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## RESEARCH ARTICLE

# Culturable diversity of bacterial endophytes associated with medicinal plants of the Western Ghats, India

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One sentence summary: A collection of bacterial endophytes isolated from a number of medicinal plants of the Western Ghats, India were investigated for their capability to produce specialised metabolites that may contribute to therapeutic properties.

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## **ABSTRACT**

Bacterial endophytes are found in the internal tissues of plants and have intimate associations with their host. However, little is known about the diversity of medicinal plant endophytes (ME) or their capability to produce specialised metabolites that may contribute to therapeutic properties. We isolated 75 bacterial ME from 24 plant species of the Western Ghats, India. Molecular identification by 16S rRNA gene sequencing grouped MEs into 13 bacterial genera, with members of Gammaproteobacteria and Firmicutes being the most abundant. To improve taxonomic identification, 26 selected MEs were genome sequenced and average nucleotide identity (ANI) used to identify them to the species-level. This identified multiple species in the most common genus as Bacillus. Similarly, identity of the Enterobacterales was also distinguished within Enterobacter and Serratia by ANI and core-gene analysis. AntiSMASH identified non-ribosomal peptide synthase, lantipeptide and bacteriocin biosynthetic gene clusters (BGC) as the most common BGCs found in the ME genomes. A total of five of the ME isolates belonging to Bacillus, Serratia and Enterobacter showed antimicrobial activity against the plant pathogen Pectobacterium carotovorum. Using molecular and genomic approaches we have characterised a unique collection of endophytic bacteria from medicinal plants. Their genomes encode multiple specialised metabolite gene clusters and the collection can now be screened for novel bioactive and medicinal metabolites.

Keywords: endophytic bacteria; antimicrobials; Bacillus; medicinal plants; bacterial genomes; biosynthetic gene clusters

## INTRODUCTION

Multiple countries use indigenous plants as traditional remedies for treatment of injury or disease. In the Indian traditional medicinal system of Ayurveda and other similar practices, leaves, roots, seeds and fruits are commonly used as alternative medicines. Garcinia indica (Baliga et al. 2011), Salacia chinensis (Deokate and Khadabadi 2012) and Alstonia scholaris (Ganjewala and Gupta 2013) are examples of Indian medicinal plant species described to have multiple therapeutic properties. Garcinia indica, commonly known as the kokum tree, produces fruits which are used in Ayurvedic medicine for its antimicrobial, antiulcer, anticancer and antiobesity properties, as well as being able to ease inflammatory and pain-related issues (Baliga et al. 2011). The roots of the Salacia chinensis herb tree have also been exploited for beneficial properties in treating tooth decay, ulcers, obesity and skin conditions (Deokate and Khadabadi 2012). Multiple parts of the Indian devil tree, Alstonia scholaris, such as leaves, follicles and latex show extensive antimicrobial and antioxidant properties (Ganjewala and Gupta 2013). Recently, the medicinal plant-associated microbiome, and especially the interaction between the complex community of endophytic microorganisms (endomicrobiome; Köberl et al. 2013) have been attributed to these antimicrobial (Martinez-Klimova, Rodríguez-Peña and Sánchez 2017) and bioactive properties through the metabolites they produce (Gouda et al. 2016; Ek-Ramos et al. 2019). Endophytic bacteria isolated from traditional Chinese medicinal plants used as anticancer therapy were screened for bioactivity and all isolates exhibited either cytotoxic, antibacterial or antifungal activities in at least one assay (Miller et al. 2012b).

Endophytic microorganisms (endophytes) are bacteria or fungi that colonise the intercellular and/or intracellular spaces of plants, often living in a symbiotic relationship (Hardoim et al. 2015). Endophytes are known to promote plant growth and nutrient gain, improve yield and aid the plant to survive in harsh conditions when under stress or attack from pathogens (Ryan et al. 2008; Hardoim et al. 2015; Santoyo et al. 2016). It is thought for this reason many endophytes produce a range of unique specialised metabolites, such as peptides, polyketides and alkaloids, to aid the plants immune response and prevent colonisation by pathogens and other microbes. Natural products from endophytes frequently possess bioactivities such as antimicrobial, antifungal, anticarcinogen, immunosuppressant and antioxidant (Zhang, Song and Tan 2006; Akinsanya et al. 2015; Sharma et al. 2020) and their investigation offers huge potential in identifying new pharmaceutical compounds.

However, whilst nearly all plants are thought to contain endophytes, very little is known about the diversity of endophytes in traditional Indian medicinal plant species. India is considered to be one of the 16 mega diversity countries in the world with around 17 500 higher plants species, of which 4050 plants are found in the Western Ghats (Pascal, Ramesh and De Franceschi 2004), many of which are used in the treatment of infection, disease, wounds and injuries (Ayyanar and Ignacimuthu 2011). In this study we aimed to determine the culturable diversity of bacterial endophytes present within a large collection of plant species taken from the Western Ghats region. Plants were chosen based on their ethnobotanical usage, being endemic to the region or were found growing within biodiversity rich areas (Strobel and Daisy 2003). Endophytes were then isolated from the leaves (the main plant part of medicinal value) from 24 plant species, initially identified by 16S rRNA gene analysis, and then followed up with whole genome sequencing for finer resolution of their taxonomy. Selected endophytes were also investigated further for their specialised metabolite potential via a genome mining and antimicrobial bioactivity analysis.

## MATERIALS AND METHODS

#### Sample site and plant material collection

The Western Ghats (or Sahyadri) is a mountain region that covers an area of around 140 000 km<sup>2</sup> and 1600 km in length running parallel to the western coast of the Indian peninsula from the river Tapti in the North to Kanyakumari in the South (Reddy, Jha and Dadhwal 2016). It traverses parts of six states, Kerala, Tamil Nadu, Karnataka, Goa, Maharashtra and Gujarat and is a UNESCO World Heritage Site and one of the eight "hottest hotspots" of biological diversity in the world (Myers et al. 2000). It has non-equatorial tropical evergreen forests which hosts at least 325 globally threatened species of flora and fauna (UNESCO). The database on ethnomedicinal plants of Western Ghats lists 500 plants from 115 families that have been used to prepare around 600 different medicinal formulations as listed by the Indian Council of Medical Research (Project by SD Kholkute, 2005-2008, submitted to ICMR). However, it is estimated that the true number of medicinal plants in the Western Ghats is >700 species with many being endemic and listed as endangered in the International Union for Conservation of Nature (IUCN) Red List of threatened species (https://www.iucnredlist.

Leaf samples (and one fruit sample) from 24 plant species (covering 19 plant genera; Figure S1a and Table S1, Supporting Information) were collected from two sites of the Western Ghats and one site of Mysore in Karnataka, India between 5th July and 28th August 2017. All samples were then transported to the laboratory in sterile polypropylene bags and processed within 24 h of collection. Each plant was identified by referring to literature, herbarium specimens, consulting with taxonomists and searching databases including The Western Ghats (India Biodiversity Portal), Sahyadri (Western Ghats Biodiversity Information System) and Digital Flora of Karnataka. Samples of the plant species were preserved in the Herbarium of Department of Studies in Microbiology, University of Mysore, India.

#### Isolation of endophytic bacteria

Samples were washed with distilled water and surface sterilised using the following procedure: 0.1% (w/v) HgCl<sub>2</sub> solution for 1 min, sterile water for 1 min, 90% (v/v) ethanol for 2 min and finally washed again with sterile water. Leaf samples were then cut into segments of approximately 0.5 cm<sup>2</sup> using a sterile scalpel and placed onto Luria-Bertani (LB) agar (HiMedia Laboratories, Mumbai, India) plates and incubated at ambient temperature in the dark. To ensure bacterial growth was only obtained from plant endophytes, one additional LB agar plate for each plant was also incubated with uncut surface sterilised leaves as a control (Martinez-Klimova, Rodríguez-Peña and Sánchez 2017). No growth from plant epiphytic bacteria was observed. During incubation, inoculated plates were frequently observed for bacterial growth at the cut-ends of the leaf tissue and emerging bacteria were transferred onto fresh LB agar. Bacterial endophytes were streaked, and individual colonies were selected and

sub-cultured three times to obtain pure bacterial cultures on LB agar. Each bacterial isolate was transferred separately to LB agar slopes and stored at 4°C for further study. The cultures were maintained at the University of Mysore for characterisation and elucidation of bioactive compounds, while phylogenetic analysis and genome sequencing of endophytes was performed at Cardiff University. All bacterial cultures isolated in this study are available from the laboratory collection held at the Department of Studies in Microbiology, University of Mysore, India by request from the corresponding author.

