

1 Article

## 2 Isolation, Genomic and Metabolomic 3 Characterization of *Streptomyces tendae* VITAKN 4 with Quorum Sensing Inhibitory Activity from 5 Southern India

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### 28 Abstract:

29 *Streptomyces*, being one of the most promising genera due to its ability to synthesize a variety of  
30 bioactive secondary metabolites of pharmaceutical interest, here studied in relation to its genomic  
31 and metabolomic potential. Coinciding with the increase in sequenced data, mining of bacterial  
32 genomes for biosynthetic gene clusters (BGCs) has become a routine component of natural product  
33 discovery. Herein, we describe the isolation and characterization of a *Streptomyces tendae* VITAKN  
34 with quorum sensing inhibitory activity (QSI) that was isolated from southern coastal parts of India.  
35 The nearly complete genome consists of 8,621,231bp with a GC content of 72.2%. Utilizing the  
36 BiG-SCAPE-CORASON platform, a sequence similarity network predicted from this strain was  
37 evaluated through sequence similarity analysis with the MIBiG database and existing 3,365 BGCs  
38 predicted by antiSMASH analysis of publicly available complete *Streptomyces* genomes. Crude  
39 extract analyzed on LC-HRMS/MS and Global Natural Product Social Molecular Networking  
40 (GNPS) online workflow using dereplication resulted in the identification of cyclic dipeptides (2,  
41 5-diketopiperazines, DKPs) in the extract, which are known to possess QSI activity. Our results  
42 highlight the potential use of genomic mining coupled with LC-HRMS/MS and bioinformatic tools  
43 (GNPS) as a potent approach for metabolome studies in discovering novel QSI lead compounds.  
44 This study also provides the biosynthetic diversity of these BGCs and an assessment of the predicted  
45 chemical space yet to be discovered.

46 **Keywords:** natural product; actinobacteria; quorum sensing inhibition (QSI); biosynthetic gene  
47 clusters (BGCs); global natural product social networking (GNPS); cyclic dipeptides  
48 (2,5-diketopiperazines, DKPs); LC-HRMS  
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## 51 1. Introduction

52 Natural products of microbial origin have gained considerable attention because of their  
53 biological of their diversity and as the chemical compounds by them produced, as secondary  
54 metabolites represent the source for almost 35% of all present drugs [1,2]. Our current use of  
55 antibiotics poses great challenges among medical practitioners and researchers due to the  
56 development and spread of antibiotic-resistant pathogens. Moreover, the low success rates of  
57 antibiotic drug discovery programs worldwide that resulted in today's' eminent lack of new  
58 antibiotic drug leads [3]. An increased understanding on bacterial pathogenesis mechanisms and of  
59 intercellular microbial communication has revealed potential alternative strategies to treat  
60 bacteria-mediated diseases. A crucial aspect for the establishment and maintenance of a microbial  
61 population is based on cell density which triggers the genetic regulation, coordinating the  
62 physiologies of the different cell types through cell-cell communication, known as quorum sensing  
63 (QS) [4]. Different types of QS communication systems rely on diverse small, secreted signaling  
64 molecules known as autoinducers (AIs). In many cases, the responses elicited by AIs contribute  
65 directly to pathogenesis through the synchronized production of virulence determinants, such as  
66 toxins, proteases, and other immune-evasive factors [5]. Additionally, QS can contribute to  
67 behaviors that enable bacteria to resist antimicrobial compounds such as biofilm development. If the  
68 signal communication that coordinates these pathogenic behaviors was blocked, it is theorized that  
69 bacteria would lose their ability to mount an organized assault on the host and thus would be less  
70 able to form organized community structures that promote resistance to antibiotics [6,7]. Hence, an  
71 alternative natural product from prolific source could be employed to discover new drug leads.

