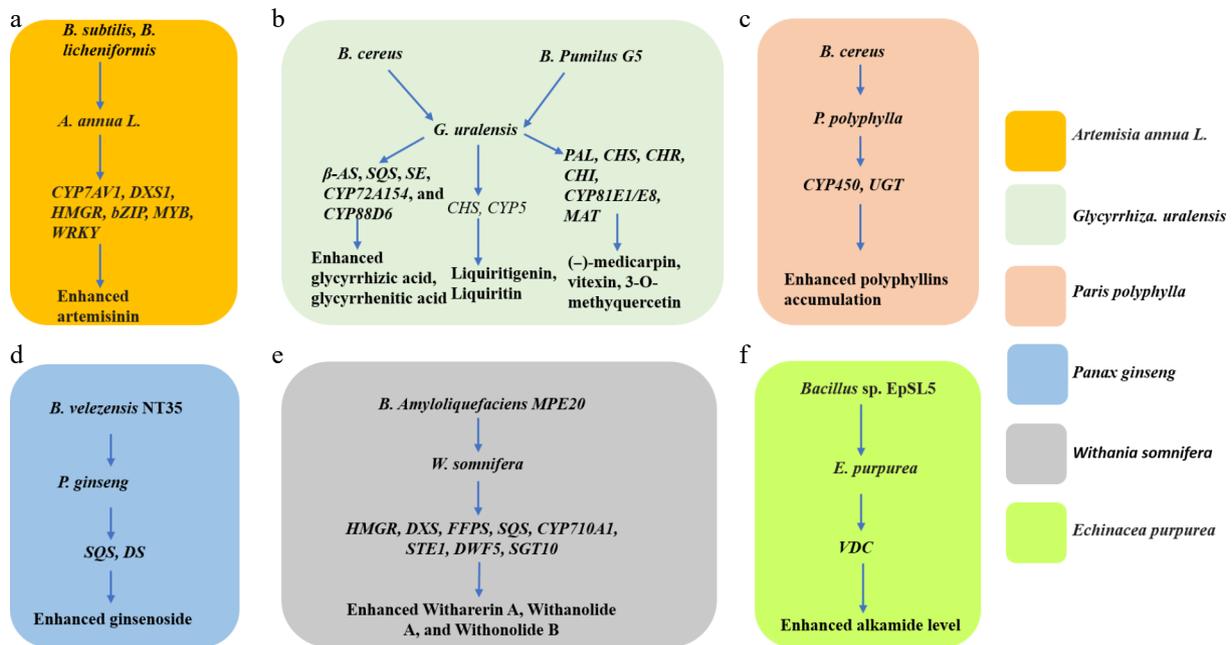
*Bacillus* spp. reconciles the classical breeding dilemma between biomass and drug quality by synchronously raising yield and the

concentrations of pharmaceutically active flavonoids, terpenoids, or alkaloids. Upon root colonization, surfactant and fengycin lipopeptides produced by *B. subtilis* and *B. amyloliquefaciens* act as microbe-associated molecular patterns that are perceived by plant pattern reorganization receptors (PRRs); within hours, this triggers a mild ISR response coupled to MAPK-mediated up-regulation of key biosynthetic genes (*CYP72A154*,  $\beta$ -AS, *HMGR*) without imposing the severe oxidative burst that normally accompanies pathogen-induced secondary metabolism<sup>[56,57]</sup>. Concomitantly, *Bacillus*-derived IAA and transient ABA pulses expand the photosynthetic surface and improve water-use efficiency, ensuring that the extra carbon skeletons required for secondary biosynthesis are supplied through enhanced primary productivity rather than through stress-driven reallocation<sup>[43]</sup>. In addition, *Bacillus* spp. induces systemic resistance mechanisms in plants, which further fortify their defenses through the production of various metabolites, including organic compounds (VOCs), which induce systemic resistance that prepares the plant against future pathogen attacks<sup>[28,58]</sup>. These metabolites, alongside phytohormones and antimicrobial compounds, synergistically foster a conducive environment for healthy growth amid environmental stressors.

*Bacillus* spp. are recognized for their ability to produce a diverse array of specialized metabolites that enhance growth and productivity. These metabolites provide additional benefits by enhancing the levels of specialized metabolites and fortifying the plant's resistance to biotic and abiotic stresses<sup>[59]</sup>. This phenomenon highlights the duality of the metabolites' functional scope, as they serve both the bacteria and their plant hosts.



**Fig. 2** Representation of some of the medicinal plants reported to interact with *Bacillus* spp. and lead to the accumulation of specialized metabolites.



**Fig. 3** Genes activated by *Bacillus* spp. to promote the accumulation of specialized metabolites in medicinal plants. CYP7AV1 (amorphadiene-12-hydroxylase), DXS1 (1-deoxy-D-xylulose-5-phosphate synthase,1); HMGR (3-hydroxy-3-methyl-glutaryl coenzyme A reductase); bZIP (basic leucine zipper); MYB (myeloblastosis),  $\beta$ -AS ( $\beta$ -amyrin synthase); SQS (squalene synthase); SE (squalene epoxidase); CYP88D6 (P450 monooxygenase encoding  $\beta$ -amyrin 11-oxidase); CHS (Chalcone synthase); CYP5 (Cytochrome P450 family 5), PAL (phenylalanine ammonia-lyase); CHR (cell cycle homology region); MAT (homotetramer), DS (dammarenediol synthase); CYP450 (Cytochrome P450); UGT (UDP-Glycosyltransferase); DXS (1-deoxy-D-xylose-5-phosphate synthase); FFPS (fluorescent fusion protein), STE (sulfotransferase); DWF (Dwarf); SGT (sterol glycosyltransferase); CYP710A1 (Cytochrome P450 subfamily 710 A1); VDC (Valine decarboxylase).

