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# Synthetic bacterial community derived from a desert rhizosphere confers salt stress resilience to tomato in the presence of a soil microbiome

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The root bacterial microbiome is important for the general health of the plant. Additionally, it can enhance tolerance to abiotic stresses, exemplified by plant species found in extreme ecological niches like deserts. These complex microbe-plant interactions can be simplified by constructing synthetic bacterial communities or SynComs from the root microbiome. Furthermore, SynComs can be applied as biocontrol agents to protect crops against abiotic stresses such as high salinity. However, there is little knowledge on the design of a SynCom that offers a consistent protection against salt stress for plants growing in a natural and, therefore, non-sterile soil which is more realistic to an agricultural setting. Here we show that a SynCom of five bacterial strains, originating from the root of the desert plant *Indigofera argentea*, protected tomato plants growing in a non-sterile substrate against a high salt stress. This phenotype correlated with the differential expression of salt stress related genes and ion accumulation in tomato. Quantification of the SynCom strains indicated a low penetrance into the natural soil used as the non-sterile substrate. Our results demonstrate how a desert microbiome could be engineered into a simplified SynCom that protected tomato plants growing in a natural soil against an abiotic stress.

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## INTRODUCTION

Plants sustain microorganisms around and inside their roots [1]. These communities of root-associated microorganisms are referred to as the root microbiome. There is increasing evidence showing that the root microbiome is vital to plant health, growth and development and plays a prominent role in plant fitness under diverse environmental growth conditions [2]. The root microbiome can promote growth and development by modulating plant hormone homeostasis, promoting nutrient acquisition, or improving resilience to abiotic stresses [3, 4].

The microbes that make up the root microbiome can sometimes succeed where other methods such as gene engineering have failed. For example, the HIGH-AFFINITY K<sup>+</sup> TRANSPORTER 1;1 (HKT1;1) is proposed to facilitate the shoot-to-root recirculation of Na<sup>+</sup>, but both loss-of-function and overexpression in *Arabidopsis thaliana* (arabidopsis) does not improve salt tolerance [5, 6]. Interestingly, a strain of the soil bacterium *Bacillus subtilis* did confer salt tolerance by concurrently down- and upregulating the expression of *AtHKT1* in the roots and shoots of arabidopsis, respectively [7]. This finding of tissue-specific regulation of *AtHKT1* mediated by a microbe being critical to Na<sup>+</sup> homeostasis in salt-stressed plants demonstrates the potential of plant-microbe interactions.

It is generally hypothesized that the root microbiome is also important in the case of desert plants to cope with multiple and critical threats such as nutrient deficiency, drought and salinity [8]. So far, only a limited number of studies have been conducted to characterize microbial communities associated with desert plants and their contribution to plant fitness. Indigofera argentea (indigofera) is a legume species that can be found in multiple desert regions [9]. It is a perennial subshrub that grows as pioneer vegetation in scattered populations in well-drained and sandy soils. Also, indigofera has a certain resilience to salt stress and can grow like a weed on former agricultural fields that suffer from high salinity due to extensive irrigation practices. For example, former agricultural areas in the Jizan desert, Saudi Arabia, are scarcely populated with indigofera (Fig. S1). We questioned whether the microbiome present in this Jizan soil plays a pivotal role in conferring abiotic stress tolerance to indigofera growing under such conditions.

Indigofera root bacterial strains of Jizan origin have been isolated and resulted among others in the identification of *Pseudomonas argentinensis* SA190, *Acinetobacter radioresistens* SA188, *Enterobacter* sp. SA187, and *Ochrobactrum intermedium* SA148. For these bacteria, plant-growth promoting effects have

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been predicted and experimentally verified for *Enterobacter* sp. SA187 [10–13].

Most studies focus on single strains applied to plants grown in essentially sterile conditions. This is not the case in a field setting where the presence of the local microbiome naturally implies a non-sterile environment. This non-sterile environment is suspected to explain the failure of a single strain in the field due to the competition with the local microbiome [14, 15]. Therefore, instead of this "one-microbe-at-a-time" approach [16], an alternative would be to create so-called synthetic microbial communities (SynComs), which as a community stands a better chance to survive and function in a non-sterile environment. However, it remains elusive to what extend a SynCom derived from a natural microbiome is effective in improving plant growth in a non-sterile environment, especially with the inclusion of an abiotic stress such as high salinity. And an efficient methodology of constructing and simplifying a functional SynCom is also unclear.

We characterized the bacterial microbiome of indigofera grown in Jizan soil under mimicked desert conditions and isolated strains representing the core root bacterial microbiome. Growth promoting effects of single strains and SynComs were studied on indigofera as well as the non-related crop tomato (*Solanum lycopersicum*). A SynCom of five bacterial strains promoted tomato growth under saline and non-sterile conditions. This increased salt tolerance was associated with both the differential expression of salt stress-related genes and ion accumulation in the shoot. Subsequent quantification of the relative abundance of SynCom strains revealed a low penetrance of the added SynCom, indicating that growth promotion can be triggered without affecting a native root microbiome.

## RESULTS

## Growth promotion of indigofera by the microbiome in the Jizan soil

To find support for the importance of the root microbiome to plant fitness, we established an assay to study the growth of indigofera mimicking native growing conditions. Indigofera did not survive when grown in sterilized Jizan soil, suggesting that the soil microbiome is essential for plant growth. Since indigofera is a legume that, under native conditions, relies on nitrogen-fixing nodule symbiosis, we repeated the growth assay now adding a compatible rhizobium microsymbiont isolated from the Jizan soil sample (strain *Bradyrhizobium* sp. SA281). This rescued plant growth and could therefore serve as an axenic control. Next, we compared plant growth in sterilized Jizan soil complemented with *Bradyrhizobium* sp. SA281 and non-sterile Jizan soil. This revealed the plants in non-sterile soil produced more biomass compared to the control condition (Fig. 1), suggesting that the native root microbiome is conducive to the growth of indigofera.

