nature biotechnology

Review article

Soil microbiome engineering for sustainability in a changing environment

Received: 22 February 2023

Accepted: 1 August 2023

Published online: 30 October 2023

Check for updates

Janet K. Jansson 🕑 🖂, Ryan McClure & Robert G. Egbert 🕑

Recent advances in microbial ecology and synthetic biology have the potential to mitigate damage caused by anthropogenic activities that are deleteriously impacting Earth's soil ecosystems. Here, we discuss challenges and opportunities for harnessing natural and synthetic soil microbial communities, focusing on plant growth promotion under different scenarios. We explore current needs for microbial solutions in soil ecosystems, how these solutions are being developed and applied, and the potential for new biotechnology breakthroughs to tailor and target microbial products for specific applications. We highlight several scientific and technological advances in soil microbiome engineering, including characterization of microbes that impact soil ecosystems, directing how microbes assemble to interact in soil environments, and the developing suite of gene-engineering approaches. This Review underscores the need for an interdisciplinary approach to understand the composition, dynamics and deployment of beneficial soil microbiomes to drive efforts to mitigate or reverse environmental damage by restoring and protecting healthy soil ecosystems.

To feed Earth's growing human population that is estimated to reach 8 and 9.8 billion by 2025 and 2050, respectively¹, new solutions provided by microorganisms are required. One promising approach to sustainably improve crop production and soil health is to harness the beneficial properties of soil microorganisms (Fig. 1). Certain soil microorganisms can be harnessed to promote plant growth by acting as fertilizers or pesticides, thereby reducing reliance on synthetic chemicals. These microorganisms may also be used to improve plant productivity in marginal soils, such as saline or alkaline soils, and/or during periods of drought². In addition, soil microorganisms have been used for remediation of organic and heavy metal pollutants in soil³⁴. Because soil microorganisms are integral to carbon cycling atmospheric carbon belowground⁵.

Our planet is currently experiencing unprecedented anthropogenic-induced changes, such as climate change and introduction of pollutants, that are having dramatic impacts on soil ecosystems and the beneficial services that they provide. Examples of climatic changes that impact crop-production systems include rising seawater levels in coastal areas, increases in areas of saline and alkaline soils, changes in precipitation patterns that result in more intense periods of flooding and drought, and increased wildfire frequency and intensity⁶. Increased global temperatures cause permafrost thaw at the poles, resulting in changes in landscapes, together with associated shifts in aboveground vegetation and belowground microbial communities⁷. Thawing permafrost also releases additional carbon dioxide and methane to the atmosphere as microbial activity increases, leading to feedback cycling of increased warming as atmospheric carbon drives a greenhouse effect⁸. Other negative anthropogenic impacts that are compounding those directly caused by climate change include deforestation, intensive agricultural practices that result in soil erosion and loss of carbon^{9,10}, and exposure of soil ecosystems to pollutant chemicals^{3,11}. The increased stresses placed on natural and managed soil ecosystems from anthropogenic impacts have spurred research into alternative approaches to reduce these negative environmental impacts.

Here, we will explore current needs for microbial solutions in soil ecosystems, report how these solutions are being developed and applied and elaborate on the potential for new biotechnology breakthroughs to tailor and target microbial products for specific

Earth and Biological Sciences Directorate, Pacific Northwest National Laboratory, Richland, WA, USA. 🖂 e-mail: janet.jansson@pnnl.gov



Fig. 1 | Soil microorganisms carry out key ecosystem services and have the potential to help mitigate a variety of deleterious anthropogenic impacts on soil ecosystems. White-boxed text indicates different deleterious anthropogenic impacts. Yellow-boxed text indicates different biological mitigation strategies. The rhizosphere is highlighted in the circle in the center, with associated mycorrhizal fungi (green threads), nitrogen-fixing noduleforming bacteria (brown nodules on the root) and a variety of root-associated

microorganisms that are indicated by the pink and yellow symbols. Top left, heavy metals (gray hexagons) that can be bound by heavy metal-binding bacteria (red rods) and pesticides (light green dots) that can be degraded by rhizosphere microorganisms. Bottom left, potential pests that include viruses (dark green sphere with knobs), bacteria (blue rod) and nematodes (green ribbon). C, carbon; N, nitrogen; P, phosphorus.

applications. We also highlight scientific and technological advances in soil microbiome engineering, which we classify into three pillars (Fig. 2): (1) the discovery and characterization of microbes that impact soil ecosystems, (2) understanding and directing how microbes assemble in structured communities to coexist and interact in soil environments, and (3) the developing suite of tools to genetically manipulate soil microbiomes to control composition, function and environmental persistence. An interdisciplinary approach to understand the composition, dynamics and deployment of beneficial soil microbiomes will drive efforts to mitigate or reverse severe impacts of anthropogenic activity by restoring and protecting healthy soil ecosystems.

The potential and challenges of harnessing soil microorganisms

Soil microorganisms are highly abundant and taxonomically diverse, with estimates of billions of microbial cells and thousands of species occurring in a single gram of soil¹². However, the majority of soil microorganisms have not yet been cultivated, which makes them difficult to study. In addition, microbial abundance and community composition vary widely across different soil types and geographic regions¹³. The soil microbial community, or soil microbiome, is also influenced by environmental variables. Increases or decreases in types and functional activities of soil microorganisms can occur depending on how the environment is altered by changes in temperature, soil moisture and other variables¹⁴.

Soil microorganisms include bacteria, archaea, fungi, protists and their respective viruses. Together, soil microorganisms interact to perform roles that are essential for normal ecosystem function. These roles include cycling of carbon and other nutrients, support of plant growth, degradation of pollutants and others. Some microbial populations carry out specific keystone functions for agriculture production and/ or ecosystem sustainability. For example, some species of rhizobia fix atmospheric nitrogen and provide it in a form that can be used by plants and other microorganisms¹. Other species carry out specific steps in cycling the resulting nitrogenous compounds¹⁵ and other essential nutrients. Some soil microorganisms decompose carbon compounds that comprise soil organic matter. However, most functions carried out by specific microorganisms in soil remain largely uncharacterized. This knowledge gap is primarily due to the difficulties in studying soil microorganisms due to (1) the physical heterogeneity of the soil matrix, (2) the high taxonomic and chemical diversity, with thousands of species and metabolites and millions of potential interactions, (3) the difficulty in studying microorganisms at the microscale at which they function in situ, and (4) the fact that most soil microorganisms have not yet been cultivated in a laboratory setting, and their functions therefore remain uncharacterized. Because uncultured microorganisms may have beneficial functions that are not yet characterized, they represent a potential opportunity that could be further explored¹⁶.

Despite these challenges, several methods have been developed and applied for the study of microorganisms in soil. Cultivation on solid or liquid medium has traditionally been used to obtain specific microbial isolates. The advantage of cultivation is that it facilitates biochemical and physiological studies of the isolated strains. Advances in culture-based approaches have helped to increase the number of known soil microbial isolates. For example, dilution-to-extinction culturing was successfully used to isolate hundreds of heterotrophic bacterial taxa from soil¹⁷. Microcultivation is an approach that relies on in situ systems that mimic the natural environment to favor growth of difficult-to-cultivate microorganisms. This was used to isolate new strains that degrade oil from contaminated soil¹⁸. In addition, a high-throughput cultivation approach, 'culturomics', was recently developed that uses machine learning and robotics to rapidly obtain isolates as colonies on microtiter plates¹⁹. A culturomic approach may also be used to identify soil taxa.



Fig. 2|**The three pillars of soil microbiome engineering are isolate discovery, assembled communities and genetic manipulation.** The interplay among these pillars will lead to advances in providing soil ecosystem services, including (1) mapping microbial functions to organisms and genes, (2) improved ecosystem function through the establishment of naturally evolved and synthetic microbial communities enhanced by engineered isolates, and (3) promoting biosafety and biosecurity goals by understanding colonization and containment dynamics at the ecosystem scale.

DNA sequencing is an approach widely used to determine the composition of soil microbiomes²⁰. Specifically, amplicon sequencing of 16S rRNA genes for bacteria and archaea and 18S rRNA genes or intervening sequences for Eukarya is routinely undertaken²⁰. Sequencing bypasses some of the limitations of cultivation because it captures the entire community, including cells that are inactive and/or dormant. However, a drawback is that dead cells may also be represented in the resulting sequence data. Another disadvantage of this approach is that it is only able to identify taxonomic signatures. This does not directly provide information on their functional potential. By contrast, metagenomic sequencing of DNA has the advantage of ascertaining the taxonomic and functional-genomic structure of the soil microbiome. However, metagenomic approaches are still challenging for certain soil types and for identifying low-abundance but potentially important species²¹. Higher-throughput sequencing can help with the depth-of-coverage issue, but this can lead to other problems related to high computational demands for large datasets²². In addition, quantitative analysis is challenging in the absence of absolute-abundance data. Most sequencing-based studies primarily rely on relative-abundance data. This can make it difficult to distinguish the actual abundance changes of a specific taxon from changes due to one species reducing in abundance, leading to greater fractional abundance for other community members23.