As part of their molecular mechanisms, *Bacillus* spp. such as *B. subtilis*, *B. amyloliquefaciens*, and *B. licheniformis* are recognized for their extensive biosynthetic gene clusters (BGCs) that encode for various specialized metabolites, including lipopeptides, polyketides, and non-ribosomal peptides, as previously documented<sup>[60]</sup>. In addition, environmental factors and plant interactions often regulate the production of specialized metabolites by *Bacillus* spp. The interaction with plant roots may trigger the expression of these biosynthetic pathways, leading to enhanced production of bioactive compounds. For example, the presence of plant root exudates has been reported to stimulate the expression of genes involved in the biosynthesis of specialized metabolites, leading to an increased production of beneficial compounds<sup>[61]</sup>. This interaction highlights the dynamic relationship between *Bacillus* and plants, where the metabolic activities of the bacteria can be influenced by the plant's physiological state and vice versa. Such interactions can enhance the plant's ability to cope with abiotic stresses such as drought and salinity by modulating specialized metabolite pathways.

## Application of *Bacillus* spp. in improving soil health for medicinal plants

The ecological interactions facilitated by *Bacillus* spp., especially in the rhizosphere, are crucial for the sustainable production of medicinal plants. For instance, dual inoculation of plant growth-promoting *B. endophyticus* IGPEB 33 and *Funneliformis mosseae* improves soil properties for *Zingiber officinale* (ginger) growth<sup>[62]</sup>. Moreover, many *Bacillus* strains secrete extracellular polymeric substances (EPS), including polysaccharides and proteins. These substances act as

biological glues, binding soil particles into stable aggregates. Aggregated soil reduces compaction, improves water infiltration, and creates pore spaces that facilitate root growth and oxygen diffusion, critical for both plant and microbial survival<sup>[63]</sup>. Moreover, *Bacillus* plays a role in regulating soil pH, thereby restoring degraded soils<sup>[64]</sup>. In addition, the use of *Bacillus* in combination with organic amendments such as biochar has been particularly effective in reducing soil contaminants such as cadmium, while enhancing microbial activity and soil fertility<sup>[65]</sup>.

*Bacillus* spp. have been implicated in the mobilization of essential nutrients in the soil, notably phosphorus, potassium, and micronutrients such as iron (Fe), zinc (Zn), and manganese (Mn), through mechanisms such as solubilization. In addition, many strains exhibit efficient nitrogen fixation. *Bacillus* spp. SSAU-2 can fix atmospheric nitrogen and synthesize phytohormones, such as IAA, even under harsh conditions, including high salinity and heavy metal stress, thereby directly enhancing soil fertility<sup>[66]</sup>. Furthermore, *Bacillus* spp. contribute to soil fertility through the decomposition of organic matter through extracellular enzymes, such as cellulases and proteases, that facilitate the breakdown of complex organic materials, thus releasing nutrients readily available for plant uptake<sup>[6]</sup>. This microbial activity is essential for the recycling of nutrients and the maintenance of soil structure, which are critical components of soil fertility<sup>[67]</sup>.

The interaction between *Bacillus* and other soil microbial communities is also crucial for enhancing soil fertility for cultivating medicinal plants. *Bacillus* modulates the composition of the rhizosphere microbiome, promoting beneficial interactions among various microbiota taxa<sup>[68]</sup>. This synergistic relationship underscores the importance of microbial diversity in maintaining soil fertility and ecosystem resilience.

## An AI-era for medicinal plant and microbe interactions

Machine learning algorithms are increasingly utilized in the analysis of large, heterogeneous datasets derived from genomic, transcriptomic, and metabolomic studies. For instance, supervised machine learning techniques have been effectively applied to identify interaction factors within microbial genomes associated with specific plant behaviors, revealing intricate patterns that drive host-microbe dynamics<sup>[69]</sup>. These approaches allow researchers to discern nuanced interactions that traditional methods may overlook, effectively correlating specific microbial traits with plant health outcomes<sup>[70]</sup>. Moreover, machine learning's capacity for pattern recognition is pivotal for addressing the complexity of the multifactorial interactions between *Bacillus* spp. and various medicinal plants, facilitating the identification of beneficial traits and resistance mechanisms<sup>[71]</sup>.

Combining biological knowledge with computational tools fosters the development of resilient models that guide the design of synthetic ecosystems, emphasizing plant-microbe interactions through machine learning insights<sup>[72]</sup>. For instance, transfer learning frameworks have shown that taxonomic signatures of *Pyrrimonadaceae*, *Nitrososphaeracea*, and *Ca. Udaeobacter* reliably indicates soil health across various medicinal-crop datasets<sup>[73]</sup>. In addition, machine learning has been used to improve the prediction of disease-associated and health-associated microbial signatures with high accuracy<sup>[72]</sup>. The use of systematic CRISPRi repression in screening amino acid biosynthesis in *B. subtilis* enhances the production of surfactin<sup>[74]</sup>. Algorithms like random forests and support vector machines analyze trait combinations in ecological networks, enabling predictions of how plant-microbe interactions evolve under different environmental conditions<sup>[75,76]</sup>. Furthermore, meta-analyses and machine learning research indicate that models such as random forests and deep learning, trained on 16S rRNA or whole-genome data, can forecast *Bacillus*-mediated disease suppression, plant growth promotion, and phytochemical production<sup>[77,78]</sup>. Advances in machine learning have also enhanced the modeling and prediction of plant-microbe interactions within more dynamic, real-time frameworks<sup>[72]</sup>. For example, Muñoz & Carneiro explore how symbiotic relationships influence ecosystem behavior and dynamics, proposing that AI could model these interactions to improve ecosystem services<sup>[79]</sup>. The potential of AI to deepen understanding of interactions aligns with the rising demand for data-driven methods to optimize medicinal plant-microbe relationships. Furthermore, as ecological models grow more sophisticated through machine learning, better insights are gained into the complex interdependencies that define medicinal plant-microbe interactions.