## The bacterial root microbiome of indigofera is relatively simple but distinct

We questioned whether indigofera recruits specific bacteria. To study its root microbiome composition, indigofera was grown in Jizan soil under mimicked native conditions. Samples from the soil, rhizosphere (Rhizo) and endophytic compartment (EC) of 42-daysold indigofera plants were collected in at least three biological replicates from which DNA was extracted. An OTU table was constructed from the Illumina sequencing reads of the 16 S rRNA gene V4 regions in these samples. Using the Bray-Curtis dissimilarity measure on the rarefied OTU table, the Soil, Rhizo, and EC samples were plotted with Principal Coordinate Analysis (PCoA) in twodimensional space (Fig. 2a). The first two principal coordinates explained 60% and 14% of the total variance, respectively. Rhizo and EC bacterial microbiomes hardly separated along the first coordinate but were clearly distinct from the Soil community. Conversely, the Rhizo and EC samples did form separate clusters along the second



Fig. 1 Jizan soil microbiome promotes growth of *Indigofera* argentea. a Six-week-old indigofera plants in Jizan soil (left) or sterile Jizan soil supplemented with the strain *Bradyrhizobium* sp. SA281 (right). There were four pots per treatment and each pot contained two indigofera seedlings. *Bradyrhizobium* sp. SA281 was isolated from nitrogen-fixing indigofera nodules grown in Jizan soil. **b** Fresh and dry shoot weight of indigofera plants at six weeks old show increased growth promotion triggered by the Jizan soil, when compared to sterile Jizan soil complemented with *Bradyrhizobium* sp. SA281. Asterisks indicate statistical significance (p < 0.05) as per one-way ANOVA.

coordinate. This revealed that indigofera grown in Jizan soil possessed a distinct root microbiome when compared to the soil (PCoA1 60%) and with different bacterial communities in the rhizosphere and endophytic compartment (PCoA2 14%).

In line with the PCoA, the bacterial communities in each compartment also differed at the phylum level (Fig. 2b). In the transition from the Soil to the EC, the biodiversity reduced due to a drop in the number of rare phyla (indicated as "Others"). Firmicutes and Proteobacteria were significantly depleted in the two root compartments compared to Soil, whereas the phyla of Chloroflexi and Actinobacteriota were significantly enriched in these compartments. Next, we determined the number of OTUs from the Soil that increased in their relative abundance in the Rhizo and EC. Compared to the Soil, 181 and 128 were enriched (p < 0.001) in the root compartments, of which 121 OTUs were shared between the Rhizo and EC (Fig. 2c & Dataset S1). Also, a similar number of OTUs was depleted in the Rhizo and EC compartments when compared to the Soil (Dataset S1 & Fig. S2). This suggests a strong rhizosphere effect of indigofera, even though the Jizan soil microbiome is relatively simple. Furthermore, there is strong commonality of bacterial community selection between the rhizosphere and endophytic compartment.

## Plant growth promotion triggered by a Jizan SynCom in indigofera and tomato

To study the function of the root bacterial microbiome, we aimed to isolate the bacterial strains that showed an increased abundance in



**Fig. 2** Indigofera argentea root microbiome in Jizan soil. a Principal coordinates analysis (PCoA) of the bacterial microbiomes in the soil, rhizosphere (Rhizo) and endophytic compartment (EC) of indigofera grown in Jizan soil for six weeks. The Soil is distinct from the Rhizo and EC along the first principal component. While the second component separates the Rhizo and EC. Bray-Curtis dissimilarities were calculated with OTU read counts after rarefaction and standard filtering. **b** Taxonomic classification of bacterial OTUs with relative abundance greater or equal to 5% grouped at the phylum level. The three bars represent the relative abundance of bacterial phyla in Soil, Rhizo and EC. There is a drop in bacterial diversity or number of rare phyla (indicated as "others") from the Soil to EC. **c** Venn diagram showing number of enriched OTUs in the Rhizo and EC of indigofera.

the indigofera root microbiome as determined by the OTU data described above. By applying a culture-dependent approach using different cultivation media, roughly two thousand bacterial isolates were obtained. All isolates were grouped by morphology and designated with the prefix SA (Saudi Arabia) followed by a strain number. Sanger sequencing of the full length 16 S rRNA gene amplicon provided the V4 region of each isolate which could then be mapped back to an OTU found on the roots of indigofera. Ultimately, representative strains for nine of the most abundant OTUs shared between the Rhizo and EC could be identified. According to their relative abundance, these OTUs (Fig. 3a) represented approximately 40% and 30% of the Rhizo and EC, respectively, and were collectively considered the core bacterial root microbiome of indigofera. We also included the isolates Ensifer sp. SA403 and Bacillus sp. SA436, which showed promise in promoting plant growth (Fig. S3) even though they belonged to the less abundant OTUs 38 and 49 - respectively. Additionally, previous work of culture-dependent isolation on a different sample batch but from the same ecological niche culminated in four growth promoting isolates that were also included in this study: Pseudomonas argentinensis SA190, Acinetobacter radioresistens SA188, Enterobacter sp. SA187 and Ochrobactrum intermedium SA148. [10, 12, 13, 17]. The V4 sequences of the first three could be found in the indigofera microbiome (matching the OTUs 1333, 17 and 955 - respectively) though they did not belong to a dominant OTU.

Together, a total collection of 15 strains was used in further studies. It included species of the genera Acinetobacter and Streptomyces (phylum Actinobacteriota), Bacillus (phylum Firmicutes), and Ensifer, Enterobacter, Massilia, Ochrobactrum, Pseudomonas, and Ralstonia (phylum Proteobacteria) (Table 1). Draft genome sequencing was conducted to further characterize the selected strains (Table S1). Subsequently, maximum likelihood phylogeny was inferred from the nucleotide alignment of the 31 AMPHORA genes. This consisted of two separate analyses. First, the nine genera covering the 15 selected Jizan strains were analysed separately with reference and other root-associated strains (Dataset S2). This showed that several isolated Jizan strains are close relatives of species with reported plantgrowth promoting effects. For example, Bacillus sp. SA436 is a close relative of the plant-growth promoting species Bascillus megaterium and Bascillus aryabhattai [18, 19], Ensifer sp. SA403 to the nitrogen-fixing legume symbionts Ensifer sojae and Ensifer alkalisoli, and the five Streptomyces sp. to Streptomyces leeuwenhoekii, a species known to produce a variety of specialised metabolites [20] (Fig. S4). Next, the 15 selected Jizan strains were compared to 61 earlier studied desert bacterial species of the same genera (Dataset S3). This revealed that the Jizan strains clustered together with the selected desert microbes at the genus level but diverged at the species or strain level (Fig. 3b). Taken together, this shows that the selected Jizan strains are novel yet representative of species found in desert environments.

We questioned whether these isolated Jizan strains as a community triggered a similar plant growth promotion previously observed with indigofera grown in Jizan soil. Therefore, plants were grown in sterilized river sand that was inoculated with Bradyrhizobium sp. SA281. Half of the plants were also inoculated with an equal mixture of the 15 selected strains (the Jizan SynCom). Indigofera inoculated with the Jizan SynCom produced significantly more shoot biomass (42 days postinoculation), when compared to the plants that were only inoculated with Bradyrhizobium sp. SA281 (Fig. 3c). This showed that the Jizan SynCom triggered increased plant growth promotion when compared to only a diazotrophic and nodulating Bradyrhizobium strain. Next, we questioned whether this growth response was specific to indigofera or more generic, which would be of more practical significance in translating these results to agriculture. We tested the growth response of the Jizan SynCom on tomato (Moneymaker cultivar). The Jizan SynCom also triggered a significant growth response in tomato (Fig. 3d). This demonstrated that the growth-promoting effect of the bacterial Jizan strains is a generic effect on plants.