For molecular characterisation analysis, bacterial isolates were revived on TSA (Tryptone Soy agar; Oxoid, Basingstoke, UK) plates at 30°C, sub-cultured three times and checked for purity, except isolates ME7 and ME8 which grew better on Reasoner's 2A agar (R2A agar, Oxoid). Pure cultures were stored at −80°C in 8% (v/v) dimethyl sulfoxide (DMSO) and tryptone soya broth (TSB) or R2A.

# 16S rRNA gene diversity and phylogenetic analysis of bacterial endophytes

DNA was extracted from 10 µL of an overnight culture (grown in TSB or R2A at 30°C) with 100  $\mu$ L of 5% (w/v) Chelex 100 resin (Walsh, Metzger and Higuchi 1991) by undergoing two cycles of boiling and freezing (5 mins each) as described (Parkes et al. 2010). The crude DNA extract was then used as template in a 16S rRNA gene PCR with bacterial primers 27F and 907R (Webster et al. 2006). All 16S rRNA gene PCR amplicons were analysed by 1.2% (w/v) agarose gel electrophoresis, purified and sequenced at Eurofins Genomics (https://www.eurofinsgenomics.eu/en/ho me/) by Sanger sequencing with primer 27F. Sequence chromatograms were analysed using Chromas version 2.6.6 (http: //technelysium.com.au) and mixed sequences (suggestive that some isolates were not pure) were removed from further analysis resulting in 75 pure endophytic bacterial isolates (see Table 1).

Bacterial 16S rRNA gene sequences were analysed using Nucleotide BLAST implemented on the NCBI server (https://blas t.ncbi.nlm.nih.gov) against the nucleotide collection (nr/nt) and the 16S ribosomal RNA sequences databases to identify closest relatives. Sequences were assigned to various operational taxonomic units (OTUs) by using BLASTClust (http://www.ncbi.nlm .nih.gov/) at 95% similarity, representing a genus level grouping (Schloss and Handelsman 2004). Diversity measurements including rarefaction curves, coverage, Shannon's and Simpson's indices of diversity and species richness (S<sub>Chao1</sub>) were calculated using the Past software package v3.14 (Hammer, Harper and Ryan 2001).

All 16S rRNA gene sequences were aligned using MAFFT v7 online (Katoh, Rozewicki and Yamada 2019) with sequences retrieved from the database. Alignments were edited manually using BioEdit (Hall 1999) and phylogenetic trees were constructed using MEGA7 (Kumar, Stecher and Tamura 2016) by using the Maximum Likelihood method with the General Time Reversible model and Gamma distribution. Congruent trees were also obtained using other methods, including minimum evolution and LogDet distance, neighbour-joining with Jukes-Cantor algorithm.

#### Bacterial genome sequencing and assembly

Bacterial genomic DNA was extracted from isolates of interest (n = 26), identified by 16S rRNA gene sequencing, from a 3 mL overnight culture grown in TSB or R2A at 30°C. Cells were collected by centrifugation at 4000 rpm using ALC PK120 Centrifuge for 10 min, resuspended in 4M guanidinium Isothiocyanate and DNA extracted using an automated Maxwell® 16 Instrument with Tissue DNA Purification Kits (Promega UK Ltd, Southampton, UK) according to the manufacturer's instructions. DNA was quantified using a Qubit 3.0 Fluorometer, and libraries prepared for 250 bp nucleotide paired-end sequencing using the NEBNext® Ultra II DNA Library Prep Kit for Illumina. Genome libraries were then sequenced by an Illumina MiSeq platform.

Sequence reads were trimmed from Illumina adaptors using the TrimGalore v0.4.2 script (https://www.bioinformatics.babra ham.ac.uk/projects/trim\_galore/) and paired reads were merged with FLASH v1.2.11 (Magoc and Salzberg 2011). Genomes were assembled with SPAdes v3.13.0, and mis-assemblies corrected using Pilon v1.22 (Bankevich et al. 2012; Walker et al. 2014).

Bacterial genome and 16S rRNA gene sequences reported in this study have been submitted to the European Nucleotide Archive (ENA) under the project/study accession number PRJEB37902.

## Species Identification of bacterial endophyte genomes

To allow species identification of the 26 bacterial endophyte genomes, the genus of each bacterial isolate was initially assigned by 16S rRNA gene comparison to the NCBI BLAST database coupled with genome identification using the taxonomic sequence classification system Kraken2 v2.0.6-beta and RefSeq complete bacterial genomes. Using this preliminary identification as a guide, full species assignment was then achieved by combining average nucleotide identity (ANI) and core-gene phylogenomics. The MinHash-based ANI tool FastANI (Jain et al. 2018) was used to identify RefSeq genomes of the same genus with high sequence similarity to each endophyte isolate. RefSeq genomes of each genus were downloaded using a NCBI genome download script available at GitHub (https: //github.com/kblin/ncbi-genome-download). Up to 30 genomes with >90% sequence identity to each isolate, in addition to other endophyte isolates of the same genus, were passed to an alignment-based ANI tool, PyANI (Pritchard et al. 2016) for enhanced ANI accuracy. A core-gene phylogeny was constructed for each genus comprising genomes (Refseq and endophyte isolates) with >95% sequence identity to a given isolate, in addition to type strains and additional species representatives. Coregene alignments were generated with Roary v3.13.0 (Page et al. 2015) implementing MAFFT v7.407 (Katoh and Standley 2013) and using genome annotations produced with Prokka v1.12. Maximum-likelihood phylogenetic trees were constructed using RaxML v8.2.12 with a general time reversible substitution model and gamma model of rate heterogeneity; and visualised with FigTree (http://tree.bio.ed.ac.uk/software/). In addition, for comparison genome sequences were also uploaded to the Type (strain) Genome Server (TYGS) bioinformatics platform available (https://tygs.dsmz.de) for whole genome-based taxonomic analysis (Meier-Kolthoff and Göker 2019). This platform provides both species assignment and digital DNA-DNA hybridisation (dDDH) values to the closest type strain genomes available.

# Assessing biosynthetic gene cluster potential of whole-genome sequenced endophytes

To ascertain the biosynthetic gene cluster (BGC) potential of bacterial endophytes the genomes were analysed with the specialised metabolite predicting software antiSMASH v4.0 (Blin et al. 2017). Following BGC prediction, the sequences were

Table 1. List of bacterial endophytes isolated from leaves of medicinal plant species sampled at different locations of the Western Ghats, Karnataka, India.