The integration of AI and machine learning in medicinal plant research also extends to ethnobotanical studies. By examining traditional plant use and chemical profiles, researchers can uncover and validate indigenous knowledge about medicinal plants. Aziz et al. documented these traditional uses based on ethnobiological insights, which can be further validated and explored through AI analysis<sup>[80]</sup>. Bioinformatics projects, such as the TCM Systems Pharmacology Database and Analysis Platform, compile extensive data on the effects of phytochemicals and their interactions within biological systems<sup>[81]</sup>. These databases support AI-driven computational methods that enable comprehensive analysis of potential therapeutic uses of plant-derived compounds, considering microbial interactions that influence their bioavailability and efficacy. Proteomics is a key area where machine learning significantly

contributes. For example, Khatabi et al.<sup>[82]</sup> reviewed how ML helps analyze large datasets to identify protein markers linked to successful plant-microbe symbiosis. Therefore, the use of current technologies can accelerate the study of *Bacillus*-medicinal plant interactions by providing sophisticated analytical frameworks that facilitate the understanding of complex biological systems, enhance data interpretation, and optimize microbial applications for agricultural sustainability. By integrating machine learning and other AI methodologies, researchers can unveil critical insights into plant-microbe interactions, paving the way for innovative practices in agriculture and medicine.

## Challenges and future directions

Research on *Bacillus*-plant interactions has been built largely on maize, rice, tomato, and other staple crops, and the resulting mechanistic framework is essentially transferable to medicinal species. Regardless of the host, Bacilli colonize the root surface, export auxins, cytotoxins, and volatile terpenes that enlarge the absorptive area and simultaneously release siderophores, phosphates, and ACC that improve mineral uptake and release ethylene-mediated stress<sup>[83]</sup>. However, the central difference is the value chain endpoint: In crops, the focus is on yield and shelf stability, thus controlling growth disruptors and improving productivity, with agricultural practices leveraging *Bacillus* for competition with pathogens and nutrient availability<sup>[84]</sup>. Conversely, the interaction between *Bacillus* and medicinal plants extends beyond growth promotion to include the enhancement of phytochemical profiles essential to the therapeutic efficacy. Recent work shows that endophytic *Bacillus* spp. can satisfy both criteria by coupling the generic growth-promoting circuitry described above to host-specific elicitation of pharmacologically active terpenoids, flavonoids, and alkaloids<sup>[85]</sup>. However, the number of medicinal species examined remains minuscule compared with the diversity used commercially, and co-culture protocols and harvest timing needed to maximize metabolite content without compromising biomass have been mapped for only a handful of taxa. Consequently, while the vast knowledge base generated for cereals and vegetables offers ready-made entry points, dedicated systematic studies are still required to translate these universal mechanisms into agronomic practices that simultaneously boost yield and therapeutic value in the medicinal plant production system.

Optimizing the use of *Bacillus* spp. under field conditions remains challenging. Many studies are conducted under controlled laboratory conditions, which may not accurately predict field performance due to differences in microbial community dynamics, inconsistent formulations, dosage, and abiotic factors<sup>[86]</sup>. Moreover, studies have not explored the comparative efficacy of various beneficial microbial strains across diverse plant species and cultivation systems, which limits the ability to recommend the most suitable *Bacillus* strains for enhancing the growth of specific medicinal plants<sup>[87]</sup>. Therefore, there is a pressing need for comprehensive field trials that evaluate the long-term effects of *Bacillus* treatments on medicinal plants for the universality and stability of their application in different ecological regions<sup>[88]</sup>. In addition, exploring the colonization laws of *Bacillus* in different soil types and climatic conditions, clarifying their interaction patterns with indigenous communities and host plants, and providing a basis for the development of regional microbial agents would help to fully address these challenges through continued research and innovation, which is crucial

for maximizing the potential of *Bacillus* spp. in sustainable medicinal plant production<sup>[4]</sup>. Furthermore, standardizing bioinoculant production, delivery, and resistant management guidelines to ensure reproducible disease suppression and non-target safety would enable the use of high-efficiency strains of *Bacillus* with high symbiotic activity for specific medicinal plants.

The knowledge gap also remains in the molecular mechanisms that govern *Bacillus*-plant signaling, transcription factor networks, and epigenetic modulation, which influence plant growth and secondary metabolite production. For example, the signal transduction pathways involved in *Bacillus* interactions with most medicinal plants, such as hormone regulation and gene expression networks, are not yet fully understood. Therefore, there is a need to explore the complexity of these interactions at the molecular level through genetic and biochemical studies. Future priorities include developing a curated, genotype-level *Bacillus* library matched to specific medicinal plants and employing multi-omics approaches to map colonization patterns, hormonal crosstalk, and metabolite flow under field stress conditions. Additionally, strain genome editing technologies can be used to selectively modify *Bacillus* strains and medicinal plants, enhancing enzyme and metabolite production or stress-resistance gene expression, thus helping to turn promising laboratory results into scalable, real-world medicinal plant systems. Recent advancements in traditional and modern plant improvement techniques, such as CRISPR, RNAi, and next-generation sequencing (NGS), have provided valuable insights into genes involved in the biosynthesis of plant specialized metabolites. Notably, CRISPR technologies are seen as promising tools to optimize therapeutic phytochemical production by creating genetically modified medicinal plants with targeted metabolite profiles<sup>[89]</sup>. Furthermore, NGS enables the identification of genetic variations among plant species, shedding light on the metabolic pathways that increase yields of bioactive compounds<sup>[90]</sup>.

