



Biodesulfurization of organosulfur compounds by a trehalose biosurfactant producing *Gordonia* sp. isolated from crude oil contaminated soil

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Abstract

Certain factors hinder the commercialization of biodesulfurization process, including low substrate-specificity of the currently reported desulfurizing bacteria and restricted mass transfer of organic-sulfur compounds in biphasic systems. These obstacles must be addressed to clean organic-sulfur rich petro-fuels that pose serious environmental and health challenges. In current study, a dibenzothiophene desulfurizing strain, *Gordonia rubripertincta* W3S5 (source: oil contaminated soil) was systematically evaluated for its potential to remove sulfur from individual compounds and mixture of organic-sulfur compounds. Metabolic and genetic analyses confirmed that strain W3S5 desulfurized dibenzothiophene to 2-hydroxybiphenyl, suggesting that it follows the sulfur specific 4 S pathway. Furthermore, this strain demonstrated the ability to produce trehalose biosurfactants (with an EI₂₄ of 53%) in the presence of dibenzothiophene, as confirmed by TLC and FTIR analyses. Various genome annotation tools, such as ClassicRAST, BlastKOALA, BV-BRC, and NCBI-PGAP, predicted the presence of *otsA*, *otsB*, *treY*, *treZ*, *treP*, and Trehalose-monomycolate lipid synthesis genes in the genomic pool of strain W3S5, confirming the existence of the OtsAB, TreYZ, and TreP pathways. Overall, these results underscore the potential of strain W3S5 as a valuable candidate for enhancing desulfurization efficiency and addressing the mass transfer challenges essential for achieving a scaled-up scenario.

Keywords Biodesulfurization · Genome annotation · Organic-sulfur compounds · Sulfur specific 4S pathway · Trehalose biosurfactants

Introduction

Sulfur is the third most prevalent element in petro-fuels found as organic and inorganic forms (Feng et al. 2016; Prasoulas et al. 2021; Silva et al. 2020). The combustion of sulfur-rich petro-fuels release SO_x gases that can cause serious health and environmental problems (Akhtar et al. 2019; Mohebbali and Ball 2016; Porto et al. 2018). To meet the set ultra-low levels of sulfur in petro-fuels, the scientists around the world are working to find effective pre-combustion ways to efficiently reduce sulfur in fuels with low operating costs (Akhtar et al. 2019; Mohebbali and Ball 2008; Parveen et al. 2020; Glekas et al. 2022).

Petroleum refineries are using a chemical hydrodesulfurization (HDS) process to remove sulfur from petro-fuels, however, it is ineffective against certain organic-sulfur compounds i.e., dibenzothiophene (DBT), benzothiophene (BT), and their alkylated forms (Ferreira et al. 2017). Moreover, this method is energy-intensive, uses chemical catalysts, and

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releases toxic by-products such as H_2S , resulting in equipment erosion and environmental pollution (Martínez et al. 2017; Rangra et al. 2018). Biodesulfurization (BDS) is a complementary alternative approach that uses particular micro-organisms to remove inorganic sulfur as well as recalcitrant organic-sulfur compounds from petro-fuels (Boniek et al. 2015; Rangra et al. 2018; Al-khazaali and Ataei 2023). In contrast to the HDS process, BDS is an eco-friendly, energy-efficient method that works under mild conditions and removes the sulfur from organic-sulfur compounds without reducing their calorific value (Aggarwal et al. 2013; Rangra et al. 2018; Silva et al. 2023). A number of bacterial genera have been reported, that can remove sulfur from organic-sulfur compounds through a well-known “4S” metabolic pathway (Akhtar et al. 2016a, b, 2018; Sadare et al. 2017). During this pathway, the DBT is sequentially converted into DBTO (DBT-Sulfoxide), DBTO₂ (DBT-Sulfone), HBPSi (2-Hydroxybiphenyl-2-Sulfinite), and 2-HBP (2-Hydroxybiphenyl). The monooxygenases DszC, DszA and desulfinase DszB (Bhanjadeo et al. 2018; Kilbane and Stark 2016; Su et al. 2018; Wang et al. 2017) are involved in this pathway, which are encoded by a group of three genes *dszC*, *dszA* and *dszB* respectively (Bhanjadeo et al. 2018; Santos et al. 2006; Su et al. 2018).

One of the major bottleneck of industrial-scale application of BDS is the scarcity of bacterial strains capable of desulfurizing a range of organic-sulfur compounds i.e., DBT, BT, and their alkylated derivatives (Alves et al. 2015; Parveen et al. 2020). Another major characteristic of an ideal desulfurizing strain is its ability to produce biosurfactants (Alves et al. 2015; Parveen et al. 2020). Biosurfactants are amphiphilic compounds that could play a critical role during biodesulfurization as they increase the mass transfer of the substrate between oil and the aqueous phase (biphasic system) by decreasing the surface tension of the medium (Alves et al. 2015; Raheb et al. 2009). Trehalose-surfactants have the potential for use in cleaning oil storage tanks and microbial enhanced oil recovery because of their extraordinary capacity to reduce surface tension, environmentally benign nature and enhanced solubility of hydrophobic compounds (Sousa et al. 2020; Wang et al. 2019).

In this study, we present the research conducted on an efficient C–S bond cleaving bacterial strain W3S5 able to desulfurize various organic-sulfur compounds i.e., DBT, BT, Thiophene, and their alkyl derivatives separately as well as in mixture. Based on phylogenomic analysis, the strain has been characterized as *Gordonia rubripertincta* W3S5, and is found to follow the well-documented “4S” pathway of DBT desulfurization as revealed by the complete identification of *dszABC* genes and GC-MS analysis of the extracted metabolites. Furthermore, strain W3S5 demonstrated the ability to produce trehalose biosurfactants in the presence of dibenzothiophene, as confirmed by TLC and FTIR analyses.

Moreover, the trehalose biosynthesis genes have been identified in strain W3S5 using its whole genome sequence.

Materials and methods

Chemicals

All the organic-sulfur compounds and 2-HBP used in this study were obtained from Sigma Co. (St. Louis, USA). All other media components and solvents used for the extraction of surfactants, DBT desulfurization metabolites, and GC-MS analysis were of HPLC-grade and bought from Merck Co. (Darmstadt, Germany).

Sample collection

To isolate organic-sulfur compounds metabolizing microorganisms, about 50 samples of crude-oil contaminated water, sand, soil, and sludge were taken from an oil drilling company, in sterilized bags/bottles (Supplementary Fig. 1A). The physicochemical properties, like nature of sample, total dissolved solids (TDS), dissolved oxygen (DO), temperature, electric conductivity (EC), salinity, and pH were recorded for representative samples (Supplementary Table 1), by multi-parameter (InoLab IDS Multi 9430, WTW, Germany). For soil, sand and sludge samples the parameters were calculated by making a 50% slurry (w/v) in deionized water.

Media and culture growth conditions

All the studies were carried out in a sulfur-free, chemically defined, Minimal-salt Glucose (MG) media (Akhtar et al. 2009). The composition of the MG media per Litre of distilled water was glucose: 5.0 g, KH_2PO_4 : 2.0 g, K_2HPO_4 : 4.0 g, $MgCl_2 \cdot 6H_2O$: 0.2 g (pH 7.0), NH_4Cl : 1.0 g, metal solution 10.0 mL and vitamin mixture 1.0 mL. For solid form of MG media, 0.75% of gellan gum powder was used. The vitamin mixture was composed of calcium pantothenate: 0.4 g, niacin: 0.4 g, inositol: 0.2 g, pyridoxine hydrochloride: 0.4 g, p-amino benzoic acid: 0.2 g, and cyanocobalamin: 0.0005 g per 1000 mL (distilled water) and filter sterilized through a vacuum filter assembly (LF-30, Rocker Scientific, Taiwan) containing 0.2 μm nylon membrane filter. The metal solution contained $CaCl_2$: 2.0 g, $NaCl$: 1.0 g, $ZnCl_2$: 0.5 g, $FeCl_2 \cdot 4H_2O$: 0.5 g, $MnCl_2 \cdot 4H_2O$: 0.5 g, Na_2MoO_4 : 0.1 g, $Na_2WO_4 \cdot 2H_2O$: 0.05 g, $CuCl_2$: 0.05 g, and 10 mL of HCl (10 M) per 1000 mL (distilled water) and filter sterilized. All the experiments were conducted in triplicates at 30 °C and 180 rpm.

Enrichment and purification of DBT desulfurizing strains

Culture enrichment was carried out by suspending 5 g/5 mL of oil-contaminated samples such as soil, sand, sludge and water in sterilized MG media (100 mL) containing 0.5 mM of DBT (prepared in ethanol) as the sole sulfur source and incubated at 30 °C and 180 rpm shaking (Kuhner, Switzerland). After 7 days of incubation, the culture broth (5 mL) from each flask was transferred into fresh MG medium and was sub-cultivated 3 times at the same growth conditions. At the end of 3 sub-cultivations, the cultures were analyzed for the metabolism of DBT into 2-HBP (a sulfur-free product), by conducting Gibb's assay. For this purpose, NaHCO₃: 30 µL (1 M, pH 8) and Gibb's reagent (2,6-Dichloroquinone-4-chloroimide): 20 µL (1 mg/mL prepared in ethanol) were added into 150 µL of cell-free supernatant, mixed, and left at room temperature for 1 h. A blue color appears upon the reaction of Gibb's reagent with aromatic hydroxyl groups, i.e., 2-HBP, which indicates the metabolism of DBT into sulfur-free compounds (Kayser et al. 1993). The development of blue color provides a qualitative assessment of a microbial culture's capacity to desulfurize organic sulfur compounds; the darker the hue, the more effective the culture is in DBT desulfurization. To obtain the pure cultures, the DBT enriched Gibb's positive mixed cultures (W3SN1, W3SL1, and W3S2) was serially diluted and spreaded on MG media plates. After 5 days of incubation the well separated colonies were picked and streaked on new MG media plates for 3 times in order to confirm the culture purity. The pure cultures were cultivated in liquid MG media at 30 °C and 180 rpm for 7 days and tested for Gibbs activity. Initially 8 bacterial isolates (W3S2-P9, W3S4, W3SN5, W3SL1, W3SN1, W3S5, W3SN4, W3SN2) were purified and screened from DBT enriched Gibb's positive mixed-cultures (see supplementary Fig. 1B, 1 C), of which the isolate W3S5 exhibited the highest level of desulfurization activity (see supplementary Fig. 1D) and was chosen for further investigations. All the cultures were stored at - 20 °C in cryo-vials containing 70% (v/v) glycerol and at 4 °C on LB/MG media slants till further use.