72 Initial screening and discovery for novel lead molecules is usually performed at the level of  
73 crude extract screening followed by the activity-guided fractionation and purification [8]. However,  
74 this approach suffers drawback due to large sample complexity resulting in additive or  
75 multiplicative effects of the compounds present in the extract together with potential rediscovery of  
76 already known compounds or its analogues. This can be partially overcome by pre-fractionation of  
77 the crude extract improving the detection capability coupled with advanced metabolomics  
78 approaches. One such example is the use of fast and extremely accurate methods such as  
79 high-performance liquid chromatography connected to high resolution tandem mass spectrometry  
80 (HPLC-HRMS/MS) in the field of natural products to develop high-throughput discovery pipelines  
81 [9,10]. Another drawback is the presence of cryptic genes disabling the detection of desired bioactive  
82 lead molecules using the conventional way. This can be overcome by using genome sequencing to  
83 unveil cryptic biosynthetic gene clusters (BGCs). Based on antiSMASH analysis, it is now apparent  
84 that many bacteria with large genomes, particularly actinomycetes have the coding capacity to  
85 produce large number of secondary metabolites [11]. Marine actinomycetes are the most  
86 economically and biotechnologically valuable prokaryotes responsible for production of about half  
87 the discovered bioactive secondary metabolites notably antibiotics, antitumor agents,  
88 immunosuppressive agents and enzymes [12]. To continue our effort in the isolation of new  
89 bioactive molecule, it is crucial that new groups of actinomycetes from unexplored places or under

90 exploited conditions be pursued as sources of novel bioactive secondary metabolites. Despite  
91 extensive exploration of actinomycetes for their antimicrobial products in the past, the search for  
92 molecules having unique therapeutic properties continues to be an active area of research. Herein  
93 we report the isolation of *Streptomyces tendae* VITAKN with quorum sensing inhibitory activity (QSI)  
94 from southern coastal areas of India, together with its almost complete (18 scaffolds, 100%  
95 completeness, 0% heterogeneity) draft genome sequence.

96

## 97 **2. Materials and Methods**

### 98 **2.1 Isolation of actinomycetes**

99 The marine soil samples were aseptically collected from the Rameswaram coast (9.2876° N,  
100 79.3129° E), Tamil Nadu, India. The soil sample was collected at a depth of 10-15 cm aseptically in  
101 sterile polythene bags and transported to the laboratory. The pre-treatment of the soil sample was  
102 done in a hot air oven at 700 °C for 30 min [13]. The dried soil sample was serially diluted upto 10<sup>-6</sup>  
103 dilution and plated on Actinomycetes Isolation Agar (AIA) (Sodium caseinate - 2.0 gL<sup>-1</sup>,  
104 L-Asparagine - 0.1 gL<sup>-1</sup>, Sodium propionate - 4.0 gL<sup>-1</sup>, Dipotassium phosphate - 0.5 gL<sup>-1</sup>, Magnesium  
105 sulphate - 0.1 gL<sup>-1</sup>, Ferrous sulphate - 0.001 gL<sup>-1</sup>, Agar - 15 gL<sup>-1</sup>, adjusted to a final pH of 8.1 ± 0.2) and  
106 Starch Casein Agar (SCA) (Starch - 10 gL<sup>-1</sup>, Casein powder 1 gL<sup>-1</sup>; Sea water 37 gL<sup>-1</sup>, Agar - 15 g  
107 L<sup>-1</sup>; adjusted to a final pH of 7.2 ± 0.2) (HiMedia Laboratories, Mumbai, India).. The plates were then  
108 incubated at room temperature for 7-14 days. Isolated actinomycetes were sequentially sub-cultured  
109 on AIA plates until pure culture was obtained. Pure culture was maintained at 28 °C until future use.

110

### 111 **2.2 Morphological and Cultural characteristics of potential strain**

112 The potential isolate with moderate to strong activity was identified further using various  
113 cultural characteristics including the growth optimization parameters on different media with (3%  
114 w/v) sea salt; ISP1 (Tryptophan Yeast Extract Broth), ISP2 (Yeast Malt Agar), ISP3 (Oat Meal Agar),  
115 ISP4 (Inorganic Salt Starch Agar), ISP5 (Glycerol Asparagine Agar Base), ISP6 (Peptone Yeast Extract  
116 Iron HiVeg Agar), ISP7 (Tyrosine Agar Base), ISP9 (Carbon Utilisation Agar), AIA, SCA (Starch  
117 Casein Agar) and NA (Nutrient Agar), temperature (30°C, 40°C and 50°C) and pH (4, 6, 7, 9 and 12).  
118 Genus level identification of the potent isolate was carried out based on aerial and substrate  
119 mycelium, reverse side pigmentation and spore chain morphology following the Bergey's Manual of  
120 Determinative Bacteriology. The arrangement of the spores in the mycelium was observed by cover  
121 slip method under light microscope as well as by scanning electron microscope. The potential isolate  
122 growth was also evaluated on different carbon supplements (1% glucose, fructose, maltose, mannitol  
123 and starch) using ISP9 medium [14].