The other notable challenge is the public concern over the use of beneficial microbes such as *Bacillus* to enhance plant production. Despite the numerous benefits of using *Bacillus* spp., the environmental impact of *Bacillus* spp. is still a critical aspect of their role in plant production and protection. For instance, studies have shown that the application of *B. thuringiensis* does not adversely affect non-target organisms, including beneficial insects and soil microorganisms, making it a safer alternative to conventional insecticides<sup>[91]</sup>. However, concerns regarding the potential development of resistance in target pest populations have been raised, necessitating the implementation of resistance management strategies<sup>[88]</sup>. Furthermore, although the biocontrol of plant diseases by *Bacillus* spp. represents a multifaceted approach to improve medicinal plant cultivation, the complexities involved in ensuring consistency and efficacy in disease suppression in various plant systems represent a barrier, making it unacceptable to some growers worldwide<sup>[92]</sup>. Moreover, the high variability in commercially available products often leads to confusion in the application and effectiveness of *Bacillus* strains. For instance, Bueno et al. have shown that the concentration and formulation of *Bacillus* inoculants significantly impact their colonization and consequent efficacy in plants<sup>[93]</sup>. However, inconsistent product application protocols can lead to underwhelming results in practical applications, signaling a need for standardized practices and more reliable product formulations, as mentioned previously in this section.

Artificial intelligence offers significant opportunities to advance the study of *Bacillus*-medicinal plant interactions. It enables the collection and analysis of large datasets on plant-microbe relationships through crowd-sourcing and remote sensing, complementing

lab results and revealing ecosystem-level factors affecting plant health and pathogen resistance. Remote sensing coupled with AI allows real-time monitoring of medicinal plant health and growth, helping maintain optimal conditions for *Bacillus* species<sup>[94]</sup>. Looking ahead, three key AI-driven innovations will be essential: (1) Environment-specific strain design: reinforcement learning agents, using soil multi-omics and climate data, will suggest targeted gene edits or promoter swaps to customize *Bacillus* genomes. (2) Optimized microbial communities: graph neural networks will analyze interaction scores, metabolite complementarity, and niche overlap to create three- to five-member *Bacillus* consortia with > 90% rhizosphere persistence and enhanced secondary metabolite production. (3) Soil-ecosystem prediction: digital twin models integrating meta-genomic data and geospatial factors will predict the long-term effects of introduced *Bacillus* strains on microbiota diversity, antibiotic resistance gene flow, and soil health, providing regulators with quantitative risk assessments before field deployment. This forecasting enables better optimization of *Bacillus* and medicinal plant interactions to maximize therapeutic benefits. AI models that incorporate climate, plant, and microbial genomics data can forecast which bacterial and plant combinations yield the greatest medicinal advantages, guiding cultivation strategies<sup>[95]</sup>.

## Conclusions

*Bacillus* spp. plays a versatile role in supporting medicinal plant growth through its various biochemical and ecological activities. They can improve plant nutrition, promote growth and metabolite synthesis, and defend against pathogens, offering a sustainable approach to medicinal plant cultivation that balances yield, quality, and environmental responsibility. This highlights their importance in modern agriculture. To realize this potential, a shift is needed from traditional inoculation methods to precise, system-level strategies supported by strong ecological and regulatory measures. Ongoing research on the molecular interactions between *Bacillus* and medicinal plants will reveal how these microbes can be better utilized to boost plant resilience and increase bioactive compound production. As research advances, identifying more *Bacillus* strains and understanding their genomes will aid in developing effective bioinoculants for sustainable medicinal plant farming. Importantly, integrating artificial intelligence offers the predictive power and speed necessary to match specific *Bacillus* strains or synthetic communities to particular crops, climates, and soils, while also evaluating their long-term impact on soil health. This review provides a broad overview and a basis for future research into how *Bacillus* strains can improve plant growth and specialized metabolite production. Future studies are expected to deepen the understanding of these beneficial interactions, fostering innovative agricultural practices focused on plant health and medicinal product yield.

## Author contributions

The authors confirm their contributions to the paper as follows: study conception and design: Medison RG, Xing Y, Wang Y, Li Y; methodology, visualization: Medison RG, Xing Y; investigation, funding acquisition: Li Y; resources: Yang X, Wang Y, Li Y; draft manuscript preparation: Medison RG, Xing Y, Medison MB, Liu H, Chai M, Li Y; writing – review & editing: Medison RG, Xing Y, Li Y, Khitov B, Liu H, Chai M, Yang X, Li Y; supervision: Li Y, Yang X, Wang Y, Li Y; project administration: Wang Y, Li Y. All authors reviewed the results and approved the final version of the manuscript.

## Data availability

Data sharing is not applicable to this article, as no datasets were generated or analyzed in the current study.

## Acknowledgments

This work was supported by the Biological Resources Programme, Chinese Academy of Sciences (Grant No. KFJ-BRP-007-017), the Guangdong Provincial Key Laboratory of Applied Botany (Grant No. 2023B1212060046), and the Shanghai Key Laboratory of Plant Functional Genomics and Resources, Shanghai Chenshan Botanical Garden (Grant No. PFGR202502).

## Conflict of interest

The authors declare that they have no conflict of interest.

## Dates

Received 26 September 2025; Revised 10 December 2025; Accepted 26 December 2025; Published online 19 March 2026