Morphological and molecular identification of isolated bacterium

The isolated DBT metabolizing strain was identified through morphological and molecular methods. The morphological characterization was carried out by carefully examining the colony morphology and by determining the cell shape through phase-contrast microscopy (CX41RF Olympus, Japan). Molecular characterization of the isolated strain was conducted by sequencing the 16S rRNA gene and whole genome sequencing (Parveen et al. 2021). In the present

study, we have used TYGS: Type (Strain) Genome Server (<https://tygs.dsmz.de/>) to undertake phylogenomic analysis to identify the W3S5 strain (Meier-Kolthoff and Göker 2019). For, this purpose the fasta-formatted contig file was uploaded to TYGS genome server to obtain the genome-based phylogenetic tree using the default settings.

Genetic analysis of the *dszABC* operon of W3S5

The *dszABC* genes amplification, cloning and sequencing

DBT desulfurization genes *dszA*, *dszB*, and *dszC* of W3S5 strain were amplified using specific and degenerate primers through PCR amplification. The specific and the degenerate primers were designed using the 5' and 3' sequences of *dszABC* genes of *Rhodococcus erythropolis* IGTS8 as described in previous studies (Akhtar et al. 2014; Kilbane and Robbins 2007), and were obtained from Integrated DNA Technologies, Inc., UK (Supplementary Table 2). The detail of the PCR profile for the amplification of *dszABC* genes is given in Supplementary Tables 3, 4 and 5. The PCR amplicons were cloned by TA cloning using *Escherichia coli* TOP10 competent cells and confirmed by restriction digestion and colony PCR. The resulting clones were sequenced from Macrogen, Korea using M13 forward and reverse primers.

Identifying the complete *dszABC* gene sequences by whole-genome sequence analysis

The draft genome sequencing (WGS) of the W3S5 strain was achieved through Illumina (NovaSeq) platform (2 × 100 bp paired-end) by Macrogen Inc. Korea. To identify the complete *dszABC* gene sequences in W3S5 the PCR amplified partial *dszABC* gene sequences were used to conduct a gene similarity search in the draft genome sequence of W3S5 using RAST-alignment tool. The identified complete sequences of *dszA*, *dszB* and *dszC* genes were submitted in GenBank database at NCBI (www.ncbi.nlm.nih.gov).

Phylogenetic analysis of *dszABC* gene

The deduced complete *dszABC* gene sequences were used for phylogenetic analysis to find out the evolutionary relationship between W3S5 and other bacterial desulfurization genes. The homologous *dsz* gene sequences were retrieved from BLASTn analysis (available at www.ncbi.nlm.nih.gov) and applied to build the phylogenetic tree through MEGA-X program (Tamura and Nei 1993; Tamura et al. 2013). A multiple-sequence alignment was generated through ClustalW using default parameters and the resulting alignment was employed to build the phylogenetic tree using Maximum Likelihood method, Tamura-Nei-model, and bootstrap approach (100 replicates). Initial tree(s) for the heuristic

search were obtained by applying the Neighbor-Joining method to a matrix of pairwise distances estimated using the Maximum Composite Likelihood (MCL) approach.

Desulfurization of various organic-sulfur compounds

To investigate the broad substrate specificity, the W3S5 culture was initially examined to desulfurize various organic-sulfur compounds individually. The strain was cultivated in MG-medium with 0.2 mM concentrations of DBT (Dibenzothiophene), DBTS (Dibenzothiophene Sulfone), 4-MDBT (4-Methyldibenzothiophene), 2,8-DMDBT (2,8-Dimethyldibenzothiophene), BT (Benzothiophene), 3-MBT (3-Methylbenzothiophene), TH (Thiophene), 2-MTH (2-Methylthiophene), and 3-MTH (3-Methylthiophene). To determine whether these compounds were metabolized, the bacterial cell growth (OD₆₆₀ nm) and the production of the phenolic end-product, 2-HBP/2-HBP_{eq} (OD₅₉₅ nm), were recorded every 24 h. Furthermore, the isolate was also investigated to desulfurize organic-sulfur compounds in combination as well. For this purpose, the strain W3S5 was cultivated in MG media containing 0.1 mM concentrations of each DBT, 3-MDBT, DBTS, BT and 3-MBT, making up a total concentration of 0.5 mM in the medium. The growth (OD₆₆₀ nm) and the 2-HBP production (OD₅₉₅ nm) was recorded every 24 h.

Detection of biosurfactants produced by W3S5 during DBT desulfurization

Qualitative tests for detecting the biosurfactants

Oil displacement and Emulsification index (% EI₂₄) tests were performed for the detection of biosurfactants produced by W3S5 strain, as described by Tabatabaee et al. (2005). For oil displacement test, poured 50 mL of distilled water into a petri dish (100 mm × 15 mm) and then added 20 μL of crude-oil to the surface of water and allowed it to settle at room temperature for 2 min. Dropped 10 μL of culture extract (grown in 0.2 mM DBT supplemented MG media for 5 days) onto the oil surface, that immediately created a clear halo on the surface of oil. The diameter of the clear halo was noted under visible light and used to calculate the oil displacement area (ODA) by using Eq. 1.

$$\text{ODA} = 22/7 (\text{radius})^2 \text{cm}^2. \quad (1)$$

The Emulsification index (% EI₂₄) was estimated by mixing culture supernatant and the kerosene oil in equal volumes (1:1) in a glass tube (125 mm × 15 mm). After being vortexed for 3 min, the glass tubes were left at room temperature for 24 h. The EI₂₄ index was then calculated following

Eq. 2, by measuring the total height of the liquid column and the height of the emulsified layer using a ruler scale.

$$\% \text{EI}_{24} = \frac{\text{Height of the emulsified layer}}{\text{Total height of the liquid column}} \times 100. \quad (2)$$

To compare the results, a positive control (1% Sodium dodecyl sulfate) and a negative control (fresh culture medium) were also used. These experiments were repeated for three times to take an average of the recorded values.

Solvent extraction of biosurfactants

To characterize the biosurfactants produced by W3S5 strain, the culture was cultivated in 100 mL of MG medium in triplicates, added with DBT to a final concentration of 0.2 mM, and grown for 5 days until it reached the log-phase. The whole culture broth from the log-phase was used to extract the biosurfactants using an equal volume of chloroform: methanol solution (2:1) thrice by shaking the culture broth vigorously every time to allow the separation of two layers until no further color appears in the culture broth. The extracted biosurfactants concentrated to dryness in a rotary vacuum evaporator (G3 Heidolph, Germany) and were re-suspended in chloroform: methanol solution (2:1) for further analysis (Wang et al. 2019).

Purification of biosurfactants by thin-layer chromatography (TLC)

The extracted biosurfactants were purified by Thin-Layer Chromatography (TLC) using pre-coated aluminum sheets (Silica gel 60-F254 plates, Merck, Germany). To separate the crude biosurfactants, 10 μL of the sample was carefully loaded on the TLC plate, run for 90 min using butanol:pyridine:water (15:30:20, v/v) solution as a mobile phase system, and left at room temperature to dry for 10 min. The dried TLC plate was colored developed by spraying with 0.5% of KMnO₄ solution prepared in 1 N NaOH, carefully scratched the well separated bands from the TLC plate and dissolved in chloroform:methanol (2:1) solvent till further use to perform Fourier Transform Infrared Spectroscopy (FT-IR) analysis.

Identifying the trehalolipid-related genes in W3S5 by analyzing the genome sequence

To identify the trehalose-surfactant related genes in W3S5, its whole-genome sequence was analyzed through different online genome annotation programs such as Classi-cRAST (version 2.0): Rapid Annotation using Subsystem Technology (<https://rast.nmpdr.org/>), BV-BRC: Bacterial and Virus Bioinformatics Resource Centre (<https://www.bv-brc.org/>), BlastKOALA: BLAST- KEGG Orthology

And Links Annotation (<https://www.kegg.jp/blastkoala/>) and NCBI-PGAP: NCBI Prokaryotic Genome Annotation Pipeline (<https://www.ncbi.nlm.nih.gov/genome/>) using default settings. The RAST and BV-BRC annotation servers accept FASTA formatted contig file while BlastKOALA uses FASTA formatted amino acid sequence file as input query. In case of NCBI-PGAP, the annotation for a genome sequence becomes available at NCBI when the whole genome sequence is submitted to NCBI genome server as FASTA formatted contig file.

