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# Title

Fatty Acid and Alcohol Metabolism in Pseudomonas putida: Functional Analysis Using Random Barcode Transposon Sequencing.

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# **Authors**

Thompson, Mitchell G Incha, Matthew R Pearson, Allison N <u>et al.</u>

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# 1 Functional analysis of the fatty acid and alcohol metabolism of *Pseudomonas putida* using

# 2 **RB-TnSeq**

- 3 Mitchell G. Thompson<sup>1,2,3\*</sup>, Matthew R. Incha<sup>1,2,4\*</sup>, Allison N. Pearson<sup>1,2,4\*</sup>, Matthias
- 4 Schmidt<sup>1,2,5</sup>, William A. Sharpless<sup>1,2</sup>, Christopher B. Eiben<sup>1,2,6</sup>, Pablo Cruz-Morales<sup>1,2,7</sup>,
- 5 Jacquelyn M. Blake-Hedges<sup>1,2,8</sup>, Yuzhong Liu<sup>1,2</sup>, Catharine A. Adams<sup>2</sup>, Robert W. Haushalter<sup>1,2</sup>,
- 6 Rohith N. Krishna<sup>1,2</sup>, Patrick Lichtner<sup>1,2</sup>, Lars M. Blank<sup>5</sup>, Aindrila Mukhopadhyay<sup>1,2</sup>, Adam M.
- 7 Deutschbauer<sup>4,9</sup>, Patrick M. Shih<sup>1,2,3,10#</sup>, Jay D. Keasling<sup>1,2,6,11,12,13,14#</sup>
- 8
- 9 <sup>1</sup>Joint BioEnergy Institute, 5885 Hollis Street, Emeryville, CA 94608, USA.
- <sup>2</sup>Biological Systems & Engineering Division, Lawrence Berkeley National Laboratory, Berkeley,
   CA 94720, USA.
- <sup>3</sup>Department of Plant Biology, University of California, Davis, CA 95616, USA
- <sup>4</sup>Department of Plant and Microbial Biology, University of California, Berkeley, CA 94720,
- 14 USA
- <sup>5</sup>Institute of Applied Microbiology-iAMB, Aachen Biology and Biotechnology-ABBt, RWTH
- 16 Aachen University, Aachen, Germany
- <sup>6</sup>Joint Program in Bioengineering, University of California, Berkeley/San Francisco, CA 94720,
   USA
- <sup>7</sup>Centro de Biotecnología FEMSA, Instituto Tecnológico y de Estudios superiores de Monterrey,
   México
- 21 <sup>8</sup>Department of Chemistry, University of California, Berkeley, CA 94720, USA
- <sup>9</sup>Environmental Genomics and Systems Biology Division, Lawrence Berkeley National
- 23 Laboratory, Berkeley, California, USA
- <sup>10</sup>Environmental and Genomics and Systems Biology Division, Lawrence Berkeley National
- 25 Laboratory, Berkeley, CA 94720, USA.
- 26 <sup>11</sup>Department of Chemical and Biomolecular Engineering, University of California, Berkeley,
- 27 CA 94720, USA
- 28 <sup>12</sup>Institute for Quantitative Biosciences, University of California, Berkeley, CA 94720, USA
- 29 <sup>13</sup>The Novo Nordisk Foundation Center for Biosustainability, Technical University of Denmark,
- 30 Denmark
- 31 <sup>14</sup>Center for Synthetic Biochemistry, Institute for Synthetic Biology, Shenzhen Institutes for
- 32 Advanced Technologies, Shenzhen, China
- 33
- 34 \*Authors contributed equally
- 35
- 36 #Co-corresponding authors
- 37 Jay D. Keasling, jdkeasling@lbl.gov
- 38 Patrick M. Shih, pmshih@lbl.gov
- 39

40

42 ABSTRACT

43 With its ability to catabolize a wide variety of carbon sources and a growing engineering toolkit, Pseudomonas putida KT2440 is emerging as an important chassis organism for 44 45 metabolic engineering. Despite advances in our understanding of this organism, many gaps 46 remain in our knowledge of the genetic basis of its metabolic capabilities. These gaps are 47 particularly noticeable in our understanding of both fatty acid and alcohol catabolism, where many paralogs putatively coding for similar enzymes co-exist making biochemical assignment 48 via sequence homology difficult. To rapidly assign function to the enzymes responsible for these 49 50 metabolisms, we leveraged Random Barcode Transposon Sequencing (RB-TnSeq). Global 51 fitness analyses of transposon libraries grown on 13 fatty acids and 10 alcohols produced strong 52 phenotypes for hundreds of genes. Fitness data from mutant pools grown on varying chain length 53 fatty acids indicated specific enzyme substrate preferences, and enabled us to hypothesize that DUF1302/DUF1329 family proteins potentially function as esterases. From the data we also 54 55 postulate catabolic routes for the two biogasoline molecules isoprenol and isopentanol, which are 56 catabolized via leucine metabolism after initial oxidation and activation with CoA. Because fatty 57 acids and alcohols may serve as both feedstocks or final products of metabolic engineering 58 efforts, the fitness data presented here will help guide future genomic modifications towards 59 higher titers, rates, and yields.