Many of the same issues that hinder DNA sequencing also apply to microbiome RNA sequencing (metatranscriptomics). Additional challenges include the fact that RNA is generally more unstable than DNA, is more difficult to extract from soil and is composed primarily of ribosomal RNA, which can make sequencing more difficult for more-informative messenger RNA transcripts that indicate function (reviewed in ref. 24). Depth of coverage is especially critical for metatranscriptomics, as individual genes are expressed at levels spanning orders of magnitude, thereby making identification of expressed genes that are transcriptionally regulated and/or from low-abundance species even more challenging. A promising technique that overcomes several of these issues is to incorporate stable isotopes (for example, ¹³C or ³H) into DNA or RNA during incubation under specific conditions. Subsequent extraction and sequencing of the heavy-labeled DNA or RNA provides information on specific microbial populations that are growing or incorporating specific substrates²⁵.

Study of community proteins (metaproteomics) provides information about specific microbial functions in soil. For a protein to be expressed, it must have already passed regulatory bottlenecks during transcription and translation. Therefore, detection of a protein provides an additional level of confidence that a function conferred by a particular protein actually occurred in the system of study. However, coverage issues and extraction challenges can also affect recovery and analysis of proteins expressed by soil microbiome constituents used for metaproteomic analyses²⁶. Another option for detection of specific proteins produced by microorganisms is to use activity-based probes²⁷. These are molecules that mimic enzyme targets and bind to them, allowing for their subsequent isolation and analysis²⁸. If the enzymes of interest are intracellular, the producing microorganisms can also be isolated, thereby providing information on which taxa are expressing a function of interest²⁷. Even when overcoming these challenges, obtaining high-quality omics data is only the first step toward gaining an understanding of microbial communities and functions in soil. Computational annotation and bioinformatic interpretation of omics data are also substantial challenges. This is largely due to the lack of fundamental knowledge regarding soil microbial processes. Many of these processes are carried out by species that are either completely unknown or, if they have been identified, our understanding of their fundamental biology is only partial, thus leading to gaps in our interpretation of data and the role of certain species in driving observed outcomes.

Several bioinformatic tools have been developed for interrogation (DRAM)²⁹ and integration (MEMPIS, XCMS) of omics datasets^{30,31}. The increasing availability of omics data provides an opportunity to mine the soil microbiome for specific species, genes, enzymes and/or functions that can be exploited for engineering applications. For example, metagenomes from saline soil were mined for genes that encode tolerance to salt stress³², from which a new cellulase was cloned from a sugarcane soil metagenome³³, and a new esterase was isolated from a plant rhizosphere soil metagenome³⁴. Several studies have also used amplicon sequencing to target specific microbial populations for isolation, such as previously uncultivated *Verrucomicrobia* spp. from the potato rhizosphere³⁵. Ideally, microorganisms with desired functions can be used as microbial inoculants for environmental-engineering applications in soil. Here, we will discuss different microbial-inoculation strategies that have been developed, tested and, in some cases, applied.

Characterization of specific isolates for improved plant performance

Traditionally, microbial inoculants for soil applications have relied on single organisms with beneficial functions that are isolated in culture, grown in large volumes and applied to the field. A classic example is the use of rhizobial inoculants to provide fixed nitrogen to legume crops in place of synthetic fertilizers¹. Arbuscular mycorrhizal inoculants have also been widely applied ³⁶ to supplement provision of nutrients to plants, especially phosphorus in P-limited soils. Other fungal inoculants include biocontrol strains of *Trichoderma* that attack plant-pathogenic fungi³⁷.

Several methods have been developed for cultivation of beneficial microorganisms for environmental applications. For example, members of the barley root microbiome were isolated using a trapbait approach³⁸. This approach used clay chips to capture most of the microorganisms present in the rhizosphere. Potentially beneficial strains can also be isolated by selective enrichment. For example, beneficial rhizosphere microorganisms were isolated following enrichment on plant root exudates³⁹.

Microbial inoculants for applications that benefit plants are often targeted to the root zone (rhizosphere) and are thus referred to as plant growth-promoting rhizobacteria (PGPR). Successful examples include the use of rhizobial inoculants to enhance soybean yields in Kenya⁴⁰ and Brazil⁴¹. Additional applications of PGPR include alleviation of abiotic stress in plants, promotion of plant growth by increasing nutrient availability and production of plant hormones and siderophores¹. For example, auxin biosynthesized by microorganisms is thought to be involved in beneficial plant-microbe interactions either indirectly via signaling pathways or directly by changing the root architecture and growth of the host⁴². Auxin from microorganisms (indole-3-acetic acid) also has several positive effects on plant growth, including promoting formation of root hairs and lateral roots⁴³. Other PGPR have been applied to mitigate plant salinity stress in a variety of studies (reviewed in ref. 44). For example, a strain of Bacillus licheniformis could improve the water-use efficiency of maize plants when compared to uninoculated plants⁴⁵.

Although several microbial species have been commercialized for delivery as PGPR to crop fields, their effects on plant performance are often inconsistent¹. In some cases, the applied strains perform poorly in the field environment in which they must compete with locally adapted microorganisms⁴⁶, and therefore the desired increases in crop yields are not realized⁴⁷. For example, tracking the abundance of inoculants added to promote growth of maize plants showed that levels of inoculants peaked at 50–100 d after inoculation but began to fall thereafter⁴⁸. Alternatively, some single-strain inoculants have even been shown to survive for years. This ability is not well understood and depends on the environment and type of inoculant, among other factors. For example, a single fungal strain added to soil was detected up to 15 years after the initial inoculation⁴⁹. A similar result was found with a *Bacillus* strain that was inoculated into soil and detected up to 3 years after application⁵⁰.

One of the major complications with application of PGPR is that individual formulations with a specific mode(s) of action may therefore limit their application to specific locations and/or soil and plant types¹. Introduction of non-native inoculants can also have unintended consequences on the local soil microbiome and the ecosystem functions they carry out⁵¹. This was found to be the case for some single inoculants of Rhizobium that led to long-lasting changes in both the bacterial and fungal communities of the soil^{52,53}. In addition, certain widely used fungal inoculants, such as arbuscular mycorrhizal fungi, have not been adequately assessed for their potential ecological impacts⁵⁴. The introduced fungi may behave as invasive species if applied in high enough concentrations. Because the diversity of soil fungi is known to positively correlate with ecosystem services, an imbalance could have negative repercussions⁵⁵. Therefore, selection of field inoculants should not only be based on their beneficial properties but also on their potentially negative impacts on the soil ecosystem.

Assembly of natural and artificial microbial communities

Although most soil inoculants to date comprise single isolates, there is increasing interest in application of communities of microorganisms ('consortia'), to provide greater resilience to stress and to improve their ability to survive competition from resident microorganisms to enable them to persist and perform their intended functions. Multi-strain inoculations also allow for a greater breadth of ecological functions to be added to the soil microbiome and a larger palette for genetic manipulation of functions that can be introduced to soil. Development of microbial consortia for soil applications proceeds along one of two routes: (1) combining isolates into synthetic communities ('SynComs')

and (2) deriving naturally enriched natural communities with reduced complexity ('NatComs') (Fig. 3). SynComs are typically built from a relatively simple (2-5-member) pre-existing collection of isolates to facilitate their formulation and environmental application and to aid in studies of interspecific interactions⁵⁶⁻⁵⁹. Technological developments for building SynComs include high-throughput screening of potential combinations of species⁶⁰ and selective culturing. Once the optimal species are identified, they can be combined into specific formulations to carry out a given environmental function. SynComs built from characterized isolates offer several benefits over less-characterized systems. As they are built from individual isolates, the community composition is already known. In addition, the individual isolates can be characterized separately for their performance and genomic data. The role of each member can be defined using leave-out experiments or genetic manipulation⁶¹. An example of a SynCom for soil is a collection of three isolates from the soybean rhizosphere that was named the hitchhikers of the rhizosphere (THOR)⁶². The individual constituents of THOR were selected based on their potential influence in the rhizosphere and their root-distribution patterns. Only isolates that were genetically tractable were selected. THOR has since proven to be a valuable model community for understanding microbial community interactions in a genetically tractable system. Another example of a SynCom is a community of 16 species built from soil surrounding switchgrass plants⁶³. While defined SynComs do have some benefits, their main drawback is that sets of isolates must first be collected, purified and studied in isolation. Only species that grow in pure culture in a laboratory setting are practical for SynComs. Furthermore, the species that are combined may not represent species that naturally interact, which may reduce their ability to persist together in the soil environment.

An alternative approach for development of mixed inoculants is to enrich microorganisms from the soil environment in which community members have naturally evolved to interact with each other (NatComs) (Fig. 3). A selective enrichment process combined with a dilution approach can be used to reduce community richness and to select for communities with a specific desired trait or combination of traits⁶⁴. For example, Model Soil Consortium 1 (MSC-1) was enriched from soil using chitin as a substrate⁶⁵. The resulting community contained approximately 30 members that demonstrated several positive interactions during chitin decomposition.