Analytical methods

To measure the bacterial cell growth, the optical-density (OD₆₆₀ nm) of the culture broth was recorded through Double-Beam UV–Visible Spectrophotometer (Camspec M350, UK), and the pH was noted using a multi-parameter (InoLab IDS Multi 9430, WTW, Germany). The concentration of 2-HBP (end product) was measured by performing Gibb's assay and taking the optical density of the resulting blue-colored solution at 595 nm followed by comparing the OD values against 2-HBP standard-curve. The qualitative estimation of DBT conversion into 2-HBP and the characterization of desulfurization metabolites was conducted through High-Performance Liquid Chromatography (HPLC) followed by Gas Chromatography–Mass Spectrometry (GC–MS) analysis. For this purpose, the W3S5 culture was inoculated in MG media (100 mL) containing 0.2 mM of DBT (sole sulfur source) and incubated at 30 °C and 180 rpm. After 3 days of incubation, 50 mL of culture broth was removed for metabolite extraction. To obtain the cell-free supernatant the culture-broth was centrifuged at 13,000×g, 4 °C, and 15 min followed by acidification to pH 2.0 using HCl (6 M) solution. The DBT desulfurization metabolites were extracted from acidified supernatant with 30 mL of ethyl-acetate and concentrated to dryness by evaporating the sample through Rotary vacuum evaporator (G3 Heidolph, Germany). The extracted metabolites were dissolved in acetonitrile solvent and filtered using nylon filters (0.2 µm pore size). The HPLC (Perkin-Elmer Series 200, USA) analysis was performed at 245 nm using the Hypersil-C18-column (Thermo Hypersil-Keystone, UK). The acetonitrile:water (60:40, v/v) solution was used as the mobile-phase system for HPLC analysis, and the samples were run at the rate of 1 mL per min to obtain the bands of DBT metabolites. The DBT desulfurization metabolites were further characterized using a Triple Quad 7000D GC–MS equipment from Agilent-Technologies (Little Falls, California, USA) equipped with an Agilent-Technologies 7683B series auto-injector and an Agilent-Technologies 5975 inert XL Mass selective detector. The samples (1.0 µL) were injected into HP-5MS column (30 m × 0.25 mm, film thickness 0.25 µm; Little Falls, CA, USA) in the split-mode keeping a split ratio of 1:10. The GC/MS

analysis was performed using an electron-ionization system (70 eV) and keeping the column-oven temperature at 60 °C for 1 min, followed by ramping at 10 °C per min to 325 °C, for 10 min. Helium was employed as a carrier-gas at a flow rate of 0.5 mL per min. The mass-scanning range was adjusted as 50 to 550 m/z, whereas the injector and Mass Spectrum transfer-line temperatures were adjusted to 220 and 290 °C, respectively. The extracted metabolites were characterized by comparing their mass-spectra with standards as well as NIST02.L and WILEY7n.L mass-spectral libraries. Fourier-transform infrared spectroscopy (FT-IR) was used to characterize the extracted/ TLC-purified biosurfactants produced by the W3S5 strain. The FT-IR analysis was performed in a dry atmosphere using Perkin-Elmer grating 1430 IR (Norwalk, CT). Data were collected in the range of 400–4000 wavenumbers (cm⁻¹) having a resolution of 4 cm⁻¹ and processed with IR analytical software. Samples were developed by diffusing the solid extract homogeneously in a potassium bromide matrix.

Results

Isolation and identification

To obtain efficient DBT desulfurizing bacteria, a total of 50 crude-oil contaminated samples were screened using MG media containing 0.5 mM of DBT as a sole sulfur source. Out of eight bacterial cultures, W3S5 exhibited maximum desulfurization activity (see Supplementary Fig. 1D). The 2-HBP bar graph in Fig. 1B represents that isolate W3S5 successfully desulfurized nearly all the DBT into 2-HBP within 72 h of incubation to obtain sulfur for its growth. This phenomenon was further evaluated by growing the culture in MG-medium containing either an organic-sulfur source (DBT) or a carbon source (glucose) or both. Figure 1C demonstrate that the isolate W3S5 growth was highest when both glucose and DBT were supplied in the medium, and reduced significantly when only DBT or glucose were added in the medium. These findings confirm that W3S5 requires both a carbon source and an organic-sulfur source for its optimum growth. The isolate shows a distinctive colony morphology when grown on LB agar plates and appeared as coccoid shape under phase-contrast microscope (Fig. 1A).

For genome-based identification of strain W3S5, the phylogenomic analysis was carried out through TYGS: Type (Strain) Genome Server (<https://tygs.dsmz.de>). The phylogenomic tree in Fig. 2 demonstrates that the strain W3S5 clusters with the *Gordonia rubripertincta* NBRC 101,908 and *Gordonia rubripertincta* ATCC 14,352 type strains, with a bootstrap value of 97, a δ value of 0.087, and sharing approximately the same G+C content of 67% with genome sizes of 4.8, 5.6, and 5.2 Mb (see Fig. 2, label

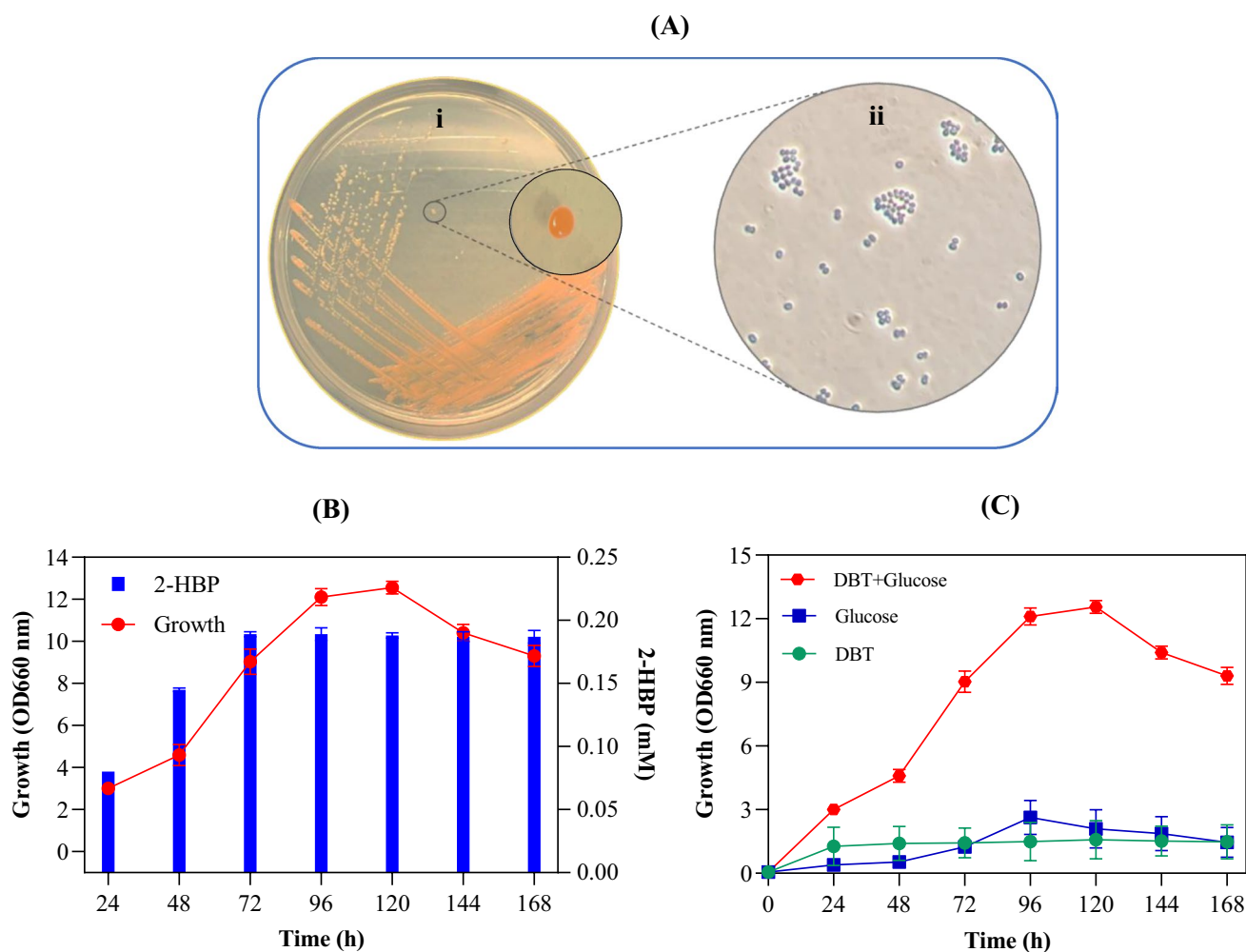


Fig. 1 Phenotypic traits and DBT desulfurization estimation of strain W3S5. **A** The pure culture of W3S5 showing distinctive colony morphology with characteristics such as pink colored, elevated, viscous texture, and entire at the edges, when grown on LB agar plates (i), the cells appeared as circular, non-motile, non-spore-forming, and coccoid shape, when observed under phase-contrast microscope, magnification 100 X, Ph:3, (ii). **B** Estimation of cell growth and 2-HBP

production by W3S5 strain when cultivated in liquid MG medium supplemented with 0.2 mM of DBT and 5% of glucose. **(C)** A comparison of cell growth and 2-HBP production when W3S5 was cultivated in MG medium with DBT only (organic-sulfur source), glucose only (carbon source), or DBT plus glucose (organic-sulfur source plus carbon source). The SD ($n=3$) is shown as error bars

1–5) respectively. The number of coded proteins for *Gordonia rubripertincta* NBRC 101,908, *Gordonia rubripertincta* ATCC 14,352 and W3S5 are also nearly the same i.e., 5023, 4802 and 4326 (see Fig. 2, label-6) respectively. From these results it can be concluded with high confidence that strain W3S5 is taxonomically more related to *Gordonia rubripertincta*.