## References

- World Health Organization. 2019. *WHO global report on traditional and complementary medicine 2019*. Geneva: World Health Organization. pp. 1–228. [www.who.int/publications/i/item/978924151536](http://www.who.int/publications/i/item/978924151536)
- Yu F, Wang Q, Wei S, Wang D, Fang Y, et al. 2015. Effect of genotype and environment on five bioactive components of cultivated licorice (*Glycyrrhiza uralensis*) populations in northern China. *Biological and Pharmaceutical Bulletin* 38:75–81
- Mohaddab M, El Goumi Y, Gallo M, Montesano D, Zengin G, et al. 2022. Biotechnology and in vitro culture as an alternative system for secondary metabolite production. *Molecules* 27:8093
- Hu G, Wang Y, Blake C, Nordgaard M, Liu X, et al. 2023. Parallel genetic adaptation of *Bacillus subtilis* to different plant species. *Microbial Genomics* 9:mgen001064
- Guo X, Yan X, Wang Y, Shi Z, Niu J, et al. 2024. Integrated transcriptomics and metabolomics analysis reveals the effects of cutting on the synthesis of flavonoids and saponins in Chinese herbal medicine *Astragalus mongholicus*. *Metabolites* 14:97
- Sun Y, Liu K, Liu Z, Liu Y, Yang X, et al. 2025. *Bacillus paralicheniformis* SYN-191 isolated from ginger rhizosphere soil and its growth-promoting effects in ginger farming. *BMC Microbiology* 25:75
- Liang L, Fu Y, Deng S, Wu Y, Gao M. 2022. Genomic, antimicrobial, and aphicidal traits of *Bacillus velezensis* ATR2, and its biocontrol potential against ginger rhizome rot disease caused by *Bacillus pumilus*. *Microorganisms* 10:63
- Ansary WR, Prince FRK, Haque E, Sultana F, West HM, et al. 2018. Endophytic *Bacillus* spp. from medicinal plants inhibit mycelial growth of *Sclerotinia sclerotiorum* and promote plant growth. *Zeitschrift Fur Naturforschung C, Journal of Biosciences* 73:247–256
- Khan MS, Gao J, Chen X, Zhang M, Yang F, et al. 2020. The endophytic bacteria *Bacillus velezensis* Lle-9, isolated from *Lilium leucanthum*, harbors antifungal activity and plant growth-promoting effects. *Journal of Microbiology and Biotechnology* 30:668–680
- Chakraborty U, Chakraborty B, Basnet M. 2006. Plant growth promotion and induction of resistance in *Camellia sinensis* by *Bacillus megaterium*. *Journal of Basic Microbiology* 46:186–195
- Bandopadhyay S. 2020. Application of plant growth promoting *Bacillus thuringiensis* as biofertilizer on *Abelmoschus esculentus* plants under field condition. *Journal of Pure and Applied Microbiology* 14:1287–1294
- Jinal NH, Amaresan N. 2020. Evaluation of biocontrol *Bacillus* species on plant growth promotion and systemic-induced resistant potential against bacterial and fungal wilt-causing pathogens. *Archives of Microbiology* 202:1785–1794
- Xu Z, Bai Q, Peng X, Lang D, Zhang X. 2024. Endophytic *Bacillus pumilus* G5 interacting with silicon to improve drought stress resilience in *Glycyrrhiza uralensis* Fisch. by modulating nitrogen absorption, assimilation, and metabolism pathways. *Journal of Agricultural and Food Chemistry* 72:10257–10270
- Li L, Mohamad OAA, Ma J, Friel AD, Su Y, et al. 2018. Synergistic plant–microbe interactions between endophytic bacterial communities and the medicinal plant *Glycyrrhiza uralensis* F. *Antonie van Leeuwenhoek* 111:1735–1748
- Chauhan AK, Maheshwari DK, Dheeman S, Bajpai VK. 2017. Termitarium-inhabiting *Bacillus* spp. enhanced plant growth and bioactive component in turmeric (*Curcuma longa* L.). *Current Microbiology* 74:184–192
- Mishra A, Singh SP, Mahfooz S, Bhattacharya A, Mishra N, et al. 2018. Bacterial endophytes modulates the withanolide biosynthetic pathway and physiological performance in *Withania somnifera* under biotic stress. *Microbiological Research* 212–213:17–28
- Khan WU, Ahmad SR, Ahmad Yasin N, Ali A, Ahmad A, et al. 2017. Application of *Bacillus megaterium* MCR-8 improved phytoextraction and stress alleviation of nickel in *Vinca rosea*. *International Journal of Phytoremediation* 19:813–824
- Wang TT, Ding P, Chen P, Xing K, Bai JL, et al. 2017. Complete genome sequence of endophyte *Bacillus flexus* KLBMP 4941 reveals its plant growth promotion mechanism and genetic basis for salt tolerance. *Journal of Biotechnology* 260:38–41
- Xiong YW, Li XW, Wang TT, Gong Y, Zhang CM, et al. 2020. Root exudates-driven rhizosphere recruitment of the plant growth-promoting rhizobacterium *Bacillus flexus* KLBMP 4941 and its growth-promoting effect on the coastal halophyte *Limonium sinense* under salt stress. *Ecotoxicology and Environmental Safety* 194:110374
- Szymańska S, Płociniczak T, Piotrowska-Seget Z, Hryniewicz K. 2016. Endophytic and rhizosphere bacteria associated with the roots of the halophyte *Salicornia europaea* L. – community structure and metabolic potential. *Microbiological Research* 192:37–51
- Iqar I, Shinwari ZK, Abdel Fatah El-Sayed AS, Ali GS. 2021. Exploration of microbiome of medicinally important plants as biocontrol agents against *Phytophthora parasitica*. *Archives of Microbiology* 203:2475–2489
- Jinal HN, Amaresan N. 2020. Characterization of medicinal plant-associated biocontrol *Bacillus subtilis* (SSL2) by liquid chromatography-mass spectrometry and evaluation of compounds by *in silico* and *in vitro* methods. *Journal of Biomolecular Structure and Dynamics* 38:500–510
- Yang K, Dai X, Maitikadir Z, Zhang H, Hao H, et al. 2024. Comparative genome analysis of endophytic *Bacillus amyloliquefaciens* MR4: a potential biocontrol agent isolated from wild medicinal plant root tissue. *Journal of Applied Genetics* 65:907–923
- Maggini V, De Leo M, Mengoni A, Gallo ER, Miceli E, et al. 2017. Plant-endophytes interaction influences the secondary metabolism in *Echinacea purpurea* (L.) Moench: an *in vitro* model. *Scientific Reports* 7:16924
- Semenzato G, Bernacchi A, Amata S, Bechini A, Berti F, et al. 2024. Antibacterial properties of bacterial endophytes isolated from the medicinal plant *Origanum heracleoticum* L. *Frontiers in Bioscience* 29:111
- Semenzato G, Faddetta T, Falsini S, Del Duca S, Esposito A, et al. 2022. Endophytic bacteria associated with *Origanum heracleoticum* L. (Lamiaceae) seeds. *Microorganisms* 10:2086
- Liu L, Galileya Medison R, Zheng TW, Meng XJ, Sun ZX, et al. 2023. Biocontrol potential of *Bacillus amyloliquefaciens* YZU-SG146 from *Fraxinus hupehensis* against *Verticillium* wilt of cotton. *Biological Control* 183:105246
- Khan AR, Mustafa A, Hyder S, Valipour M, Rizvi ZF, et al. 2022. *Bacillus* spp. as bioagents: uses and application for sustainable agriculture. *Biology* 11:1763
- Shi Z, Guo Y, Wang Y, Yan X, Guo X, et al. 2024. Nitrogen-fixing bacteria promote growth and bioactive components accumulation of *Astragalus mongholicus* by regulating plant metabolism and rhizosphere microbiota. *BMC Microbiology* 24:261

