

1 **Methylotroph Natural Product Identification by Inverse Stable Isotopic Labeling**

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20 **Abstract**

21 Natural products are an essential source of bioactive compounds. Isotopic labeling is an effective way to
22 identify natural products that incorporate a specific precursor; however, this approach is limited by the
23 availability of isotopically-enriched precursors. We used an inverse stable isotopic labeling approach to
24 identify natural products by growing bacteria on a ^{13}C -carbon source and then identifying ^{12}C -precursor
25 incorporation by mass spectrometry. We applied this approach to methylotrophs, ecologically important
26 bacteria predicted to have significant yet underexplored biosynthetic potential. We demonstrate this
27 method identifies *N*-acyl homoserine lactone quorum sensing signals produced by diverse methylotrophs
28 grown on three one-carbon compounds. We then apply this approach to simultaneously identify five
29 uncharacterized signals produced by a methylotroph, and link these compounds to their synthases. We
30 envision that this method can identify other classes of natural products synthesized by methylotrophs and
31 other organisms that grow on inexpensive and readily available ^{13}C -carbon sources.
32

33 Introduction

34
35 Natural products are an important source of small molecule therapeutics (Newman and Cragg,
36 2020), agricultural compounds (Cantrell et al., 2012), and other bioactive metabolites. Precursor feeding
37 studies are commonly used to determine the biosynthetic route to a compound of interest, and can also be
38 used to identify previously undetected compounds produced by an organism (Gross et al., 2007; Kinnel et
39 al., 2017; May et al., 2020; Schaefer et al., 2018). However, this approach can be limited by the synthetic
40 or commercial availability of an isotopically enriched precursor. Alternatively, in an inverse stable
41 isotopic labeling approach, a fully ^{13}C -labeled organism is fed a ^{12}C -biosynthetic precursor to identify
42 natural products that incorporate this precursor. This incorporation can be detected by a negative shift in
43 the mass-to-charge ratio (m/z) consistent with incorporation of all or part of the ^{12}C -precursor. With this
44 approach researchers can use any precursor without having to synthesize or purchase a ^{13}C -labeled
45 version. Inverse stable isotopic labeling has been previously used to help determine the biosynthetic
46 origins of the cofactor pyrroloquinoline quinone (Kleef and Duine, 1988) and an isocyanide-containing
47 antibiotic (Brady and Clardy, 2005). However, to our knowledge, this approach has not been used to
48 systematically identify previously uncharacterized natural products.

49 Inverse stable isotopic labeling is particularly well-suited for bacteria that can grow on
50 inexpensive and readily available ^{13}C carbon sources, such as methylotrophs. Methylotrophs are bacteria
51 that grow on reduced compounds with no carbon-carbon bonds, such as methane, methanol, methylamine,
52 and dimethyl sulfide (Chistoserdova et al., 2009). These organisms play important roles in
53 biogeochemical cycling and bioremediation (Nisbet et al., 2014; Singh et al., 2010; Stein and Klotz,
54 2016), as well as plant-microbe interactions (Fedorov et al., 2011). Genomic analysis also predicts that
55 methylotrophs possess the biosynthetic potential to produce myriad natural products that have not yet
56 been identified (Puri, 2019). Identifying and characterizing these molecules can help scientists understand
57 how these important organisms interact with each other and their environment, discover new drug leads,
58 and help synthetic biologists optimize the desirable activities of methylotrophs using exogenous small
59 molecules.

60 A benefit of working with methylotrophs is that ^{13}C -labeled versions of their one-carbon growth
61 substrates are relatively inexpensive. For this reason, a methylotroph was used to create ^{13}C -labeled
62 nucleic acids from ^{13}C -methanol for DNA structural studies by NMR spectroscopy (Batey et al., 1996).
63 Stable isotope labeling experiments have also been repeatedly used to identify active methylotrophs in the
64 environment (Kalyuzhnaya et al., 2008; Radajewski et al., 2000). We sought to take advantage of this
65 benefit to aid in the discovery of methylotroph natural products.

66 As a proof of concept, we applied this method to identify quorum sensing (QS) signals produced
67 by methylotrophs. QS is a form of chemical communication used by bacteria to regulate gene expression
68 in a cell density-dependent manner (Papenfort and Bassler, 2016; Whiteley et al., 2017). In one well-
69 characterized form of QS, Gram-negative proteobacteria use *N*-acyl-homoserine lactones (acyl-HSLs)
70 produced by LuxI-family synthases. Acyl-HSL signals vary in their acyl chain, but all possess a common
71 homoserine lactone derived from methionine via *S*-adenosyl-*L*-methionine (Moré et al., 1996; Schaefer et
72 al., 1996) (Figure 1A). These signals are detected by LuxR-family receptors, which are also transcription
73 factors that regulate gene expression upon signal binding. Methylotrophs often possess QS systems, and
74 several strains have three or more annotated *luxI*-family synthase genes in their genome (Marx et al.,
75 2012; Poonguzhali et al., 2007). The majority of these genes are predicted to encode CoA-utilizing
76 enzymes known to produce noncanonical signals (Liao et al., 2018). However, relatively few
77 methylotroph acyl-HSL signals have been characterized, and many cannot be predicted based on the
78 amino acid sequences of their synthases (Puri, 2019).