Elucidation of the DBT desulfurization pathway through metabolic and genetic analysis

The desulfurizing metabolites produced by W3S5 strain during the desulfurization of DBT were identified using HPLC and GC–MS analysis of extracted metabolites. Initially, the

HPLC analysis was performed, which revealed the existence of DBT, DBTO₂, and 2-HBP in the extracted metabolites, when compared to the standards. The further characterization of DBT desulfurization metabolites was conducted through GC–MS analysis of the extracted metabolites. In GC chromatogram, a strong peak was detected at a retention time (R_t) of 6.461 min along with some minor peaks (Fig. 3A). When the GC spectra was compared with the standards, the sharp peak (R_t : 6.461 min) was identified as 2-HBP while the minor peaks at the R_t of 12.814 and 10.065 min were identified as DBT and DBTO₂ respectively. The mass-spectrometry of detected peaks further validated the existence of 2-HBP, DBTO₂ and DBT in the culture extract. The main ion peaks detected at the m/z of

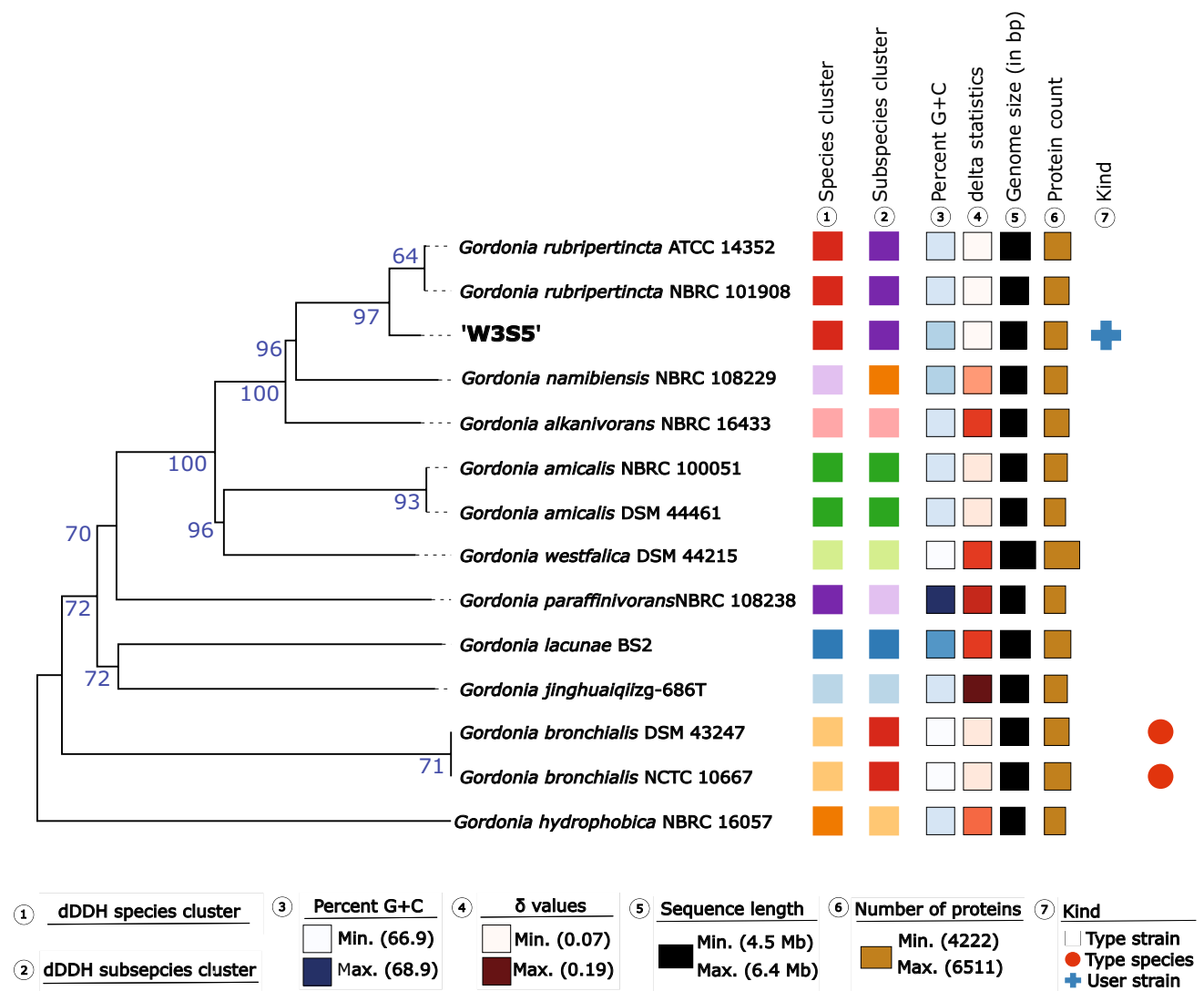


Fig. 2 The TYGS genome-based phylogenomic analysis of W3S5 strain. The phylogenomic tree was constructed using GBDP distances estimated from genome sequences and was deduced using FastME 2.1.456. The branch support was calculated using GBDP pseudo-bootstrap values from 100 replications and are shown above each branch, whereas the branch lengths are scaled with reference to GBDP distance formula d5. The clustering produced 10 species and subspecies clusters. The colored leaf-labels in the figure represent various aspects of the genome annotations and the same color codes have been used to identify the species and subspecies within the same taxon, such as label 1 and 2 in the figure shows clusters of

same dDDH (digital DNA-DNA Hybridization) species and subspecies, respectively. The percent G+C content of each species is represented on label 3 by light to dark blue color codes, with the lowest to greatest values. Similarly, labels 4, 5, and 6 with the brown, black, and mustard color codes, respectively, denote the delta value, genome size, and number of proteins for each species. The length of the colored boxes varies to show the range of values. Whereas label 7 designates the type of strain at each branch, such as Type-Strain, Type-Species, or User-Strain, with each denoted by a white box, a red circle and a plus sign respectively

184.1, 216.1, and 170.2 (Fig. 3B, C and D), correspond to the molecular masses of DBT, DBTO₂, and 2-HBP respectively, when compared with MS Spectra in WILEY7n.L, and NIST02.L mass-spectral libraries and standards. The DBTO was not detected in the analysis which may be due to its instant conversion into DBTO₂ or the hydrophilic nature that hinders its extraction with organic solvents from culture broth (Parveen et al. 2020; Su et al. 2018)

The enzymes of the “4S” pathway are encoded by the *dszA*, *dszB*, and *dszC* genes, which are found on the plasmid DNA in the form of an operon (Ferreira et al. 2017). In order to characterize the complete *dszABC* gene sequences in strain W3S5, initially the partial sequences of *dszA* (~350 bp), *dszB* (~600 bp) genes and almost the complete sequence of *dszC* (~1250 bp) gene were obtained by PCR amplification and sanger sequencing. The NCBI-BLASTn analysis of these sequences showed >95% similarity with

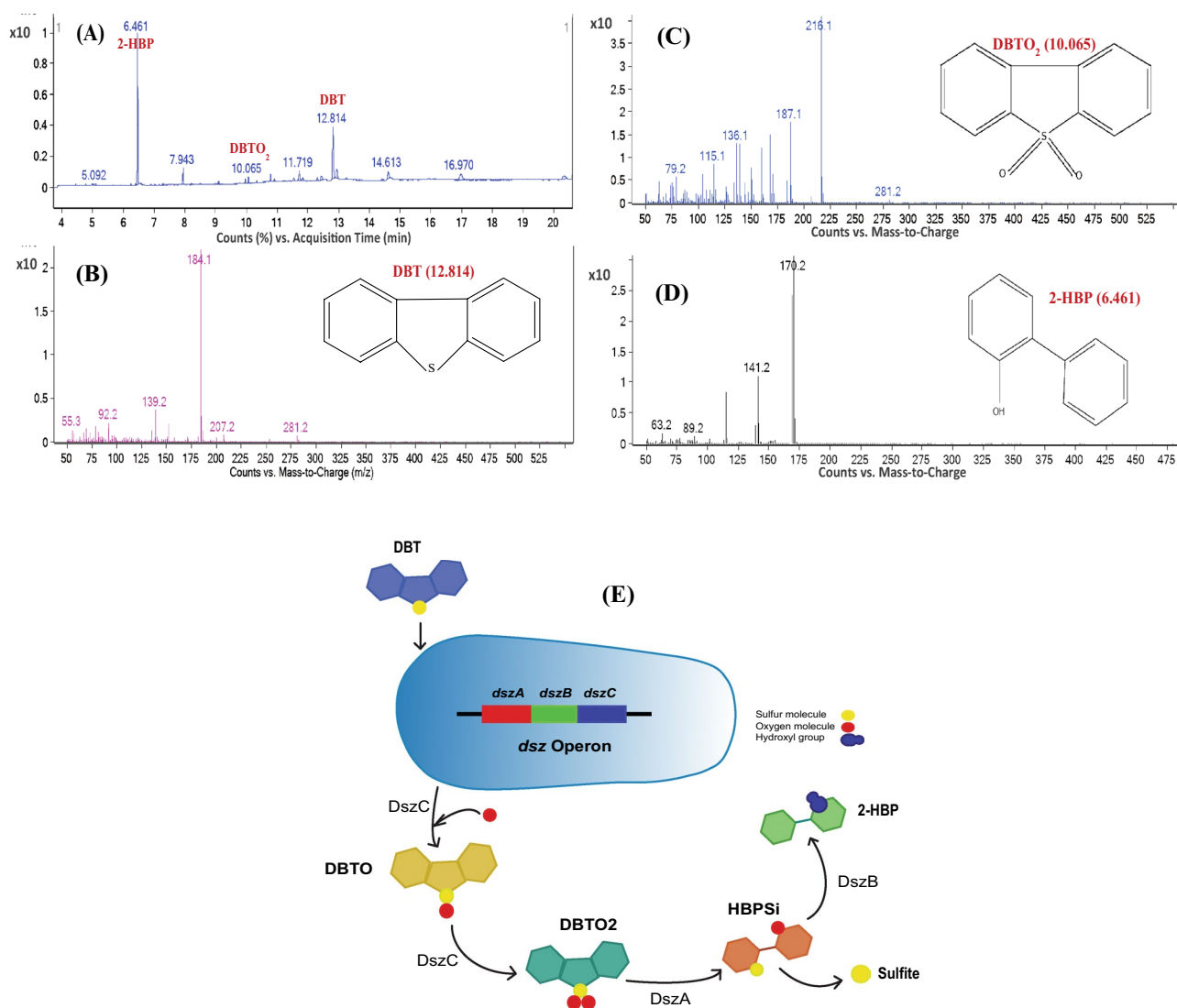


Fig. 3 Characterization of DBT desulfurization pathway in W3S5 by GC–MS analysis of the extracted metabolites. **A** Gas–Chromatogram of DBT desulfurization extracted metabolites. **B**, **C**, **D** Mass-spectrum of main ion peaks 184.1, 216.1, and 170.2, identified as DBT, DBTO₂ and 2-HBP respectively. **E** Proposed “4S” pathway of DBT desulfurization in W3S5 strain, interpreted from GC–MS analysis. The DBT is first converted into DBT-sulfoxide (DBTO)

by DBT monooxygenase DszC through addition of an oxygen molecule. The DBTO is transformed into DBT sulfone (DBTO₂) by the same enzyme through addition of another oxygen molecule. The DBT monooxygenase DszA then converts DBTO₂ into sulfinate HBPSi (2-Hydroxybiphenyl-2-Sulfinite). Finally, the HBPSi is metabolized into 2-Hydroxybiphenyl (2-HBP) and sulfate by desulfinase DszB enzyme by cleaving the C–S bond

dsz genes of other desulfurizing bacteria. The RAST alignment search of partial *dszA*, *dszB* and *dszC* gene sequences against the genome sequence of W3S5 revealed the presence of *dszABC* genes on contig#22 in the form of an operon (Fig. 4A).