124

### 125 **2.3 Crude extracts preparation and quorum sensing inhibitory (QSI) activity**

126 Pure culture of the strain was further inoculated in small scale fermentation AM3 medium  
127 (Soluble starch 15 g/L, soybean powder 5 g/L, peptone bacteriological 15 g/L, glycerol 15 g/L,  
128 CaCO<sub>3</sub> 2 g/L, 3% sea salt, pH 7.4). After one week of incubation cell free supernatant was extracted  
129 thrice using ethyl acetate and dried in vacuum to obtain the crude extract. Crude extract was serially  
130 diluted to obtain 12.5-0.0487 mg/ml in 20% DMSO in water. QSI activity were tested using *E. coli*  
131 pSB401 and *E. coli* pSB1075, luminescence based reporters and were quantified on a TriStar  
132 Multimode Microplate reader (Berthold Technologies GmbH & Co. KG, Germany) following [15,16].  
133 Plasmid pSB401 and pSB1075 contains *luxI/R* and *lasI/R* gene promoter respectively regulating

134 *luxCDABE* expression, and responds well to exogenously provided AHLs [15,17]. The inoculum of  
135 the reporter strains (OD<sub>600</sub> 0.01, final concentration) were prepared from an overnight culture and  
136 added (50  $\mu$ L) to each well of 96 well plates. The inoculum was supplemented with  
137 N-(3-oxo-hexanoyl)-L-homoserine lactone (3-oxo-C6-HSL, 1  $\mu$ M final concentration) and  
138 N-(3-oxo-dodecanoyl)-L-homoserine lactone (3-oxo-C12-HSL, 2  $\mu$ M final concentration) to stimulate  
139 QS of pSB401 and pSB1075 biosensors, respectively. The bioluminescence was recorded every 30  
140 min for 7 hours at 30°C. The production of bioluminescence in the graphs is given as the relative  
141 light units (RLU), obtained at 4 h. A parallel experiment was run to determine non inhibitory  
142 concentration for the crude extract dilutions against both the biosensor without the exogenously  
143 addition of its cognate HSL.

144

#### 145 **2.4 Genomic characterization**

146 Strain AKN, were grown on ISP No. 1 medium for 4 days (Tryptone yeast extract broth)  
147 (HiMedia, Mumbai, India) to obtain the mycelium for DNA isolation. Later, the genomic DNA was  
148 isolated using High pure PCR template Preparation Kit, Roche. DNA libraries were prepared using  
149 the TruSeq DNA PCR free kit. Metagenomic shotgun libraries were sequenced on an Illumina  
150 platform (100-bp paired-end reads) in Macrogen, Korea, yielding a total of 6.6G bp of sequence.  
151 Sequences were trimmed using Trimmomatic version 0.36 (minlen 100, slidingwindow 4:20) (8), and  
152 read quality was assessed using FastQC version 0.11.5 [18]. Prior to *de novo* assembly using SPADES  
153 version 3.13.0 (parameters: -k 21,33,55,77,91 --careful --only-assembler --cov-cutoff auto) [19].  
154 Scaffolds  $\geq$  2 kb was used for further analysis. Completeness and contamination were estimated with  
155 checkM version 1.0.7 [20] based on 460 markers and using taxonomy workflow for *Streptomyetaceae*.  
156 The near-full-length 16S rRNA gene sequence was obtained as followed; rRNA sequences were first  
157 sorted from the raw shotgun reads using SortMeRNA (v. 2.1b) [21] and SILVA 132as reference  
158 database. Second, the obtained reads were assembled with rnaSPAdes [22] using default parameters.  
159 SILVA 132 non-redundant databases was downloaded from the SILVA official web site  
160 (<http://www.arb-silva.de>). For the phylogenetic analysis, sequences of the closest described type  
161 strains were obtained from EzTaxon [23]. Open reading frames (ORFs) for AKN genome were  
162 identified and annotated with the RASTtk algorithm [24,25]. The sequences were compared with  
163 those available in Genbank using BLASTn [26].

164 To further assess the biosynthetic capacity of this strain, antiSMASH v4.1 [27] was used to  
165 identify the BGCs encoded in its genome, along with other publicly available 113 complete  
166 *Streptomyces* RefSeq genomes obtained from the National Center for Biotechnology Information.  
167 BGCs were then clustered into groups based on sequence similarity using BiG-SCAPE [28] using  
168 default parameters, including singletons, and a distance cut-off score of 0.3. MIBiG database v1.4  
169 [29] was also applied to the networks to assign BGCs that putatively produce known compounds.  
170 Generated networks were visualized through Cytoscape software [30].