79 Acyl-HSL quorum sensing signals are often detected using reporter assays, in which a strain is
80 engineered so that the LuxR-family receptor activates the expression of a reporter gene upon signal
81 binding (Thornhill and McLean, 2018). However, signal detection is dependent on the specificity of the
82 receptor used, which can lead to false negatives. Reporter assays are often paired with thin layer
83 chromatography to correlate detected signals with the retention factors of known standards, which can be

84 inaccurate. Liquid chromatography coupled to tandem mass spectrometry (LC-MS/MS) can also be used
 85 to identify acyl-HSLs based on known fragmentation patterns (Morin et al., 2003; Patel et al., 2016), but
 86 access to these instruments may still limit routine analysis using this method, and fragmentation patterns
 87 may differ for some acyl-HSLs. For example, the aryl-HSL *p*-coumaroyl-HSL does not produce the

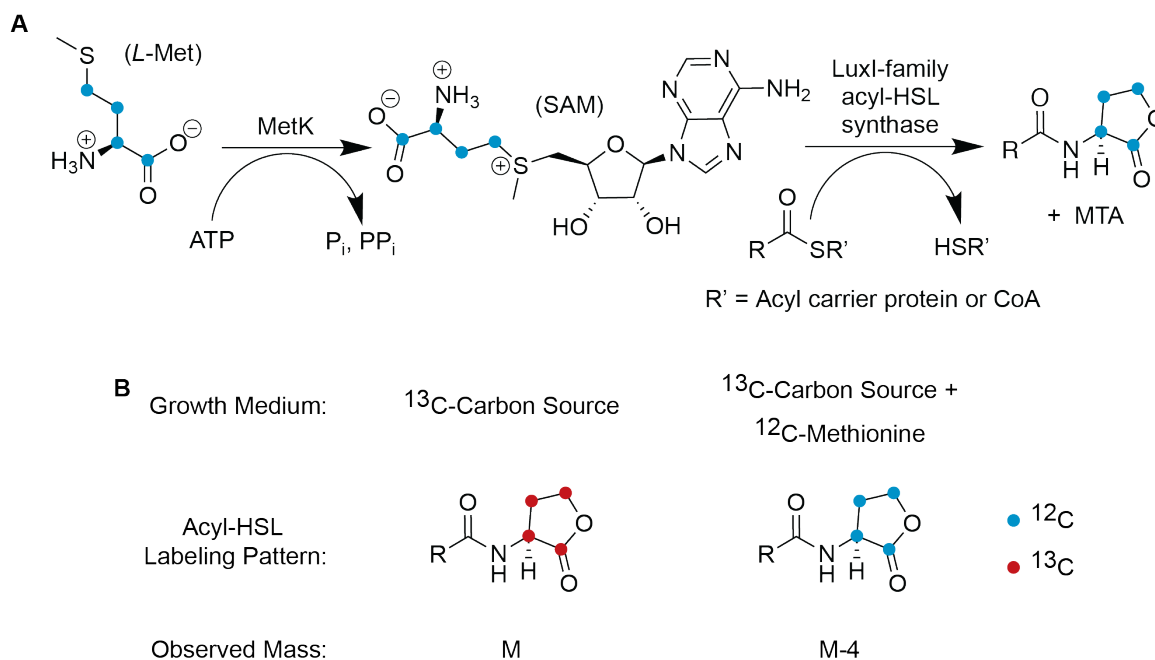


Figure 1. (A) Acyl-HSL biosynthesis incorporates methionine. *L*-Met: *L*-methionine. MetK: *S*-adenosyl-*L*-methionine synthase. SAM: *S*-adenosyl-*L*-methionine. MTA: 5'-methylthioadenosine. (B) The inverse stable isotope labeling approach applied to acyl-HSL signals. Note that the acyl carbonyl carbon is not denoted as ¹²C or ¹³C as it can be derived from endogenous or exogenous sources and therefore may or may not be labeled when an organism is grown on a ¹³C-carbon source.

88 characteristic *m/z* 102 HSL fragment (Schaefer et al., 2008).

89 Detection of methionine incorporation into the common HSL portion of acyl-HSLs is a more
 90 generalizable method that has been successfully used to detect QS signals (Ahlgren et al., 2011; Eberhard
 91 et al., 1991; Lindemann et al., 2011; Schaefer et al., 2018). ¹⁴C-labeled methionine can be used in feeding
 92 studies to indirectly identify signals by comparing radioactivity retention via HPLC to the retention times
 93 (RTs) of known acyl-HSL standards. We sought to build off of this approach by using an inverse stable
 94 isotopic labeling method with ¹²C-methionine to identify QS signals produced by methylotrophs (Figure
 95 1B). We show this method works with three ¹³C-labeled one-carbon sources (methane, methanol, and
 96 methylamine) in two diverse methylotrophs. We then apply the method to simultaneously identify five
 97 QS signals produced by *Methylorubrum rhodinum* DSM2163 (Green and Ardley, 2018), including three
 98 which could not be predicted based on sequence homology to characterized QS systems. Finally, we link
 99 these signals to the synthase genes responsible for their production.