Phylogenetic analysis offers a thorough understanding of evolutionary relationship among genus/species or genes (Gray et al. 1996; Kilbane II and Le Borgne, 2004; Pylro et al. 2012). The complete *dszABC* gene sequences (retrieved from RAST) of W3S5 showing > 88% homology with *dszABC* genes of other desulfurizing bacteria

during NCBI-BLASTn analysis (Fig. 4B) were used to construct the phylogenetic tree using MEGA-X program. The phylogenetic trees in Fig. 4C show that the *dszA*, *dszB*, and *dszC* genes of W3S5 form a cluster (cluster I) with *Gordonia sp.* IITR100 (KC693733.1), *Gordonia sp.* WQ-01 (DQ448811.1), *Gordonia alkanivorans* RIPI90A (EU364831.1), and *Gordonia alkanivorans* 1B (AY678116.1) which shows a close evolutionary relatedness among their *dszABC* genes than with other species desulfurizing genes (see cluster II) making a separate cluster suggesting that the *dsz* genes of W3S5 strain are

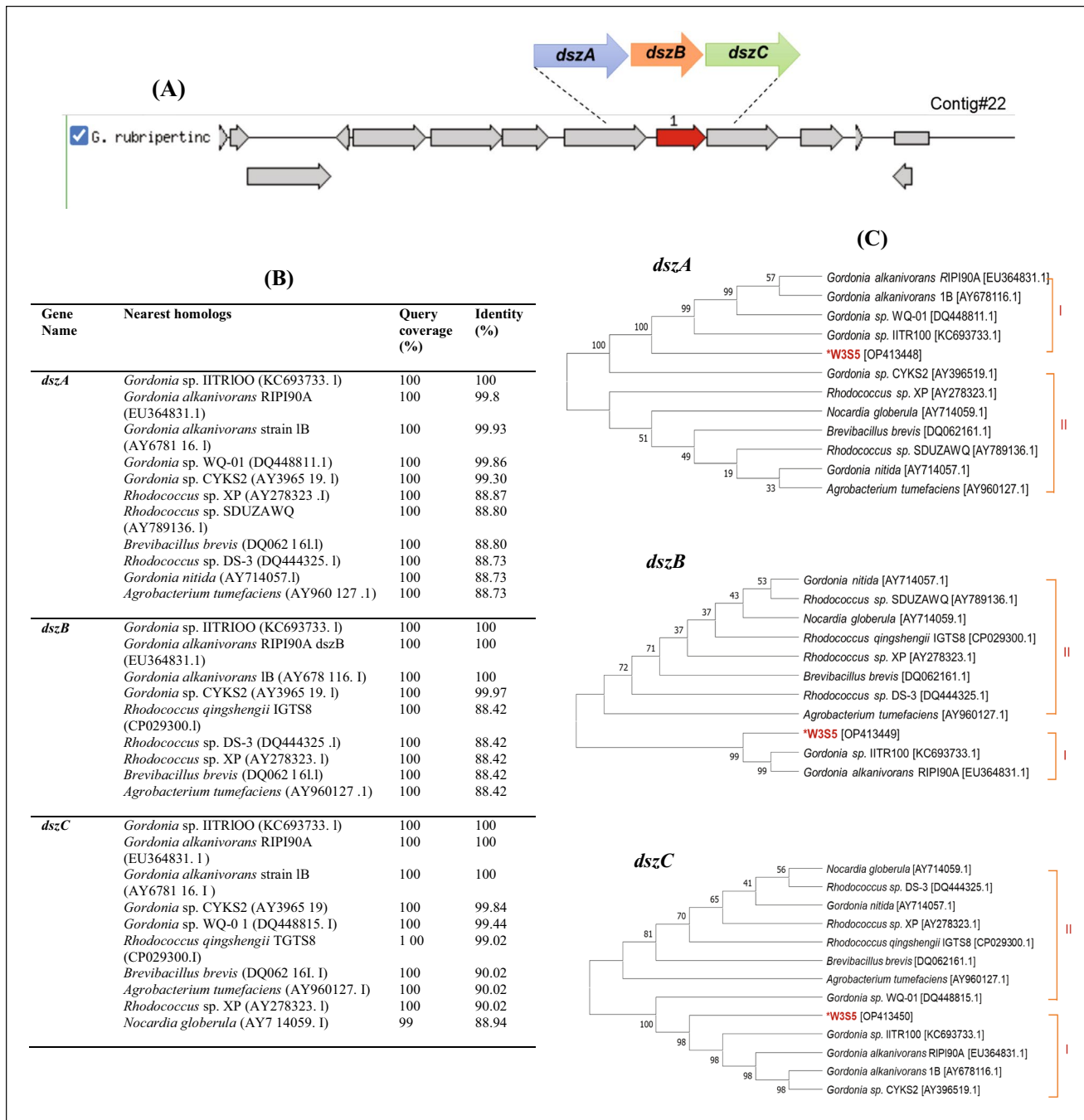


Fig. 4 Characterization of complete *dszABC* gene sequences in strain W3S5 and determination of their evolutionary relationship with other related desulfurizing bacteria. **A** The structure of *dsz* operon located at contig#22, identified in W3S5 strain by searching the whole-

genome sequence through RAST alignment tool. **B** The outcomes of BLASTn search displaying the closely related sequences to the complete *dszABC* gene sequences of W3S5. **C** Phylogenetic tree of *dszABC* genes of W3S5

conserved and quite similar to the *dsz* genes of *Gordonia* species.

Based on the characterization of the DBT desulfurization metabolites i.e., DBT, DBTO₂, 2-HBP and the identification of *dszABC* genes it is evident that the isolate W3S5 follows the same steps of “4S” pathway reported

in the literature (Gunam et al. 2006; Parveen et al. 2020; Su et al. 2018). Keeping in view our findings we have proposed a basic schematic of “4S” pathway in W3S5 as shown in Fig. 3E.

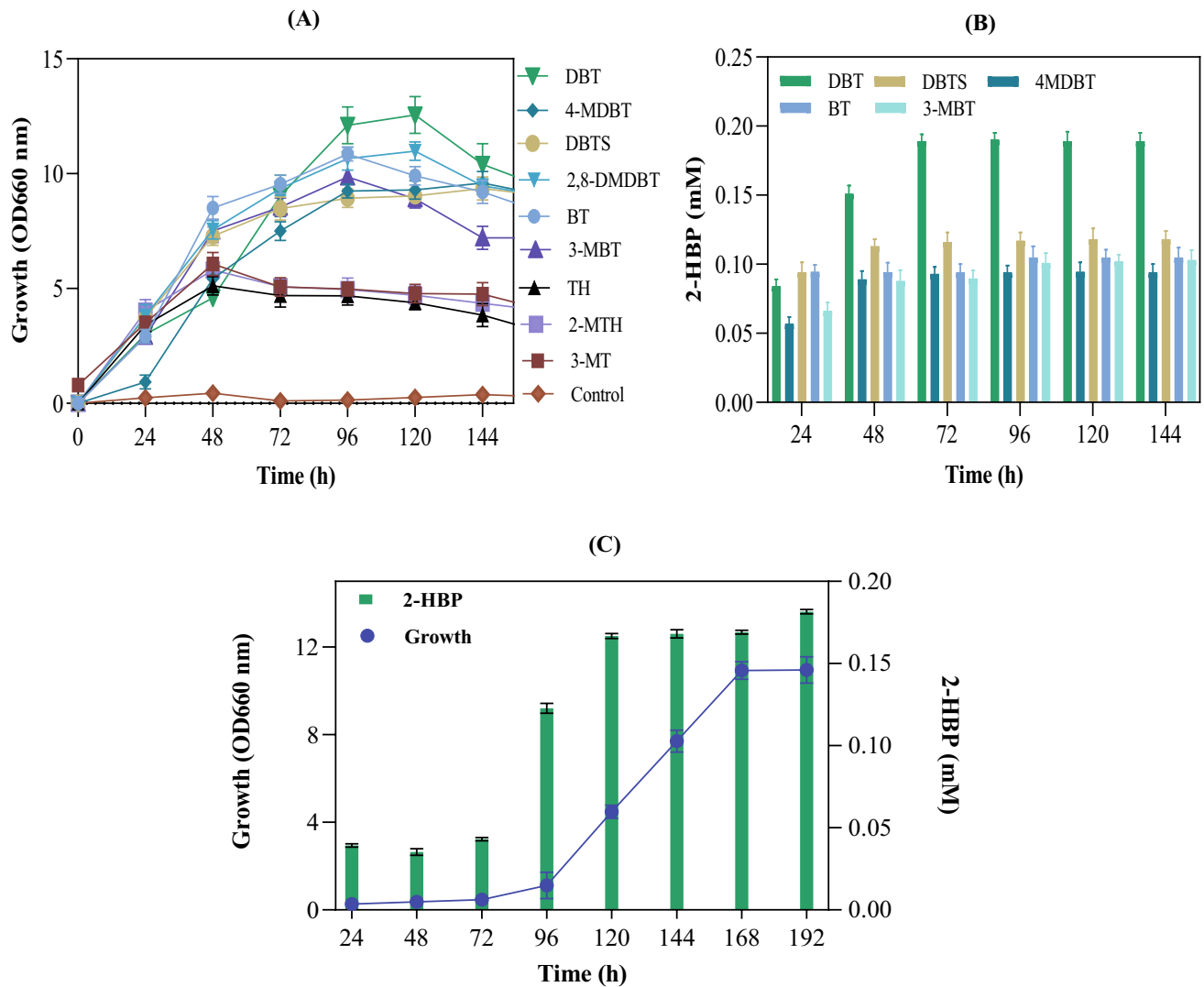


Fig. 5 Desulfurization of DBTs, BTs and THs by W3S5, as a single sulfur source and as a mixture. **A** Comparison of growth and **B** production of phenolic end-product i.e., 2-HBP/2-HBP_{equivalent} by isolate W3S5, cultivated in MG media in the presence of 0.2 mM of DBT (Dibenzothiophene), DBTS (Dibenzothiophene Sulfone), 4-MDBT (4-Methyldibenzothiophene), 2,8-DMDBT (2,8-Dimethyldibenzothiophene), BT (Benzothiophene), 3-MBT (3-Methylbenzothio-