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#### 65 **IMPORTANCE**

To engineer novel metabolic pathways into *P. putida*, a comprehensive understanding of the genetic basis of its versatile metabolism is essential. Here we provide functional evidence for the putative roles of hundreds of genes involved in the fatty acid and alcohol metabolism of this bacterium. These data provide a framework facilitating precise genetic changes to prevent product degradation and channel the flux of specific pathway intermediates as desired.

71

#### 72 INTRODUCTION

73 Pseudomonas putida KT2440 is an important metabolic engineering chassis, which can 74 readily metabolize compounds derived from lignocellulosic and plastic derived feedstocks (1-3), 75 and has an ever-growing repertoire of advanced tools for genome modification (4-7). Its upper 76 glycolytic pathway architecture enables *P. putida* to natively generate large amounts of reducing 77 equivalent (8), and it more robustly withstands metabolic burdens than many other frequently 78 used host organisms (9). To date, a wide variety of products have been produced through 79 metabolic engineering of *P. putida*, including valerolactam (10), curcuminoids (11), diacids (12), 80 methyl-ketones (13), rhamnolipids (14), cis,cis-muconic acid (15), and many others (16). Recent 81 advances in genome-scale metabolic modeling of P. putida make engineering efforts more 82 efficient (7, 17). However, a large gap still exists between genes predicted to encode enzymatic 83 activity and functional data to support these assumptions. Recent characterizations of enzymes 84 and transporters involved in the catabolism of lysine (12, 18), levulinic acid (19), and aromatic compounds (20) highlight the need to continue functionally probing the metabolic capabilities of 85 86 *P. putida*, because its native catabolism can consume many target molecules and dramatically 87 impact titers.

88 Amongst the most important metabolisms not yet rigorously interrogated via omics-level 89 analyses are fatty acid and alcohol degradation. Recently, fatty acids have been shown to be a 90 non-trivial component of some feedstock streams (1) and, depending on their chain length, serve 91 as high-value target molecules (21). Furthermore, intermediates in beta-oxidation can be 92 channeled towards mega-synthases to produce more complex molecules (22), or used in reverse 93 beta-oxidation to produce compounds such as medium chain n-alcohols (23). However, 94 assigning the genetic basis of fatty acid degradation is complicated by the presence of multiple homologs of the individual fad genes encoded in the genome of P. putida KT2440 (17, 24). 95 96 Although work has been done to either biochemically or genetically demonstrate the substrate 97 specificity of some individual *fad* genes, the majority of these homologs still have no functional 98 data associated with them.

99 *P. putida* is also able to oxidize and catabolize a wide variety of alcohols. Much work has 100 focused on the unique biochemistry and regulation of two pyrroloquinoline quinone (PQQ)-101 dependent alcohol dehydrogenases (ADH), *pedE* and *pedH*, which exhibit broad substrate 102 specificity for both alcohols and aldehydes (25, 26). Specific work has also investigated the 103 suitability of *P. putida* for the production of ethanol (27) and the genetic basis for its ability to 104 catabolize butanol and 1,4-butanediol (28-30). P. putida is also known for its ability to tolerate 105 solvents and alcohols, making it an attractive host for their industrial production (31, 32). 106 Tolerance to these compounds is a product of both robust efflux pumps (31) and the ability of 107 some strains, such as *P. putida* mt-2, to catabolize a range of organic compounds (33). Metabolic 108 engineering has biologically produced a diverse range of alcohols with a wide array of industrial 109 and commercial uses (34–36). As more alcohol synthesis pathways are engineered into P. putida, a more complete understanding of the molecular basis of its catabolic capacities will be requiredto achieve high-titers.

112 A recent surge in omics-level data has revealed much about the metabolism of P. putida, 113 with adaptive evolution (30), proteomics (10, 28, 29), and <sup>13</sup>C flux analysis (37–39) yielding 114 valuable insights. An approach that has proven to be particularly powerful is Random Barcode 115 Transposon Sequencing (RB-TnSeq) (40, 41). RB-TnSeq allows rapid and inexpensive genome-116 wide profiling of individual gene fitness in various conditions, and has been used in *P. putida* to 117 identify numerous novel metabolic pathways and aid in increasing titers of the polymer precursor 118 valerolactam (10, 11, 18–20). RB-TnSeq improves over other TnSeq-based techniques by 119 introducing a random nucleotide barcode into the transposon which is flanked by conserved 120 primer binding sites (40). After one initial round of TnSeq to map the transposon insertion within 121 the genome which also associates that insertion site with a barcode, all subsequent mutant 122 abundance quantification can be performed using standard barcode counting via Illumina 123 sequencing of PCR product from the conserved priming sites (40). This advance reduces the cost 124 per experiment, as well as greatly speeding up processing time required to conduct genome-wide 125 fitness experiments (40). Here, we leverage RB-TnSeq to interrogate the genetic basis for the 126 catabolism of multiple fatty acids and alcohols to develop an evidence-based understanding of 127 the enzymes and pathways utilized in these metabolisms.