171

#### 172 **2.5 HPLC-HRMS/MS analysis and Metabolites identification using GNPS dereplication**

173 Crude extract was analyzed using high-resolution ESI mass spectrometry experiments  
174 (LC-HRMS and LC-HRMS/MS) using a Thermo LTQ Orbitrap XL mass spectrometer (Thermo  
175 Fisher Scientific Spa, Rodano, Italy) coupled to an Agilent model 1100 LC system (Agilent  
176 Technologies, Cernusco sul Naviglio, Italy) equipped with a solvent reservoir, an in-line degasser, a



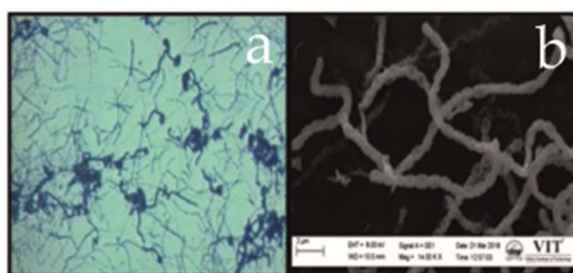
177 binary pump and a refrigerated autosampler [31]. The spectra were recorded by infusion into the  
178 ESI source using MeOH as the solvent. A 5  $\mu\text{m}$  Kinetex C18 column (50  $\times$  2.1 mm), maintained at 25  
179  $^{\circ}\text{C}$ , was operated using a gradient elution of  $\text{H}_2\text{O}$  and MeOH both with 0.1% formic acid, running at  
180 200  $\mu\text{L}/\text{min}$ . The gradient program was as follows: 10% MeOH for 3 min, 10%–90% MeOH over 30  
181 min, 90% MeOH for 3 min. All the mass spectra were recorded in the positive-ion mode. MS  
182 parameters were a spray voltage of 5 kV, a capillary temperature of 230  $^{\circ}\text{C}$ , a sheath gas rate of 12  
183 units  $\text{N}_2$  (ca. 120 mL/min), and an auxiliary gas rate of 5 units  $\text{N}_2$  (ca. 50 mL/min). Data were  
184 collected in the data-dependent acquisition mode, in which the five most intense ions of a full-scan  
185 mass spectrum were subjected to high resolution tandem mass spectrometry (HRMS/MS) analysis.  
186 HRMS/MS scans were obtained for selected ions with CID fragmentation, isolation width of 2.0,  
187 normalized collision energy of 35, Activation Q of 0.250, and activation time of 30 ms. A molecular  
188 network was created with the Feature-Based Molecular Networking (FBMN) workflow [32] on  
189 GNPS (<https://gnps.ucsd.edu>, [33,34]). The mass spectrometry data were first processed with  
190 MZMINE2 [35] and the results were exported to GNPS for FBMN analysis. The data was filtered by  
191 removing all MS/MS fragment ions within  $\pm 17$  Da of the precursor  $m/z$ . MS/MS spectra were  
192 window filtered by choosing only the top 6 fragment ions in the  $\pm 50$  Da window throughout the  
193 spectrum. The precursor ion mass tolerance was set to 2 Da and the MS/MS fragment ion tolerance  
194 to 0.02 Da. A molecular network was then created where edges were filtered to have a cosine score  
195 above 0.7 and more than 6 matched peaks. Further, edges between two nodes were kept in the  
196 network if and only if each of the nodes appeared in each other's respective top 10 most similar  
197 nodes. Finally, the maximum size of a molecular family was set to 100, and the lowest scoring edges  
198 were removed from molecular families until the molecular family size was below this threshold.  
199 The spectra in the network were then searched against GNPS spectral libraries [33,36]. The library  
200 spectra were filtered in the same manner as the input data. All matches kept between network  
201 spectra and library spectra were required to have a score above 0.7 and at least 6 matched peaks.  
202 The DEREPLICATOR was used to annotate MS/MS spectra [37]. The molecular networks were  
203 visualized using Cytoscape software [30].