100

101 Results

102

103 *Inverse stable isotopic labeling identifies previously characterized acyl-HSL signals*

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105 To verify the utility of the inverse stable isotopic labeling approach for identifying natural
 106 products, we began by applying it to a methylotroph that produces acyl-HSL signals that have been

107 previously characterized. The methanol-oxidizing *Methylorubrum extorquens* PA1 produces a single
108 LuxI-family signal synthase, MlaI, with 100% amino acid sequence identity to the characterized version
109 found in *Methylorubrum extorquens* AM1 (Marx et al., 2012; Nieto Penalver et al., 2006). Vorholt and
110 coworkers previously demonstrated that MlaI produces two QS signals with unsaturated acyl chains: *N*-
111 (2-*trans*-7-*cis*-tetradecenoyl)-*L*-homoserine lactone (referred to as 2*E*,7*Z*-C_{14:2}-HSL) and *N*-(7-*cis*-
112 tetradecenoyl)-*L*-homoserine lactone (7*Z*-C_{14:1}-HSL) (Nieto Penalver et al., 2006) (Figure 2).
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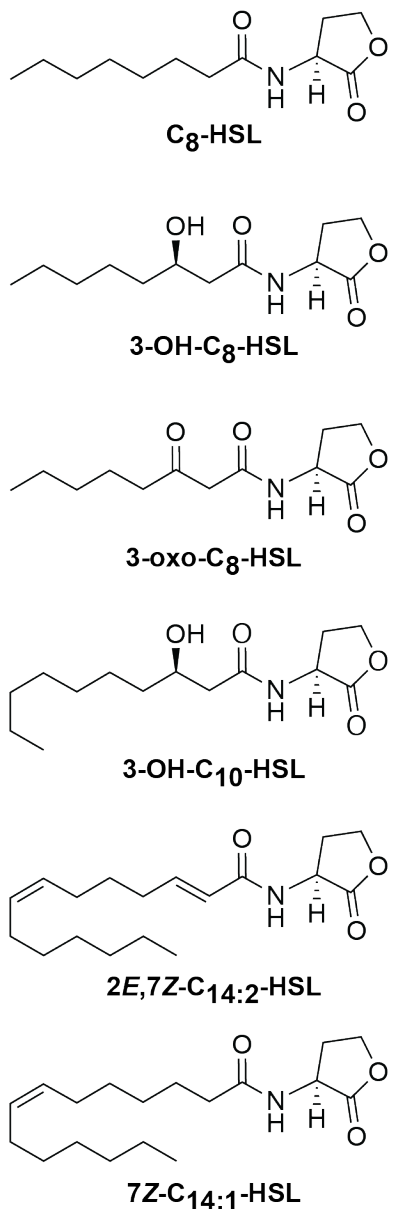


Figure 2. Acyl-HSLs identified in this work. Stereochemistry was not determined and is inferred based on previous studies. All biologically produced acyl-HSLs that have been characterized have homoserine lactones with an *L* stereocenter. The hydroxyls in 3-OH-C₈-HSL and 3-OH-C₁₀-HSL are shown as 3*R* because their synthases are annotated as acyl carrier protein (ACP)-linked (KEGG Orthology term K13060) and these enzymes use acyl-ACPs from fatty acid biosynthesis (Hoang et al., 2002; Val and Cronan, 1998) where the stereoselective β -ketoacyl acyl carrier protein reductase FabG produces 3*R*-OH fatty acyl chains (Volpe and Vagelos, 1976).

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115 In order to streamline the inverse stable isotopic labeling procedure for future screening of
116 diverse bacteria with potentially different growth rates, we chose to add the ¹²C-methionine precursor at
117 the beginning of growth. We grew the *M. extorquens* PA1 Δ *cel* strain CM2730 (referred to as PA1)
118 (Delaney et al., 2013) with ¹³C-methanol and different concentrations of ¹²C-methionine. We extracted the
119 supernatant with acidified ethyl acetate, analyzed the extract by LC-MS, and detected features using the
120 program MZmine2 (Pluskal et al., 2010). We identified two features with *m/z* values of 322 and 324,

121 which correspond to protonated versions of 2*E*,7*Z*-C_{14:2}-HSL and 7*Z*-C_{14:1}-HSL, respectively, that have
 122 incorporated the four carbons of ¹²C-methionine but are otherwise fully ¹³C-labeled (Figure S1 and Table
 123 1). When we cultured PA1 with ¹²C-methanol as a control, we identified features with the same RTs but
 124 with *m/z* values of 308 and 310, which correspond to the protonated ¹²C-versions of 2*E*,7*Z*-C_{14:2}-HSL and
 125 7*Z*-C_{14:1}-HSL, respectively. Together, these results show that the inverse labeling approach can be used to
 126 correctly identify acyl-HSLs.