- [30] Adeleke BS, Ayangbenro AS, Babalola OO. 2021. Genomic analysis of endophytic *Bacillus cereus* T4S and its plant growth-promoting traits. *Plants* 10:1776
- [31] Dong B, Deng Z, Liu W, Rehman F, Yang TJ, et al. 2022. Development of expressed sequence tag simple sequence repeat (EST-SSR) markers and genetic resource analysis of tea oil plants (*Camellia* spp.). *Conservation Genetics Resources* 14:41–45
- [32] Shurigin V, Li L, Alaylar B, Egamberdieva D, Liu YH, et al. 2024. Plant beneficial traits of endophytic bacteria associated with fennel (*Foeniculum vulgare* Mill.). *AIMS Microbiology* 10:449–467
- [33] Chen L, Wang X, Ma Q, Bian L, Liu X, et al. 2020. *Bacillus velezensis* CLA178-induced systemic resistance of *Rosa multiflora* against Crown gall disease. *Frontiers in Microbiology* 11:587667
- [34] Banchio E, Xie X, Zhang H, Paré PW. 2009. Soil bacteria elevate essential oil accumulation and emissions in sweet basil. *Journal of Agricultural and Food Chemistry* 57:653–657
- [35] Hossain S, Hasan R, Karmakar D, Tasnim N, Sultana R, et al. 2023. Isolation, screening, and molecular characterization of rhizosphere derived potential biofertilizer from different crops land for sustainable agriculture and environment. *Applied Environmental Biotechnology* 8:29–43
- [36] Yue L, Uwaremwe C, Tian Y, Liu Y, Zhao X, et al. 2022. *Bacillus amyloliquefaciens* rescues glycyrrhizic acid loss under drought stress in *Glycyrrhiza uralensis* by activating the jasmonic acid pathway. *Frontiers in Microbiology* 12:798525
- [37] Wu L, Xie Y, Li J, Han M, Yang X, et al. 2024. The effect of two siderophore-producing *Bacillus* strains on the growth promotion of perennial ryegrass under cadmium stress. *Microorganisms* 12:1083
- [38] Nanjundappa A, Bagyaraj DJ, Saxena AK, Kumar M, Chakdar H. 2019. Interaction between arbuscular mycorrhizal fungi and *Bacillus* spp. in soil enhancing growth of crop plants. *Fungal Biology and Biotechnology* 6:23
- [39] Ma X, Xu Z, Lang D, Zhou L, Zhang W, et al. 2022. Comprehensive physiological, transcriptomic, and metabolomic analyses reveal the synergistic mechanism of *Bacillus pumilus* G5 combined with silicon alleviate oxidative stress in drought-stressed *Glycyrrhiza uralensis* Fisch. *Frontiers in Plant Science* 13:1033915
- [40] Salem MA, Ismail MA, Radwan KH, Abd-Elhalim HM. 2024. Unlocking the potential of plant growth-promoting rhizobacteria to enhance drought tolerance in Egyptian wheat (*Triticum aestivum*). *Sustainability* 16:4605
- [41] Akhtyamova Z, Arkhipova T, Sharipova G, Ivanov R, Nuzhnaya T, et al. 2024. The effect of plant growth-promoting bacteria *Bacillus subtilis* IB-22 on the hydraulic conductivity and abundance of PIP2 aquaporins in the roots of an abscisic acid-deficient barley mutant. *International Journal of Molecular Science* 25:10706
- [42] Misra S, Chauhan PS. 2020. ACC deaminase-producing rhizosphere competent *Bacillus* spp. mitigate salt stress and promote *Zea mays* growth by modulating ethylene metabolism. *3 Biotech* 10:119
- [43] Chen L, Liu Y, Wu G, Veronican Njeri K, Shen Q, et al. 2016. Induced maize salt tolerance by rhizosphere inoculation of *Bacillus amyloliquefaciens* SQR9. *Physiologia Plantarum* 158:34–44
- [44] Zou L, Wang Q, Li M, Wang S, Ye K, et al. 2023. Culturable bacterial endophytes of *Aconitum carmichaelii* Debx. were diverse in phylogeny, plant growth promotion, and antifungal potential. *Frontiers in Microbiology* 14:1192932
- [45] Lee BD, Dutta S, Ryu H, Yoo SJ, Suh DS, et al. 2015. Induction of systemic resistance in *Panax ginseng* against *Phytophthora cactorum* by native *Bacillus amyloliquefaciens* HK34. *Journal of Ginseng Research* 39:213–220
- [46] Hazarika DJ, Goswami G, Gautom T, Parveen A, Das P, et al. 2019. Lipopeptide mediated biocontrol activity of endophytic *Bacillus subtilis* against fungal phytopathogens. *BMC Microbiology* 19:71
- [47] Akpor OB, Akinwusi OD, Ogunnusi TA. 2021. Production, characterization and pesticidal potential of *Bacillus* species metabolites against sugar ant (*Camponotus consobrinus*). *Heliyon* 7:e08447
- [48] López-Isasmendi G, Alvarez AE, Petroselli G, Erra-Balsells R, Audisio MC. 2019. Aphicidal activity of *Bacillus amyloliquefaciens* strains in the peach-potato aphid (*Myzus persicae*). *Microbiological Research* 226:41–47