204

### 205 3. Results and discussion

206 The isolate AKN had white powdery, raised colonies with small to medium sized colonies  
207 when cultured on AIA plates. The substrate mycelium was pale white in color. The isolate was  
208 Gram- positive (Figure 1). The spores had smooth surface when examined under Scanning electron  
209 microscope (1000X magnification). The spores of the isolate were oblong in shape and were arranged  
210 in chains (Figure 1). The Scanning electron microscopic image of the isolate depicts that the isolate  
211 belongs to the *Streptomyces* sp. The isolate AKN was further characterized by the methods  
212 recommended by International *Streptomyces* Project. The growth of the isolate on different media is  
213 given in the Table S1. The isolate AKN grew abundantly on ISP 1, ISP 2, ISP 4 and ISP 7 respectively.  
214 In ISP 3, ISP 5, ISP 6, nutrient agar and starch Casein Agar (SCA) the growth of the isolate was  
215 observed to be good to moderate. The isolate AKN showed positive for Methyl red test and Citrate  
216 utilization test. It showed negative for Indole and Voges Proskauer's test. It showed an alkaline butt  
217 with alkaline slant in triple sugar iron test. The isolate AKN was non-motile and negative for  
218 mannitol test. The isolate was also found positive for lipase, oxidase, catalase and urease and  
219 negative for amylase respectively (Table S2). The cultural condition for the growth of the isolate was  
220 optimized. The isolate grew very well up to 4% NaCl concentration, moderate growth in 6% NaCl

221 and no growth was observed in 10% NaCl concentration. The isolate also grew excellent in the pH 7  
222 and moderate growth was observed in pH 6 and 9 respectively. Based on the temperature, the isolate  
223 had very good growth between 28-30°C. It grew moderately at 40°C and no growth at 50°C.

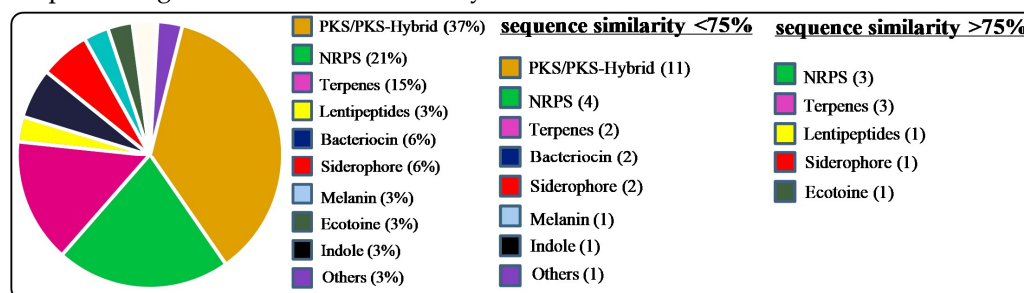


224  
225 **Figure 1.** Image of strain VITAKN a) Gram's staining on light microscope and b) Scanning electron microscopy.

226 Crude extract was evaluated for determination of its non-inhibitory concentration (NIC) against  
227 *E. coli* pSB401 (pSB401) and *E. coli* pSB1075 (pSB1075) the two strains used for testing quorum sensing  
228 inhibitory activity. Determination of NIC is important to rule out any possible growth inhibition  
229 artifacts during quorum quenching assays. The growth-inhibitory activities were tested at  
230 concentrations between 0.0487-12.5 mg/mL. No growth inhibition compared with the control  
231 (solvent only) was observed. Therefore, this concentration was used for further evaluation of QSI  
232 activity. Crude extracts inhibited luminescence by 20% at 0.78125 mg/mL (for pSB401) and 1.56  
233 mg/mL (for pSB1075). These data suggested the presence of some QSI active molecule in the extract  
234 and hence required further investigation.