127 The methionine titration indicated that the optimal concentration of the ¹²C-methionine precursor
 128 was 0.5 mM when added at the beginning of growth (Figure S1). Higher-than-necessary label
 129 concentrations may result in slowed growth or nonspecific incorporation of ¹²C-precursor carbons due to
 130 toxicity or methionine metabolism, respectively. We did not observe any fully ¹³C-labeled acyl-HSLs
 131 using our workflow upon addition of ¹²C-methionine at any concentration we tested. This indicates that
 132 for acyl-HSL natural products it is necessary to include a separate ¹³C-carbon source condition with no
 133 precursor as a benchmark to identify ¹²C-enriched features in the ¹³C-carbon source + ¹²C-methionine
 134 condition.
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Table 1. Identification of acyl-HSL signals using the inverse stable isotopic labeling approach. Max paired *m/z* refers to the maximum feature *m/z* observed in that condition where the desired *m/z* difference of four units was observed compared to the other ¹³C-condition. Note the RT differences between PA1 and DSM2163 for 2*E*,7*Z*-C_{14:2}-HSL and 7*Z*-C_{14:1}-HSL were resolved when smaller injection volumes were used after initial screening (see Figure S3).

Strain	Carbon source	¹² C-carbon source		¹³ C-carbon source		¹³ C-carbon source + ¹² C-methionine		# Pairs detected	Identified Acyl-HSL
		RT (min)	<i>m/z</i>	RT (min)	Max paired <i>m/z</i>	RT (min)	Max paired <i>m/z</i>		
<i>M. extorquens</i> PA1	Methanol	23.0	310	23.0	328	23.1	324	6	7 <i>Z</i> -C _{14:1} -HSL
		22.7	308	22.7	326	22.8	322	5	2 <i>E</i> ,7 <i>Z</i> -C _{14:2} -HSL
	Methylamine	23.1	310	23.1	327	23.2	323	5	7 <i>Z</i> -C _{14:1} -HSL
		22.8	308	22.8	325	22.9	321	5	2 <i>E</i> ,7 <i>Z</i> -C _{14:2} -HSL
<i>M. tundripaludum</i> 21/22	Methane	15.6	272	15.6	286	15.6	282	1	3-OH-C ₁₀ -HSL
<i>M. rhodinum</i> DSM2163	Methanol	22.9	308	22.9	326	22.8	322	5	2 <i>E</i> ,7 <i>Z</i> -C _{14:2} -HSL
		23.2	310	23.2	328	23.1	324	5	7 <i>Z</i> -C _{14:1} -HSL
		12.0	244	12.0	256	12.0	252	4	3-OH-C ₈ -HSL
		15.6	228	15.5	240	15.5	236	3	C ₈ -HSL
		12.7	242	12.7	254	12.7	250	1	3-oxo-C ₈ -HSL

137 In addition to detecting fully ^{13}C -labeled acyl-HSLs in the PA1 culture grown on ^{13}C -methanol
138 without addition of the ^{12}C -precursor, we also detected several features with the same RT but stepwise
139 decreases of one m/z unit. We also identified the same spectral pattern in the ^{13}C -methanol + ^{12}C -
140 methionine condition, but decreased by four m/z units, corresponding to ^{12}C -methionine incorporation
141 (Figure S2). Many methylotrophs in the alphaproteobacteria class, including *M. extorquens*, assimilate
142 reduced one-carbon compounds such as methanol using the serine cycle (Chistoserdova et al., 2009). In
143 the serine cycle, half of the carbon input is derived from carbon dioxide, which we did not label in our
144 system and could therefore result in incomplete ^{13}C -labeling of metabolites of interest. The fact that we do
145 observe fully ^{13}C -labeled acyl-HSLs is likely because ^{13}C -carbon dioxide is rapidly produced by the
146 bacterium's central metabolism. When we grew PA1 on the carbon source ^{13}C -methylamine, we did not
147 identify complete ^{13}C -labeling but this did not affect our ability to identify a decrease of four m/z units
148 corresponding with ^{12}C -methionine incorporation (Table 1) because the extent of acyl-HSL ^{13}C -labeling
149 was consistent between the ^{13}C -methylamine and ^{13}C -methylamine + ^{12}C -methionine conditions.

150 We wrote a Python script to identify pairs of features with matching RTs and a decrease of four
151 m/z units in the ^{13}C -carbon source + ^{12}C -methionine condition compared to the ^{13}C -carbon source condition
152 (see Methods). For the RTs corresponding to *2E,7Z-C*_{14:2}-HSL and *7Z-C*_{14:1}-HSL, our script identifies
153 several pairs of features with the desired m/z difference due to the aforementioned incomplete labeling
154 (Table 1). Notably, out of all the feature pairs identified in the PA1 culture extract, the two acyl-HSL
155 signals have the most identified pairs that correspond with a single feature at the same RT in the ^{12}C -
156 carbon source control (Table S1). We can therefore use this knowledge to prioritize identified features
157 that are more likely to be acyl-HSLs.

158 In order to determine if this method is more broadly applicable, we applied it to the methane-
159 oxidizing bacterium *Methylobacter tundripaludum* 21/22 (21/22), which was previously shown to
160 produce the QS signal *N*-(3-hydroxydecanoyl)-*L*-homoserine lactone (3-OH-*C*₁₀-HSL) (Puri et al., 2017)
161 (Figure 2). When we grew 21/22 with ^{13}C -methane, we identified a feature with an m/z value of 286,
162 corresponding to the protonated and fully ^{13}C -labeled 3-OH-*C*₁₀-HSL. We detected a feature with the
163 same RT and a decrease of four m/z units in the ^{13}C -methane + ^{12}C -methionine condition (Table 1),
164 indicating ^{12}C -methionine incorporation. These results show that this method can be broadly applied, as it
165 works with the methane-oxidizing gammaproteobacterium 21/22 as well as the methanol- and
166 methylamine-oxidizing alphaproteobacterium PA1.