NatComs have some key advantages over SynComs; the major one being that, as they are allowed to develop naturally, they are more likely to represent native interactions. The user or developer has little input on which species are retained or lost in the NatCom as this is driven primarily by microbial ecology. In some cases, communities can be developed that have advantages of both NatComs and SynComs. This is the case for Model Soil Consortium 2, which is a combination of eight isolates derived from the MSC-1 NatCom⁶⁶. As this consortium is a combination of individual isolates, it has elements of a SynCom. However, because the isolates were selected from a naturally evolved community (MSC-1), this implies that the interactions between community members are more likely to reflect those driven by microbial ecology in nature rather than an arbitrary assembly of soil isolates. Examination of Model Soil Consortium 2 has shown that only a subset of species contributes to the metabolism of abundant carbon and nitrogen sources, likely sharing these breakdown products with other members of the consortium⁶⁶. These results suggest that the ability to metabolize a major nutrient source is not the only factor determining whether a species will be successful in a community context. Rather, this study suggested that the fundamental niche size of a species (how many carbon sources it can metabolize) is the main determinant of success, at least as measured by abundance.

One of the main advantages of reducing the soil microbiome complexity is the ability to better delineate possible interactions between species that give rise to the functions of the greater soil microbiome. Sequencing data based on the 16S rRNA gene are normally used to



Fig. 3 | **Design of tractable communities of soil microbes.** The design of tractable communities usually proceeds along one of two routes. In the naturally evolved route (NatCom), naturally interacting members of the soil microbiome are enriched from soil. In a SynCom, individual isolates are combined to form

a community. A SynCom leads to much greater control of the community's constituents as well as more inherent knowledge of the potential processes, but the individual SynCom members may not naturally interact and may be less stable in the environment than a NatCom.

infer a network in which taxa are linked based on their co-abundances across a range of samples and/or experimental conditions. Networks can be built using Pearson or Spearman correlations, but other network-inference tools have also been used (reviewed in refs. 67,68). Once inferred, networks have been used to predict species interactions (that is, those that are strongly correlated in abundance), the nature of the interaction (a positive correlation may indicate cooperation, and a negative correlation may indicate competition), and keystone members in a community (by identifying central nodes in the network) (Fig. 4). For example, network analysis was used to identify potential keystone species in MSC-1, such as members of the *Streptomyces* and *Rhodococcus* genera⁶⁵.

Network inference can be a powerful tool to view potential interactions between species, but care must be taken when interpreting coexpression networks. Species co-abundance networks are normally derived from macroscale amounts of soil (0.1–1g) and thus include species that may not normally co-occur on a microbiological scale. In addition, mechanical processing of soil samples (sieving, homogenizing, bead beating, etc.) destroys the native structure of the soil. Therefore, co-occurrence networks are not in themselves definitive proof of species interactions. Indeed, new studies have suggested that interaction networks, in some cases, may be driven more by the richness of the samples rather than by individual interactions⁶⁹. The main advantage with network analyses is that they provide an integrated and high-level view of the system that can point researchers in the right direction to pursue more targeted experiments to test specific hypotheses.

Environmental applications of soil inoculants

Soil inoculants have been developed for a variety of applications, including bioremediation of pollutants, improvement of soil fertility and support of plant growth (Fig. 1). For example, the toxic pollutant 2,4-dinitrotoluene was degraded in contaminated soil by an engineered strain of *Pseudomonas putida* in association with plants⁷⁰. However, the majority of recent studies have instead focused on promotion of plant growth. We therefore mainly highlight that application in this Review.

There is increasing interest in designing SynComs and NatComs (Fig. 3) to promote plant growth and resilience in the face of climate change and other stress conditions. Design of SynComs for soil applications can, however, be impeded by lack of understanding of the complexity of natural interactions that can occur between community members in the environment. One approach that can circumvent this is to design SynComs based on knowledge of the core microbiome, which consists of a specific combination of microorganisms that are recruited by a given plant species (reviewed in ref. 63). For example, the core microbiome associated with 12 cultivated varieties belonging to the Citrus genus has been defined as Pseudomonas, Agrobacterium, Cupriavidus, Bradyrhizobium, Rhizobium, Meorhizobium, Burkholderia, Cellvibrio, Sphingomonas, Variovorax and Paraburkholderia⁷¹. By contrast, that of potato has been defined as Bradyrhizobium, Sphingobium, Microvirga, Blastococcus and SMB53 (ref. 72). The hypothesis behind this strategy is that the core microorganisms are adapted to a given plant species and can serve to benefit the growth of that plant across a variety of habitats. By focusing on species that comprise the core microbiome, it is possible to circumvent the assembly challenges with a greater diversity of microorganisms. While these approaches have been met with success, there are drawbacks related to the fact that there can be minor differences between strains and species of the same genus that can lead to major differences in function, particularly in specialized metabolism. This means that building a SynCom from available isolates defined at the genus (or even species) level can be misleading. One alternative is to use isolates cultivated directly from the soil site of interest for construction of native SynComs to increase the potential for inclusion of site-adapted strains with desired functions.

There are several examples of SynComs that have been built for specific soil environmental applications. A SynCom was developed to provide tomato plants protection against bacterial wilt disease caused by *Ralstonia solanacearum*⁷³. The SynCom consisted of four Gram-positive bacteria and helped to confer disease resistance to tomato plants. Another example was the use of a SynCom to help alleviate water-deficit stress in maize⁷⁴. This SynCom consisted of 17 isolates from the sugarcane core microbiome⁷⁵. Application of this SynCom may have helped to stimulate production of plant osmolytes, as suggested by the enrichment of ABC-type transporters for different osmolyte molecules in the genomes of the community members⁷⁶. This is an example of cross-species protection because the same SynCom was beneficial to both sugarcane and maize (Poaceae)^{75,76}.

While applications of SynComs to soil have led to some benefits, there are also important concerns about applying non-indigenous microbial consortia to a soil ecosystem. In some cases, the applied SynComs can alter the existing microbiome, shifting the abundances



Fig. 4 | **Schematic of a co-abundance network for microbial taxa**. Microbial taxa are represented with distinct shapes and colors. Potential interactions between species (for example, exchange of metabolites, predation, cross-feeding) are indicated by lines connecting taxa. These lines are drawn based on co-abundances of these species across a range of conditions or samples. Gray lines indicate positive co-abundances and may point to positive interactions, while yellow lines indicate negative co-abundances and putative negative interactions. By using this approach at a community level, taxa that are critical to the community can be identified. These may be species of 'high betweenness' (acting as a bridge point connecting two separate clusters of taxa) or 'high degree' (having a large number of connections to other taxa).

of certain rhizosphere members based on interactions and recruiting new members from the existing rhizosphere community. This was found to be the case with the maize SynComs described above^{74,75}. Here, the added SynCom competed with the existing microbiome and displaced it, in the process promoting maize growth. However, these experiments were carried out in a laboratory setting and over a relatively short timeframe (4 weeks). In another case, SynComs directly added to field sites had a positive effect on plant growth⁷⁷. To what extent the members of the added SynCom were still present was not evaluated in this case, but the effect of the SynCom addition was clear even when applied in the context of an existing community⁷⁷. Another study found a similarly positive effect of SynComs in promoting the growth of wheat. The persistence of the SynCom was monitored in the native soil, finding that it dropped dramatically after 2 weeks⁷⁸. These conclusions and other work⁷⁹ suggest that some SynComs may be short lived in native soil, and their use may therefore be limited by the need for repeated applications.

Although a single-strain inoculum has the advantage of ease of growth and formulation compared to a multi-species inoculum, consortia potentially allow for a wider range of desirable traits to be added to soil and take advantage of the inherent benefits of microbial interactions driving emergent functions. However, it must be acknowledged that use of single inoculants or consortia depends on the specific environmental application. A meta-analysis of over 400 experiments showed that single-species inoculations increased crop growth up to 41% more compared⁸⁰ to inoculations with consortia of microorganisms. In addition, a combined treatment with three fungal strains was less efficient at promoting strawberry plant growth than a treatment consisting of a single strain⁸¹. Another study with tomato plants found no synergistic effect of adding two species (Bacillus subtilis and Azospirillum brasilense) compared to each species individually⁸². It should be noted that many of the studies in these analyses were focused on plants in controlled environments over short timeframes. In natural field soils, combined inoculations may perform better. For example, three strains of bacteria (belonging to Microbacterium, Stenotrophomonas and Xanthomonas) that were specifically recruited in the rhizosphere of Arabidopsis thaliana plants provided control of the downy mildew plant pathogen when they were inoculated together in soil, but the individual-strain inoculants were not able to do so⁸³. Because multi-species communities have been used for far less time than single-strain inoculants, a direct comparison of the two approaches does not provide equal weight to the scientific history of each approach. Another approach to consider is inoculation with fully complex communities. This approach relied on soil translocation to successfully to restore degraded soils⁸⁴. Ultimately, the use of single species or communities comes down to the specifics of the plant being targeted, the environmental conditions and the desired output.