## Jizan SynCom promotes tomato growth under salt stress and non-sterile conditions

We questioned whether the Jizan SynCom is also effective in promoting abiotic stress tolerance in other plant species and under non-sterile conditions. To test this, we used tomato and established a generic assay for analysing microbial effects on plant fitness under various conditions with the focus on salt stress in this study (Fig. S5). A controlled and reproducible nonsterile substrate was created by mixing sterilized river sand with 10% of a well characterized soil and supplemented with nutrient solution. We wanted to exclude interference from the endogenous SynCom strains present in the soil and evaluate SynCom effectiveness in the presence of another natural microbial community outside its native habitat. So, we collected soil from an ecological field station (the Mossel area at Veluwe, the Netherlands), referred to as the Mossel soil, of which the





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Source	Strain Code	010	Class	Order	Family	Genus
Current work	Highly abundant					
	SA670	5	Actinobacteria	Actinobacteria	Streptomycetaceae	unclassified
	SA087	9	Beta-Proteobacteria	Burkholderiales	Oxalobacteraceae	Massilia
	SA424	14	Beta-Proteobacteria	Burkholderiales	Burkholderiaceae	Ralstonia
	SA444	30	Actinobacteria	Actinobacteria	Streptomycetaceae	Streptomyces
	SA613	71	Gamma-Proteobacteria	Pseudomonadales	Pseudomonadaceae	Pseudomonas
	SA244	136	Gamma-Proteobacteria	Pseudomonadales	Pseudomonadaceae	Pseudomonas
	SA619	203	Actinobacteria	Actinobacteria	Streptomycetaceae	Streptomyces
	SA681	326	Actinobacteria	Actinobacteria	Streptomycetaceae	unclassified
	SA113	171	Actinobacteria	Actinobacteria	Actinomycetaceae	unclassified
	Potential PGPRs					
	SA403	38	Alpha-Proteobacteria	Rhizobiales	Rhizobiaceae	Ensifer
	SA436	49	Firmicutes	Bacillales	Bacillaceae	Bacillus
Previous work	SA148	-	Alpha-Proteobacteria	Rhizobiales	Brucellaceae	Ochrobactrum
	SA187	955	Gamma-Proteobacteria	Enterobacterales	Enterobacteriaceae	Enterobacter
	SA188	17	Gamma-Proteobacteria	Pseudomonadales	Moraxellaceae	Acinetobacter
	SA190	1333	Gamma-Proteobacteria	Pseudomonadales	Pseudomonadaceae	Pseudomonas

Table 1. Selected bacterial strains of the root microbiome of Indigofera argentea grown in Jizan soil.

Eleven strains were isolated in this study, including nine strains belonging to highly abundant OTUs representing ~40% and ~30% of rhizosphere and endophytic compartment, respectively, and two low abundant or rare strains with potential PGPR traits. Four additional strains with PGPR straits were collected from previous studies. These 15 strains together were used for SynCom construction.

rhizosphere effect was characterized on a series of plant species [21]. Diluting the soil with sand allowed us to design a synchronized growth assay in which the effects of soil nutrients were reduced. The physical properties of the sand were also more suitable for the salt stress assay. Tomato seeds were sown in the 10% soil - 90% sand mixture and inoculated with/without the Jizan SynCom (approximately 10<sup>9</sup> cells per plant). After one week of growth in this soil mixture, plants were exposed to various salt levels (0, 100, 200 and 300 mM NaCl) (Fig. S5). Two weeks post salt imposition, the total plant biomass was quantified. First, we noted that under non-sterile conditions the Jizan SynCom promoted tomato growth in the absence of salt (Fig. S6). Furthermore, the biomass was not significantly different between control and SynCom treated plants except for those exposed to 200 mM NaCl. In contrast, tomato plants without Jizan SynCom inoculation showed a clear decline in biomass proportional to the salt concentration. These results showed that the Jizan SynCom not only promoted tomato growth but also conferred tolerance to salt imposition. Since the 200 mM salt level provided a clear contrast in plant growth between the Jizan SynCom inoculated plants and noninoculated control plants, it was set as the standard salt concentration for subsequent experiments in this study.

## Bacterial SynCom triggered salt stress resilience associates with differential expression of salt stress related marker genes and ion content accumulation

We questioned whether a simplified Jizan SynCom can trigger salt tolerance under non-sterile conditions. First, individual strains were tested. Tomato plants were grown as described above, inoculated with 15 strains individually and exposed to 200 mM NaCl. Plants growing only in the non-sterile substrate served as an inoculum-free control. Of the 15 strains tested, *Ensifer* sp. SA403, *Ralstonia* sp. SA424, *Massilia* sp. SA087, and *Bacillus* sp. SA436 promoted tomato growth compared to the non-inoculated plants. The remaining strains did not significantly affect plant growth when compared to the control plants (Fig. 4a). Interestingly, the Jizan SynCom inoculated plants showed the highest shoot biomass compared to other inoculated plants.

Next, we tested simplified SynComs containing a subset of the 15 strains from the Jizan core microbiome. Instead of using a targeted approach, we decided to randomly combine the strains. We did avoid taxonomic redundancy so that none of the simplified SynComs would have two or more strains of the same genus. In total, 20 combinations of 3 to 5 strains were tested on tomato plants growing in the non-sterile substrate and exposed to 200 mM NaCl (Table S2). This revealed that SynCom C, which consisted of *Massilia* sp. SA087, *Enterobacter* sp. SA187, *Ensifer* sp. SA403, *Bacillus* sp. SA436, and *Streptomyces* sp. SA444 led to the strongest growth response, having a 34% increase in dry shoot biomass compared to the non-inoculated control (Fig. 4b) and even outperforming the 15 strain Jizan SynCom.

We questioned whether the increased biomass of salt-treated tomato plants inoculated with SynCom C is the result of a generic growth response, or alternatively, associated with salt stress-related physiological factors such as ion homeostasis or the expression of salt stress-related marker genes. To this end, leaf and root tissues were sampled from tomato at four, seven and ten days post salt imposition. Plants were grown either sterile (control), inoculated with SynCom C or with the five individual strains which compose this best performing SynCom. By including the five strains as separate inoculums, we aimed to validate that simultaneous presence of different strains as a SynCom is a prerequisite for the observed growth response. Quantification of the fresh shoot biomass showed that SynCom C was the only inoculum that significantly promoted tomato growth compared to the inoculum-free control (Fig. 5a). Transcriptional analysis was then performed on root and shoot tissue for the salt stress related marker genes CELLULOSE SYNTHASE A2 (CESA2), HKT1;1, SALT OVERLY SENSITIVE 1 (SOS1), SOS2 and WRKY8 (Table S3). Four days post salt imposition, SOS1, SOS2 and WRKY8 expression was significantly upregulated in the root of tomato plants treated with SynCom C compared to the noninoculated control (Fig. 5b). This effect was not observed in the