phene), TH (Thiophene), 2-MTH (2-Methylthiophene), and 3-MTH (3-Methylthiophene) respectively, as a single sulfur source. **C** A time-course study of cell growth and production of phenolic end-product i.e., 2-HBP/2-HBP_{equivalent} for 192 h, when DBTs, and BTs (DBT, DBTS, 4-MDBT, BT, and 3-MBT) were supplied in MG medium together in equimolar ratio (0.1 mM)

Investigating the desulfurization of DBTs, BTs, and THs, both separately as well as a mixture by strain W3S5

The isolate W3S5 was interrogated for its ability to metabolize a variety of HDS resistant organic-sulfur compounds like DBTs, BTs, and THs. The line graph in Fig. 5A shows the cell growth of W3S5 cultivated in the presence of DBT, DBTS, 4-MDBT, 2,8-DMDBT, BT, 3-MBT, TH, 2-MTH, and 3-MTH. The isolate exhibited the highest growth in the presence of DBT, 2,8-DMDBT, 4-MDBT, DBTS, BT and 3-MBT. In addition to these compounds, a relatively

less growth was also observed in the presence of TH and its derivatives, indicating the utilization of these compounds by W3S5 for its growth. The overall order of growth for all these compounds was: DBT > 2,8-DMDBT > BT > 3-MBT > DBTS > 4-MDBT > 3-MTH > 2-MTH > TH. The bar graph in the Fig. 5B represent the production of 2-HBP resulting from the desulfurization of DBT, DBTS, 4-MDBT, BT and 3-MBT within 144 h of incubation. A maximum 2-HBP production was observed after 96 h of incubation, indicating that the isolate W3S5 desulfurized DBT and DBTS into 2-HBP by ~95% and ~75% respectively, while 4-MDBT, BT, and 3-MBT were desulfurized into 2-HBP_{eq} by ~50%.

Overall, the order of desulfurization activity for these compounds was: DBT > DBTS > BT > 3-MBT > 4-MDBT. The formation of 2-HBP/2HBP equivalent was not detected in cultures treated with 2,8-DMDBT, TH, 2-MTH, and 3-MTH. This suggests their conversion into non-phenolic end products or that the produced phenolic end products did not react with the Gibbs reagent, that do not give a blue reaction with Gibb's reagent. In addition to desulfurize DBTs, and BTs as a single-sulfur source, the isolate W3S5 was also investigated to desulfurize them simultaneously as a mixture as well. The Fig. 5C compares the growth and desulfurization activity (2-HBP production) by isolate W3S5 for the desulfurization of DBTs and BTs (DBT, 3-MDBT, DBTS, BT and 3-MBT) when supplied together in MG medium in equimolar ratios (0.1 mM). The isolate exhibited an increase in growth after 72 h of incubation, however, a sharp increase in growth and the production of 2-HBP was observed after 96 h of incubation and was found maximum at 192 h of cultivation. Although the lag-phase for growth was prolonged, the results indicate that the isolate W3S5 can effectively desulfurize DBTs, and BTs when supplied together as a mixture.

Characterization of biosurfactants in W3S5 strain

Biosurfactants are amphiphilic surface-active compounds that help a bacterium in the biotransformation/biodegradation of water insoluble compounds by decreasing the surface tension of the medium (Mnif and Ghribi 2015). In order to check the production of biosurfactants by isolate W3S5 during DBT desulfurization, a qualitative estimation was carried out by performing the oil-displacement assay and calculating the emulsification index (% EI₂₄) of the cell-free culture. A positive control (SDS, a strong amphiphilic compound) and a negative control (culture medium) were used to validate the result. In oil-displacement test, the cell-free culture created a clearing zone of 2.3 cm, while for positive control (SDS) it was 4 cm (see Supplementary Fig. 2A). The negative control did not show any oil displacement, which confirms that the clearing zone formed by cell-free culture was due to the presence of surface-active compounds (SAC) released in the culture medium during desulfurization of DBT. To further validate these results the emulsification index of the cell free culture, positive control and the negative control was also calculated. The EI₂₄ for cell free culture was 53% and for positive control 65%, while negative control did not show any emulsification (see Supplementary Fig. 2B).

The crude biosurfactants were purified using Thin-Layer Chromatography (TLC). Yellow-colored spot appeared on the TLC plate with a purple-colored background when developed with potassium permanganate stain, indicating the glycolipid nature of the extracted biosurfactants.

The TLC purified biosurfactants were subjected to FTIR analysis in the range of 4000–500 cm⁻¹ and the resulting IR spectrum was interpreted by reading the IR spectrum chart/table from Sigma-Aldrich and previous reports on the characterization of glycolipids (De Smet et al. 2000; Wang et al. 2019). The Fig. 6A shows the FT-IR spectrum of the TLC purified biosurfactants. A wide band detected in the range of 3200–3500 cm⁻¹ can be assigned to O-H bond vibrations, indicating the presence of an alcohol group (De Smet et al. 2000; Wang et al. 2019). A strong band detected at 2970–3007 cm⁻¹ range exhibited the existence of unsaturated hydrocarbons and sharp bands observed at 2951–2850 cm⁻¹ were designated to C-H stretching bands of CH₂ and CH₃ groups demonstrating the presence of saturated hydrocarbons (De Smet et al. 2000; Wang et al. 2019). A strong band at 1708 cm⁻¹ was also observed, that is a characteristic band of esters denoting the presence of carbonyl groups in the extracted biosurfactants (De Smet et al. 2000; Wang et al. 2019). A medium sized band observed at 1464 cm⁻¹ was ascribed to C-H stretching bands (De Smet et al. 2000; Wang et al. 2019). Moreover, the absorption bands observed at 1190–1456 cm⁻¹ denote the existence of aliphatic chains in the analyzed compound (De Smet et al. 2000; Wang et al. 2019). The sharp bands detected in the range of 950–1155 cm⁻¹ were attributed to C-O vibration bands, which are characteristic of the sugar rings (De Smet et al. 2000). These FT-IR findings strongly suggest that the extracted biosurfactants are glycolipid in nature and may belong to trehalose subclass.

Identification of trehalolipid-biosurfactant genes in W3S5 strain by genetic analysis

In total, five trehalose synthesis pathways have been reported in bacteria of which the OtsAB, TreYZ, and TreS are the three major pathways that are often present in more than one copies for some specific bacteria, depending on the physiological requirements in the environment (Cardoso et al. 2007; Ruhel et al. 2013). The existence of a certain metabolic pathway within an organism is generally inferred by recognizing the respective enzyme-coding genes. The trehalose-related metabolic pathways in W3S5 were identified by analyzing its whole genome sequence via different online genome annotation programs such as ClassicRAST, BlastKOALA, BV-BRC, and NCBI-PGAP. Moreover, the KEGG and MetaCYS pathway analysis were also performed and the proposed pathway in W3S5 were drawn on the basis of results obtained from all these studies. The trehalose-related genes predicted by the four annotations and their potential functions are presented in Table 1. All four annotations generated different results with respect to the number of genes identified and their copy number. ClassicRAST and BlastKOALA predicted 10 genes, whereas BV-BRC