- [49] Park G, Nam J, Kim J, Song J, Kim PI, et al. 2019. Structure and mechanism of surfactin peptide from *Bacillus velezensis* antagonistic to fungi plant pathogens. *Bulletin of the Korean Chemical Society* 40:704–709
- [50] Sun Y, Yang N, Li S, Chen F, Xie Y, et al. 2024. Mechanism of oxalate decarboxylase Oxd\_S12 from *Bacillus velezensis* BvZ45-1 in defence against cotton *Verticillium* wilt. *Journal of Experimental Botany* 75:3500–3520
- [51] Chaves-Gómez JL, Chávez-Arias CC, Prado AMC, Gómez-Caro S, Restrepo-Díaz H. 2021. Mixtures of biological control agents and organic additives improve physiological behavior in cape gooseberry plants under vascular wilt disease. *Plants* 10:2059
- [52] Zhang Y, Lang D, Zhang W, Zhang X. 2022. *Bacillus cereus* enhanced medicinal ingredient biosynthesis in *Glycyrrhiza uralensis* Fisch. under different conditions based on the transcriptome and polymerase chain reaction analysis. *Frontiers in Plant Science* 13:858000
- [53] Chu LL, Bae H. 2022. Bacterial endophytes from ginseng and their biotechnological application. *Journal of Ginseng Research* 46:1–10
- [54] Tripathi A, Pandey P, Tripathi SN, Kalra A. 2025. Plant growth-promoting endophytic consortium improved artemisinin biosynthesis via modulating antioxidants, gene expression, and transcriptional profile in *Artemisia annua* (L.) under stressed environments. *Plant Stress* 15:100757
- [55] Prakash J, Arora NK. 2019. Development of *Bacillus safensis*-based liquid bioformulation to augment growth, stevioside content, and nutrient uptake in *Stevia rebaudiana*. *World Journal of Microbiology and Biotechnology* 36:8
- [56] Zhang Q, Chang S, Yang Y, Xi C, Dong Y, et al. 2023. Endophyte-inoculated rhizomes of *Paris polyphylla* improve polyphyllin biosynthesis and yield: a transcriptomic analysis of the underlying mechanism. *Frontiers in Microbiology* 14:1261140
- [57] Wu W, Chen W, Liu S, Wu J, Zhu Y, et al. 2021. Beneficial relationships between endophytic bacteria and medicinal plants. *Frontiers in Plant Science* 12:646146
- [58] Zhao X, Huang LJ, Sun XF, Zhao LL, and Wang PC. 2022. Transcriptomic and metabolomic analyses reveal key metabolites, pathways and candidate genes in *Sophora davidii* (Franch.) Skeels seedlings under drought stress. *Frontiers in Plant Science* 13:785702
- [59] Belbahri L, Chenari Bouket A, Rezik I, Alenezi FN, Vallat A, et al. 2017. Comparative genomics of *Bacillus amyloliquefaciens* strains reveals a core genome with traits for habitat adaptation and a secondary metabolites-rich accessory genome. *Frontiers in Microbiology* 8:1438
- [60] Caulier S, Nannan C, Gillis A, Licciardi F, Bragard C, et al. 2019. Overview of the antimicrobial compounds produced by members of the *Bacillus subtilis* group. *Frontiers in Microbiology* 10:302
- [61] Han L, Zhang H, Bai X, Jiang B. 2023. The peanut root exudate increases the transport and metabolism of nutrients and enhances the plant growth-promoting effects of *Burkholderia pyrocinia* strain P10. *BMC Microbiology* 23:85
- [62] Jabborova D, Davranov K, Jabbarov Z, Bhowmik SN, Ercisli S, et al. 2022. Dual inoculation of plant growth-promoting *Bacillus endophyticus* and *Funneliformis mosseae* improves plant growth and soil properties in ginger. *ACS Omega* 7:34779–34788
- [63] Ren P, Zhou B, Bi Y, Chen X, Yao S, et al. 2025. *Bacillus subtilis* can promote cotton phenotype, yield, nutrient uptake and water use efficiency under drought stress by optimizing rhizosphere microbial community in arid area. *Industrial Crops and Products* 227:120784
- [64] Bhanse P, Kumar M, Singh L, Awasthi MK, Qureshi A. 2022. Chemosphere Role of plant growth-promoting rhizobacteria in boosting the phytoremediation of stressed soils: opportunities, challenges, and prospects National Centre for Biotechnology Information. *Chemosphere* 303:134954
- [65] Zhu Y, Lv X, Song J, Li W, Wang H. 2022. Application of cotton straw biochar and compound *Bacillus* biofertilizer decrease the bioavailability of soil Cd through impacting soil bacteria. *BMC Microbiology* 22:35
- [66] Sharma A, Singh SK, Maurya N, Tripathi SM, Jaiswal S, et al. 2025. Restoration of the soil fertility under Cr (VI) and artificial drought condition by the utilization of plant growth-promoting *Bacillus* spp. SSAU2. *International Microbiology* 28:81–93
- [67] Zennathara, Afrin S, Ali M, Islam MN, Saha ML. 2023. Exopolysaccharide producing bacteria of Sundarban Mangrove Forest soil and their