128

#### **129 RESULTS AND DISCUSSION**

130 <u>Global Analysis of Fatty Acid Metabolism</u>. To characterize the genetic basis of fatty acid

131 metabolism in *P. putida*, barcoded transposon mutant libraries were grown in minimal media

132 with straight chain fatty acids (C3-C10, C12, and C14), fatty esters (Tween20 and butyl stearate),

and an unsaturated fatty acid (oleic acid) as sole carbon sources. An overview of sample
collection is provided in Figure 1A. Pearson correlation analyses of global fitness patterns
revealed that the metabolisms of straight chain fatty acids between C7 and C14 clade together,
suggesting similar overall catabolic routes (Figure 1B). Oleic acid, an 18-carbon
monounsaturated fatty acid, also grouped within this clade. Shorter chain fatty acids ( <c7) did<="" td=""></c7)>
not show high correlation to one another based on global fitness analyses, suggesting more
independent routes of catabolism (Figure 1B). Annotations in the BioCyc database, functional
assignment from a recent metabolic model of <i>P. putida</i> KT440 ( <i>i</i> JN1462), and previous <i>in vitro</i>
biochemical work predict the existence of several enzymes in the genome of the bacterium that
may be putatively involved in fatty acid catabolism: six acyl-CoA ligases, seven acyl-CoA
dehydrogenases, seven enoyl-CoA hydratases, four hydroxyacyl-CoA dehydrogenases, and five
thiolases (Figure 2) (17, 24, 42). Our data show discrete fitness patterns for the steps of beta-
oxidation that appear to be largely dictated by chain length (Figure 2).
When grown on fatty acids, many bacteria require the anaplerotic glyoxylate shunt to
avoid depleting TCA cycle intermediates during essential biosynthetic processes. In P. putida,
the two steps of the glyoxylate shunt are encoded by PP_4116 (aceA - isocitrate lyase) and
PP_0356 (glcB - malate synthase). Transposon mutants in both of these genes showed serious
fitness defects (fitness score < -3) when grown on nearly all of the fatty acids tested ( <b>Figure 2</b> ).
However, the glyoxylate shunt genes appeared dispensable for growth on valerate (C5), and
showed a more severe fitness defect when grown on heptanoate (C7). Complete beta-oxidation
of valerate and heptanoate results in ratios of propionyl-CoA to acetyl-CoA of 1:1 and 1:2,
respectively. This higher ratio of 3-carbon to 2-carbon production presumably offers an alternate
means to replenish TCA cycle intermediates in the absence of a glyoxylate shunt (Figure 2).

156	In order to utilize the propionyl-CoA generated by beta-oxidation of odd-chain fatty
157	acids, bacteria often employ the methylcitrate cycle (MCC), producing succinate and pyruvate
158	from oxaloacetate and propionyl-CoA. In P. putida, the MCC is catalyzed via methylcitrate
159	synthase ( <i>prpC</i> - PP_2335), 2-methylcitrate dehydratase ( <i>prpD</i> - PP_2338, or <i>acnB</i> - PP_2339),
160	aconitate hydratase ( <i>acnB</i> - PP_2339, or <i>acnA2</i> - PP_2336), and 2-methylisocitrate lyase ( <i>mmgF</i>
161	- PP_2334) (Supplementary Figure 1). Unsurprisingly, the MCC appeared to be absolutely
162	required for growth on propionate (C3), valerate (C5), heptanoate (C7), and nonanoate (C9),
163	with PP_2334, PP_2335, and PP_2337 (a putative AcnD-accessory protein) showing severe
164	fitness defects (Figure 2, Supplementary Figure 1). While PP_2338 (prpD) encodes for a 2-
165	methylcitrate dehydratase, transposon mutants showed no fitness defects when grown on odd-
166	chain fatty acids. This reaction is likely carried out by PP_2339 (acnB - a bifunctional 2-
167	methylcitrate dehydratase/aconitase hydratase B); however, there were no mapped transposon
168	insertions for this gene (Figure 2, Supplementary Figure 1). This suggests that PP_2339 was
169	essential during the construction of the RB-TnSeq library. Furthermore, PP_2336 showed
170	relatively modest fitness defects when grown on propionate and other odd-chain fatty acids,
171	suggesting that PP_2339 likely accounts for much of the methylaconitate hydratase activity as
172	well (Figure 2, Supplementary Figure 1).
173	