Endophytic bacterium <sup>a</sup>	Plant species isolated from	Sampling location	Identification by 16S rRNA gene similarity	Identification by average nucleotide identity (ANI)	Identification by Type strain Genome Server (TYGS)
ME1	Memecylon malabaricum	Bisle Ghat region	Serratia sp.		
ME3	Memecylon malabaricum	Bisle Ghat region	Serratia sp.		
ME4	Aphanamixis polystachya	Bisle Ghat region	Bacillus sp.		
ME5	Aphanamixis polystachya	Bisle Ghat region	Bacillus sp.	Bacillus thuringiensis	Bacillus paranthracis
ME6	Terminalia bellirica	Bisle Ghat region	Bacillus sp.	Bucillus thurmglensis	bucillus pururienrucis
ME7	Terminalia bellirica	Bisle Ghat region	Aureimonas sp.	Aureimonas sp.	Aureimonas sp.
ME8	Terminalia bellirica	Bisle Ghat region	Aureimonas sp.	Time of the second	1100 of 1
ME9	Terminalia bellirica	Bisle Ghat region	Bacillus sp.		
ME10	Ventilago sp.	Bisle Ghat region	Enterobacter sp.		
ME11	Ventilago sp.	Bisle Ghat region	Bacillus sp.		
ME12	Terminalia paniculata	Bisle Ghat region	Curtobacterium sp.	Curtobacterium sp.	Curtobacterium sp.
ME13	Terminaliapaniculata	Bisle Ghat region	Enterobacter sp.	Enterobacter bugandensis	Enterobacter bugandensis
ME14	Aristolochia tagala	Bisle Ghat region	Enterobacter sp.	o angumanono io	o agumaciio io
ME15	Aristolochia tagala	Bisle Ghat region	Klebsiella sp.		
ME16	Aristolochia tagala	Bisle Ghat region	Enterobacter sp.		
ME17A	Aristolochia tagala	Bisle Ghat region	Klebsiella sp.		
ME18	Aristolochia tagala	Bisle Ghat region	Enterobacter sp.		
ME19	Aristolochia tagala	Bisle Ghat region	Enterobacter sp.		
ME20	Aristolochia tagala	Bisle Ghat region	Bacillus sp.		
ME21	Aristolochia tagala	Bisle Ghat region	Klebsiella sp.		
ME23	Garcinia xanthochymus	Bisle Ghat region	Bacillus sp.		
ME25	Aphanamixis polystachya	Bisle Ghat region	Bacillus sp.	Bacillus taxi	Bacillus taxi
ME26	Ventilago sp.	Bisle Ghat region	Curtobacterium sp.	Curtobacterium sp.	Curtobacterium sp.
ME27	Aphanamixis polystachya	Bisle Ghat region	Acinetobacter sp.	Acinetobacter lactucae	Acinetobacter lactucae
ME28	Salacia macrosperma	Bisle Ghat region	Bacillus sp.		
ME29	Salacia macrosperma	Bisle Ghat region	Bacillus sp.		
ME30	Garcinia xanthochymus	Bisle Ghat region	Klebsiella sp.	Klebsiella pneumoniae	Klebsiella pneumoniae
ME31	Garcinia xanthochymus	Bisle Ghat region	Enterobacter sp.	•	•
ME32	Ventilago sp.	Bisle Ghat region	Bacillus sp.		
ME33	Ventilago sp.	Bisle Ghat region	Brevibacillus sp.		
ME34	Ventilago sp.	Bisle Ghat region	Enterobacter sp.	Enterobacter bugandensis	Enterobacter bugandensis
ME35	Terminalia bellirica	Bisle Ghat region	Bacillus sp.	Bacillus licheniformis	Bacillus licheniformis
ME36	Terminalia paniculata	Bisle Ghat region	Bacillus sp.	•	•
ME38	Ventilago sp.	Bisle Ghat region	Bacillus sp.		
ME39	Pterocarpus santalinus	Mysore	Bacillus sp.	Bacillus aryabhattai	Bacillus aryabhattai
ME40	Garcinia indica	Mysore	Bacillus sp.	Bacillus megaterium	Bacillus sp.
ME42	Pterocarpus santalinus	Mysore	Bacillus sp.	Bacillus aryabhattai	Bacillus aryabhattai
ME43	Coscinium fenestratum	Mangaluru	Serratia sp.	Serratia marcescens	Serratia sp.
ME44	Coscinium fenestratum	Mangaluru	Enterobacter sp.	Enterobacter asburiae	Enterobacter asburiae
ME45	Coscinium fenestratum	Mangaluru	Enterobacter sp.		
ME46	Coscinium fenestratum	Mangaluru	Enterobacter sp.		
ME47	Coscinium fenestratum	Mangaluru	Serratia sp.	Serratia marcescens	Serratia sp.
ME51	Coscinium fenestratum	Mangaluru	Stenotrophomonas sp.		
ME53	Coix lacryma-jobi	Mangaluru	Stenotrophomonas sp.		
ME55	Coix lacryma-jobi	Mangaluru	Stenotrophomonas sp.	Stenotrophomonas pavanii	Stenotrophomonas pavanii
ME56	Coix lacryma-jobi	Mangaluru	Paenibacillus sp.		
ME57	Coix lacryma-jobi	Mangaluru	Klebsiella sp.		
ME60	Coix lacryma-jobi	Mangaluru	Bacillus sp.		
ME62	Coix lacryma-jobi	Mangaluru	Enterobacter sp.		
ME63	Coix lacryma-jobi	Mangaluru	Pseudomonas sp.	Pseudomonas sp.	Pseudomonas sp.
ME64	Coix lacryma-jobi	Mangaluru	Enterobacter sp.		
ME66	Coix lacryma-jobi	Mangaluru	Klebsiella sp.		
ME67	Coix lacryma-jobi	Mangaluru	Stenotrophomonas sp.		
ME68	Salacia chinensis	Mangaluru	Klebsiella sp.		
ME70	Salacia chinensis	Mangaluru	Klebsiella sp.		
ME71	Salacia chinensis	Mangaluru	Stenotrophomonas sp.		

Table 1. Continued

Endophytic bacterium <sup>a</sup>	Plant species isolated from	Sampling location	Identification by 16S rRNA gene similarity	Identification by average nucleotide identity (ANI)	Identification by Type strain Genome Server (TYGS)
ME72	Salacia chinensis	Mangaluru	Klebsiella sp.		
ME73	Salacia chinensis	Mangaluru	Klebsiella sp.	Klebsiella variicola	Klebsiella variicola
ME74	Salacia chinensis	Mangaluru	Enterobacter sp.		
ME75	Calophyllum inophyllum	Mangaluru	Bacillus sp.	Bacillus aryabhattai	Bacillus sp.
ME76	Calophyllum inophyllum	Mangaluru	Bacillus sp.	Bacillus aryabhattai	Bacillus sp.
ME78	Madhuca insignis	Mangaluru	Bacillus sp.	Bacillus thuringiensis	Bacillus cereus
ME79	Madhuca insignis	Mangaluru	Klebsiella sp.	Klebsiella variicola	Klebsiella variicola
ME81	Garcinia morella	Mangaluru	Erwinia sp.	Pantoea sp.	Pantoea sp.
ME83	Apama siliquosa	Mangaluru	Klebsiella sp.	-	-
ME84	Apama siliquosa	Mangaluru	Stenotrophomonas sp.		
ME86	Desmodium pulchellum	Mangaluru	Klebsiella sp.	Klebsiella variicola	Klebsiella variicola
ME87	Barringtonia acutangula	Mangaluru	Enterobacter sp.		
ME89	Barringtonia acutangula fruit	Mangaluru	Enterobacter sp.		
ME90	Alstonia scholaris	Mangaluru	Enterobacter sp.		
ME91	Alstonia scholaris	Mangaluru	Enterobacter sp.		
ME92	Alstonia scholaris	Mangaluru	Enterobacter sp.		
ME93	Alstonia scholaris	Mangaluru	Pseudomonas sp.		
ME94	Alstonia scholaris	Mangaluru	Methylobacterium sp.	Methylobacterium radiotolerans	Methylobacterium radiotolerans
ME95	Alstonia scholaris	Mangaluru	Pseudomonas sp.		

<sup>&</sup>lt;sup>a</sup>Genome sequenced medicinal plant endophytes (ME) are highlighted in bold font

extracted for de-replication to understand the overall biosynthetic diversity of the endophyte genome collection. BGC sequences were grouped according to genus and de-replicated using a pairwise k-mer-based comparison with Mash v2.2 (Ondov et al. 2016) and applying a maximum distance threshold of 0.24. De-replication was performed with the assumption that BGCs would not be shared between the different genera. The resulting distance network was visualised using Cytoscape v3.4.0 (Shannon 2003). Manual curation of the network was required to identify instances of BGCs split across multiple contigs and erroneously predicted hybrid BGCs due to close genomic locus proximity.

# In vitro antagonism assays

Genome-sequenced medicinal plant endophytes (ME) were tested for antimicrobial activity against a small panel of human and plant pathogens (Pectobacterium carotovorum LMG 2464; Staphylococcus aureus NCTC 12981; Candida albicans SC5314) using an agar overlay inhibition assay as described (Mullins et al. 2019). In brief, ME isolates were grown overnight at 30°C on agar-solidified basal salts medium supplemented with glycerol (BSMG). After 24 h growth, a 10 µL-sized loopful of bacteria was resuspended in 1 mL phosphate buffered saline (PBS) buffer, spotted (3 µL volume) onto BSMG plates and incubated at 30°C for 48 h. ME isolates were killed by chloroform exposure for 2 mins, overlaid with pathogen-seeded half-strength iso-sensitest agar (Oxoid) supplemented with 0.2% (w/v) triphenyl tetrazolium chloride and incubated at 30°C or 37°C for 24 h.