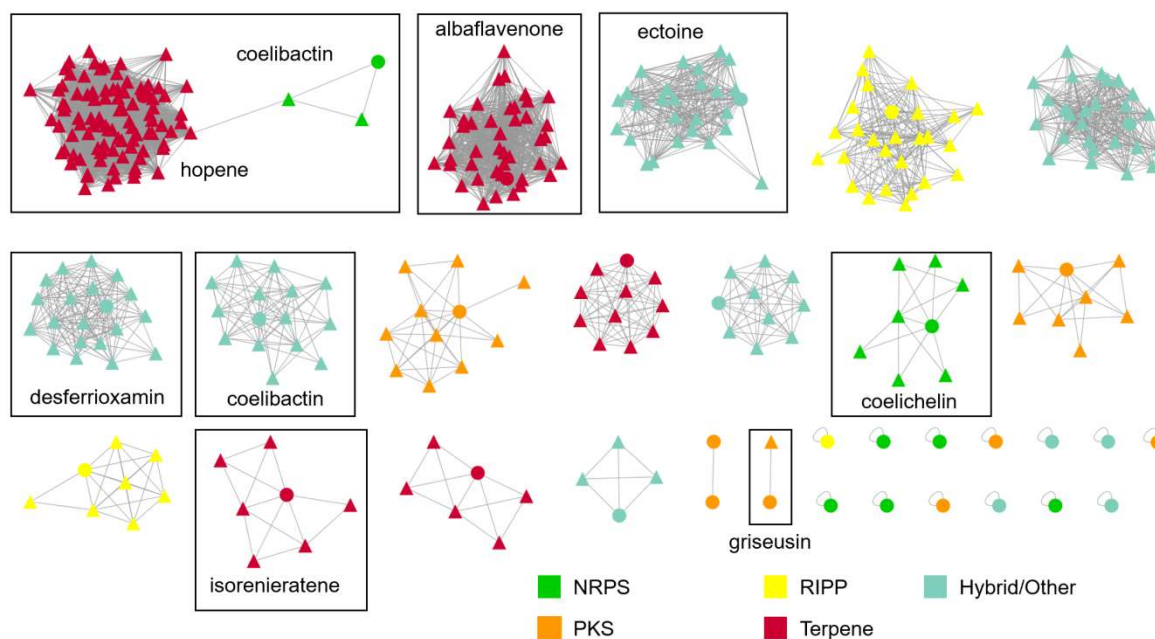
235 AKN genome assembly yielded 20 scaffolds with an  $N_{50}$  value of 788,548 bp, the largest contig  
236 having 1,671,513bp. The genome consists of 8,621,231 bp with a GC content of 72.2 % with 100%  
237 estimated completeness, 0.06% contamination and 0% heterogeneity. AKN genome contains 7,898  
238 predicted and 69 RNA genes (67 tRNA genes). 16S rRNA gene was assembled separately (see  
239 Materials and Methods). Based on EzTaxon analyses of extracted 16SrRNA gene (1564bp), the strain  
240 showed 99.8% similarity to *Streptomyces tendae* ATCC 19812 and hence strain AKN was designated  
241 as *Streptomyces tendae* VITAKN. antiSMASH analysis identified 33 clusters, mostly encoding for PKS  
242 and hybrid-PKS (12) and NRPS (7) BGCs, both of which are well known for producing structurally  
243 diverse compounds displaying various bioactivity. Detected BGCs belonging to other classes  
244 includes five terpenes, two siderophores, two bacteriocins and one of each of the following: melanin,  
245 ectoine, lanthipeptide, indole, and an unassigned cluster (Figure 2). Also, 9 clusters poses sequence  
246 similarity more than 75% to known BGCs. Interestingly, two BGCs with 100% similarity, SapB (a  
247 lantibiotic-like peptide) and coelichelin (siderophore) both known to be produced by *Streptomyces*  
248 *coelicolor*. SapB is a morphogenetic peptide that is important for aerial mycelium formation by the  
249 filamentous bacterium *Streptomyces coelicolor* [38]. Another BGC encoding for coelibactin, a NRPS  
250 synthesized peptide with predicted zincophore activity has been implicated in antibiotic regulation  
251 in *Streptomyces coelicolor* A3 (2) [39]. Manual curation of antiSMASH data inspired us to mine the  
252 genome to explore and exploit BGCs diversity at larger extend. These BGCs can be readily identified  
253 in a genome sequence as they are usually clustered together on the chromosome. The novelty and  
254 uniqueness of the BGCs predicted from this strain was evaluated through sequence similarity  
255 analysis with the MIBiG database and existing 3,365 BGCs predicted by antiSMASH analysis of  
256 publicly available complete *Streptomyces* genomes respectively. The genus *Streptomyces* is one of the

257 most chemically exploited genera for discovering novel drugs since the discovery of penicillin and  
 258 streptomycin. Further, the establishment of full genome sequence of two well studied natural  
 259 product producing strains *Streptomyces coelicolor* [40] and *Streptomyces avermitilis* [41], led the scientist  
 260 to notice the unexplored potential hidden in bacterial genomes [42]. A *Streptomyces* genome contains  
 261 on average about 30 secondary metabolite gene clusters, but the limitation of detection analytically  
 262 inspired us to explore the strains much more in depth and suggested that even well studied strains  
 263 contain the genetic potential to synthesize many more compounds than detected analytically. One of  
 264 the largest collections, MIBiG containing manually curated BGCs provided us a highly curated  
 265 reference dataset (~1920 BGCs). Out of all the BGCs curated, 636 BGCs have been entered from  
 266 genus *Streptomyces* alone followed by *Aspergillus* (88 BGCs) and *Pseudomonas* (68 BGCs) [43]. This  
 267 survey assesses the potential to discover novel metabolites from isolated *S. tendae* VITAKN and  
 268 depicts unexplored biosynthetic space. Out of 33 BGCs observed, only nine BGCs displayed  
 269 similarity with known BGCs, and only 17 BGCs associated with other BGCs extracted from existing  
 270 *Streptomyces* genomes (Figure 3), warranting further exploration of the biosynthetic potential of this  
 271 strain for producing novel bioactive secondary metabolites.