- antibiotic sensitivity profile. *Dhaka University Journal of Biological Sciences* 32:243–255
- [68] Hauschild K, Orth N, Liu B, Giongo A, Gschwendtner S, et al. 2024. Rhizosphere competent inoculants modulate the apple root-associated microbiome and plant phytoalexins. *Applied Microbiology and Biotechnology* 108:344
- [69] Ma B, Charkowski AO, Glasner JD, Perna NT. 2014. Identification of host-microbe interaction factors in the genomes of soft rot-associated pathogens *Dickeya dadantii* 3937 and *Pectobacterium carotovorum* WPP14 with supervised machine learning. *BMC Genomics* 15:508
- [70] Sharma M, Sudheer S, Usmani Z, Rani R, Gupta P. 2020. Deciphering the omics of plant-microbe interaction: perspectives and new insights. *Current Genomics* 21:343–362
- [71] Baslam M. 2023. Advances and new perspectives in plant-microbe interactions. *International Journal of Molecular Sciences* 24:5143
- [72] Emmenegger B, Massoni J, Pestalozzi CM, Bortfeld-Miller M, Maier BA, et al. 2023. Identifying microbiota community patterns important for plant protection using synthetic communities and machine learning. *Nature Communications* 14:7983
- [73] Hernández Medina R, Kutuzova S, Nielsen KN, Johansen J, Hansen LH, et al. 2022. Machine learning and deep learning applications in microbiome research. *ISME Communications* 2:98
- [74] Wang C, Cao Y, Wang Y, Sun L, Song H. 2019. Enhancing surfactin production by using systematic CRISPRi repression to screen amino acid biosynthesis genes in *Bacillus subtilis*. *Microbial Cell Factories* 18:90
- [75] Pichler M, Boreux V, Klein AM, Schleuning M, Hartig F. 2020. Machine learning algorithms to infer trait-matching and predict species interactions in ecological networks. *Methods in Ecology and Evolution* 11:281–293
- [76] Simon SM, Glaum P, Valdovinos FS. 2023. Interpreting random forest analysis of ecological models to move from prediction to explanation. *Scientific Reports* 13:3881
- [77] Wilhelm RC, van Es HM, Buckley DH. 2022. Predicting measures of soil health using the microbiome and supervised machine learning. *Soil Biology and Biochemistry* 164:108472
- [78] Berruto CA, Demirer GS. 2024. Engineering agricultural soil microbiomes and predicting plant phenotypes. *Trends in Microbiology* 32:858–873
- [79] Muñoz E, Carneiro J. 2022. Plant-microbe symbiosis widens the habitability range of the Daisyworld. *Journal of Theoretical Biology* 554:111275
- [80] Aziz MA, Khan AH, Adnan M, Ullah H. 2018. Traditional uses of medicinal plants used by Indigenous communities for veterinary practices at Bajaur Agency, Pakistan. *Journal of Ethnobiology and Ethnomedicine* 14:11
- [81] Deng LJ, Deng WQ, Fan SR, Chen MF, Qi M, et al. 2022. m6A modification: recent advances, anticancer targeted drug discovery and beyond. *Molecular Cancer* 21:52
- [82] Khatabi B, Gharechahi J, Ghaffari MR, Liu D, Haynes PA, et al. 2019. Plant-microbe symbiosis: what has proteomics taught us? *Proteomics* 19:e1800105
- [83] Dimopoulou A, Theologidis I, Liebmann B, Kalantidis K, Vassilakos N, et al. 2019. *Bacillus amyloliquefaciens* MBI600 differentially induces tomato defense signaling pathways depending on plant part and dose of application. *Scientific Reports* 9:19120
- [84] Thérien M, Kiesevalter HT, Auria E, Charron-Lamoureux V, Wibowo M, et al. 2020. Surfactin production is not essential for pellicle and root-associated biofilm development of *Bacillus subtilis*. *Biofilm* 2:100021
- [85] Castro-Restrepo D, Domínguez MI, Gaviria-Gutiérrez B, Osorio E, Sierra K. 2022. Biotization of endophytes *Trichoderma asperellum* and *Bacillus subtilis* in *Mentha spicata* microplants to promote growth, pathogen tolerance and specialized plant metabolites. *Plants* 11:1474
- [86] Blake C, Christensen MN, Kovács ÁT. 2021. Molecular aspects of plant growth promotion and protection by *Bacillus subtilis*. *Molecular Plant-Microbe Interactions* 34:15–25
- [87] Gadhave KR, Gange AC. 2016. Plant-associated *Bacillus* spp. alter life-history traits of the specialist insect *Brevicoryne brassicae* L. *Agricultural and Forest Entomology* 18:35–42
- [88] Human DJ, Potgieter L. 2023. Landscape configurations of refuge areas that delay the evolution of resistance to Bt sugarcane: an agent based modeling approach. *Journal of Economic Entomology* 116:1360–1371
- [89] Ai P, Xue D, Wang Y, Zeng S. 2023. An efficient improved CRISPR mediated gene function analysis system established in *Lycium ruthenicum* Murr. *Industrial Crops and Products* 192:116142
- [90] Alami MM, Ouyang Z, Zhang Y, Shu S, Yang G, et al. 2022. The current developments in medicinal plant genomics enabled the diversification of secondary metabolites' biosynthesis. *International Journal of Molecular Sciences* 23:15932
- [91] Kumar P, Kamle M, Borah R, Mahato DK, Sharma B. 2021. *Bacillus thuringiensis* as microbial biopesticide: uses and application for sustainable agriculture. *Egyptian Journal of Biological Pest Control* 31:95
- [92] Tsotetsi T, Nephali L, Malebe M, Tugizimana F. 2022. *Bacillus* for plant growth promotion and stress resilience: what have we learned? *Plants* 11:2482
- [93] Bueno CB, Dos Santos RM, de Souza Buzo F, Santos Reis de Andrade da Silva M, Rigobelo EC. 2022. Effects of chemical fertilization and microbial inoculum on *Bacillus subtilis* colonization in soybean and maize plants. *Frontiers in Microbiology* 13:901157
- [94] Gao P, Nasution AK, Ono N, Kanaya S, Altaf-Ul-Amin M. 2025. Investigating potential anti-bacterial natural products based on Ayurvedic Formulae using supervised network analysis and machine learning approaches. *Pharmaceuticals* 18:192
- [95] Xiong C, Zhu YG, Wang JT, Singh B, Han LL, et al. 2021. Host selection shapes crop microbiome assembly and network complexity. *New Phytologist* 229:1091–1104



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