Strategies for genetic manipulation of microorganisms

New synthetic biology tools are continually being developed for genetic transformation, strain optimization and biocontainment of soil microorganisms⁸⁵ that are designed to address current environmental and sustainability challenges (Fig. 5). Synthetic biology is a field of science that incorporates aspects of both molecular biology and genetic engineering⁸⁶. For example, advances in synthetic biology and genetic engineering tools are being used to discover and enhance native microbial functions^{87,88}, introduce new traits⁸⁹, develop biological sensors⁹⁰, eliminate bottlenecks that limit critical pathways⁹¹ and combine multiple beneficial traits into a single organism⁹². Additionally, the environmental persistence of engineered functions can be controlled through containment measures at the species and community levels. To meet growing needs for synthetic biology studies on environmental isolates93, considerable advances have been made in the following areas: (1) developing genetic tools for new soil microbial isolates, (2) high-throughput genome-scale gene editing, (3) in situ microbial community editing using conjugation and CRISPR-Cas technologies and (4) platforms to reproducibly interrogate plant-microbe interactions via microscopy and multiomics. An important ethical consideration for engineered microbes in soil environments is the potential ecological and biosecurity impacts of their environmental proliferation. Despite substantial advances in the field, challenges remain in predicting soil microbiome functions and interactions from available data and algorithms and in optimizing engineered microbiome functions in the field.

Most synthetic biology to date has been performed on model laboratory isolates that are used as an experimental chassis for DNA circuit and metabolic pathway design. For soil applications, the bacterium *P. putida* has been used extensively as a model soil microbial chassis⁹⁴. Among other relevant applications for soil, *P. putida* has been used as a model strain for bioremediation of environmental pollutants³. The explosion of interest and momentum in studying soil isolates and communities are likely to add hundreds of new microbial hosts compatible with synthetic biology practices. To date, a maize-associated, nitrogen-fixing strain of *Klebsiella variicola* was engineered to increase fixation of atmospheric nitrogen in the field by engineering the genome to relieve gene-regulatory barriers⁹¹. Furthermore, root-associated *Ralstonia* and *Pseudomonas* strains have been engineered to increase bioavailable phosphate for plant growth by breaking down phytate⁸⁹.

Genetic transformation of new hosts

Synthetic biology approaches have advanced considerably in the last decade to enable targeted optimization and design of microorganisms, including soil isolates, for specific sensing or metabolic functions. Gene editing is a fundamental tool of synthetic biology that has undergone major recent advances for non-model hosts. Directed gene edits are primarily carried out through native recombination of homologous DNA, enhanced by approaches that increase recombination efficiency⁹² or allow the selection of gene edits without antibiotic markers⁹⁵. Precision gene editing requires whole-genome sequence data and methods for genetic transfer into the cell.

Genetic transformation efficiency can be highly variable across microbial taxa, even at the genus level, and remains a technical challenge for environmental isolates. Optimization of intracellular



Fig. 5 | Platforms to edit and evaluate genome modifications of soil microbiome isolates. Platforms and approaches in the image, starting clockwise from the top left: (1) isolate engineering: establishing genetic tools for soil microbiome isolates must overcome transformation barriers, such as host-specific methylation patterns (colored dots on DNA strands), and use genetic parts for gene editing and gene expression that are compatible with the target host. (2) Fabricated ecosystems: the design, build, test and learn cycle for soil microbiome engineering will be substantially accelerated by field-simulant fabricated ecosystems that reveal plant-microbe interactions and can be reproducibly deployed across research laboratories. (3) High-throughput genetics: when employed at the genome scale, high-throughput genetic tools

can indicate microbial function in the context of microbial communities and accelerate the development of engineered functions. Community contexts provide insight into strategies to control the environmental persistence of engineered functions. (4) Ecological containment: specific strains can be engineered to carry out a desired function at the target site, for example, the rhizosphere. In this example, either engineering metabolic dependency on the plant or introduction of genes for which the products kill the cells when they leave the rhizosphere can be effective biocontainment options. (5) Community gene engineering: this approach relies on plasmids to introduce functional genes to other members of the soil community. Plants and bacteria are not drawn to scale.

DNA-delivery efficiency has been realized through advances in electroporation methods^{96,97}. Low-volume microfluidic electroporation enabled the transformation of combinatorial libraries⁹⁷, whereas large-volume, continuous-flow microfluidic electroporation enabled the transformation of large mutant libraries at scale for strains with lower transformation efficiencies⁹⁶. A major barrier to DNA stability after entry in the cell is cellular defense mechanisms, such as the degradation of introduced nucleic acids via restriction endonucleases. Restriction endonucleases degrade intracellular DNA that does not contain the host's native methylation patterns. To overcome this barrier, heterologous expression of methyltransferases from a target host in a surrogate strain, such as Escherichia coli, enabled efficient transformation of plasmid DNA by mimicking the methylation patterns of the target host⁹⁸. Native methylation patterns have been decoded through single-molecule pore sequencing and custom workflows⁹⁹, which are likely to extend genetics to new soil isolates by creating surrogate methylation strains that generate host-compatible DNA.

High-throughput strain optimization

Certain technologies allow for high-throughput and tailored optimization of microbial strain phenotypes (Fig. 6). High-throughput approaches for genome integration and transformation enable optimization of strain function and genetic stability in genetically tractable hosts. These approaches include the creation and evaluation of gene expression libraries across taxonomically diverse microbes^{100,101}, engineered protein libraries¹⁰² and combinatorial pathway-expression libraries¹⁰³. These approaches overcome uncertainties regarding sequence–function relationships by creating and screening massive collections of functional variants. The advent of deep-learning approaches applied to synthetic biology^{104,105} could rapidly accelerate the realization of designer functions in soil microorganisms through genome engineering.

Multiple genome-editing approaches have been applied to engineer genetically stable bacterial strains that could be used for soil microbiome engineering. Chromosomally integrated DNA is more genetically stable and does not require antibiotics that are generally necessary to maintain plasmid DNA and impractical for deployment in soil environments. Recombineering is a short-homology recombination method designed to integrate single-stranded oligonucleotides or double-stranded DNA into microbial genomes and can be accomplished efficiently using homologous sequences as short as 35 bp¹⁰⁶. This approach was adapted to create CRISPR-Cas9 gene-edited mutant libraries that are genetically barcoded to map functions to individual genes in a high-throughput, genome-wide manner¹⁰⁷. Another successful approach to genetic transformation is the construction of an engineered or minimal integrative and conjugative element (mini-ICE) in B. subtilis to specifically engineer the genomes of target hosts¹⁰⁸. The mini-ICE system removes fragments that enable jumping from organism to organism, resulting in 'one-hop' modifications of microbial genomes, with efficacy in Gram-positive bacilli, including in soil environments.

Phage recombinase-based methods have emerged as powerful techniques for engineering large gene clusters and creating high-throughput genome variant libraries. Recombinase-assisted approaches are more universally effective than recombineering strategies, which have primarily found success in model hosts such as *E. coll*⁹². By contrast, chassis-independent recombinase-assisted genome engineering (CRAGE)¹⁰⁹ demonstrated the integration of large biosynthetic gene clusters in dozens of proteobacteria hosts using Cre-*lox* recombination and was used to show that engineered bacteria can release phosphate to plants⁸⁹. Using a collection of up to ten independent integration sites and their cognate recombinases, serine recombinase-assisted genome engineering (SAGE)¹⁰¹ has been demonstrated to integrate heterologous DNA constructs in



Fig. 6 | **Genome-editing approaches for soil microbiome engineering. a**, Sitespecific recombination uses serine recombinases (SAGE, shown in graphic) or tyrosine recombinases (CRAGE) to integrate engineered DNA into specific sites on bacterial chromosomes, including those of soil isolates, with high efficiency. **b**, Engineered homologous recombination, or recombineering, relies on native or engineered proteins to create deletions, insertions or directed mutations in DNA using single-stranded or double-stranded substrates with homology for the target site. Recombineering methods enhanced by CRISPR–Cas counterselection ease introduction of mutation without selection markers and can be employed

to selectively promote or kill strains in microbial communities (ssCRISPR) or to create genome-wide pooled mutant libraries. **c**, Direct community editing has been demonstrated using conjugative transfer, using *an E. coli* host (MAGIC) to transfer a replicative or integrative plasmid to the mouse microbiome or a *Bacillus* host expressing a mini-ICE to Gram-positive bacteria in soil communities. **d**, Engineered CRISPR–Cas transposase complexes can create directed gene edits without homologous recombination (INTEGRATE) and have been demonstrated to engineer members of microbial consortia (DART). PAM, protospacer-adjacent motif.

five taxonomically diverse hosts as efficiently as plasmid transformation, which conventionally transforms orders of magnitude more efficiently. SAGE enables construction of combinatorial strain libraries through iterative integration of DNA constructs and was used in multiple plant-derived soil isolates to evaluate a panel of hundreds of promoters from taxonomically diverse species as tools for genetic circuits or metabolic pathways.

Engineering microbial communities in situ

Recent developments show promise for in situ control of microbial community composition, host-agnostic community function and host-specific genome edits, including those that originate from soil (Fig. 6). Strain-specific CRISPR (ssCRISPR) was developed to edit the membership of a microbiome community and selectively purified or eliminated members of a synthetic collection of model hosts¹¹⁰. The approach uses CRISPR–Cas guide RNA species unique to a target host to elicit strain-specific DNA cleavage and cell death or to introduce an antibiotic-resistance marker gene to selectively enrich a target strain. Metagenomic alteration of the gut microbiome by in situ conjugation (MAGIC) was developed to transfer a function to the community via conjugation without specific knowledge of the metagenome or the genetic tractability of community members¹¹¹. In MAGIC, a replicative or integrative plasmid was transferred by *an E. coli* donor to a complex community to confer a fluorescence or antibiotic-resistance phenotype

that, under some circumstances, persisted in a mouse host for at least 11 days. Although MAGIC was demonstrated in the mouse gut, similar approaches could be extended to transform a soil microbiome with an engineered function in a host-agnostic manner.