272  
 273 **Figure 2.** Total 32 BGCs with or without homology to MIBiG clusters identified using antiSMASH for  
 274 *Streptomyces tendae* VITAKN, out of them 9 clusters poses sequence similarity more than 75%.

275  
 276 The chemical structures of their products can be predicted to a certain extent, based on the analysis  
 277 and biosynthetic logic of the enzymes encoded in a BGC and their similarity to known counterparts  
 278 [44]. Whereas, as mentioned before its not very common and easy that these BGCs product  
 279 compounds to be detected analytically, still we analyzed crude extract of *S. tendae* VITAKN for  
 280 metabolites by LC-HRMS and LC-HRMS/MS. This was planned to determine whether the extract  
 281 features some unique chemical diversity and also how does it match with the predicted BGCs  
 282 product. To create molecular network, the LC-MS/MS data were analyzed with publicly available  
 283 data sets accessed via the GNPS-MassIVE database. To date, >93 million MS/MS spectra from  
 284 various instruments (including Orbitrap, Ion Trap, qTOF, and FT-ICR) have been searched at GNPS,  
 285 yielding putative dereplication matches of 7.7 million spectra to 15,477 compounds [33,45]. The  
 286 usage of this platform yielded the formation of the molecular network containing 327 parent ions  
 287 (nodes) (Figure S1).

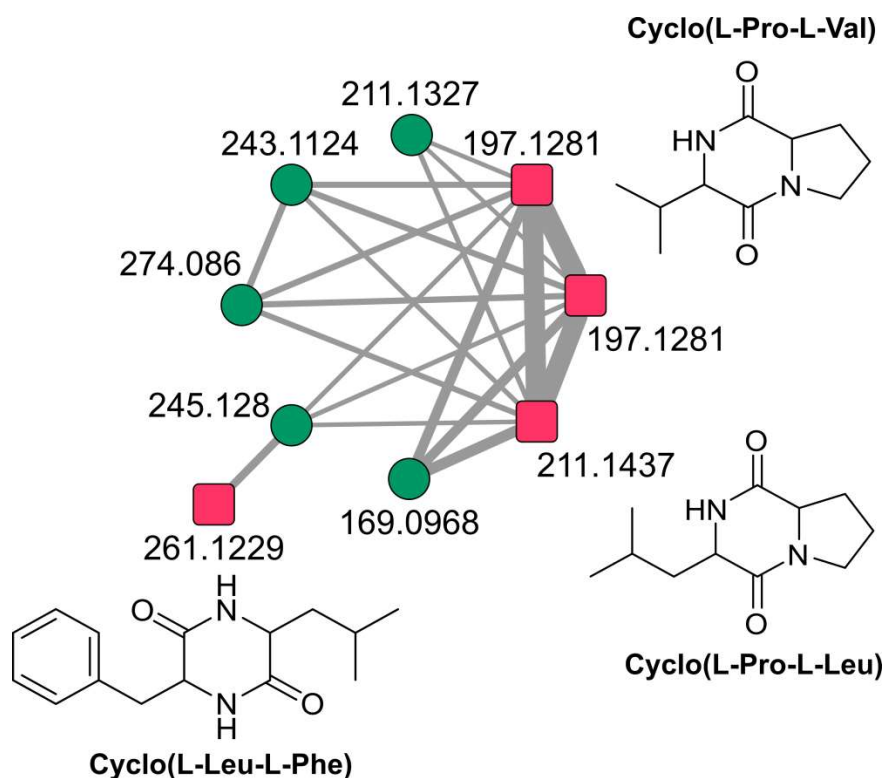


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289 **Figure 3.** Sequence similarity network of the 33 BGCs detected in *S. tendae* VITAKN compared against BGCs  
 290 in the MIBiG database and other *Streptomyces* strains. Circular nodes represent BGCs from this strain, and  
 291 triangular nodes represent MIBiG and other *Streptomyces* BGCs. Boxed clusters represent clusters containing  
 292 nodes associated with a MIBiG BGC. Colors were schemed according to different BGC family annotation.