167
168 *Simultaneous identification of five acyl-HSL signals produced by the methylotroph M. rhodinum*
169 *DSM2163*

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171 Next, we applied the inverse stable isotopic labeling method to identify the signals produced by
172 the methanol-oxidizer *M. rhodinum* DSM2163 (DSM2163), which possesses three predicted LuxI-family
173 acyl-HSL synthases. A previous study used a reporter assay to speculate which acyl-HSL signals are
174 produced by this strain, but the exact signals were not identified (Poonguzhali et al., 2007). We identified
175 several features with the signature decrease of four m/z units when DSM2163 was grown on ^{13}C -methanol
176 + ^{12}C -methionine compared to ^{13}C -methanol alone. Three of these features corresponded to the signals *N*-
177 octanoyl-*L*-homoserine lactone (*C*₈-HSL), *N*-(3-hydroxyoctanoyl)-*L*-homoserine lactone (3-OH-*C*₈-HSL),
178 and *N*-(3-oxooctanoyl)-*L*-homoserine lactone (3-oxo-*C*₈-HSL) (Figure 2 and Table 1), which we
179 confirmed by high-resolution mass spectrometry (Table S2) as well as by verifying these compounds have
180 identical LC-MS retention times to commercial standards (Figures S3A-C).

181 Our method also identified features in the DSM2163 culture corresponding to the signals *2E,7Z-*
182 *C*_{14:2}-HSL and *7Z-C*_{14:1}-HSL, and these signals had identical LC-MS retention times (Figures S3D and
183 S3E) and high-resolution MS/MS spectra (Table S3) compared to the signals produced by PA1. This is
184 consistent with the fact that one of the DSM2163 acyl-HSL synthases shares 91% amino acid identity
185 with MlaI from PA1. We were therefore able to use the inverse labeling method to simultaneously
186 identify a total of five acyl-HSL QS signals produced by the methylotroph DSM2163.

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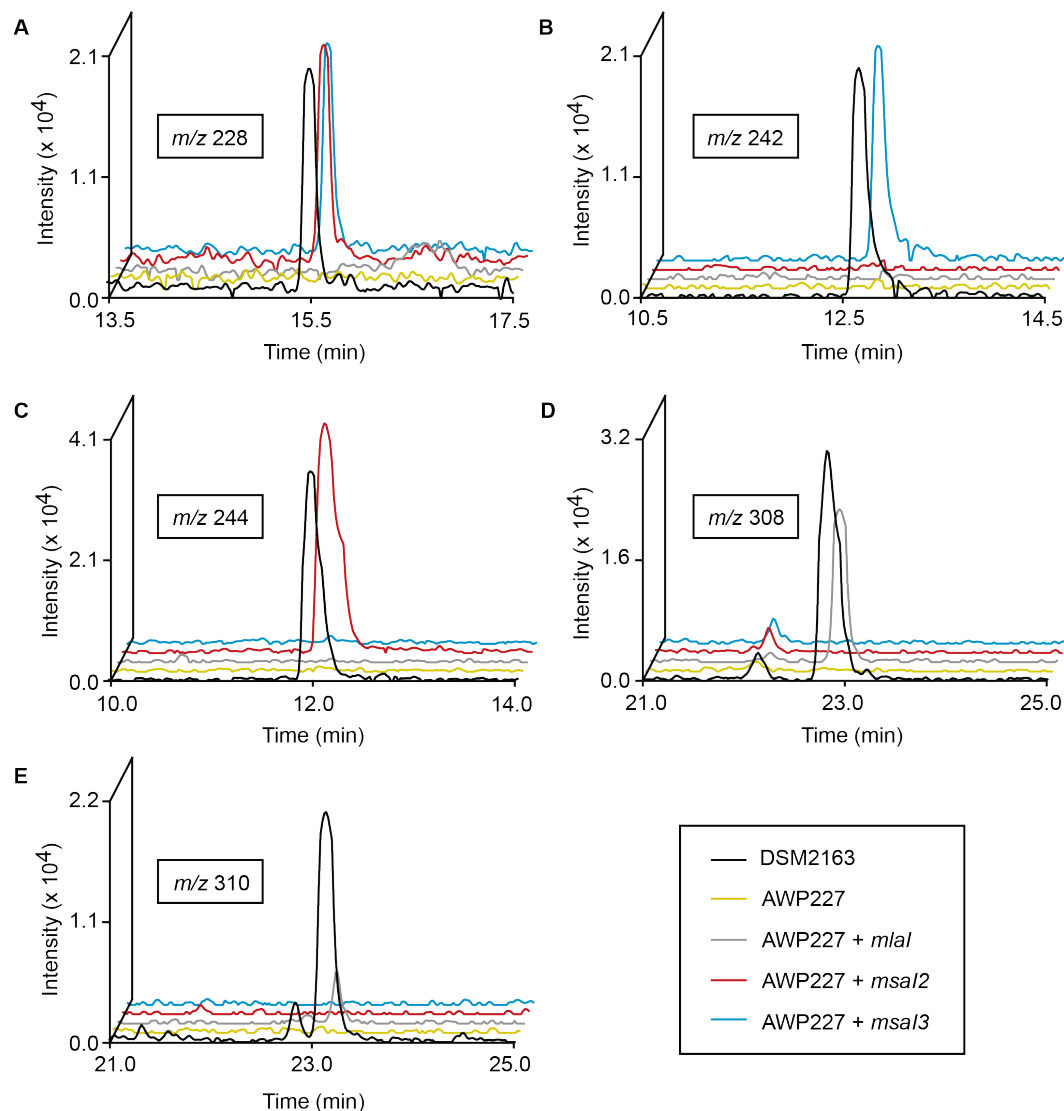