Direct genome edits within complex communities have been enabled by engineering advances in high-efficiency CRISPR-Cas systems. The insertion of transposable elements by guide RNA-assisted targeting (INTEGRATE), an engineered version of recently discovered CRISPR-transposon systems, enabled high-efficiency genome integration of large genetic constructs without selection markers⁹⁵. DNA-editing all-in-one RNA-guided CRISPR-Cas transposase (DART), a similar CRISPR-transposase system, was exploited to establish host-specific genome editing within a nine-member, synthetic soil microbial community and extended to infant gut microbiome samples¹¹². Efficient DART targeting was enabled by environmental transformation sequencing of the microbial community, a method to identify genetically transformable members of a mixed community by mapping genome-integration events of a transposable element by high-throughput sequencing. Genome editing in microbial communities enabled by environmental transformation sequencing could take advantage of accessibility of metagenome-assembled genomes (MAGs) from soil metagenomes, although rare species might not be represented. While these advances represent unprecedented access to genome editing within a microbial community, substantial hurdles

remain to assess the efficacy of these in situ editing approaches in non-laboratory environments.

Containment of engineered microbes

When deploying microbial systems to promote soil and plant health. biosecurity is often a critical consideration. In this context, 'biosecurity' refers to preserving the resilience of native ecosystems and restricting the proliferation of engineered functions beyond the expected spatiotemporal operating bounds. Developing effective containment approaches for engineered microbial functions could help minimize regulatory hurdles and public hesitation regarding engineered microbial systems being used in the environment. Risk assessment involves several steps that need to be evaluated before field application. These include extensive identification and evaluation of potential adverse consequences¹¹³. Therefore, despite the original promise and excitement about the potential applications of genetically modified microorganisms, there have been few recent examples of field releases. The majority have focused on non-food applications, such as bioremediation of heavy metals and xenobiotic compounds and/or biostimulation of the rate of microbial degradation of pollutants¹¹³⁻¹¹⁵. Currently, it is difficult to gauge how readily future applications that target crop productivity and climate-change mitigation will be approved.

Traditionally, containment measures for soil microorganisms have relied on introduction of amino acid auxotrophies, environmentally triggered toxins or combined use of these approaches¹¹⁶. For example, a strain of *P. putida* was engineered to be metabolically dependent on phosphite, a rare compound in nature¹¹⁷. The strain was engineered both to assimilate phosphite and disable its ability to transport and grow on phosphate. Synthetic biology has introduced other new approaches, including the integration of multiple signals, and inherent redundancy to suppress escape via individual mutations. These approaches include introduction of non-canonical amino acids¹¹⁸ and environmentally sensitive kill switches that incorporate logic gates¹¹⁹. More recently, increased genetic stability of kill switches has been demonstrated by introducing redundancy¹²⁰. Despite early interest in biocontainment of genetically engineered microorganisms designed for soil applications, there are only a few recent examples⁸⁵. One example is the control of the persistence of Bacillus thuringiensis spores by introducing a genetic circuit that prevented sporulation¹²¹. An important consideration for biocontainment is to avoid the use of antibiotic-resistance genes that could potentially spread and contribute to the growing health concern of antibiotic-resistant pathogens¹²². While these technical advances provide new tools to control the function of engineered microbial systems in the environment, efficacy in field environments remains a frontier for biosecurity research related to the release of engineered microbial functions.

Soil microbiome-testing platforms

A challenge is scaling results from the laboratory and the greenhouse to the field. We acknowledge that laboratory studies are invaluable for gaining detailed knowledge regarding species interactions, how they can be harnessed and modified, what the keystone species are and the development of tools to change these species to gain more from the soil. However, laboratory studies are not 'the field', and care must be taken that the information gained is physiologically and ecologically relevant to field processes. Although direct analysis of soil microorganisms in the field, for example, using multiomic analyses, is progressing, it remains a daunting challenge due to the complexity of the natural environment.

The development of new testing platforms allows for a detailed study of complex, field-relevant systems in a laboratory setting. As these tools become more common, they can be used to generate specific hypotheses that can be tested in a native field system, bridging the gap between laboratory and field for a more detailed but translational understanding of soil microbial systems. For example, rhizotrons and other specialized chamber systems have been developed to study plant-microbe interactions¹²³. Testing systems are also available to determine the fate and efficacy of engineered and native soil microorganisms for environmental applications. For example, fabricated ecosystems (ecoFABs) provide standardized platforms for plantmicrobiome studies across laboratories that promote reproducible findings (Fig. 5)¹²⁴. Another platform is the 'rhizochip', which uses structured polymer molds to mimic irregular soil particles and leads to root growth and exudation profiles that mimic soil growth¹²⁵. Rhizochip growth assays are compatible with light microscopy and spatial mass spectrometry. To enable spatially resolved investigations of plantmicrobe interactions, three-dimensional-printed 'rhizogrid' scaffolds allow integration of X-ray computed tomography, high-throughput taxonomic profiling and metabolomics data from segmented soil and rhizosphere samples at multiple depths¹²⁶. Currently, an opportunity exists to increase the field relevance of these platforms by integrating synthetic, reproducible soil systems to emulate the geochemistry of regional soils using laboratory reagents and resources¹²⁷.

Engineering the rhizosphere of the plant host

Another approach for engineering the soil microbiome is to engineer the plant to produce specific compounds in the rhizosphere that select for beneficial members of the community. This approach relies on the ability of plant root exudates to shape the composition of soil microorganisms associated with their roots. For example, root exudation of sucrose promoted colonization of the beneficial soil microorganism B. subtilis on the roots of A. thaliana plants¹²⁸. Differences in root exudation of specific flavonoid compounds also influenced the ability of arbuscular mycorrhiza to colonize the invasive plant Triadica sebifera¹²⁸. Production of benzoxazinoids that are defensive metabolites produced in roots resulted in alteration of the rhizosphere microbiomes of maize plants¹²⁹. Barley engineered to produce rhizopine¹³⁰ coupled with a synthetic nitrogen-fixation phenotype regulated by rhizopine in the bacterium Azorhizobium caulinodans enabled activation of nitrogen fixation by the microbe only in the presence of the modified barley^{131,132}. These studies suggest that plants may be engineered to produce specific root-exudate compounds for targeted recruitment of beneficial microbes, natural or engineered. A related approach is to stimulate growth of beneficial microbes by conditioning soil with specific root exudates that are known to recruit beneficial microbes. For example, combinations of fatty acids and amino acids enriched different rhizosphere microbes when compared to combinations of organic acids and sugars. Several bacterial isolates were isolated from the soil enrichments, and some of them protected the host from a foliar pathogen infection⁹¹. Identification of plant quantitative trait loci that are responsive to specific beneficial microorganisms and/or environmental conditions can also be used for plant selection 132 .

Remaining gaps and opportunities for soil microbiome engineering

Although this Review has summarized the current state of the science, several hurdles remain before wide-scale implementation of soil microorganisms can be applied for tackling pressing issues in the face of climate change, an increasing global human population and a decline in wildlife habitat and biodiversity. Soil microorganisms have the potential to alleviate issues associated with these challenges, but we are still largely working in context with several unknowns with respect to understanding the functional potential of soil microorganisms, how they work together as a community and how they can best be collected and formulated to provide the desired beneficial outcome. Furthermore, with respect to working with genetically engineered strains, regulatory hurdles remain that limit their widespread application.

The largely untapped potential of soil microorganisms presents a tremendous opportunity for mitigating many of the challenges facing the environment. These opportunities include using natural or

Review article

engineered soil inoculants and consortia for remediation of polluted and otherwise degraded soils, maintaining and improving crop performance and mitigating certain negative consequences of climate change. For example, soil microorganisms may help to reduce levels of greenhouse gases and sequester carbon in soil¹⁴. Advances in genetic engineering of soil microorganisms and associated knowledge of biocontainment of released soil microorganisms can also be valuable for containment of unintended releases or cases of bioterrorism. Lastly, knowledge obtained on how best to manipulate soil microorganisms for desired functions may be used at a 'systems level' by soil managers for specific crops by adding soil amendments that optimize the chances for natural soil microorganisms to grow and thrive. This last situation may turn out to be one of the most valuable for taking advantage of the inherent beneficial properties that are carried out by interacting members of the soil microbiome. Ultimately, the combination of several strategies is necessary to meet challenges that we are facing with climate change and a growing human population, including genetic engineering of microorganisms and plants and use of best practices that promote ecosystem sustainability¹³³.