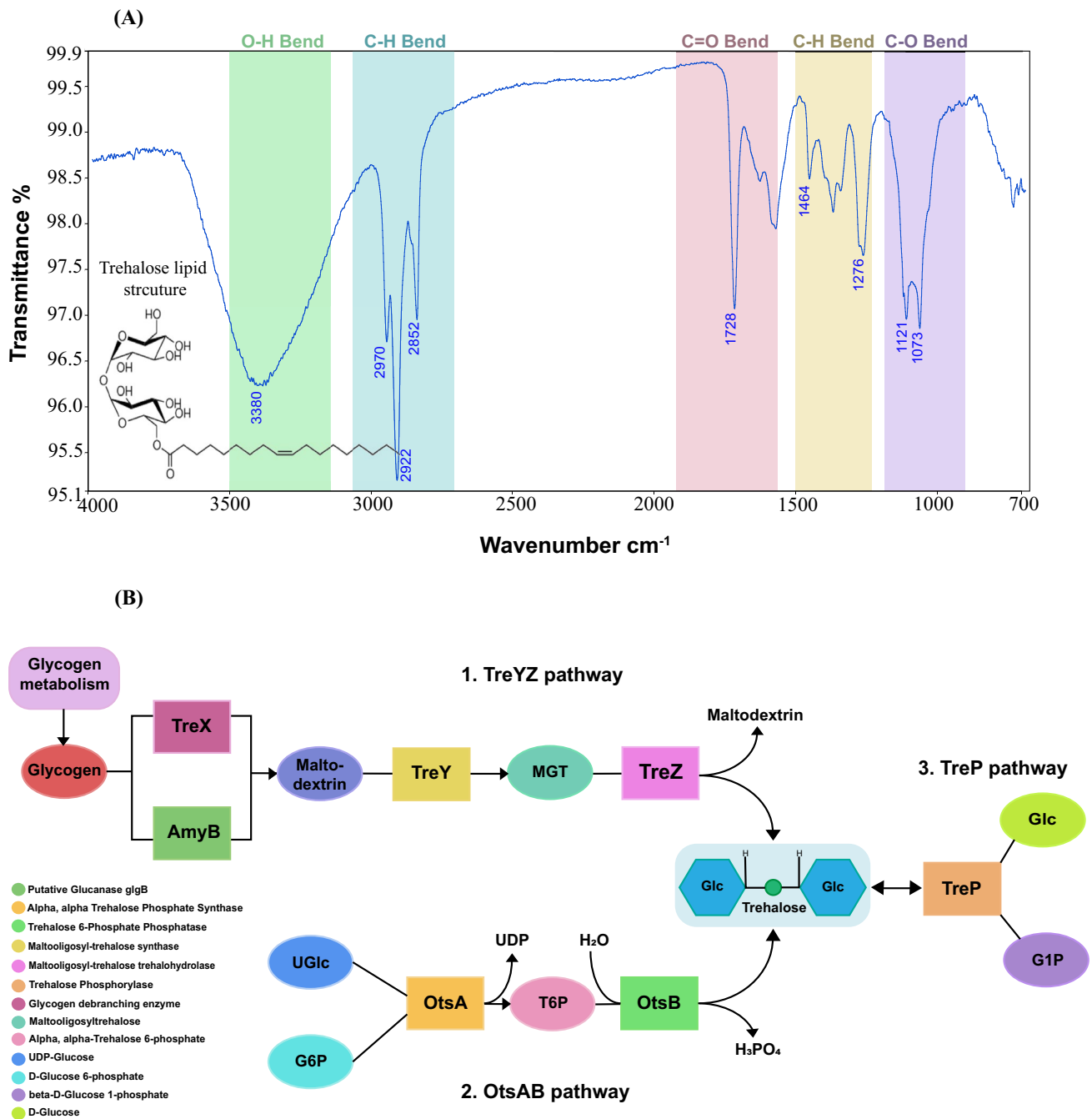


Fig. 6 Characterization of biosurfactants production in W3S5 during DBT desulfurization, by Fourier-transform infrared spectroscopy (FTIR) and whole-genome sequence analysis. **A** The FT-IR spectrum

of TLC purified biosurfactants in the range of 4000–500 cm^{-1} . **B** A schematic of TreYZ, OtsAB and TreP pathways of trehalose biosynthesis identified in strain W3S5

and NCBI-PGAP predicted 5 and 3 genes respectively. The results indicate that nearly all annotations predicted the presence of *otsA*, *otsB*, *treY*, *treZ* and *treP* genes (Table 1) in the genome that confirms the presence of OtsAB and TreYZ and TreP pathways in W3S5 strain (Fig. 6B). The OtsAB pathway, is the most prevalent pathway for stress response in bacteria that starts with glucose-6-phosphate and

UDP-glucose to form trehalose-6-phosphate, catalyzed by trehalose-6-phosphate synthase (*otsA*) (Avonce et al. 2006), which is then dephosphorylated by trehalose-6-phosphate phosphatase (*otsB*) to release a free trehalose molecule (Avonce et al. 2006). Whereas, in TreYZ pathway, the glycogen or oligomaltodextrin is transformed into maltooligosyl-trehalose by transglycosylation of terminal maltosyl residue

Table 1 Identification of genes involved in trehalose metabolism in *Gordonia rubripertincta* W3S5, using various bioinformatics annotation tools

Gene	Gene product	Function	RAST	BlastKOALA	BV-BRC	NCBI-PGAP
<i>otsA</i>	Alpha, alpha-trehalose-phosphate synthase	Trehalose biosynthesis	+ <i>otsA</i>	+ <i>otsA</i>	+ <i>otsA</i>	+ <i>otsA</i>
<i>otsB</i>	Trehalose-6-phosphate phosphatase	Trehalose biosynthesis	++ <i>otsB</i>	–	++ <i>otsB</i>	++ <i>otsB</i>
<i>treZ</i>	Malto-oligosyltrehalose trehalohydrolase	Trehalose biosynthesis	+ <i>treZ</i>	+ <i>treZ</i>	+ <i>treZ</i>	–
<i>treY</i>	Malto-oligosyltrehalose synthase	Trehalose biosynthesis	+ <i>treY</i>	–	+ <i>treY</i>	–
<i>lpqY</i>	trehalose/maltose transport system substrate-binding protein	Trehalose biosynthesis	–	+ <i>lpqY</i>	–	–
<i>sugA</i>	trehalose/maltose transport system permease protein	Transport across cell membrane	–	+ <i>sugA</i>	–	–
<i>sugB</i>	trehalose/maltose transport system permease protein	Transport across cell membrane	–	+ <i>sugB</i>	–	–
<i>mmpL3</i>	trehalose monomycolate/heme transporter	Transport of trehalose monomycolates	–	+ <i>mmpL3</i>	–	–
<i>treP</i>	Trehalose phosphorylase	Trehalose metabolism	+ <i>treP</i>	+ <i>treP</i>	–	–
<i>papA3</i>	mycolipenoyltransferase / trehalose acyltransferase	Biosynthesis of polyacyltrehalose (PAT) trehalose-based cell wall glycolipid	–	++ <i>papA3</i>	–	–
<i>glgE</i>	Putative glucanase	Trehalose biosynthesis	+ <i>glgE</i>	–	–	–
<i>pgmB</i>	Beta-phosphoglucomutase	Trehalose uptake and utilization	+ <i>pgmB</i>	–	–	+ <i>pgmB</i>
<i>fbp</i>	trehalose O-mycolyltransferase	Trehalose mycolate metabolism	–	++ <i>fbp</i>	+ <i>fbp</i>	–
<i>glgB</i>	Glucosyltransferase	Trehalose biosynthesis	+ <i>GlcP</i>	–	–	–
<i>GlcP</i>	Glucose/mannose:H ⁺ symporter	Trehalose uptake and utilization	+ <i>GlcP</i>	–	–	–
<i>glgB</i>	1,4-alpha-glucan (glycogen) branching enzyme	Trehalose biosynthesis	+ <i>glgB</i>	–	–	–
<i>stf0</i>	trehalose 2-sulfotransferase	Biosynthesis of sulfolipid, a trehalose-based cell wall glycolipid	–	+ <i>stf0</i>	–	–

The plus sign “+” represent the no of copies of a gene and minus sign “–” represent the gene was not detected.

into a trehalosyl group by maltooligosyl-trehalose synthase (*treY*) and subsequently the trehalose is liberated from maltooligosyl-trehalose by the action of maltooligosyl-trehalose trehalohydrolase (*treZ*) (Avonce et al. 2006; Takayama et al. 2005). The TreP is another pathway found in bacteria, which consists of a single reversible reaction to synthesis trehalose from D-glucose and β-D-glucose 1-phosphate, catalyzed by trehalose phosphorylase (*treP*) (Takayama et al. 2005). Furthermore, the trehalose-monocorynomycolates (TMM) transporter gene (*mmpL3*) and trehalose O-mycolyltransferase gene (*fbp*) were also detected by BlastKOALA and BV-BRC annotations respectively (Table 1), indicating the synthesis of TMM lipids and their transport across the cell membrane (Li et al. 2019; Luong et al. 2018).

Certain genes associated with trehalose transport such as *lpqY*, *SugA*, and *SugB* were predicted by the BlastKOALA annotation (Table 1). Trehalose acyltransferase (*papA3*) and 2-sulfotransferase (*stf0*) genes that contribute to the biosynthesis of trehalose-based cell wall glycolipids were also detected by BlastKOALA annotation (Table 1). Beta-phosphoglucomutase (*pgmB*) and Glucose/mannose:H⁺ symporter (*GlcP*) genes involved in the uptake and utilization of trehalose and the trehalose phosphorylase (*treP*) gene

implicated in trehalose catabolism/anabolism were identified by ClassicRAST, BlastKOALA, and NCBI-PGAP annotations (Table 1) indicating that isolate W3S5 can use trehalose as carbon/energy sources or as a solute for maintaining the osmotic pressure of the cell under stress conditions. Furthermore, the genes for 1,4-alpha-glucan (glycogen) branching enzyme (*glgB*) and putative glucanase (*glgE*) were also recognized by ClassicRAST annotation. The *glgB* and *glgE* genes participate in glycogen metabolism and are interconnected with trehalose biosynthesis as glycogen is used as a substrate for trehalose biosynthesis during the TreYZ pathway and therefore influences trehalose biosynthesis at these nodes.