Figure 3. Linking *M. rhodinum* DSM2163 LuxI-family acyl-HSL synthases with their products. Extracted ion chromatograms of supernatant extracts for the listed strains for the listed *m/z* ranges (A) 228.0-228.5, corresponding to C₈-HSL, (B) 242.0-242.5, corresponding to 3-oxo-C₈-HSL, (C) 244.0-244.5, corresponding to 3-OH-C₈-HSL, (D) 308.0-308.5, corresponding to 2*E*,7*Z*-C_{14:2}-HSL, and (E) 310.0-310.5, corresponding to 7*Z*-C_{14:1}-HSL.

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Heterologous expression links acyl-HSL signals with their synthases

Finally, we constructed a strain for heterologous expression of *luxI*-family acyl-HSL synthase genes to link synthases with their signal products. We created an unmarked deletion strain of PA1 called AWP227 that no longer produces acyl-HSL signals by knocking out the acyl-HSL receptor gene *mlaR* and the synthase gene *mlaI*. We then used AWP227 to express each of the three DSM2136 synthase genes separately on a plasmid to determine which signals are produced by each synthase.

198 When we heterologously expressed the DSM2163 synthase gene Ga0373200_3300, we observed
199 features corresponding to production of C₈-HSL (Figure 3A) and 3-oxo-C₈-HSL (Figure 3B) that were not
200 present in the no-plasmid AWP227 control. Heterologous expression of Ga0373200_1920 also resulted in
201 production of C₈-HSL (Figure 3A), as well as 3-OH-C₈-HSL (Figure 3C). We also confirmed that the
202 synthase with 91% amino acid identity to MlaI (Ga0373200_956) produces the signals 2E,7Z-C_{14:2}-HSL
203 and 7Z-C_{14:1}-HSL (Figures 3D and 3E). All gene locus tags refer to the Joint Genome Institute Integrated
204 Microbial Genomes & Microbiomes data management system (JGI IMG/M) (Chen et al., 2021). Vorholt
205 and coworkers previously named a LuxI-family synthase that produces *N*-hexanoyl-*L*-homoserine lactone
206 (C₆-HSL) and C₈-HSL MsaI for *Methylobacterium* short-chain acyl-HSLs (Nieto Penalver et al., 2006).
207 We therefore name Ga0373200_1920 MsaI2 and Ga0373200_3300 MsaI3 based on our results, and also
208 refer to Ga0373200_956 as MlaI in *M. rhodinum* DSM2163.

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210 Discussion

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212 We used an inverse stable isotopic labeling approach to rapidly identify acyl-HSL natural
213 products made by methylotrophic bacteria. This method was effective using three different ¹³C-one-
214 carbon sources (methane, methanol, and methylamine) and for diverse methylotrophs including both a
215 methane-oxidizing gammaproteobacterium and two species of alphaproteobacteria. Together these results
216 show the broad applicability of this method for identifying natural products by growing different bacteria
217 on a ¹³C-carbon source and feeding readily available ¹²C-precursors.

218 The inverse stable isotopic labeling method can be applied in the future to identify other classes
219 of natural products based on a common precursor, including those which may not be readily available in
220 an isotopically labeled form. Feeding studies using isotopically enriched precursors are extremely
221 widespread, and the inverse stable isotopic labeling method is applicable in any situation where a
222 traditional method can be used. However, this method is especially well-suited for organisms that grow
223 on inexpensive ¹³C-carbon sources, including methanotrophs and autotrophs such as cyanobacteria, which
224 are known to have significant biosynthetic potential (Dittmann et al., 2015).

225 A strength of stable isotopic labeling is that it can be performed using unit-resolution mass
226 spectrometers, which are widely available to researchers for routine analysis. This approach complements
227 existing LC-MS/MS based methods for acyl-HSL identification, as fragmentation patterns may change
228 based on signal structure. Notably, the characteristic *m/z* 102 HSL fragment was not one of the top twenty
229 signals detected in the tandem mass spectra of 2E,7Z-C_{14:2}-HSL, likely because it contains an α , β
230 unsaturated acyl chain (Table S3). More broadly, the inverse stable isotopic labeling approach can also be
231 applied using LC-MS/MS and techniques such as feature-based molecular networking (Klitgaard et al.,
232 2015; Nothias et al., 2020) to identify precursor incorporation into specific molecular fragments. The
233 combination of these techniques in the future will enable researchers to gain richer information about
234 identified natural products early in the discovery process.