References

- Vejan, P., Abdullah, R., Khadiran, T., Ismail, S. & Nasrulhaq Boyce, A. Role of plant growth promoting rhizobacteria in agricultural sustainability—a review. *Molecules* 21, 573 (2016).
- Naylor, D. et al. Soil microbiomes under climate change and implications for carbon cycling. *Annu. Rev. Environ. Resour.* 45, 29–59 (2020).
- Gong, T. et al. An engineered *Pseudomonas putida* can simultaneously degrade organophosphates, pyrethroids and carbamates. Sci. Total Environ. 628, 1258–1265 (2018).
- Rajkumar, M., Ae, N., Prasad, M. N. V. & Freitas, H. Potential of siderophore-producing bacteria for improving heavy metal phytoextraction. *Trends Biotechnol.* 28, 142–149 (2010).
- Bhattacharyya, S. S., Ros, G. H., Furtak, K., Iqbal, H. M. & Parra-Saldívar, R. Soil carbon sequestration—an interplay between soil microbial community and soil organic matter dynamics. Sci. Total Environ. 815, 152928 (2022).
- 6. Intergovernmental Panel on Climate Change (ed.). *Climate Change 2014: Synthesis Report* (Intergovernmental Panel on Climate Change Fifth Assessment Report, 2014).
- 7. Jansson, J. K. & Taş, N. The microbial ecology of permafrost. Nat. Rev. Microbiol. **12**, 414–425 (2014).
- 8. Natali, S. M. et al. Permafrost carbon feedbacks threaten global climate goals. *Proc. Natl Acad. Sci. USA* **118**, e2100163118 (2021).
- 9. Abdalla, M. et al. A critical review of the impacts of cover crops on nitrogen leaching, net greenhouse gas balance and crop productivity. *Glob. Chang. Biol.* **25**, 2530–2543 (2019).
- Furey, G. N. & Tilman, D. Plant biodiversity and the regeneration of soil fertility. Proc. Natl Acad. Sci. USA 118, e2111321118 (2021).
- Cleary, D. W. et al. Long-term antibiotic exposure in soil is associated with changes in microbial community structure and prevalence of class 1 integrons. *FEMS Microbiol. Ecol.* 92, fiw159 (2016).
- 12. Torsvik, V. & Øvreås, L. Microbial diversity and function in soil: from genes to ecosystems. *Curr. Opin. Microbiol.* **5**, 240–245 (2002).
- Thompson, L. et al. A communal catalogue reveals Earth's multiscale 736 microbial diversity. *Nature* 551, 457–463 (2017).
- 14. Jansson, J. K. & Hofmockel, K. S. Soil microbiomes and climate change. *Nat. Rev. Microbiol.* **18**, 35–46 (2020).
- Nelson, M. B., Martiny, A. C. & Martiny, J. B. Global biogeography of microbial nitrogen-cycling traits in soil. *Proc. Natl Acad. Sci.* USA **113**, 8033–8040 (2016).
- Bodor, A. et al. Challenges of unculturable bacteria: environmental perspectives. *Rev. Environ. Sci. Biotechnol.* 19, 1–22 (2020).

- 17. Bartelme, R. P. et al. Influence of substrate concentration on the culturability of heterotrophic soil microbes isolated by high-throughput dilution-to-extinction cultivation. *mSphere* **5**, e00024-20 (2020).
- Ferrari, B. C., Binnerup, S. J. & Gillings, M. Microcolony cultivation on a soil substrate membrane system selects for previously uncultured soil bacteria. *Appl. Environ. Microbiol.* 71, 8714–8720 (2005).
- Huang, Y. et al. High-throughput microbial culturomics using automation and machine learning. *Nat. Biotechnol.* https://doi.org/10.1038/s41587-023-01674-2 (2023).
- Schöler, A., Jacquiod, S., Vestergaard, G., Schulz, S. & Schloter, M. Analysis of soil microbial communities based on amplicon sequencing of marker genes. *Biol. Fertil. Soils* 53, 485–489 (2017).
- 21. McArdle, A. J. & Kaforou, M. Sensitivity of shotgun metagenomics to host DNA: abundance estimates depend on bioinformatic tools and contamination is the main issue. *Access Microbiol.* **2**, acmi000104 (2020).
- 22. Van der Walt, A. J. et al. Assembling metagenomes, one community at a time. *BMC Genomics* **18**, 521 (2017).
- 23. Vandeputte, D. et al. Quantitative microbiome profiling links gut community variation to microbial load. *Nature* **551**, 507–511 (2017).
- Carvalhais, L. C., Dennis, P. G., Tyson, G. W. & Schenk, P. M. Application of metatranscriptomics to soil environments. *J. Microbiol. Methods* **91**, 246–251 (2012).
- 25. Hestrin, R. et al. Plant-associated fungi support bacterial resilience following water limitation. *ISME J.* **16**, 2752–2762 (2022).
- 26. Callister, S. J. et al. Addressing the challenge of soil metaproteome complexity by improving metaproteome depth of coverage through two-dimensional liquid chromatography. *Soil Biol. Biochem.* **125**, 290–299 (2018).
- 27. Lin, V. S. Interrogating plant-microbe interactions with chemical tools: click chemistry reagents for metabolic labeling and activity-based probes. *Molecules* **26**, 243 (2021).
- Whidbey, C. & Wright, A. T. In Activity-Based Protein Profiling (eds Cravatt, B. F., Hsu, K.-L. & Weerapana, E.) 1–21 (Springer International, 2019).
- Shaffer, M. et al. DRAM for distilling microbial metabolism to automate the curation of microbiome function. *Nucleic Acids Res.* 48, 8883–8900 (2020).
- 30. Chowdhury, T. R. et al. Metaphenomic responses of a native prairie soil microbiome to moisture perturbations. *mSystems* **4**, e00061-19 (2019).
- Forsberg, E. M. et al. Data processing, multi-omic pathway mapping, and metabolite activity analysis using XCMS Online. *Nat. Protoc.* 13, 633–651 (2018).
- Ahmed, V., Verma, M. K., Gupta, S., Mandhan, V. & Chauhan, N. S. Metagenomic profiling of soil microbes to mine salt stress tolerance genes. *Front. Microbiol.* 9, 159 (2018).
- Alvarez, T. M. et al. Structure and function of a novel cellulase 5 from sugarcane soil metagenome. *PLoS ONE* 8, e83635 (2013).
- Lee, M. H. et al. A new esterase EstD2 isolated from plant rhizosphere soil metagenome. *Appl. Microbiol. Biotechnol.* 88, 1125–1134 (2010).
- Da Rocha, U. N., Andreote, F. D., de Azevedo, J. L., van Elsas, J. D. & van Overbeek, L. S. Cultivation of hitherto-uncultured bacteria belonging to the *Verrucomicrobia* subdivision 1 from the potato (Solanum tuberosum L.) rhizosphere. J. Soils Sediments **10**, 326–339 (2010).
- Sharma, S., Anand, G., Singh, N. & Kapoor, R. Arbuscular mycorrhiza augments arsenic tolerance in wheat (*Triticum aestivum* L.) by strengthening antioxidant defense system and thiol metabolism. *Front. Plant Sci.* 8, 906 (2017).
- 37. Sood, M. et al. Trichoderma: the 'secrets' of a multitalented biocontrol agent. *Plants* **9**, 762 (2020).

- Abdelfadil, M. R. et al. Clay chips and beads capture in situ barley root microbiota and facilitate in vitro long-term preservation of microbial strains. *FEMS Microbiol. Ecol.* 98, fiac064 (2022).
- Wen, T., Zhao, M., Yuan, J., Kowalchuk, G. A. & Shen, Q. Root exudates mediate plant defense against foliar pathogens by recruiting beneficial microbes. Soil Ecol. Lett. 3, 42–51 (2021).
- 40. Thuita, M. et al. Commercial rhizobial inoculants significantly enhance growth and nitrogen fixation of a promiscuous soybean variety in Kenyan soils. *Biol. Fertil. Soils* **48**, 87–96 (2012).
- 41. Alves, B. J., Boddey, R. M. & Urquiaga, S. The success of BNF in soybean in Brazil. *Plant Soil* **252**, 1–9 (2003).
- 42. Ghahremani, M. & MacLean, A. M. Home sweet home: how mutualistic microbes modify root development to promote symbiosis. *J. Exp. Bot.* **72**, 2275–2287 (2021).
- 43. Vacheron, J. et al. Plant growth-promoting rhizobacteria and root system functioning. *Front. Plant Sci.* **4**, e356 (2013).
- Arora, N. K., Egamberdieva, D., Mehnaz, S., Li, W. J. & Mishra, I. Salt tolerant rhizobacteria: for better productivity and remediation of saline soils. *Front. Microbiol.* 12, 660075 (2021).
- 45. Akhtar, S. S. et al. *Bacillus licheniformis* FMCH001 increases water use efficiency via growth stimulation in both normal and drought conditions. *Front. Plant Sci.* **11**, 297 (2020).
- De Souza, R. S. C., Armanhi, J. S. L. & Arruda, P. From microbiome to traits: designing synthetic microbial communities for improved crop resiliency. *Front. Plant Sci.* **11**, 1179 (2020).
- Mendoza-Suárez, M., Andersen, S. U., Poole, P. S. & Sánchez-Cañizares, C. Competition, nodule occupancy, and persistence of inoculant strains: key factors in the *Rhizobium*legume symbioses. *Front. Plant Sci.* 12, 690567 (2021).
- Kari, A. et al. Monitoring of soil microbial inoculants and their impact on maize (*Zea mays* L.) rhizosphere using T-RFLP molecular fingerprint method. *Appl. Soil Ecol.* 138, 233–244 (2019).
- Enkerli, J., Widmer, F. & Keller, S. Long-term field persistence of Beauveria brongniartii strains applied as biocontrol agents against European cockchafer larvae in Switzerland. Biol. Control 29, 115–123 (2004).
- Fu, L. et al. Inducing the rhizosphere microbiome by biofertilizer application to suppress banana *Fusarium* wilt disease. *Soil Biol. Biochem.* **104**, 39–48 (2017).
- Mawarda, P. C., Le Roux, X., Van Elsas, J. D. & Salles, J. F. Deliberate introduction of invisible invaders: a critical appraisal of the impact of microbial inoculants on soil microbial communities. *Soil Biol. Biochem.* 148, 107874 (2020).
- 52. Xu, H. et al. *Rhizobium* inoculation drives the shifting of rhizosphere fungal community in a host genotype dependent manner. *Front. Microbiol.* **10**, 3135 (2020).
- 53. Zhong, Y. et al. Genotype and *Rhizobium* inoculation modulate the assembly of soybean rhizobacterial communities. *Plant Cell Environ.* **42**, 2028–2044 (2019).
- Hart, M. M., Antunes, P. M. & Abbott, L. K. Unknown risks to soil biodiversity from commercial fungal inoculants. *Nat. Ecol. Evol.* 1, 115 (2017).
- Martignoni, M. M., Garnier, J., Hart, M. M. & Tyson, R. C. Investigating the impact of the mycorrhizal inoculum on the resident fungal community and on plant growth. *Ecol. Modell.* 438, 109321 (2020).
- Chevrette, M. G., Bratburd, J. R., Currie, C. R. & Stubbendieck, R. M. Experimental microbiomes: models not to scale. *mSystems* 4, e00175-19 (2019).
- De Roy, K., Marzorati, M., Van den Abbeele, P., Van de Wiele, T. & Boon, N. Synthetic microbial ecosystems: an exciting tool to understand and apply microbial communities. *Environ. Microbiol.* 16, 1472–1481 (2014).