## **RESULTS**

# Medicinal plants from the Western Ghats contain high diversity of bacterial endophytes

A total of 26 different medicinal plant samples (Table S1 and Figure S1a, Supporting Information) were taken from two sites in the Western Ghats and one site in Mysore, India. This represented one of the largest surveys of bacterial endophytes in Indian plants used for multiple medicinal purposes (Table S1, Supporting Information). The incubation of inoculated leaf tissue samples on LB agar readily enabled the growth of culturable endophytes from medicinal plants (Figure S1b, Supporting Information). During incubation, visible colonies were easily distinguishable on the edges of the leaf sections. After further subculture and incubation, 95 plant endophyte cultures were collected. These cultures were then further purified on TSA/R2A and checked for purity using 16S rRNA gene sequencing which resulted in 75 pure cultures of medicinal plant endophytes (designated as ME isolates). The assembled pure bacterial collection included 50 ME Gram-negative and 25 ME Gram-positive bacterial isolates (Table 1).

Overall, from the three locations sampled (Bisle Ghat, Mysore and Mangaluru) pure culturable endophytes were isolated from 20 plant species covering 16 plant genera (Fig. 1A; Table 1). Only three plant genera (four plant species: Nothapodytes nimmoniana, Garcinia gummi-gutta, Kingiodendron pinnatum and Dysoxylum binectariferum) were unsuccessful in ME pure culture isolation. Interestingly, diversity indices and rarefaction analysis calculated at the bacterial genus level (Fig. 1B; Table 2; Figure S2, Supporting Information) suggested that the endophyte population collected from Bisle Ghat (34 isolates) was more diverse and species rich than the populations collected at Mangaluru (38 isolates) or Mysore (three isolates). In addition, rarefaction curves (Figure S2, Supporting Information) and Good's coverage statistics (Table 2) suggest that the total culturable bacterial diversity has not yet been isolated from the medicinal plants investigated in this study and further analysis is necessary to identify the full range of bacterial endophytes present.

Using 16S rRNA gene sequence similarity all medicinal plant endophytes were representatives of three bacterial phyla (Proteobacteria, 66%; Firmicutes 31%; Actinobacteria, 3%; Fig. 2; Figure S3, Supporting Information) belonging to the following 13

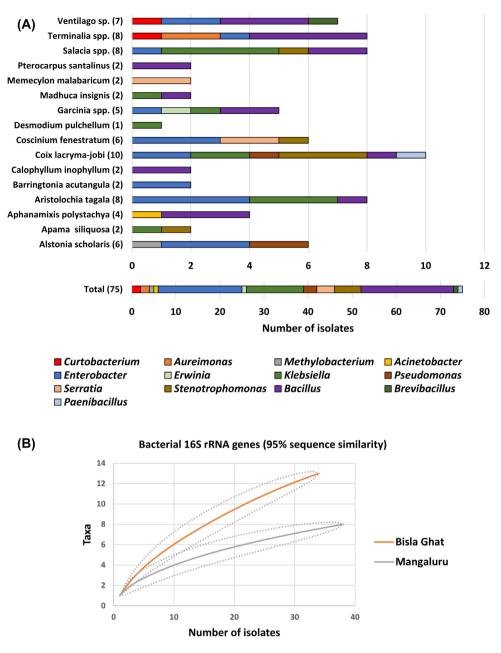


Figure 1. Community composition and rarefaction curves for the Western Ghats medicinal plant endophyte (ME) collection isolated during this study. (A) Composition of the bacterial endophyte collection assigned at the taxonomic genus level based on 16S rRNA genes. Each bar represents the relative distribution of each bacterial genus isolated from different medicinal plant genera. Numbers in parentheses represent the number of ME obtained from each plant genera. (B) Rarefaction curves for bacterial endophyte 16S rRNA gene diversity. ME were isolated from leaves of plants from the Bisle Ghat and Mangaluru regions of the Western Ghats, India. Curves were plotted for 95% similarity for 16S rRNA genes. Note, since there were only three isolates from Mysore leaf samples, this endophyte collection is not included.

genera (Fig. 1A) in order of dominance: Bacillus, 28%; Enterobacter, 25.4%; Klebsiella, 17.3%; Stenotrophomonas, 8%; Serratia, 5.4%; Pseudomonas, 4%; Acinetobacter, 1.3%; Aureimonas, 1.3%; Curtobacterium, 1.3%; Brevibacillus, 1.3%; Erwinia/Pantoea, 1.3%; Methylobacterium, 1.3%; Paenibacillus, 1.3%.

The grass species Coix lacryma-jobi was observed to contain the highest culturable diversity (ten isolates) of MEs (Fig. 1A; Table 1) with six different bacterial genera present (Enterobacter, Klebsiella, Pseudomonas, Stenotrophomonas, Bacillus and Paenibacillus). Contrastingly, the shrub Desmodium pulchellum had the lowest culturable diversity with only one bacterial isolate belonging

to Klebsiella (ME86). Both plants were sampled from the Mangaluru location. For comparison, Aristolochia tagala, a climbing species found in forests of Asia had the highest culturable diversity (eight isolates) of MEs (Enterobacter, Klebsiella and Bacillus) identified from leaf samples taken from the Bisle Ghat (Fig. 1A; Table 1).

Multiple ME isolates were taxonomically related (based on 16S rRNA gene similarity) to previously known endophytes or bacteria isolated from soil and rhizosphere environments (Fig. 2). For example, the large collection of ME Enterobacter (19 isolates) are closely related (Fig. 2A) to endophytes from tomato,

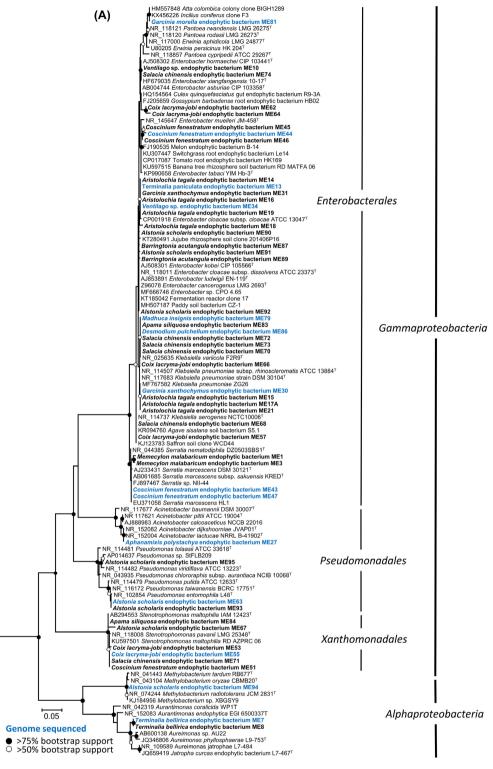


Figure 2. Phylogenetic trees showing the relationship of medicinal plant endophyte (ME) 16S rRNA gene sequences to sequences from representative type species and other plant endophytes. (A) Proteobacteria (Gram-negative) and (B) Firmicutes and Actinobacteria (Gram-positive). Trees were constructed using Maximum Likelihood method based on the GTR model. A discrete Gamma distribution was used to model evolutionary rate differences among sites. All positions containing gaps and missing data were eliminated and there was a total of 627 and 695 positions in the final datasets, respectively. Deltaproteobacteria 16S rRNA gene sequences were used as outgroups in (A) Desulfobacter curvatus DSM 3379 (AF418175), Desulfuromonas acetoxidans DSM 684 (AAEW02000008), Desulfovibrio aerotolerans Dv06 (AY746987); and Proteobacteria 16S rRNA gene sequences were used as outgroups in (B) Methylobacterium radiotolerans JSCM 2831 (NR.074244), Desulfovibrio aerotolerans Dv06 (AY746987), Enterobacter ludwigii EN-119<sup>T</sup> (AJ853891). Evolutionary analyses were conducted in MEGA7. The percentage of trees in which the associated taxa clustered together is shown next to the branches, based on 100 bootstraps. Nodes with black circles represent > 75% bootstrap support; nodes with white circles represent > 50% bootstrap support. The property is a support of the branches of thsupport. The scale bar represents 5% sequence divergence. Sequences in bold represent ME isolates and sequences in bold blue represent ME isolates that had their genomes sequenced.