235 The increase in metagenomic sequencing of microbial communities has led to an increased
236 demand for predicting how these organisms interact in the environment. Methods for rapidly determining
237 the QS signal(s) produced by an organism enable researchers to link these compounds to specific gene
238 sequences, and in turn to hypothesize how these bacteria are interacting *in situ*. The acyl-HSL signals
239 produced by MsaI2 and MsaI3 could not be predicted on the basis of amino acid sequence alone. MsaI2
240 shares only 58% amino acid identity with RaiI from *Rhizobium etli* ISP42, which was reported to produce
241 C₈-HSL and 3-OH-C₈-HSL (Pérez-Montaña et al., 2011). MsaI3 does not share >50% amino acid identity
242 with any currently characterized LuxI-family synthases. During heterologous expression of MsaI2 and
243 MsaI3 we determined that both synthases produce significant amounts of C₈-HSL (Figures 3 and S3). It is
244 therefore unclear if one or both of these synthases are responsible for the C₈-HSL detected in the
245 DSM2163 culture. Together, these annotations will aid in the future prediction of QS signal production
246 from bacterial genome sequences. Furthermore, our heterologous expression strain can be used in the
247 future to identify QS signals produced by synthases from non-methylotrophic species using the inverse
248 labeling approach.

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Significance

Natural products are a vetted source of bioactive compounds with medicinal and agricultural value. Isotopic labeling is often used to identify and characterize natural products, however the labeled precursors required for these studies can be difficult to obtain commercially or synthetically. Here we use an inverse stable isotopic labeling approach to identify natural products via incorporation of unlabeled precursors, which significantly expands precursor availability for natural product studies. This approach is broadly applicable to bacteria that grow on inexpensive labeled carbon sources such as methylotrophs, and can be used to rapidly identify natural products known to incorporate a particular precursor.

260 **Methods**

261

262 *Key Reagents*

263 ¹³C-labeled methanol, methane, and methylamine were purchased from Cambridge Isotope Laboratories.
264 C₈-HSL was purchased from Millipore Sigma. All other acyl-HSLs were purchased from Cayman
265 Chemical.

266

267 *Routine bacterial culturing*

268 Strains used in this study are listed in Table S4. *Escherichia coli* strains were grown in lysogeny broth
269 (LB) at 37°C. *M. extorquens* PA1 and *M. rhodinum* DSM2163 were grown at 30 °C in modified
270 ammonium mineral salts (AMS) medium (Whittenbury et al., 1970), with the addition of 0.1% (m/v)
271 yeast extract for strain DSM2163. AMS contains 0.2 g/L MgSO₄·7H₂O, 0.2 g/L CaCl₂·6H₂O, 0.5 g/L
272 NH₄Cl, 30 μM LaCl₃, and 1X trace elements. 500X trace elements contains 1.0 g/L Na₂-EDTA, 2.0 g/L
273 FeSO₄·7H₂O, 0.8 g/L ZnSO₄·7H₂O, 0.03 g/L MnCl₂·4H₂O, 0.03 g/L H₃BO₃, 0.2 g/L CoCl₂·6H₂O, 0.6 g/L
274 CuCl₂·2H₂O, 0.02 g/L NiCl₂·6H₂O, and 0.05 g/L Na₂MoO₄·2H₂O. Final concentrations of 4 mM
275 phosphate buffer pH 6.8 and 50 mM ¹²C- or ¹³C-methanol were added prior to use and cultures were
276 shaken at 200 rpm. *M. tundripaludum* 21/22 was grown in modified nitrate mineral salts (NMS) medium
277 (Whittenbury et al., 1970), which is the same as AMS with 1 g/L KNO₃ substituted for the NH₄Cl. *M.*
278 *tundripaludum* 21/22 was cultured at room temperature (22-24°C) in an atmosphere of 50% (v/v) methane
279 in air. For routine culturing, plates were incubated in sealed jars while liquid cultures were grown in 18-
280 by 150-mm tubes sealed with rubber stoppers and aluminum seals shaken at 200 rpm.

281

282 *Plasmid construction*

283 Plasmids used in this study are listed in Table S5. Primers used in this study are listed in Table S6. All
284 plasmids were constructed using Gibson Assembly (Gibson et al., 2009) and selection was performed
285 with kanamycin (50 μg/mL) both in *E. coli* and *M. extorquens* PA1 strains.

286

287 *Genetic manipulation*

288 Genetic manipulation of strain PA1Δ*cel* (CM2730) and the derivative strain AWP227 was performed at
289 30°C. Verified plasmids were conjugated into these strains using the *E. coli* donor S17-1 (Simon et al.,
290 1983). 500 μL of exponentially growing cultures (OD 0.4-0.6) of the donor and recipient strains were
291 pelleted at 16,100 rcf for one minute and resuspended in 500 μL sterile ultrapure H₂O. These strains were
292 then pelleted again and the two pellets were combined in a total volume of 50 μL sterile ultrapure H₂O.
293 Next, the entire mixture was spotted onto an AMS agar plate containing 50 mM methanol and 10% (v/v)
294 nutrient broth and incubated for two days. Successful conjugants were selected on AMS plates containing
295 kanamycin (50 μg/mL). To construct the unmarked deletion mutant AWP227, kanamycin-resistant
296 integrants (single crossovers) were restreaked and then plated on an AMS plate containing 50 mM
297 methanol and 1% (m/v) sucrose for counterselection. The resulting colonies were screened for double
298 crossovers by kanamycin sensitivity and colony PCR before the final mutant was verified by Sanger
299 sequencing.