**Fig. 4 Growth promotion of the SynComs and individual Jizan strains on salt-stressed tomato plants. a** The dry shoot weight of threeweek-old tomato plants grown in the non-sterile substrate and inoculated with either a single Jizan strain or the SynCom as an equimolar mixture. Salt imposition was with 200 mM NaCl according to the assay described previously (Fig. S4). The SynCom (colored in blue) performed best and together with the strains *Ensifer* sp. SA403, *Ralstonia* sp. SA424, *Massilia* sp. SA087, *Bacillus* sp. SA436 were significantly different from the control plants (colored in green) which were not inoculated. **b** Ratios of the shoot dry weight of tomato plants treated with simplified SynComs to the control. Each SynCom contained four or five Jizan strains and the control was not inoculated. The five member SynCom C performed the best and was the only one significantly different to the control. Asterisk indicates statistical significance (*p* < 0.05) as per Dunnett's test.

roots of plants inoculated with the individual strains. Conversely, in the shoot there was a significant downregulation of SOS2 for the individual strains but not SynCom C (Fig. S7f). Interestingly, HKT1;1 was upregulated in the shoot by SynCom C and three of the individual strains though none were significantly different to the control. This stands in contrast to the expression of the same gene in the root tissue where HKT1;1 is downregulated by four of the inoculums including SynCom C. The ion content of the shoot tissue from the control and SynCom C inoculated plants was measured at ten days post salt imposition. This revealed that the Na<sup>+</sup>/K<sup>+</sup> ratio was significantly lower in SynCom C inoculated plants, when compared to control plants (Fig. 5c). To determine whether this effect is also observed in presence of a soil microbiome, the experiment was repeated but now plants were grown in the 10% Mossel soil + 90% sand mixture. Again, this showed the growth promoting effect of SynCom C under saline conditions and with a significantly lower Na<sup>+</sup>/K<sup>+</sup> ratio than the control plants (Fig. S8b & d). Taken together, these results demonstrate that SynCom C triggers increased resistance to salt stress in tomato plants grown in non-sterile conditions.

## The Jizan SynCom colonized the root of tomato plants under non-sterile conditions The degree of root colonization due to some treatment as an

indicator of strain importance is the dominant approach taken in microbiome studies. This strategy also lends itself to the study of the inter-bacterial dynamics in either a native microbiome or, in our case, the interaction between a SynCom and its environment. As the 15 Jizan strains correspond to abundant OTUs in the root compartments of indigofera, their root colonization especially as a function of salt level could be a key factor leading to a successful plant phenotype.

To identify traits other than the growth promotion of single strains that can be used in the design of a SynCom, we conducted an experiment to measure the root colonization of the 15 Jizan strains in a non-sterile environment. Tomato plants were grown in the non-sterile substrate and half were inoculated with the Jizan SynCom. Plants were exposed to a single salt concentration ranging from 0 to 300 mM NaCl in 100 mM increments. The V4 16 S rRNA gene region was sequenced with the Illumina Hiseq2500 platform on DNA isolated from the Soil, Rhizo and EC of each sample.



**Fig. 5 SynCom C induces salt stress tolerance related responses in tomato.** Tomato seeds were sown in sterilized river sand and inoculated with the five-member SynCom C or the five individual strains. Plants were exposed to 200 mM NaCl on day seven. The root and shoot tissue were harvested on four, seven, and ten days post salt imposition. a Shoot fresh weight of the tomato plants for the three time points after salt imposition. A linear model was fitted to the biomass with the time points and inoculation as the explanatory variables. Only the SynCom C treated samples had a significantly different (p < 0.05) slope from the inoculum-free control samples. **b** Relative expression of salt stress resilience-related genes to Actin in the root tissue of tomato plants four days post salt imposition. An asterisk indicates a significant (p < 0.05) difference from the control, according to Dunnett's test. **c** The Na<sup>+</sup>/K<sup>+</sup> ratio in the shoot of tomato plants ten days post salt imposition. SynCom C inoculated plants had a significantly lower ratio than the control (tested with Student's t test). SynCom C is composed of the strains *Massilia* sp. SA087, *Enterobacter* sp. SA187, *Ensifer* sp. SA403, *Bacillus* sp. SA436 and *Streptomyces* sp. SA444.

Amplicon sequence variants (ASVs) were inferred from the sequencing reads and, after standard filtering, resulted in 10,029,248 reads distributed over 3766 measurable ASVs.

With the V4 subregion from the 16 S rRNA gene in the genome assemblies assumed as the expected sequence, the Jizan strains could be matched to ASVs which served as an indicator for strain presence and relative abundance (Table S4). This analysis showed that of the 15 Jizan strains, the ASVs of 8 strains were found among the measurable ASVs (designated as targeted ASVs). While the other seven strains, including two members of SynCom C (Ensifer sp. SA403 and Streptomyces sp. SA444), are not shown because they fell below the filtering criteria (Fig. S9). The relative abundances of each targeted ASVs in the three compartments were plotted along the salt gradient (Fig. 6). Out of the eight targeted ASVs, ASV2 (Pseudomonas sp. SA244), ASV12 (Enterobacter sp. SA187), ASV13 (O. intermedium SA148) and ASV38 (Pseudomonas sp. SA613) as well as ASV91 (Ensifer sp. SA403) were not detected in the control but only in the soil inoculated with the Jizan SynCom. This indicated that the bacteria with these ASVs were likely not present in the nonsterile substrate and probably originated from the Jizan strains. Apart from the four targeted ASVs that were absent, ASV5 (P. argentinensis SA190), ASV16 (Ralstonia sp. SA424), ASV84 (Massilia sp. SA087), ASV513 (Bacillus sp. SA436) were detected both in the control and SynCom-inoculated samples. This prevents the differentiation of these four Jizan strains from the endogenous microbes present in the non-sterile substrate. Linear regression analysis showed that ASV2 (Pseudomonas sp. SA244) and ASV13 (O. intermedium SA148) significantly correlated with the salt level in the EC and, in the case of ASV2, also in the Rhizo (Fig. S10), which suggested the two strains belonging to these targeted ASVs were able to successfully colonize the roots under increasing saline conditions.

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Moreover, bacterial network analysis was performed and the cooccurrence of targeted ASVs was determined as a function of the salt level. The bacterial co-occurrence analysis showed that ASV2 (Pseudomonas sp. SA244) and ASV13 (O. intermedium SA148) were always present in both root compartments; while ASV513 (Bacillus sp. SA436) and ASV84 (Massilia sp. SA087) were only present in the Rhizo and EC, respectively. The presence of the Jizan SynCom significantly increased the number of connections and, as a result, the average connectivity in the Rhizo and EC networks (Fig. 7). As ASV2 and ASV13 were highly abundant in the root compartments, these two strains may have contributed to changes in the microbial networks, though their functions in the bacterial networks in the root compartment are yet unknown. Taken together, the presence of the SynCom C members was confirmed in this experiment, but only two of them could be definitively distinguished from the natural microbiome already present in the non-sterile substrate.