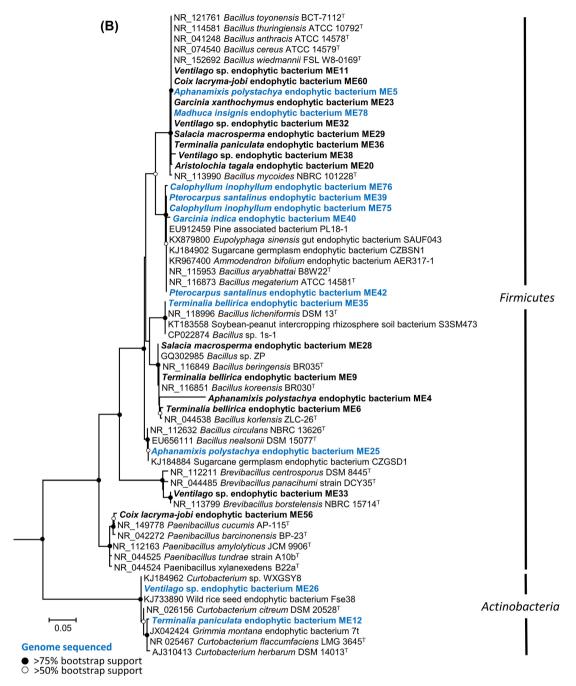


Figure 2. continued

switchgrass, banana, jujube, cotton and rice paddy soils, and were isolated from a range of medicinal plants which include Ventilago sp., Salacia chinensis, Coix lacryma-jobi, Coscinium fenestratum, Aristolochia tagala, Terminalia paniculata, Garcinia xanthochymus, Alstonia scholaris and Barringtonia acutangular sampled from both the Bisle Ghat and Mangalaru locations. Similarly, the 21 ME isolates belonging to the genus Bacillus (12 different plant species and 3 locations) are related to endophytes from pine trees, sugar cane, legumes as well as insect guts (Fig. 2B). Many of these Bacillus isolates (ten isolates) were closely related to soilborne bacteria within the Bacillus cereus group (Rasko et al. 2005; Carroll, Wiedmann and Kovac 2020).

# Average nucleotide identity and dDDH reveal the predominant bacteria in the sequenced panel as Bacillus spp. and Enterobacteriaceae

Few endophytes have been genome sequenced as part of their collection and initial characterisation. A total of 26 selected medical plant endophytes were genome sequenced to increase the level to which they could be identified and characterised. The genus-level diversity of the genome sequenced endophytes as determined by genomic ANI and dDDH analysis (Table 1) were as follows: Bacillus (n = 9), Klebsiella (n = 4), Enterobacter (n = 3), Curtobacterium (n = 2), Serratia (n = 2), Aureimonas (n = 1), Stenotrophomonas (n = 1), Acinetobacter (n = 1), Pantoea

Table 2. Diversity indices for bacterial endophyte 16S rRNA gene sequences using genus-level groupings (95% similarity).

Diversity indices	All isolates	Bisle Ghat region	: Mangaluru	Mysore
Number of isolates	75	34	38	3
Unique OTUs	16	13	8	2
Good's coverage (%)	79	62	79	33
Simpson's diversity index (1-D)	0.72	0.82	0.60	0.44
Shannon's diversity index (H')	1.88	2.10	1.33	0.64
S <sub>Chao1</sub>	23	17	11	2

OTU, operational taxonomic unit.

 $S_{Chao1}$  represent the expected number of OTUs present in an environment if sampling were complete.

Shannon's and Simpson's indices are measures of species diversity and both increase with increasing genetic diversity.

(n = 1), Methylobacterium (n = 1) and Pseudomonas (n = 1). A summary of the genome assembly metrics is given in Table S2 (Supporting Information). Overall identification at the genuslevel by genome analysis was in agreement with classification by 16S rRNA gene identification (Figs 2-5, Table 1, Figures S4-S9, Supporting Information) with the exception of isolate ME81 which was identified initially by 16S rRNA gene analysis as Erwinia (Fig. 2A) but subsequently classified by both genome analysis methods as Pantoea (Table 1, Figure S7, Supporting Information).

The species-level identity provided was consistent between ANI and dDDH for all isolates, excluding five Bacilli. A total of two Bacillus isolates, ME5 and ME78, were identified as Bacillus thuringiensis (98.8%) by ANI but were identified as Bacillus paranthracis and Bacillus cereus respectively by dDDH using TYGS. The remaining isolates, ME40, ME75 and ME76 could not be assigned a species-level identity by TYGS, but were identified as Bacillus megaterium (ME40, 95.8% identity), and Bacillus aryabhattai (ME75 and ME76, 96.3% identity) respectively by ANI. A heatmap providing a visual representation of the full diversity of Bacillus endophytes by ANI is shown in Fig. 3.

# Core-gene analysis indicates a high-degree of intra-genus similarity for Enterobacter and Serratia endophytes, whilst highlighting the novelty of the Aureimonas sp. ME7

To increase the resolution of genomic taxonomy applied to the endophytic bacterial collection phylogenomic approaches were also applied on selected genera as follows. Core-gene phylogenetic analysis (Fig. 4) revealed three genera of interest, due to either the high degree of similarity between one or more sequenced endophytes (Enterobacter and Serratia) or unique phylogenetic placement supported by ANI, indicating a novel species group (Aureimonas). The analysis of Enterobacter genomes revealed that endophyte ME13, isolated from Terminalia paniculata in the Bisle Ghat region possessed the same core-genes as endophyte ME34, isolated from Ventilago sp. in the same region (Fig. 4A). The nearest neighbour of these isolates was the genome of Enterobacter cloacae 153\_ECLO. This isolate, and both ME13 and ME34, were however distinct from the E. cloacae type strain, ATCC 13047<sup>T</sup>, both phylogenetically and in terms of ANI. Core-gene analysis of Serratia genomes

revealed that endophytes ME43 and ME47, both of which were isolated from Coscinium fenestratum in the Mangalaru region were identical in terms of core-gene content (Fig. 4B). Additionally, both ME43 and ME47 possessed >95% identity in comparison to the Serratia marcescens type strain, ATCC 13880<sup>T</sup> (Fig. 4B).

Notably, core-gene analysis revealed Aureimonas sp. isolate ME7 as a novel endophyte, as shown by its unique phylogenetic placement (Fig. 5). All sequenced genomes obtained for the genus Aureimonas were extremely diverse, displaying deep phylogenetic branching and ANI values far below the established 95% threshold for species delineation (≥85% identity). The nearest neighbours for this isolate were all known endophytes and included Aureimonas sp. AU22 and Leaf324 from soybean and Arabidopsis thaliana, respectively.

Core-gene phylogenetic analyses for endophytes that did not belonging to genera of interest can be found in Figures S4-S9 (Supporting Information). In addition, since only a limited number of genomes are available for the Actinobacteria genus, Curtobacterium full-length 16S rRNA gene phylogenies were constructed instead (Figure S8, Supporting Information). Phylogenetic analysis demonstrated that endophyte ME12 (from Terminalia paniculate) was closely related (99% sequence similarity) to the plant pathogen Curtobacterium flaccumfaciens strains and that isolate ME26 from Ventilago sp. was related (99% sequence similarity) to novel endophytic Curtobacterium sp. WXGSY8 from sugarcane and Curtobacterium sp. ER1/6 from Citreus sinensis (sweet orange), a potential biocontrol strain (Garrido et al. 2016). The frequent isolation of Curtobacterium as endophytes from asymptomatic citrus plants infested with the pathogen Xylella fastidiosa indicated that endophytic Curtobacterium species may help to resist infection (Rosenblueth and Martínez-Romero 2006).

# Biosynthetic gene cluster prediction revealed both known and uncharacterised specialised metabolites

Following the prediction and curation of BGCs of the 26 sequenced endophyte genomes, a total of 102 distinct BGCs were identified across the 11 bacterial genera. These BGCs represented 15 known metabolite classes including siderophores, lassopeptides and non-ribosomal peptides (Table 3). Approximately 15% of BGCs could not be assigned a class and were collated under the antiSMASH category 'Other'. The most prevalent classes were non-ribosomal peptides synthetases (NRPS), terpenes and bacteriocins representing approximately 45% of curated BGCs. The genus Bacillus with nine ME isolates contributed the majority of predicted BGCs to the endophyte biosynthetic potential, representing one-third of the 102 gene clusters (Table 3).