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301 *Inverse labeling experiments*

302 Exponentially growing bacterial cultures were pelleted at 16,100 rcf for one minute and resuspended in
303 growth medium with no carbon source. Subsequently, three separate six milliliter cultures were
304 inoculated with the resuspended strain at a starting OD of 0.02. The ¹²C-carbon source was added to one
305 culture, the ¹³C-carbon source to the second, and the ¹³C-carbon source plus 500 nM ¹²C-methionine to
306 the last culture. The carbon sources used were 50 mM methanol, 50 mM methylamine, or 50% (v/v)
307 methane. Cultures were grown until reaching stationary phase (OD of approximately 0.8) and then were
308 centrifuged at 4,800 rcf for ten minutes. The resulting supernatant was extracted twice with an equal
309 volume of ethyl acetate containing 0.01% acetic acid, and the combined organic extract was evaporated to
310 dryness using a nitrogen stream and stored at -20°C until analysis by LC-MS.

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LC-MS for acyl-HSL signal detection

Dried culture supernatant extracts were resuspended in 200 microliters of 1:1 water:acetonitrile, and subsequently 65 microliters were injected onto an Agilent 1260 Infinity liquid chromatography system connected to an Agilent 6120 single quadrupole mass spectrometer operating with positive polarity and a mass range of 150-1500 *m/z*. A Waters Xselect HSS T3 column (2.5 μ m particle size, 2.1 mm x 50 mm) held at 30 °C was used for reverse phase separation with a flow rate of 0.4 mL/min. Solvent A: Water + 0.1 % formic acid, Solvent B: Acetonitrile + 0.1% formic acid. Gradient: 0-2 min, 0% B. 2-32 min, 0-100% B. 32-35 min, 100% B. 35-36 min, 100-0% B. 36-38 min, 0% B. The limit of detection for known standards on this setup was 125 nM (Figure S4), which corresponds to a limit of approximately 5 nM in the original bacterial culture.

LC-MS analysis

Raw data files in netCDF format were exported using Agilent OpenLab CDS (rev C.01.07). Features were detected using MZmine version 2.53 (Pluskal et al., 2010) using the following workflow: 1. Mass detection (centroid, noise level 1.0E3). 2. ADAP chromatogram builder (minimum group size 5 scans, group intensity threshold 1.0E3, min highest intensity 5.0E3), *m/z* tolerance 0.3) (Myers et al., 2017). 3. Chromatogram deconvolution (local minimum search, chromatogram threshold 30%, search minimum 0.1 min, minimum relative height 10%, minimum absolute height 6.0E3, minimum ratio of peak top/edge 2, peak duration 0-2 min). 4. Adduct search (RT tolerance 0.1 min, adducts [M+Na-H] and [M+NH₃] selected, *m/z* tolerance 0.2, max relative peak height 200%). 5. Feature list rows filter (remove identified adducts). Subsequently, isotopes were removed from ¹²C samples using the Isotopic peaks grouper (*m/z* tolerance 0.2, retention time tolerance 0.1 min, monotonic shape required, maximum charge 3, representative isotope most intense), and the three feature lists were aligned in the order ¹³C-carbon source + ¹²C-methionine, ¹²C-carbon source, ¹³C-carbon source using the Join aligner (*m/z* tolerance 0.3, weight of *m/z* 50, retention time tolerance 0.1 min, weight for retention time 50). The alignment was exported in .csv format with the row retention time as a common element and peak *m/z* as the data file element. Features containing the desired four *m/z* unit difference in the ¹³C-carbon source and ¹³C-carbon source + ¹²C-methionine samples were then detected using a custom Python script (available at <https://github.com/purilab/inverse>).

HRMS

Mass spectrometry data were collected using a Waters Acquity I-class ultra-high pressure liquid chromatograph coupled to a Waters Xevo G2-S quadrupole time-of-flight mass spectrometer. An Acquity UPLC BEH C18 column (2.1 x 50 mm) was used for separation and resolving samples. Solvent A: Water + 0.1 % formic acid, Solvent B: Acetonitrile + 0.1% formic acid. The sample was eluted from the column using a ten minute linear solvent gradient: 0-0.1 min, 1% B; 0.1 - 10 min, 100% B. The solvent flow rate was 0.45 mL per minute. Mass spectra were collected in positive ion mode, with following parameters: 3 kV capillary voltage; 25 V sampling cone voltage; 150 °C source temperature; 500 °C desolvation temperature; nitrogen desolvation at 800 L/hr. The fragmentation spectra were collected using the same parameters with a 10-25 eV collision energy ramp. The lockspray solution was 200 pg/ μ L leucine enkephalin. The lockspray flow rate was 6 μ L/min. Sodium formate was used to calibrate the mass spectrometer. The acquired mass spectra were processed using Masslynx 4.1 software.

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368 **Author Contributions**

369

370 AWP and DAC designed the experiments. DAC, AIS, and AWP performed the experiments. AWP wrote
371 the manuscript. AWP and DAC edited the manuscript. All authors read and approved of the final version
372 of the manuscript.

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375 **Conflicts of Interest**

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377 The authors declare no conflicts of interest.

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379 **References**

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