#### DISCUSSION

In this study, we showed that a bacterial SynCom originating from the Jizan desert plant indigofera promotes growth of the important economic crop tomato under salt stress in the presence of a non-sterile substrate that mimics a natural soil microbiome. Furthermore, we simplified this SynCom from the initial 15 to 5 strains. This simplified SynCom outperformed the plant growth promoting effect observed with the initial SynCom under the same experimental conditions. The five selected strains originate from the roots of the desert plant indigofera grown in a native soil. We argue that crop cultivation under abiotic stresses can be improved with microbiomes from such environments.

Some studies took a similar approach exploring desert microbiomes for the discovery of plant growth promoting rhizobacteria. For example, microbial communities have been



**Fig. 6** SynCom colonization at different salt levels in the soil and roots of tomato. Relative abundances of the bacterial ASVs in the Soil, Rhizo and EC of three-week-old tomato plants inoculated with or without the Jizan SynCom. Plants were grown in the non-sterile substrate and were exposed to a salt gradient. The eight ASVs with a perfect match to the V4 region of the Jizan strains are shown here. The other strains fell below our filtering criteria (Fig. S8). The relative abundances of the replicates are shaded as gray symbols per compartment and the mean is shown as a cross with the color referring to the salt level.

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**Fig. 7 Bacterial co-occurrence networks in the root of tomato across a salt gradient.** Networks are based on Spearman's rank correlation between the ASVs in the Rhizo and EC of tomato growing in the non-sterile substrate with or without SynCom across a salt gradient from 0 to 300 mM NaCl. Only edges with a correlation score  $|\rho| > 0.7$  and a p < 0.001 are shown. Positive and negative correlations are colored as gold and gray lines, respectively. Each node in a network is a detected ASV which means it passed these selection criteria. The square nodes are the ASVs belonging to a Jizan strain from the SynCom. A blue or green for the SynCom and control, respectively, indicates an ASV that was significantly enriched in any of the salt levels. The Jizan strains which were detected as well as enriched in a salt level are enlarged for clarity. Additional properties are shown below each network; ASVs: number of detected ASVs (initial number of ASVs), Connections: total number of edges per node.

analyzed from different desert regions, like Jizan, Thar, Atacama, Kalahari, Namib and Sahara deserts, as well as from various desert plant species [3, 22–27]. Bacterial strains belonging to the genera *Pseudomonas, Bacillus, Klebsiella, Cupriavidus, Ochrobactrum, lsoptericola*, and *Enterobacter* were isolated and showed to promote growth of multiple plant species under saline conditions, including model plant species arabidopsis as well as crops like wheat (*Triticum aestivum*), rice (*Oryza sativa*), alfalfa (*Medicago sativa*) and tomato [28, 29].

In our opinion, confirming the plant growth promoting response of rhizobacteria is a critical step in determining the robustness of such a trait. Plant growth promoting responses under both abiotic and biotic stress induced by single strain inoculants has been well documented. Unfortunately, these strains often fail when they are applied individually in the field, which is attributed to competition by the local microbiome [30]. For this reason, there has been a shift from this so-called "one-microbe-ata-time" approach to creating synthetic microbial communities [16]. The general idea is that a community of microbes will be more competitive by forming a stable community and will be able to maintain the traits beneficial to plant growth in the field [31]. Other studies have attempted to combat salt stress with SynComs albeit in sterile conditions [32-34]. However, to our knowledge there are no studies where a SynCom provides protection against salt stress to plants grown in the presence of a natural or local microbiome as seen under field conditions.

The quantification of shoot biomass was considered as the indicator for SynCom performance. From this data, it is unclear if the five member SynCom (SynCom C) leads to a higher biomass due to a specific microbe-mediated salt stress response or a general plant growth promotion. To verify, we measured the transcription of a selected list of salt stress related genes in tomato after SynCom C inoculation with a salt stress. This revealed that four days post salt imposition, the SynCom C mediated an early salt stress response in both the root and shoot tissues of tomato. For example, SOS1, SOS2 and WRKY8 were significantly uprequlated in the root four days post salt imposition. The most common causes of salt stress on plant growth are ion toxicity [35], osmotic stress [36], and the accumulation of reactive oxygen species (ROS) [37]. As salt imposition causes large influxes of Na<sup>+</sup> into plant tissue, a critical step in the plant response is to recirculate and sequestrate  $Na^+$ , as well as prevent further influx via the root [38]. The well-studied salt overly sensitive (SOS) pathway plays a crucial step in preventing Na<sup>+</sup> accumulation [39]. SOS3 is a calcium binding protein that senses cytosolic Ca<sup>2+</sup> changes, caused by salt stress, and in turn interacts with SOS2, which belongs to the SnRK3/calcineurin-interacting protein kinase (CIPK) subfamily. The SOS3/SOS2 kinase complex phosphorylates the Na<sup>+</sup>/H<sup>+</sup> exchanger SOS1, which is fundamental in Na<sup>+</sup> extrusion, distribution and long-distance transport in tomato [40]. Mutant studies of SOS1 show that it is essential for tomato NaCl tolerance, as gene silencing results in reduced growth [41]. It is therefore interesting

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that we find an upregulation of SOS1 in SynCom C inoculated plants in the presence of salt. Likewise, SOS2 is highly upregulated four days post salt imposition, indicating that the SOS pathway is more active in SynCom C treated tomato plants than in the noninoculated control. In addition, HKT1-like transporters are also essential in Na<sup>+</sup> recirculation and extrusion [42]. In arabidopsis and rice, ectopic expression of HKT1;1 can increase Na<sup>+</sup> exclusion from the shoot [43, 44]. While the effect was not significant, there was an upregulation by SynCom C of HKT1;1 in the shoot of tomato plants four days after the salt imposition [45]. These findings suggest that SynCom C plays a role in the avoidance of ion toxicity, prompting an early activation of plant ion homeostasis mechanisms. This is in line with the lower Na<sup>+</sup> /K<sup>+</sup> ratio in the shoot of SynCom C treated tomato plants. Additionally, none of the five SynCom C strains when applied as a separate inoculum showed a significant effect on plant biomass, nor was there a noticeable difference in the expression of genes that would indicate a salt stress response. This supports that SynCom C as a community is required for increasing salt stress resilience in tomato.