Only four hybrid non-ribosomal peptide synthetasepolyketide synthases (NRPS-PKS) were predicted, one of the hybrid BGCs from Klebsiella sp. ME86 possessed similarity to the yersiniabactin BGC, while the remaining three of these represented uncharacterised BGCs. Additional known BGCs identified in the endophyte genomes included the lassopeptide genes responsible for lichenicidin synthesis in Bacillus sp. ME35, and the NRPS required for acinetobactin synthesis in Acinetobacter sp. ME27. The majority of endophyte derived BGCs lacked homology to known specialised metabolite BGCs using the MiBIG database (Medema et al. 2015) via antiSMASH (Blin et al. 2017) that was applied.

Table 3. Summary of biosynthetic gene cluster (BGC) potential of medicinal plant endophytic bacteria. AntiSMASH was used to predict BGCs in the 26 whole-genome sequenced endophytic isolates. The predicted BGCS were curated and de-replicated to determine the number of distinct BGCs in the genome collection.

											Specialised metabolite class	abolite class							
	Number of	AntiSMASH	Distinct												_ =	Homoserine			
Genus	genomes	BGCs	BGCs	NRPS	Bacteriocin	T3PKS	NRPS-T1PKS	T1PKS	Thiopeptide	Thiopeptide Lassopeptide Lantipeptide	Lantipeptide	Terpene	Phosphonate	Phosphonate Arylpolyene Butyrolactone lactone	utyrolactone	lactone	Microcin	Siderophore	Other
Bacillus	σ	29	37	7	ır	-	-	c	-	6	r	ır	-	c	c	c	c	ď	ď
Klebsiella	4	17	9		n —	0		0		1 0	0	0	0	0	. ⊢	0		0	0
Enterobacter	ю	15	9	1	0	0	0	0	1	0	0	0	0	1	1	1	0	1	0
Serratia	2	33	10	4	1	1	2	0	1	0	0	0	0	0	0	1	0	0	0
	2	12	00	0	0	2	0	0	0	0	0	1	0	0	0	0	0	1	4
Curtobacterium																			
Acinetobacter	1	9	7	2	1	0	0	0	0	0	0	0	0	2	0	1	0	1	0
Aureimonas	1	4	4	0	0	0	0	1	1	0	0	2	0	0	0	0	0	0	0
	1	00	00	0	0	0	0	7	0	0	0	33	0	0	0	2	0	0	2
Methylobacterium	tm:																		
Pantoea	1	11	6	2	1	0	0	0	1	0	0	2	0	2	0	1	0	0	0
Pseudomonas	1	18	9	2	1	0	0	0	0	0	0	0	0	0	1	1	0	0	1
	1	4	4	1	2	0	0	0	0	0	0	0	0	1	0	0	0	0	0
Stenotrophomonas	ıas																		
Total	26	195	102	20	12	4	4	2	9	2	ſΛ	13	1	9	m	7	₽	9	10
BGC, biosvn	thetic gene	cluster; NRP	S, nonribos	omal per	BGC, biosynthetic gene cluster; NRPS, nonribosomal peptide synthase; T1PKS, Type 1 polyketide synthase; T3PKS, Type 3 polyketide synthase; NRPS-T1PKS, nonribosomal peptide synthase; T1PKS, Type 1 polyketide synthase; T3PKS, Type 3 polyketide synthase; NRPS-T1PKS, nonribosomal peptide synthase; T3PKS, Type 1 polyketide synthase; T3PKS, Type 1 polyketide synthase; T3PKS, Type 3 polyketide synthase; NRPS-T3PKS, nonribosomal peptide synthase; T3PKS, T4PKS, T4PKS, T4PKS, Nonribosomal peptide synthase; T4PKS, T4PKS, T4PKS, T4PKS, Nonribosomal peptide synthase; T4PKS, T4PKS, T4PKS, T4PKS, Nonribosomal peptide synthase; T4PKS, T4PKS, T4PKS, Nonribosomal peptide synthase; T4PKS, T4PKS, T4PKS, Nonribosomal peptide synthase; T4PKS, T4PKS, T4PKS, T4PKS, Nonribosomal peptide synthase; T4PKS, T4PKS, T4PKS, T4PKS, Nonribosomal peptide synthase; T4PKS, T	e; T1PKS,	Type 1 polyk	etide svn	hase: T3PKS.	. Type 3 poly	ketide svnth	ase: NRPS-	T1PKS, non	ibosomal pe	ptide synth	ase-Type 1	polyketide	synthase hyl	rid

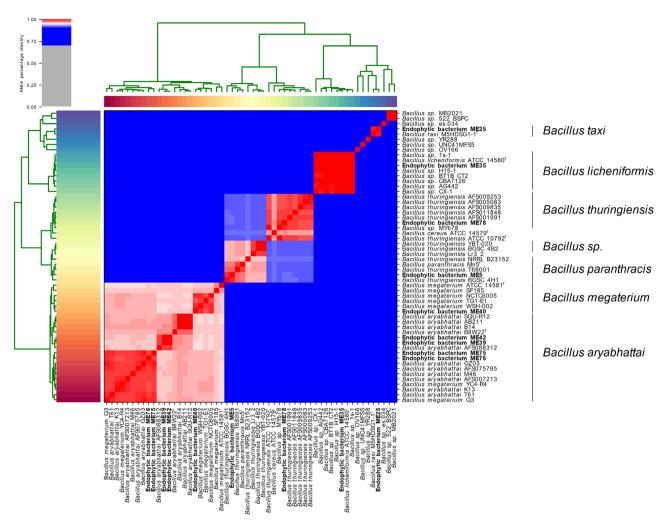


Figure 3. Genome sequence taxonomic placement of Bacillus medicinal plant endophytes (ME) inferred by average nucleotide identity (ANI). Heatmap generated by the PyANI script, indicating the degree of nucleotide-level similarity between Bacillus species ME and their closest reference strains. ME are highlighted in bold font, whilst species type strains are denoted by <sup>T</sup>. Colour indicates the degree of nucleotide similarity, with red areas indicating >95% ANI, and darker shades of red indicating greater similarity. Blue indicates <95% ANI.

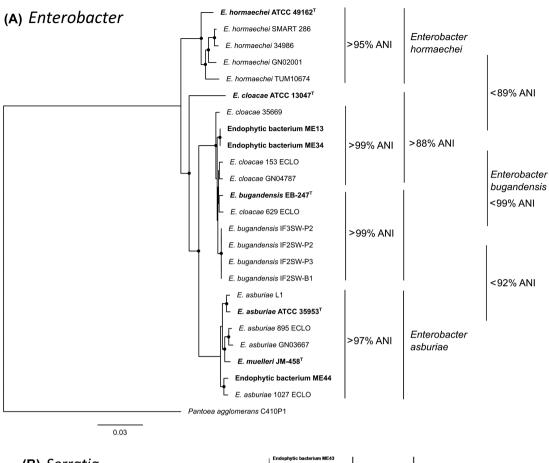
## Antimicrobial activity of medicinal plant endophytes

A total of five of the 26 genome-sequenced bacterial endophytes showed antimicrobial activity against the plant pathogen, Pectobacterium carotovorum (Figure S10, Supporting Information for examples). However, no zones of clearing were observed for the pathogens Staphylococcus aureus or Candida albicans by any ME tested. Isolates with clear antibacterial activity against the Gram-negative bacterium, P. carotovorum were identified as Bacillus aryabhattai (ME39), Bacillus sp. (ME40), Enterobacter asburiae (ME44) and Serratia sp. (ME43 and ME47). A total of four additional isolates showed weak antimicrobial activity against P. carotovorum: Bacillus aryabhattai (ME42), Bacillus sp. (ME75), Klebsiella pneumoniae (ME30) and Klebsiella variicola (ME73) (Figure S10, Supporting Information). Interestingly, several of the ME isolates with antibacterial activity and with predicted BGCs were obtained from medicinal plants used in traditional medicine for the treatment of wounds and/or known to have described antimicrobial activity. For example, Coscinium fenestratum (isolates ME43, ME44 and ME47) and Garcinia species (isolates ME30 and ME40) plant extracts have shown activity against Escherichia coli and other pathogenic bacteria (Nair et al. 2005; Baliga et al. 2011; Joseph, Dandin and Murthy Hosakatte 2016).