- Dolinšek, J., Goldschmidt, F. & Johnson, D. R. Synthetic microbial ecology and the dynamic interplay between microbial genotypes. *FEMS Microbiol. Rev.* 40, 961–979 (2016).
- 59. Wittebolle, L. et al. Initial community evenness favours functionality under selective stress. *Nature* **458**, 623–626 (2009).
- 60. Kehe, J. et al. Massively parallel screening of synthetic microbial communities. *Proc. Natl Acad. Sci. USA* **116**, 12804–12809 (2019).
- 61. Herrera Paredes, S. et al. Design of synthetic bacterial communities for predictable plant phenotypes. *PLoS Biol.* **16**, e2003962 (2018).
- 62. Lozano, G. L. et al. Introducing THOR, a model microbiome for genetic dissection of community behavior. *mBio* **10**, e02846-18 (2019).
- 63. Shayanthan, A., Ordoñez, P. A. C. & Oresnik, I. J. The role of synthetic microbial communities (SynCom) in sustainable agriculture. *Front. Agron.* **58**, 896307 (2022).
- 64. Naylor, D. et al. Deconstructing the soil microbiome into reducedcomplexity functional modules. *mBio* **11**, e01349-20 (2020).
- 65. McClure, R. et al. Development and analysis of a stable, reduced complexity model soil microbiome. *Front. Microbiol.* **11**, 1987 (2020).
- McClure, R. et al. Interaction networks are driven by community-responsive phenotypes in a chitin-degrading consortium of soil microbes. *mSystems* 7, e00372-22 (2022).
- Cappellato, M., Baruzzo, G., Patuzzi, I. & Di Camillo, B. Modeling microbial community networks: methods and tools. *Curr. Genomics* 22, 267–290 (2021).
- Matchado, M. S. et al. Network analysis methods for studying microbial communities: a mini review. *Comput. Struct. Biotechnol.* J. 19, 2687–2698 (2021).
- 69. Li, R. et al. Co-occurrence networks depict common selection patterns, not interactions. *Soil Sci. Environ.* **2**, 1 (2023).
- 70. Akkaya, Ö. & Arslan, E. Biotransformation of 2,4-dinitrotoluene by the beneficial association of engineered *Pseudomonas putida* with *Arabidopsis thaliana*. *3 Biotech* **9**, 408 (2019).
- 71. Xu, J. et al. The structure and function of the global citrus rhizosphere microbiome. *Nat. Commun.* **9**, 4894 (2018).
- Pfeiffer, S. et al. Rhizosphere microbiomes of potato cultivated in the High Andes show stable and dynamic core microbiomes with different responses to plant development. *FEMS Microbiol. Ecol.* 93, fiw242 (2017).
- Lee, S.-M., Kong, H. G., Song, G. C. & Ryu, C.-M. Disruption of Firmicutes and Actinobacteria abundance in tomato rhizosphere causes the incidence of bacterial wilt disease. *ISME J.* 15, 330–347 (2021).
- Armanhi, J. S. L., de Souza, R. S. C., Biazotti, B. B., Yassitepe, J. E. D. C. T. & Arruda, P. Modulating drought stress response of maize by a synthetic bacterial community. *Front. Microbiol.* 12, 747541 (2021).
- 75. Armanhi, J. S. L. et al. A community-based culture collection for targeting novel plant growth-promoting bacteria from the sugarcane microbiome. *Front. Plant Sci.* **8**, 2191 (2018).
- De Souza, R. S. C., Armanhi, J. S. L., Damasceno, N. D. B., Imperial, J. & Arruda, P. Genome sequences of a plant beneficial synthetic bacterial community reveal genetic features for successful plant colonization. *Front. Microbiol.* **10**, 1779 (2019).
- Wang, C. et al. Functional assembly of root-associated microbial consortia improves nutrient efficiency and yield in soybean. *J. Integr. Plant Biol.* 63, 1021–1035 (2021).
- 78. Liu, H. et al. Effective colonisation by a bacterial synthetic community promotes plant growth and alters soil microbial community. *J. Sustain. Agric. Environ.* **1**, 30–42 (2022).
- Bankhead, S. B., Landa, B. B., Lutton, E., Weller, D. M. & Gardener, B. B. M. Minimal changes in rhizobacterial population structure following root colonization by wild type and transgenic biocontrol strains. *FEMS Microbiol. Ecol.* **49**, 307–318 (2004).

Review article

- Van Geel, M., De Beenhouwer, M., Lievens, B. & Honnay, O. Crop-specific and single-species mycorrhizal inoculation is the best approach to improve crop growth in controlled environments. *Agron. Sustain. Dev.* **36**, 37 (2016).
- Vestberg, M. The effect of vesicular–arbuscular mycorrhizal inoculation on the growth and root colonization of ten strawberry cultivars. *Agric. Food Sci.* 1, 527–535 (1992).
- 82. Felici, C. et al. Single and co-inoculation of *Bacillus subtilis* and *Azospirillum brasilense* on *Lycopersicon esculentum*: effects on plant growth and rhizosphere microbial community. *Appl. Soil Ecol.* **40**, 260–270 (2008).
- 83. Berendsen, R. L. et al. Disease-induced assemblage of a plantbeneficial bacterial consortium. *ISME J.* **12**, 1496–1507 (2018).
- Gerrits, G. M. et al. Synthesis on the effectiveness of soil translocation for plant community restoration. J. Appl. Ecol. 60, 714–724 (2023).
- Pantoja Angles, A., Valle-Pérez, A. U., Hauser, C. & Mahfouz, M. M. Microbial biocontainment systems for clinical, agricultural, and industrial applications. *Front. Bioeng. Biotechnol.* **10**, 830200 (2022).
- 86. De Lorenzo, V. & Danchin, A. Synthetic biology: discovering new worlds and new words. *EMBO Rep.* **9**, 822–827 (2008).
- Temme, K., Zhao, D. & Voigt, C. A. Refactoring the nitrogen fixation gene cluster from *Klebsiella oxytoca*. *Proc. Natl Acad. Sci. USA* 109, 7085–7090 (2012).
- Del Valle, I. et al. Soil organic matter attenuates the efficacy of flavonoid-based plant-microbe communication. Sci. Adv. 6, eaax8254 (2020).
- Shulse, C. N. et al. Engineered root bacteria release plant-available phosphate from phytate. *Appl. Environ. Microbiol.* 85, e01210-19 (2019).
- Del Valle, I. et al. Translating new synthetic biology advances for biosensing into the earth and environmental sciences. *Front. Microbiol.* **11**, 618373 (2020).
- 91. Wen, A. et al. Enabling biological nitrogen fixation for cereal crops in fertilized fields. *ACS Synth. Biol.* **10**, 3264–3277 (2021).
- 92. Egbert, R. G. et al. A versatile platform strain for highfidelity multiplex genome editing. *Nucleic Acids Res.* **47**, 3244–3256 (2019).
- 93. Sridhar, S., Ajo-Franklin, C. M. & Masiello, C. A. A framework for the systematic selection of biosensor chassis for environmental synthetic biology. *ACS Synth. Biol.* **11**, 2909–2916 (2022).
- Nikel, P. I., Chavarria, M., Danchin, A. & de Lorenzo, V. From dirt to industrial applications: *Pseudomonas putida* as a synthetic biology chassis for hosting harsh biochemical reactions. *Curr. Opin. Chem. Biol.* **34**, 20–29 (2016).
- Vo, P. L. H. et al. CRISPR RNA-guided integrases for high-efficiency, multiplexed bacterial genome engineering. *Nat. Biotechnol.* **39**, 480–489 (2021).
- Huang, P.-H. et al. M-TUBE enables large-volume bacterial gene delivery using a high-throughput microfluidic electroporation platform. *PLoS Biol.* 20, e3001727 (2022).
- Shih, S. C. C. et al. A versatile microfluidic device for automating synthetic biology. ACS Synth. Biol. 4, 1151–1164 (2015).
- Riley, L. A., Ji, L., Schmitz, R. J., Westpheling, J. & Guss, A. M. Rational development of transformation in *Clostridium thermocellum* ATCC 27405 via complete methylome analysis and evasion of native restriction-modification systems. *J. Ind. Microbiol. Biotechnol.* 46, 1435–1443 (2019).
- 99. Tourancheau, A., Mead, E. A., Zhang, X.-S. & Fang, G. Discovering multiple types of DNA methylation from bacteria and microbiome using nanopore sequencing. *Nat. Methods* **18**, 491–498 (2021).
- 100. Yim, S. S. et al. Multiplex transcriptional characterizations across diverse bacterial species using cell-free systems. *Mol. Syst. Biol.* 15, e8875 (2019).