With the success of SvnCom C, derived from the Jizan SvnCom, we could evaluate the reported methods to design a suitable SynCom from a bacterial library. The key characteristics reported in literature rely on obvious traits such as plant growth promoting potential of single strains and, within the field of microbiome research, the presence of microbes in and around the roots [31]. A popular method to identify key species in a natural microbiome is based on the read counts of microbial sequences as an estimate of microbe presence [46]. This lends itself to the idea of a core microbiome and dominant OTUs, which we used to guide the isolation and selection of the original strains from the Jizan soil microbiome. The correlation between the abundance of a single strain and a triggered effect, such as abiotic stress tolerance, is considered to be indicative of a strain's relative importance [47]. By extending this idea to the interactions between strains, network analysis can reveal the effect of a treatment on microbiome structure, which can further guide the identification of key species [48]. However, the key characteristics of the SynCom C strains did not meet the above expectations. Starting with the evaluation of plant growth promotion as a trait, only three of the five strains belonging to SynCom C significantly improved tomato growth under the same conditions when inoculated individually: namely Massilia sp. SA087, Ensifer sp. SA403, and Bacillus sp. SA436. The other two strains (Enterobacter sp. SA187 and Streptomyces sp. A444) showed a non-significant increase in biomass compared to the control. Interestingly, the community consisting of the best performing strains (SynCom A) did not significantly outperform the non-sterile control. This suggests that the selection criteria in the design of a SynCom should not solely rely on the plant growth promotion by a strain.

Shifting focus to the presence of microbes in or near the root, we would expect the five SynCom C strains to be dominant in relative abundance, positively correlated to the salt level and play a leading role in microbial network structure. Even though all SynCom C strains can be detected when added to a natural microbiome in combination with salt stress, none of the strains was dominant in abundance relative to the other strains detected from the Jizan SynCom. Interestingly, the only two strains (Pseudomonas sp. SA244 and O. intermedium SA148) that showed a positive correlation between read count and salt level did not belong to SynCom C. None of the SynCom C members showed a similar response to the salt gradient. Inoculation of the 15 strains from the Jizan SynCom influenced the microbial network of the natural microbiome by increasing the average connectivity. The network analysis revealed that only two members from SynCom C passed the detection threshold: Bacillus sp. SA436 and Massilia sp. SA087 in the rhizosphere and endophytic compartment, respectively. Both these strains were positioned in the periphery of their respective networks, which suggests a minor interaction with the natural microbiome. The SynComs containing *Pseudomonas* sp. SA244 and *O. intermedium* SA148, which were also present in the network and highly connected with the natural microbiome, did not perform as well as SynCom C. This suggests that solely relying on read count abundances from meta-amplicon sequencing is also not a reliable method for the design of a SynCom.

Overall, in this study, we isolated a core root bacterial microbiome of the desert plant indigofera and constructed a 15 strain SynCom that possesses a robust plant growth promoting effect on tomato when exposed to salt stress. The reduction of this Jizan SynCom led to a simplified version in the form of SynCom C, which retained its plant growth promoting effect. This SynCom was effective in specifically combating salt stress and did not lose effectiveness in a non-sterile environment. Our data suggests that a promising approach or strategy is in the combination of plant phenotype screening and more advanced and accurate methods, such as metagenomic, metatranscriptomics and metabolomics sequencing, to better model the predictive traits for a successful SynCom design.

## MATERIALS AND METHODS

### Bacterial strains and culture conditions

Bacterial strains were cultured in tryptic soy broth medium (TSB) at 28 °C. Fast growing strains were cultivated in 1/10th TSB for 1 day and slow growing strains were cultivated in ½ strength TSB for 5 days. Rhizobial strains were cultivated in yeast extract manitol (YEM) for 3–4 days. Bacterial cells were collected by centrifugation, washed three times with 0.9% NaCl and resuspended in appropriate solution according to the plant assay. The single strain cultures were an equimolar mixture of strains with a final concentration of  $5 \times 10^8$  CFU ml<sup>-1</sup> and each plant received in total  $10^9$  cells.

#### Plant assay for indigofera and tomato

Indigofera seeds were surface sterilized by washing with ethanol and soaking in 1/4 bleach for 10 min. Seeds were kept at 4 °C for three days followed by a seven-day incubation at 30 °C. After germination, two seedlings were transplanted per pot containing either sterile river sand supplemented with Bradyrhizobium sp. SA281 or Jizan soil. The Jizan soil was collected from the Jizan desert in Saudi Arabia (Latitude 16.9405 N; Longitude 42.6119E) and has a low nutrient content (Table S5). The river sand was sterilized by gamma radiation with a minimum dose of 25 kGy which is fatal to most microbes [49]. The water holding capacity (WHC) of the substrate was maintained at 30% with sterilized dH<sub>2</sub>O. The climate room was configured at 35/25 °C day/night, 12 h of light and 75% relative humidity to mimic the Jizan desert condition. The second indigofera experiment with the Jizan SynCom was identical in growing conditions and seed preparation. Two seedlings were transplanted to pots with sterile river sand inoculated with the Jizan SynCom or only with Bradyrhizobium sp. SA281 as a control. The sample size per treatment was four with two seedlings per replicate or pot. WHC was again maintained at 30% but Fahräeus medium was used once a week instead of sterile dH<sub>2</sub>O. In both experiments, fresh and dry shoot weight were measured at day 42 post transplantation.

Tomato seeds of the MoneyMaker cultivar were sterilized with the same method. After vernalization, seeds were germinated in one day at 25 °C in the dark. The germinated seeds were sown into plastic cups containing, according to the experiment, either sterile river sand or the non-sterile substrate which was a 10/90% mixture of Mossel soil sourced from the Veluwe (the Netherlands) and sterile river sand. Inoculation by either a single Jizan strain or the 15-member Jizan SynCom followed immediately after sowing. Uniform seedlings were selected 7 days post sowing and the fresh weight recorded at day 21. Pots were randomly repositioned in the growing chamber (25 °C, 12 h lighting, 60% relative humidity) several times throughout the growing period. Where applicable, the salt imposition always occurred on day 7 according to a modified protocol from a previous study [50] (Fig. S4). Pots were first watered to 60% WHC before soaking them in a saline solution for 30 min. The inflow of the saline solution will mix with the water present in the substrate and (after returning to 60% WHC) a target salt concentration is reached. For details refer to Fig. S4.

#### DNA extraction and sequencing

The soil, rhizosphere and endophytic compartment were isolated from the roots of tomato or indigofera following the procedure described previously [21]. In summary, the soil was defined as the sand easily removed from the roots by shaking. The roots were washed in sterile phosphate buffer (6.33 g NaH<sub>2</sub>PO<sub>4</sub>.H<sub>2</sub>O, 16.5 g Na<sub>2</sub>HPO<sub>4</sub>.7H<sub>2</sub>O & 200 µL Silwet L-77 in 1 L dH2O, pH = 7.0) and vortexed briefly. After removing the roots, the suspension was filtered through a 100 µm cell strainer and spun down for 10 min at 4000 x q. Supernatant was discarded and the remaining pellet was the rhizosphere. For the EC: the roots were washed twice more with sterile phosphate buffer, transferred to a new tube with sterile phosphate buffer, sonicated for 10 min (with a 30 s pause in every minute) and dried on sterile filter paper. All samples were frozen in liquid nitrogen and stored at -80 °C. DNA from soil and rhizosphere samples was isolated using the Mo Bio PowerSoil kit (Qiagen) according to the manufacturer's instructions. According to the procedure described previously [51], DNA from the EC samples was isolated using the Fast DNA Spin Kit for Soil (MP Biomedicals). Quality and quantity of the DNA was checked by nanodrop and gel electrophoresis. Per sample, around 400 ng was sent for 16 S rRNA gene sequencing at Beijing Genomics Institute (BGI) with the V4 primers 515 F and 806 R. The samples from indigofera and tomato were sequenced with MiSeq and HiSeq, respectively.