## **DISCUSSION**

## Medicinal plant endophyte diversity

Using a cultivation-based approach we have successfully isolated and identified 75 fast-growing cultivable bacteria that were associated with leaves of different plant species. Previously, endophytes have been reported from various other traditional medicinal plants; for example, Gynura procumbens (Bhore, Nithya and Loh 2010), Artemisia annua (Li et al. 2011), Tridax procumbens (Preveena and Bhore 2013), ginseng (Khan Chowdhury et al. 2017) and other traditional Chinese herbs (Miller et al. 2012a). However, to our knowledge, this study is unique in exploring a diverse range of bacterial isolates from a large collection (covering 24 plant species) of medicinal plants from the Western Ghats region of India. The identified bacterial endophytes belonged to four major taxa, Alphaproteobacteria, Gammaproteobacteria, Actinobacteria and Firmicutes, with isolates from the following genera: Bacillus, Enterobacter, Klebsiella, Stenotrophomonas, Serratia, Pseudomonas, Acinetobacter, Aureimonas, Curtobacterium, Brevibacillus, Pantoea, Methylobacterium and Paenibacillus. Previously, culture-based bacterial endophyte diversity analysis has shown that most culturable endophytes are Proteobacteria, followed



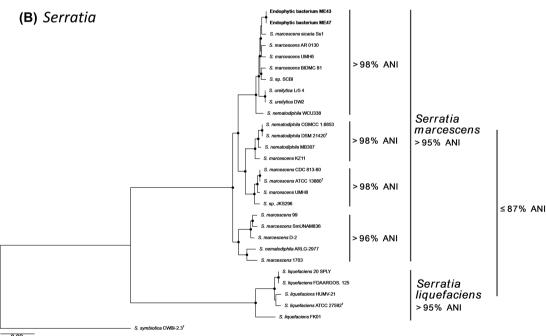


Figure 4. Average nucleotide identity (ANI) and core genome analysis of medicinal plant endophytes (ME) belonging to the order Enterobacterales: (A) Enterobacter and (B) Serratia. (A) Core-gene phylogeny of ME belonging to Enterobacter species. A 1912 core-gene alignment generated by Roary was used to construct a maximum likelihood tree highlighting the placement of Enterobacter endophytes. Isolates ME13 and ME34 placed within the E. cloacae species clade, whilst ME44 placed within the E. asburiae clade. (B) Core-gene phylogeny of ME belonging to Serratia species. A 255 core-gene alignment generated by Roary was used to construct a maximum likelihood phylogeny highlighting the placement of isolated Serratia endophytic bacteria. ME43 and ME47 were placed within the Serratia marcescens species clade with >95% ANI to other members of the species. Phylogenetic trees were constructed with GTR model with gamma substitution and supported by 100 bootstraps. Nodes with black circles represent > 90% bootstrap support. Scale bar = substitutions per site.

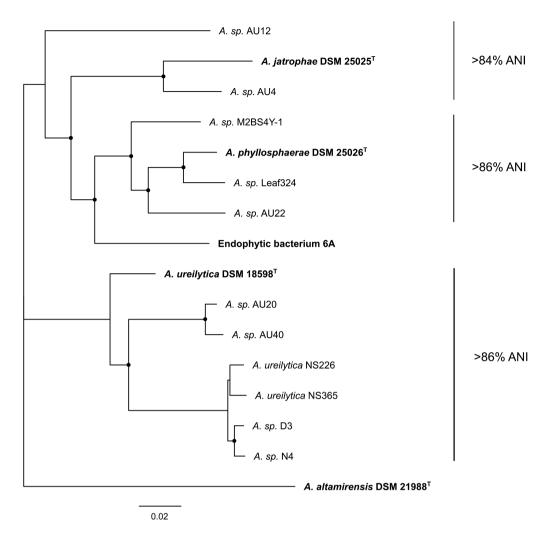


Figure 5. Core-gene phylogeny of medicinal plant endophytes (ME) belonging to Aureimonas species. A 25 core-gene alignment generated by Roary was used to construct a maximum likelihood tree highlighting the placement of Aureimonas endophytes. Isolate ME7 was placed as a novel species close to the A. phyllosphaerae clade. The phylogenetic tree was constructed with GTR model with gamma substitution and supported by 100 bootstraps. Nodes with black circles represent >90% bootstrap support. Scale bar = substitutions per site.

by Actinobacteria, Bacteroidetes and Firmicutes (Rosenblueth and Martínez-Romero 2006; Khan Chowdhury et al. 2017). The same limited group of bacterial phyla were also found to predominate in the phyllosphere of different plants identified by a range of culture-independent approaches including metagenomic shotgun sequencing of total genomic DNA (Vorholt 2012). However, concerted efforts have been made to study Actinobacteria since they are a major source of natural antibiotics and metabolites (Passari et al. 2017; Ek-Ramos et al. 2019), while other bacterial phyla are a natural resource that are still relatively

A previous study observed that higher culturable endophytic bacterial diversity was associated with a higher likelihood of the host plant exhibiting antimicrobial properties (Egamberdieva et al. 2017). However, in contrast to bacterial diversity, this study also reported that the total bacterial cell numbers of colonizing microbes maybe higher in plants that have poor antimicrobial activity (Egamberdieva et al. 2017). Presumably, this is due to less stringent conditions encountered in these plants which allows for high numbers of colonizing bacteria to proliferate due to the

lack of competition and lower concentrations of antimicrobials. In our study, only a tentative relationship was observed, linking high culturable microbial diversity to previously known medicinal properties for the treatment of bacteria-associated disease or known antibacterial activity. The medicinal plants with the highest culturable bacterial diversity, Terminalia spp., Ventilago sp. and Salacia spp. are used to treat bacterial diseases and leaf extracts of Coix lacryma-jobi and Coscinium fenestratum (Nair et al. 2005; Das et al. 2017) have been reported to have antimicrobial properties. However, we also observed plants with similar medicinal uses to have a low culturable diversity of ME isolates, namely Calophyllum inophyllum and Memecylon malabaricum (Table S1, Supporting Information). It should be noted that total bacterial numbers found within the leaves were not counted in our study. Further studies may be necessary to address the issue of achieving full culturable diversity, through focused efforts to isolate and count other endophytic community members including slow growing bacteria and fungi through the use of less complex and/or specific media (Eevers et al. 2015; Martinez-Klimova, Rodríguez-Peña and Sánchez 2017).

# The nearest neighbours to endophytes of interest can be isolated from a variety of environments

Core-gene analysis demonstrates that the nearest neighbours of all endophytes in this study are not limited to association with plants, but are instead ubiquitous, and able to endure a plethora of environments. This is evidenced in the analysis of Enterobacter, where the nearest neighbours to endophytes ME13 and ME34 (Fig. 4A), namely E. cloacae 35 669 (Doijad et al. 2016), 153.ECLO, 629.ECLO and GN04787 (Matteoli et al. 2020), were all isolated from clinical infections (Fig. 4A). In contrast, the nearest neighbours Enterobacter bugandensis IF2SW-B1, IF2SW-P2, IF2SW-P3 and IF3SW-P2 were all recently isolated from the International Space Station (Singh et al. 2018). The similarity of the space station isolates to clinical isolate 153 ECLO has been commented upon previously (Singh et al. 2018) and is thus concordant with the analysis in this study. Members of the Enterobacter genus also comprise species that have been reported as plant beneficial organisms and these include, plant-growth promoting endophytes of Enterobacter asburiae on date palm (Yaish 2016), Enterobacter cloacae with citrus and banana plants (Araujo et al. 2002; Macedo-Raygoza et al. 2019) and Enterobacter sp. J49, a biofertilizer for peanut and maize (Ludueña et al. 2019).

A number of nearest phylogenomic neighbours to Serratia endophytes ME43 and ME47, including S. marcescens AR\_0130, BIDMC 81 and UMH6 (Anderson et al. 2017), originate from the nosocomial environment, whilst S. marcescens sicaria Ss1 was isolated from the haemolymph of worker bees suffering from sepsis and implicated as a new pathogen of honey bees (Burritt et al. 2016). However, isolates of S. marcescens are known to fix nitrogen and act as plant growth promoting endophytic colonisers of rice roots and stems (Gyaneshwar et al. 2001). Nonclinical isolates of S. marcescens have also been used as biocontrol agents (Hallmann et al. 1997) and induce systemic resistance to fungal and viral pathogens (Press et al. 1997), as well as the production of the biologically active compound prodigiosin (Khanam and Chandra 2018).