- 101. Elmore, J. R. et al. High-throughput genetic engineering of nonmodel and undomesticated bacteria via iterative site-specific genome integration. *Sci. Adv.* **9**, eade1285 (2023).
- 102. Younger, D., Berger, S., Baker, D. & Klavins, E. High-throughput characterization of protein–protein interactions by reprogramming yeast mating. *Proc. Natl Acad. Sci. USA* **114**, 12166–12171 (2017).
- 103. Nielsen, A. A. et al. Genetic circuit design automation. *Science* **352**, aac7341 (2016).
- 104. Yeh, A. H.-W. et al. De novo design of luciferases using deep learning. *Nature* **614**, 774–780 (2023).
- 105. Madani, A. et al. Large language models generate functional protein sequences across diverse families. *Nat. Biotechnol.* **41**, 1099–1106 (2023).
- 106. Yu, D. et al. An efficient recombination system for chromosome engineering in *Escherichia coli. Proc. Natl Acad. Sci. USA* 97, 5978–5983 (2000).
- 107. Garst, A. D. et al. Genome-wide mapping of mutations at single-nucleotide resolution for protein, metabolic and genome engineering. *Nat. Biotechnol.* **35**, 48–55 (2017).
- Brophy, J. A. N. et al. Engineered integrative and conjugative elements for efficient and inducible DNA transfer to undomesticated bacteria. *Nat. Microbiol.* 3, 1043–1053 (2018).
- 109. Wang, G. et al. CRAGE enables rapid activation of biosynthetic gene clusters in undomesticated bacteria. *Nat. Microbiol.* **4**, 2498–2510 (2019).
- 110. Rottinghaus, A. G., Vo, S. & Moon, T. S. Computational design of CRISPR guide RNAs to enable strain-specific control of microbial consortia. *Proc. Natl Acad. Sci. USA* **120**, e2213154120 (2023).
- Ronda, C., Chen, S. P., Cabral, V., Yaung, S. J. & Wang, H. H. Metagenomic engineering of the mammalian gut microbiome in situ. *Nat. Methods* 16, 167–170 (2019).
- 112. Rubin, B. E. et al. Species- and site-specific genome editing in complex bacterial communities. *Nat. Microbiol.* **7**, 34–47 (2021).
- 113. Singh, J. S., Abhilash, P. C., Singh, H. B., Singh, R. P. & Singh, D. P. Genetically engineered bacteria: an emerging tool for environmental remediation and future research perspectives. *Gene* **480**, 1–9 (2011).
- Pant, G. et al. Biological approaches practised using genetically engineered microbes for a sustainable environment: a review. *J. Hazard. Mater.* 405, 124631 (2021).
- Liu, L., Bilal, M., Duan, X. & Iqbal, H. M. N. Mitigation of environmental pollution by genetically engineered bacteria current challenges and future perspectives. *Sci. Total Environ.* 667, 444–454 (2019).
- Ronchel, M. C. & Ramos, J. L. Dual system to reinforce biological containment of recombinant bacteria designed for rhizoremediation. *Appl. Environ. Microbiol.* 67, 2649–2656 (2001).
- 117. Asin-Garcia, E. et al. Phosphite synthetic auxotrophy as an effective biocontainment strategy for the industrial chassis *Pseudomonas putida*. *Microb. Cell Factories* **21**, 156 (2022).
- Mandell, D. J. et al. Biocontainment of genetically modified organisms by synthetic protein design. *Nature* 518, 55–60 (2015).
- Chan, C. T. Y., Lee, J. W., Cameron, D. E., Bashor, C. J. & Collins, J. J. 'Deadman' and 'Passcode' microbial kill switches for bacterial containment. *Nat. Chem. Biol.* **12**, 82–86 (2016).
- 120. Rottinghaus, A. G., Ferreiro, A., Fishbein, S. R. S., Dantas, G. & Moon, T. S. Genetically stable CRISPR-based kill switches for engineered microbes. *Nat. Commun.* **13**, 672 (2022).
- 121. Park, S. et al. Construction of *Bacillus thuringiensis* simulant strains suitable for environmental release. *Appl. Environ. Microbiol.* **83**, e00126-17 (2017).
- 122. Jaderlund, L., Hellman, M., Sundh, I., Bailey, M. J. & Jansson, J. K. Use of a novel nonantibiotic triple marker gene cassette to monitor high survival of *Pseudomonas fluorescens* SBW25 on winter wheat in the field. *FEMS Microbiol. Ecol.* **63**, 156–168 (2008).

- 123. Yee, M. O. et al. Specialized plant growth chamber designs to study complex rhizosphere interactions. *Front. Microbiol.* **12**, 625752 (2021).
- Zengler, K. et al. EcoFABs: advancing microbiome science through standardized fabricated ecosystems. *Nat. Methods* 16, 567–571 (2019).
- Aufrecht, J. et al. Hotspots of root-exuded amino acids are created within a rhizosphere-on-a-chip. *Lab Chip* 22, 954–963 (2022).
- 126. Handakumbura, P. P., Rivas Ubach, A. & Battu, A. K. Visualizing the hidden half: plant-microbe interactions in the rhizosphere. *mSystems* **6**, e0076521 (2021).
- Del Valle, I., Gao, X., Ghezzehei, T. A., Silberg, J. J. & Masiello, C. A. Artificial soils reveal individual factor controls on microbial processes. *mSystems* 7, e0030122 (2022).
- 128. Tian, B., Pei, Y., Huang, W., Ding, J. & Siemann, E. Increasing flavonoid concentrations in root exudates enhance associations between arbuscular mycorrhizal fungi and an invasive plant. *ISME J.* **15**, 1919–1930 (2021).
- 129. Hu, L. et al. Root exudate metabolites drive plant-soil feedbacks on growth and defense by shaping the rhizosphere microbiota. *Nat. Commun.* **9**, 2738 (2018).
- Geddes, B. A. et al. Engineering transkingdom signalling in plants to control gene expression in rhizosphere bacteria. *Nat. Commun.* 10, 3430 (2019).
- Haskett, T. L. et al. Engineered plant control of associative nitrogen fixation. Proc. Natl Acad. Sci. USA **119**, e2117465119 (2022).
- 132. Kaeppler, S. M. et al. Variation among maize inbred lines and detection of quantitative trait loci for growth at low phosphorus and responsiveness to arbuscular mycorrhizal fungi. Crop Sci. 40, 358–364 (2000).
- 133. Tosi, M., Mitter, E. K., Gaiero, J. & Dunfield, K. It takes three to tango: the importance of microbes, host plant, and soil management to elucidate manipulation strategies for the plant microbiome. *Can. J. Microbiol.* **66**, 413–433 (2020).

Acknowledgements

This work was supported by the US Department of Energy (DOE) Office of Biological and Environmental Research as part of the Genomic Science Program and is a contribution of the Pacific Northwest National Laboratory (PNNL) Secure Biosystems Design Science Focus Area entitled 'Persistence Control of Engineered Functions in Complex Soil Microbiomes'. PNNL is a multiprogram national laboratory operated by Battelle Memorial Institute for the DOE under contract DE-AC05-76RL01830.

Author contributions

All authors contributed equally to the writing and formulation of figures.

Competing interests

The authors declare no competing interests.

Additional information

Correspondence and requests for materials should be addressed to Janet K. Jansson.

Peer review information *Nature Biotechnology* thanks Giles Oldroyd, Paul Bodelier, and Marnix Medema for their contribution to the peer review of this work.

Reprints and permissions information is available at www.nature.com/reprints.

Publisher's note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

Springer Nature or its licensor (e.g. a society or other partner) holds exclusive rights to this article under a publishing agreement with the author(s) or other rightsholder(s); author self-archiving of the accepted manuscript version of this article is solely governed by the terms of such publishing agreement and applicable law.

© Battelle Memorial Institute, under exclusive licence to Springer Nature America, Inc. 2023