#### Meta amplicon sequencing data processing

For the indigofera sequencing data, paired-end FASTQ reads were merged into contigs using PANDASeq (v.2.3) with a minimum overlap of 50 bp, minimum contig length of 100 bp and a Phred score of 25. Contigs were converted to FASTA format with the fastx-toolkit (v.0.0.13) into a single file. These reads were clustered into operational taxonomic units (OTUs) according to the UPARSE pipeline [52] implemented in VSEARCH (v.1.1.3) [53]. In short, the pipeline consisted of de-replication, sorting by abundance, and discarding singletons. OTUs were generated with the UPARSE algorithm and chimeric sequences were removed with the UCHIME algorithm. An OTU table was constructed by mapping reads back to the OTUs with the "usearch\_global" algorithm from VSEARCH. Taxonomy based on the SILVA (V138) [54] 16 S rRNA gene dataset was assigned to the OTUs with the RDP classifier (v.2.10.1). All processing steps were implemented in a SnakeMake workflow.

For the tomato sequencing data, amplicon sequence variants (ASVs) were inferred from the Illumina paired-end FASTQ reads with the DADA2 pipeline (v.1.12.1) [55]. FASTQ reads were filtered with the filterAndTrim function allowing for only one expected number of errors (maxEE = 1) and discarding reads with any ambiguous nucleotides (maxN = 0). Error rates were learned separately with the first  $1 \times 10^8$  nucleotide bases of the filtered forward and reverse reads. The pseudo-pooling algorithm from the dada function together with the learned error rates predicted the ASVs in both orientations of the filtered reads after dereplication. The paired reads were merged with the mergePairs function and chimeras were removed by the consensus method with the removeBimeraDenovo function. The RDP Naive Bayesian Classifier algorithm [56] as implemented in the assign-Taxonomy function assigned the taxonomy of the ASVs against the SILVA (v138) dataset.

#### Meta amplicon sequencing data analysis

All analyses were performed in the R environment (v.3.6.3). The bacterial dataset of indigofera, which was the OTU table, was processed as described previously [21]. First, OTUs related to mitochondrial and chloroplast sequences were removed and it was named as "raw OTUs". Next, the OTUs that have more than 25 reads in any sample were kept and they were named as "measurable OTUs". The result was a table with 873 measurable OTUs with over 728,970 sequences divided over 11 samples (Dataset S4). Using the Bray-Curtis dissimilarity measure on a rarefied measurable OTU table, the soil, Rhizo and EC samples of indigofera were plotted with principal coordinate analysis (PCoA) in two-dimensional space. This was largely done with the vegan package (v.2.5.6).

For the bacterial dataset of tomato, which was the ASV table, ASVs related to mitochondrial and chloroplast sequences were removed. Then, ASVs with sequence length smaller than 253 or bigger than 254 bps were excluded. After this, data relating to our study were subset and named as "raw ASVs". In order to track the SynCom members in our sequencing data, the V4 region of these strains were extracted and aligned with the sequences of "raw ASVs". The "raw ASVs" table was then filtered and ASVs (which have more than 25 reads in at least 5 samples) and named as "measurable ASVs". The custom R commands were used in these analyses,

mainly retrieved from the R packages tidyr (v.1.1.1), reshape2 (v.1.4.4), ggplot2 (v.3.3.2) and fmsb (v.0.7.0).

For differential abundance test, we used the same method as implemented in a previous study [21]. To test OTUs differently abundant between the Rhizo and EC in comparison to Soil, we used the default setting to create the normalized OTU table from "raw OTUs". Next to it, the fitZig function and default settings in the metagenomeSeq package (v.1.28.2) [57] were used for differential abundance testing. This was the same for tomato where the "raw ASVs" were tested for differential abundance between no salt (0 mM) and each salt treatment (100, 200, 300 mM NaCl input) for all three compartments. Furthermore, for the enriched ASVs, the correlation between their abundance (log2-normalized reads) and increasing salt gradients was tested with linear regression.

We constructed co-occurrence networks between bacterial ASVs embedding all salt levels in three compartments in both control and SynCom inoculation conditions, using a custom implementation of publicly available scripts [58]. For these networks, we used the normalized ASV table and conducted Spearman rank correlations between ASVs. The networks were visualized with the Fruchterman-Reingold layout (50,000 permutations) in igraph and show the strong and significant correlations (|p| > 0.7 and p < 0.001).

## Bacteria isolation and correlation analysis

To isolate strains from the rhizosphere and endophytic compartment of indigofera grown in the Jizan soil, serial dilutions of the glycerol stocks obtained from these compartments were plated on 1/10th TSA, King's B, R2A and ISP3 agar media. Plates were incubated at 28 °C for 14 days. Colony appearance was monitored daily and independent colonies were re-streaked on 1/10th TSA plates. Colonies were re-streaked on fresh 1/ 10th TSA plates once more to ensure purity. The 16S rRNA gene was amplified with primers 63 F 5'-CAGGCCTAACACATGCAAGTC-3' and 1389 R 5'-ACGGGCGGTGTGTACAAG-3' [59] of fresh colonies in replicate. PCR products were sequenced at Macrogen (Amsterdam, the Netherlands). All 16 S rRNA sequences were processed with Geneious 8.1.9 (https://www. geneious.com) and submitted to RDP database for taxonomic identification. For the correlation analysis, the V4 region of the 16 S rRNA gene sequences were aligned with the consensus sequences of the indigofera OTUs. Isolates with the V4 region matching OTUs with more than 97% identity were kept. Representative isolates of these OTUs were selected for strain level analysis by using BOX-PCR with primer BOXA1R 5'-CTACGG-CAAGGCGACGCTGACG-3' [60] and repetitive strains were removed by comparing the genetic profiles. In the end, 11 strains were selected including 9 strains belonging to high abundant OTUs and 2 strains belonging to relatively low abundant OTUs but potentially promoting plant growth. Their glycerol stocks were prepared and stored at -80 °C.