Interestingly, the Aureimonas endophyte ME7, was related to bacteria originally isolated from surfaces and internal tissues of plants and identified as a unique species by ANI and coregene analyses (see Fig. 5). Members of the genus, Aureimonas are increasingly being isolated from leaves of plants (Madhaiyan et al. 2013; Li et al. 2017; Tuo and Yan 2019) and thought to be involved in the cycling of carbon and nitrogen (Ikeda et al. 2010). The nearest phylogenomic neighbours for this isolate were Aureimonas sp. AU22 and Aureimonas sp. Leaf324 isolated from the stems of soybean, and the leaves of Arabidopsis thaliana respectively, whilst the nearest neighbouring type-strains, Aureimonas phyllosphaerae DSM 25024<sup>T</sup> and Aureimonas jatrophae DSM 25025<sup>T</sup> were both isolated from the leaves of Jatropha curcas (Madhaiyan et al. 2013), a small tree whose seed oil is widely used as biofuel, soap and medicine (Pandey et al. 2012).

## Biosynthetic capacity of medicinal plant endophytes

Previous studies have investigated the NRPS and PKS diversity of medicinal plant bacterial and fungal endophytes through culture-independent PCR-based methods (Miller et al. 2012a). The benefits of this culture-independent approach included a lack of culture-bias and the ability to detect both fungal and bacterial NRPS and PKS potential. However, as noted, the limitations of a PCR screen were the inability to detect low level target DNA, and divergent sequence domains. Additional studies by Miller et al. (2012b) on Chinese medicinal plants obtained pure bacterial and fungal isolates that permitted cytotoxicity and antimicrobial phenotypic testing (Miller et al. 2012b). Although our culturedependent isolation of endophytes was biased towards bacteria capable of growth on LB agar, the output of this study included draft whole-genome sequences and pure cultures of the isolated bacterial endophytes. This enabled both phenotypic testing of antimicrobial activity and genome mining for a multitude of biosynthetic gene clusters. A high proportion of the sequenced ME isolates possessed BGCs with NRPS and PKS-predictions (73% and 54%, respectively). This represents a significantly larger proportion than previously described endophyte collections (Miller et al. 2012b). However, this is partly biased by only examining the genome-sequenced portion of the collection, and the ability to predict type 3 polyketide synthase (T3PKS) and hybrid NRPS-PKS BGCs. The draft genomes described in our study enabled accurate taxonomic identification and resulted in the prediction of BGCs representing multiple metabolite classes, a contrast to existing work on medicinal plant endophytes.

The isolation of multiple endophytic bacterial isolates has previously been coupled to phenotypic assays of antimicrobial activity, tandem mass spectrometry analyses and PCR-based detection of conserved PKS and NRPS domains (Passari et al. 2017). This combinatory approach has led to promising leads of novel antimicrobial metabolites (Passari et al. 2017). Future work into the identification and isolation of metabolites of the endophyte collection in this study can be guided by the genomic insight into the biosynthetic origins of potential metabolites of these bacteria. Despite the identification of BGCs with high sequence similarity to previously characterised BGCs, most of the 102 biosynthetic gene clusters possessed no homology to published BGCs, and thus represent a novel source of pharmaceutically relevant products.

# Potential use of medicinal plant endophytes as antimicrobial and biocontrol agents

ME isolates which showed antibacterial activity towards the plant pathogen, P. carotovorum belonged to the genera Bacillus (n = 4), Klebsiella (n = 2), Serratia (n = 2) and Enterobacter (n = 2)1). Previously, Bacillus endophytes have demonstrated activity against bacterial phytopathogens (Ryan et al. 2008; Santoyo et al. 2016; Chen et al. 2019), including P. carotovorum (Wang et al. 2019). For example, the strain Bacillus sp. NA-HTong-7, isolated from the stems of the medicinal plant, Dendrobium possessed activity against both fungal (Athelia rolfsii and Myrothecium roridum) and bacterial (P. carotovorum subsp. actinidiae) pathogens of Dendrobium species and has potential as a biocontrol agent (Wang et al. 2019). Whereas, other studies have reported that Bacillus species isolated from medicinal plants exhibited general antibacterial activity including that against Staphylococcus aureus, Escherichia coli, Klebsiella pneumoniae and Pseudomonas aeruginosa (Akinsanya et al. 2015; Beiranvand et al. 2017; Egamberdieva et al. 2017) and suggest that they are responsible for the plants therapeutic properties. For a comprehensive review of the use of endophytes as therapeutic agents in Asian medicinal plants see the recent paper by Sharma and colleagues (Sharma et al. 2020).

Bacillus species have been found to be one of the most abundant metabolite-producing Gram-positive bacterial endophytes (Frank, Saldierna-Guzmán and Shay 2017), and in this study Bacillus were responsible for a third of all distinct BGCs identified (Table 3). Bacillus species produce a wide variety of antimicrobial metabolites, including ribosomally synthesised antimicrobial peptides (e.g. bacteriocins, lantipeptides and lassopeptides),

as well as non-ribosomally synthesised peptides and polyketides (Zhao and Kuipers 2016). The Bacillus ME isolates (ME39 and ME40), with good bioactivity against P. carotovorum found in this study were shown by genome mining to contain several complete BGCs that may contribute to antimicrobial activity. Bacillus aryabhattai ME39 was shown to carry both lantipeptide and bacteriocin BGCs, while Bacillus sp. ME40 carried a lassopeptide BGC with sequence similarity and gene synteny to the paeninodin BGC. While the paeninodin lassopeptide lacked antimicrobial activity against representatives of Actinobacteria, Firmicutes and Proteobacteria (Zhu et al. 2016), antagonism against P. carotovorum was not investigated. However, several endophytic bacterial peptides with antimicrobial activity have been reported (Zhao and Kuipers 2016).

Other BGCs of interest in the remaining isolates with clear antagonism included hybrid NRPS-PKS BGCs in Serratia sp. ME47 with no homology to characterised BGCs; and thiopeptide BGCs predicted in Enterobacter asburiae ME44, Serratias isolates ME43 and ME47. Most characterised thiopeptides display nanomolar potency toward Gram-positive bacteria by blocking protein translation, and the majority of them have been identified from Actinobacteria and Bacilli (Schwalen et al. 2018). However, thiopeptides were also identified by genome mining in Proteobacteria (Schwalen et al. 2018). Our study shows the potential of Bacillus and other bacterial endophytes as biological control agents of plant pathogenic bacteria, and that ME isolates could be used to produce peptide-based antimicrobial and/or other compounds for therapeutic use. In addition, this study adds support to the claims and reports that some species of medicinal plants of the Western Ghats possess antimicrobial properties and may explain their ethnomedicinal use.

# **CONCLUSIONS**

This study identified multiple bacterial endophytes across a diverse array of medicinal plants from one of the World's 'Hottest Hotspots' of biodiversity, the Western Ghats (Myers et al. 2000). The draft genome assemblies obtained from these endophytes have permitted an insight into the biosynthetic diversity of these bacteria, whilst the isolation of pure cultures enables the future exploitation of the identified biosynthetic potential. To our knowledge, this represents one of the largest collections of isolates with draft genomes available from endophytic bacteria in a single study of medicinal plants. Identifying and understanding the medicinal plant endophytic microbial diversity therefore has potential for the discovery of new natural products.

#### **SUPPLEMENTARY DATA**

Supplementary data are available at FEMSEC online.

## **ACKNOWLEDGEMENTS**

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#### **AUTHOR CONTRIBUTIONS**

We describe author contributions to the paper using the CRedit taxonomy. Conceptualisation: GW, AJM, ECO, EM and RRV; Data Curation: GW, AJM, ECO, AR, JBA, EM and RRV; Formal analysis: GW, AJM, ECO, AR, JBA, EM and RRV; Funding Acquisition: EM and RRV; Investigation: GW, AJM, ECO, AR, JBA and RRV; Methodology: AR, JBA, GW, AJM and ECO; Project Administration: EM and RRV; Resources: EM and RRV; Software: AJM, ECO and GW; Supervision: EM and RRV; Validation: GW, AJM, ECO, EM and RRV; Visualisation: GW, AJM, ECO and AR; Writing-Original Draft: GW, AJM, ECO, JBA, EM and RRV; Writing-Review & Editing: GW, AJM, ECO, AR, JBA, EM and RRV.

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Conflicts of interest. None declared.

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