293 These metabolites formed twenty-four clusters and one hundred eighty six self loop nodes. High  
 294 throughput molecular networking in our study showed putative presence of cyclic dipeptides  
 295 (2,5-diketopiperazines, DKPs) in cluster 4. The four cyclic peptides identified using the database in  
 296 our present study; are cyclo-(Leu-Phe), cyclo-(L-Leu-L-Pro), cyclo-(L-Pro-L-Val) and  
 297 cyclo-(L-Trp-L-Pro) (Figure 4). These DKPs have been previously reported to activate or inhibit  
 298 LuxR-type proteins in AHL biosensor strains, albeit at significantly higher concentrations than  
 299 native lactones [46]. These finding further emphasizes to continue our effort on isolating and  
 300 purifying these molecules and identify the exact activity of these molecules and also identify other  
 301 molecules present in the clusters which can be possibly a new analogue of these DKPs. Also, we  
 302 were not able to identify any other metabolites, which were putatively predicted using the BGCs  
 303 pathway. This strain may produce large number of yet unknown compounds one of which may be  
 304 the relevant for the QSI activity observed apart from detected DKPs in the extract. Furthermore, the  
 305 use DEREPLICATOR as part of library search for *in silico* identification of both peptidic and  
 306 non-peptidic natural products including polyketides, lipids, terpenes, benzenoids, alkaloids,  
 307 flavonoids, etc., is an advanced tool to identify the known among unknown [9,10].





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310 **Figure 4.** DKP cluster in *S. tendae* VITAKN molecular network. Each node represents m/z value of the parent ion  
311 and edge thickness is related to cosine score similarity

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#### 4. Conclusion

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The continued rise in antibiotic resistance needs to be addressed by discovering an alternative way for tackling the infection. Quorum sensing inhibitory activity (QSI) is one of many strategies to start with, whereas at the same time, it should also be noted to explore the potential of isolating a strain from a unexplored place. Assessment of *Streptomyces tendae* VITAKN biosynthetic gene cluster and comparing it with all the available genome data from *Streptomyces* genus can provide insight to direct responsible discovery efforts. The present study also makes a use of chemical fingerprinting and molecular networking tool to identify the presence of metabolites in the crude extract. However, the vast discrepancies between BGCs with and without sequence similarity warranting further exploration of the biosynthetic potential of this strain for producing novel bioactive secondary metabolites.

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**Data deposition and job accessibility:** The mass spectrometry data were deposited on public repository (provide the deposition accession number), such as [MassIVE](#) or [MetaboLights](#). The molecular networking job can be publicly accessed at <https://gnps.ucsd.edu/ProteoSAFe/status.jsp?task=2f692735adc7493c84080eb3042fad5>.

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**Supplementary Materials:** The following are available online at [www.mdpi.com/xxx/s1](http://www.mdpi.com/xxx/s1), Table S1: Growth pattern of isolate AKN on different media Table S2: Biochemical tests for VITAKN Figure S1: Generation of molecular network with various clusters produced by crude extract of *Streptomyces tendae* VITAKN by GNPS above similarity score threshold. Nodes highlighted in coloured boxes represent parent ions.

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**Author's Contributions:** All authors have read and agree to the published version of the manuscript. Conceptualization, N.I., K.S., K.K., L.S. and V.C.; methodology, K.S., R.T., I.B., J.J. ; data curation, K.S., I.B., S.S.,

334 D.E., P.H., L.S., and V.C.; writing—original draft preparation, K.S., N.I., I.B., J.J., R.T., L.S., and V.C.;  
335 writing—review and editing, K.S., I.B., R.T., K.K., P.H., L.S., and V.C.; supervision, K.S., L.S., V.C.,; project  
336 administration, K.S., K.K., L.S., and V.C.; funding acquisition, K.S., P.H. and V.C.

337 **Funding:** This study was supported by the Ministry of Education, Youth and Sports of the Czech Republic  
338 MSCA IF II project (CZ.02.2.69/0.0/0.0/18\_070/0010493) and Czech Science foundation (GAČR)- project  
339 no.19-17868Y). This research was also funded by Project “Campania Oncoterapie” No. B61G18000470007.  
340 Finally, the study was also supported by Cross-Border cooperation Czech-Bavaria –Project No. 41.

341 **Acknowledgments:** N.I., K.S. and K.K. would like to thank the management of VIT University for providing  
342 facilities to carry out this study.

343 **Conflicts of Interest:** The authors declare no conflict of interest.

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