#### Genome assemblies and phylogeny

Illumina paired-end FASTQ files were cleaned with Trimmomatic (v.0.38) [61] by clipping reads if the average Phred quality score within four consecutive bases dropped below 28 (SLIDINGWINDOW:4:28). The trimmed FASTQ files were then assembled into contigs by SPAdes (v.3.12.0) [62] with the careful option turned on and k-mer sizes of 21, 33, 55, and 77 nt. A high amount of assembly contamination (up to 79%) was detected by CheckM (v.1.1.2) [63] in the following genera: *Bacillus* (SA436), *Ensife* (SA403), *Massilia* (SA087), *Pseudomonas* (SA613 and SA244), *Ralstonia* (SA424), and *Streptomyces* (SA113, SA444, SA619, SA670 and SA681). These assemblies were cleaned with K-means clustering (Python Scikit-learn) [64] on the tetranucleotide signatures of the contigs. A second round of CheckM indicated a drop in contamination to below two percent for all assemblies. Finally, assembly statistics and genome completeness were assessed with QUAST (v.5.0.0) [65].

The phylogeny of the Jizan strains was inferred by maximum likelihood on concatenated AMPHORA gene alignments. For the nine genera, candidate accessions were selected from the NCBI RefSeq database based on several criteria. First, all the reference assemblies from each genus were included. Additional accessions were either plant root-associated or isolated from a desert habitat. The coding domain sequences and translated protein sequences were downloaded from NCBI in September 2020. For the Jizan strains, the open reading frames (ORFs) on the contigs were predicted by Prodigal (v.2.6.3) [66]. Hidden Markov Model profiles of the AMHPORA proteins were used by hmmsearch (v.3.2) [68] to identify the best protein hit in the translated ORFs with an E-value threshold below 0.001. Accessions without the full set of 31 AMPHORA genes were discarded from the analysis. The AMHPORA genes were aligned separately with Clustal Omega (v.1.2.4) [69] and inspected manually. A multiple sequence alignment (MSA) was constructed by concatenating the AMHPORA gene alignments per accession. Phylogeny was inferred on the MSA with IQTree (v.1.6.12) [70]. The affiliated tool ModelFinder [71] identified the best-fit substitution model for each MSA. Finally, trees were visualized with the Python framework ETE3 [72].

#### Gene expression and ion content assay

Tomato seeds were grown in sterile river sand, inoculated with either SynCom C, SA087, SA187, SA403, SA436 or SA444 and exposed to a 200 mM salt stress as described in Fig. S4. Plant shoot and root tissue were harvested at 4-, 7- and 10-days post salt imposition. The fresh shoot weight was recorded, and the root tissue was carefully extracted from the sand and vortexed briefly in phosphate buffer. All samples were frozen in liquid nitrogen and stored at -80 °C.

Five candidate genes for salt tolerance in tomato were chosen based on literature. The genes *HKT1;1, WRKY8, SOS1* and *SOS2* were previously shown to be associated with salt tolerance in tomato [40, 73–76]. The gene *CESA2* was also included as it showed a high homology to *AtCESA6*, which is important to salt tolerance in *Arabidopsis thaliana* [77]. Of these five genes, the primer sequences of *WRKY8* were taken from literature. For the others, custom primers were designed in silico on the RefSeq tomato assembly SL3.0 (GCF\_000188115.4) with Geneious 11.1.5 (https://www.geneious.com). *Actin* was chosen as the housekeeping gene for normalization within samples [78]. Primer sequences, GC content, annealing temperature (Tm), expected amplicon length, NCBI GeneID, and references are shown in Table S3. Primer efficiencies were confirmed to be around 100% for all primer pairs using a range of serial dilutions.

Total RNA was extracted from the shoot and root tissue with the E.Z.N.A.® Plant RNA kit (OMEGA BioTek). An optimal on-membrane DNase digestion step was performed during the RNA extraction by adding 10 µL DNase 1 and 70 µL Buffer RDD from the Qiagen DNase 1 kit. RNA quantity and purity as well as integrity were checked by Nanodrop and agarose gel electrophoresis. cDNA was synthesized from 300 and 600 ng of root and shoot RNA, respectively, with the iScript<sup>™</sup> Select cDNA Synthesis kit (Bio-Rad). The synthesis reaction was carried out at 25 °C for 5 min, 46 °C for 20 min followed by 1 min at 95 °C. cDNA samples were diluted 5 times, aliquoted and stored at -20 °C. For the gPCR, each reaction contained: 5 µL IQ<sup>™</sup> SYBR<sup>®</sup>, 2 µL cDNA and 1.5 µL of the forward and reverse primers with a total volume of 10 µL. Samples were loaded into a CFX Connect<sup>™</sup> system (Bio-Rad) and initialized at 95 °C for 3 min, followed by 40 rounds of thermocycling. Each cycle started at 95  $^\circ\!C$  for 15 s, followed by 30 s at the primer-specific Tm (average temperature of the forward and reverse primers). Melting curves of all samples (from 55 °C to 95 °C in 5 second intervals with a 0.5 °C increment after each cycle) showed primer specificity and no primer-dimer formation. Relative expression of target genes was calculated for shoot and root tissue per timepoint as described previously [79]. Calculations were based on the control treated plants with salt as the reference group and Actin as the reference gene. Relative expression level (fold change) was calculated by the 2^-AACt method. Statistical significance was determined by a Dunnett's test on the relative expression levels.

Ion concentrations was measured in tomato seedlings at ten days post salt imposition using an Ion Chromatography (IC) system 850 Professional (Metrohm, Switzerland), essentially as described previously [80]. Leaves of tomato seedlings were weighed in glass screw cap test tubes, dried and ashed in a furnace at 575 °C for 5 h. After cooling down to room temperature 1 mL formic acid (3 M) was added to each tube. Samples were heated at 103 °C for 15 min with shaking at 600 rpm. The extracts were then diluted by adding 9 mL of milliQ water to each sample. The samples were again heated and mixed at 80 °C for 30 min. After cooling down to room temperature all samples were measured in two dilutions 1/100 and 3/100 using a Metrohm 881 Compact IC pro ion chromatograph. Data was expressed in mg ion/mg dry weight.

A similar experiment was carried out with the same inoculums but in the non-sterile substrate. The shoot tissue of plants at ten days post salt imposition was harvested in order to record the fresh weight and to measure the ion content as described above.

## DATA AVAILABILITY

The raw sequencing reads are available upon request before they are uploaded to the Sequence Read Archive (SRA). The processed OTU/ASV tables and custom R and Python scripts are also available upon request.

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## **AUTHOR CONTRIBUTIONS**

LS, ZY, XC, MdR, RP, QZ, CF executed the experiments. LS, MS, ZY, RvV constructed and implemented the bioinformatics pipelines. LS, ZY, MS, XC conducted in silico analyses. AD and LMT performed ion content analysis. TB and RG initiated this project and helped setting up this study. LS, ZY, RG and XC wrote the manuscript.

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## **COMPETING INTERESTS**

The authors declare no competing interests.

## **ADDITIONAL INFORMATION**

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