Discussion

Biodesulfurization of organic-sulfur compounds present in petro-fuels has attracted attention on a global scale due to the lack of economic and environmentally favorable methods for the removal of organic sulfur as opposed to inorganic sulfur removal (Davoodi-Dehaghani et al. 2010; Kalita et al. 2022; Al-khazaali and Ataei 2023; Silva et al. 2023). Certain

microbes can obtain sulfur from complex organic-sulfur compounds for growth and other essential functions, and therefore can be used to remove organic-sulfur from petro-fuels with no negative environmental impact (Sousa et al. 2020). For the past several decades, DBT has been utilized as a model compound to isolate and characterize the organic-sulfur compound desulfurizing bacteria, since it is prevalent in ptero-fuels and challenging to remove using traditional methods (Davoodi-Dehaghani et al. 2010; Pavlopoulos et al. 2010; Xia 2018). Here, we are providing a detailed study on an efficient DBT desulfurizing strain, W3S5, isolated from an oil-contaminated soil sample that can desulfurize ~99% of DBT (0.2 mM) within 48 h of incubation. When grown in MG medium containing only DBT, the isolate did not show prominent growth, however, when both DBT and glucose were provided, a very rich growth was obtained indicating that the isolate utilizes DBT as a sole sulfur source and not as a carbon source (Fig. 1C). Through TYGS based phylogenomic analysis the strain has been identified as *Gordonia rubripertincta*, as it makes a cluster with *Gordonia rubripertincta* type strains in the phylogenomic tree by sharing similar genome features (Fig. 2). The TYGS has been applied in this study because it is one of the best tools for genome-based classification of species as it contains a large-scale database of type strains genomes having legally published names and utilizes trustworthy whole-genome based classification and phylogeny methods (Meier-Kolthoff et al. 2013; Meier-Kolthoff and Göker 2019). Our findings of GC-MS analysis of extracted metabolites and genetic studies of *dsz* genes revealed the production of core metabolites DBT, DBTO₂, and 2-HBP indicating that W3S5 follows the “4S” pathway (Fig. 3) of DBT desulfurization encoded by *dszA*, *dszB*, and *dszC* genes present on contig# 22 in the form of an operon spanned by some mobile/transposable elements (Fig. 4A). In literature, two major pathways the ring destructive “Kodama pathway” and sulfur specific “4S pathway” have been reported for DBT desulfurization by aerobic bacteria (Gunam et al. 2006; Parveen et al. 2020; Su et al. 2018). In “4S” pathway the sulfur is specifically removed through enzymes by cleaving the C–S bond instead of C–C bond without breaking the carbon-skeleton, that preserves the calorific value of the fuel (Ferreira et al. 2017; Gunam et al. 2006; Parveen et al. 2020; Su et al. 2018). Our studies showed that W3S5 also follows the “4S” pathway of DBT desulfurization, and hence able to preserve the calorific value of the fuel when applied as a biocatalyst. The phylogenetic analysis of *dszABC* genes showed a close evolutionary relatedness with *Gordonia* species suggesting that the *dsz* genes of W3S5 strain are conserved and quite similar to the *dsz* genes of other desulfurizing *Gordonia* species (Fig. 4C).

Majority of BDS studies reported in literature could applied either DBTs or BTs, however only a few bacteria have been recorded to desulfurize both DBTs and BTs

(Chen et al. 2021; Mohamed et al. 2015; Raheb and Hajipour 2011). We find that W3S5 can effectively metabolize all three classes of compounds i.e., DBTs, BTs, and THs when fed in MG medium separately as well as in a mixture. The overall growth order for all these compounds was: DBT > 2,8-DMDBT > BT > 3-MBT > DBTS > 4-MDBT > 3-MTH > 2-MTH > TH, and desulfurization activity order for compounds showing Gibb’s positive test was: DBT > DBTS > BT > 3-MBT > 4-MDBT (Fig. 5A and B). In case of methylated thiophenic compounds, the strain W3S5 showed a little more growth with double methylated compound (like 2,8-dimethyl DBT) as compared to single methylated compounds (Fig. 5A). In cultures treated with 2,8-DMDBT, TH, 2-MTH, and 3-MTH, the 2-HBP/2-HBP equivalent formation was not detected, however, the increase in growth in the presence of these compounds suggests that the isolate W3S5 have utilized these compounds to obtain sulfur for its growth and might have converted them into some non-phenolic end products that are non-reactive with Gibb’s reagent. Furthermore, there is a possibility that the produced phenolic end product did not react with the Gibbs reagent, which does not yield a blue reaction. For instance, 2,8-DMDBT may be converted into 3’,5-dimethyl-2-hydroxybiphenyl by the bacterium, a phenolic end product that does not give a blue reaction with Gibb’s reagent. Gibb’s reagent specifically reacts with phenols lacking substituents in the ortho position. Determining the formation of end products from the use of these phenolic compounds will require further studies through GC–MS/LC–MS/NMR in the future.

There could be several reasons for these variable effects of derivatizations; varying degrees of microbial toxicity of these compounds, the bacterium might be using various metabolic pathways for the more complicated compounds, or the more complex compounds may have a stronger affinity for the transport proteins. Collectively, the results indicate that as compared to the previous reported desulfurizing bacteria, the W3S5 strain can not only effectively desulfurize DBTs but also BTs as well as THs that are the highly recalcitrant organic-sulfur compounds present in petro-fuels (Chen et al. 2021; Mohamed et al. 2015; Raheb and Hajipour 2011).

In addition to desulfurize DBTs and BTs as a single-sulfur source, the isolate W3S5 was also investigated to desulfurize them together in equimolar ratios (0.1 mM). As compared to single-sulfur compounds (Fig. 5C), a delayed onset of log-phase was observed for the mixture of compounds (DBT, DBTS, 3-MDBT, BT and 3-MBT) after 96 h of incubation instead of 24 h, which might be due to the need for the cells to adjust to an environment rich in multiple organic-sulfur compounds and time for producing the respective BDS enzymes. In addition, there may be a competition (gradation in affinity) among different organic sulfur compounds to attach with the receptors/transporters responsible for the uptake of these compounds into the cell

which can cause a delay in the onset of the log phase. So, even if one compound can be metabolized optimally when supplied individually, it may have a different behavior in uptake and metabolism in the presence of multiple sulfur compounds. After adaptation, the isolate successfully desulfurized 36% of the total amount of mixed-compounds within 192 h of cultivation, suggesting its potential to utilize multiple organic-sulfur compounds simultaneously. Overall, this is the first study on the desulfurization of DBTs as well as BTs, as single-sulfur source and a mixture of compounds by *Gordonia rubripertincta* W3S5.

Restricted mass transfer of substrate between oil and the aqueous phase is another main bottleneck in the large-scale application of BDS (Alves et al. 2015; Parveen et al. 2020; Hasanbeik et al. 2022). Biosurfactants are amphiphilic surface-active compounds that aid in enhancing the substrate mass transfer in biphasic systems by lowering the surface tension of the medium (Mnif and Ghribi 2015). We have found that strain W3S5 produces trehalose-surfactants during the biodesulfurization of DBT, as confirmed by TLC and FTIR analyses. The FTIR analysis of the TLC purified biosurfactants in the range of 4000–500 cm^{-1} confirmed that the produced biosurfactants are trehalose-surfactants (Fig. 6A). Trehalolipids are one of the best-studied subclasses of glycolipids, that have wide range industrial applications including microbial enhanced oil recovery, because of their adaptive structural and functional groups that give them the desired high surface activity (Arguelles 2000). Several bacterial species have been reported to produce trehalolipids, of which *Rhodococcus* genus is well reported to produce various types of trehalolipids such as trehalose-monocorynomycolates (TMM), trehalose-dicorynomycolates (TDM), and trehalose-tricorynomycolates (TTM), including succinoyl trehalose lipids and trehalose tetraesters (Franzetti et al. 2010; Kretschmer et al. 1982; Luong et al. 2018). However, no study has been reported for the production of trehalolipids by a desulfurizing *Gordonia* specie (Luong et al. 2018). We are first time reporting the production of trehalose-surfactants by a desulfurizing *Gordonia rubripertincta* W3S5 strain and have identified the trehalose-surfactant related genes by analyzing its whole genome sequence using several online genome annotation programs i.e., ClassicRAST, BlastKOALA, BV-BRC, and NCBI-PGAP (Table 1). We have identified three potential trehalose biosynthesis pathways, OtsAB, TreYZ, and TreP in strain W3S5 based on data obtained from these annotations (Fig. 6B). Additionally, few genes related to the biosynthesis of trehalose-monocorynomycolate (TMM), a precursor for the synthesis of various types of trehalolipids were also identified. The results also suggest that it is best to perform a genomic analysis using multiple annotations as each tool has certain limitations such as differences in variances, the limited knowledge available in a database to correctly identify

or annotate certain enzymes, or the sequences that could not meet the threshold of that database. A thorough understanding of biosurfactants produced by DBT desulfurizing bacteria would be helpful in studies intended in improving the desulfurization rate by increasing the mass transfer of the organic-sulfur compounds with the help of biosurfactants.

Conclusion

In conclusion, our study provides in-depth insights into the remarkable biodesulfurization potential of the strain W3S5, which was isolated from oil-contaminated soil. Our findings reveal that strain W3S5 follows the “4S” pathway of DBT desulfurization and can metabolize a variety of HDS-resistant organic-sulfur compounds, including DBTs, BTs, and THs separately as well as in a mixture. Moreover, it produces trehalose-surfactants during DBT desulfurization, enabling the bacterial cells to efficiently uptake the DBT from the medium by reducing the surface tension. Furthermore, we present the first comprehensive analysis of the whole-genome sequence of the desulfurizing strain W3S5 using different annotation programs, which identified three potential trehalose synthesis pathways, namely OtsAB, TreYZ, and TreP, as well as trehalose-monomycolate lipid synthesis genes. The identification of various trehalose-related genes in the strain W3S5 provides new insight into the mechanisms governing sulfur removal, which opens up new possibilities for optimizing this process. Overall, these findings suggest that the isolated strain *Gordonia rubripertincta* W3S5 has the potential for sustainable and efficient biodesulfurization of wide range of organic-sulfur compounds and could be a highly effective candidate in advanced biodesulfurization research aimed at addressing environmental issues related to sulfur-emissions.

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Author contributions SP contributed in Investigation, Methodology, Formal analysis, Data curation and Writing. NA contributed in Conceptualization, Resources, Methodology, Validation, Supervision, Writing—review & editing. TEK and AIH contributed in Formal analysis, Visualization, Data curation. RB and KA contributed in Writing—review & editing. All authors have approved the final version of the manuscript.

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Data availability The whole genome shotgun sequence of isolate W3S5 is available at DDBJ/ENA/GenBank under the accession NZ_VLNS00000000 (BioProject: PRJNA555169; BioSample: SAMN12302752), version VLNS00000000.1. The identified complete sequences of *dszA*, *dszB* and *dszC* genes were submitted in GenBank database at NCBI (www.ncbi.nlm.nih.gov) and were assigned the

following accession numbers: OP413448, OP413449, and OP413450 respectively.

Declarations

Competing interest The authors declare no competing interests.

Ethical approval Not applicable.

Consent to participate Not applicable.

Consent for publication Not applicable.

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