Long and Medium Chain Fatty Acid Catabolism. Pearson correlation analysis of fitness data
indicated that both long and medium chain fatty acids are likely catabolized via similar
pathways. Fitness data suggests that FadD1 (PP\_4549) catalyzes the initial CoA-ligation of C7 to
C18 fatty acids, and may potentially act on C6 as well (Figure 2). Disruption of *fadD2*(PP 4550) did not cause fitness defects as severe as those seen in *fadD1* mutants, although it did

179 result in moderate fitness defects when grown on C8-C10 fatty acids. These data are consistent 180 with the biochemical characterization of FadD1 from P. putida CA-3, which showed greater 181 activity on longer chain alkanoic and phenylalkanoic acids than on shorter chain substrates (43). 182 For fatty acids with chain lengths of C10 and greater, the data suggest that the *fadE* homolog 183 PP 0368 is the primary acyl-coA dehydrogenase, while the nearby *fadE* homolog PP 0370 184 appears to be preferred for C6-C8 fatty acids (Figure 2). A relatively even fitness defect for 185 these two fadE homologs indicates that PP 0368 and PP 0370 may have equal activity on 186 nonanoate (Figure 2). These data are supported by a previous biochemical characterization of 187 PP 0368, in which it showed greater activity on chain lengths longer than C9 (44). The fadB 188 homolog PP 2136 showed severe fitness defects when grown on all fatty acids with chain 189 lengths of C6 and longer, implicating it as the primary enoyl-CoA hydratase/3-hydroxy-CoA 190 dehydrogenase for those substrates (Figure 2). P. putida was able to grow on the unsaturated 191 substrate oleic acid, and is likely able to isomerize the position of the unsaturated bond via the 192 enoyl-CoA isomerase PP 1845, which showed specific fitness defects when grown on oleic acid 193 (Figure 2). P. putida's primary long chain thiolase appears to be the fadA homolog PP 2137, 194 which showed severe to moderate fitness defects when grown on fatty acids with chain lengths 195 C8 or longer (Figure 2). Fitness data for mutant pools grown on heptanoate showed minor 196 fitness defects for both PP 2137 and PP 3754 (bktB), suggesting that both thiolases may work 197 on C7 substrates (Figure 2). 198 Both long chain fatty esters tested (Tween 20 and butyl stearate) appeared to utilize the

Both long chain fatty esters tested (1 ween 20 and butyl stearate) appeared to utilize the
same *fad* homologs as the long chain fatty acids. However, before either molecule can be
directed towards beta-oxidation, Tween 20 and butyl stearate must be hydrolyzed to generate a
C12 or C18 fatty acid, respectively. To date, no such hydrolase has been identified in *P. putida*

202	KT2440. Comparing the mutant fitness scores between Tween 20 and laurate (C12) carbon
203	source experiments revealed six genes (PP_0765, PP_0766, PP_0767, PP_0914, PP_2018, and
204	PP_2019) that had significant and severe fitness defects specific to Tween 20 (fitness score $<$ -2,
205	t >  4 ) in both biological replicates (Figure S2). The same comparison between butyl stearate
206	and myristate (C14) revealed four genes specific to the fatty ester (PP_0765, PP_0766, PP_2018,
207	and PP_4058) that had significant severe fitness defects (fitness score < -2, $t >  4 $ ) in both
208	biological replicates (Figure S2). As PP_0765-6 and PP_2018 appear to have specific
209	importance in both of the ester conditions tested, it may be possible that they contribute to the
210	hydrolysis of the fatty ester bonds. However, it is also possible that the esterase is secreted or
211	associated with the outer membrane (45), in which case its enzymatic activity would be shared
212	amongst the library and it would not have the associated fitness defect expected (10).
213	The genes PP_2018 and PP_2019 encode a BNR-domain containing protein and a RND-
214	family efflux transporter, respectively, and are likely co-expressed in an operon that also
215	includes PP_2020 and PP_2021. Interestingly, although PP_2021 codes for a putative lactonase,
216	transposon mutants had no apparent fitness defect with either of the fatty esters as the carbon
217	source. PP_0765 and PP_0766 encode a DUF1302 family protein and DUF1329 family protein,
218	respectively. Given their similar fitness scores, they are likely coexpressed in an operon
219	positively regulated by the LuxR-type regulator PP_0767 (Figure S2). Previous work in multiple
220	other species of Pseudomonas has observed cofitness of DUF1302/DUF1329 family genes with
221	BNR-domain and RND-family efflux genes when grown on Tween 20 (41). The authors
222	proposed that these genes may work together in order to export a component of the cell wall.
223	However, an alternative hypothesis could be that PP_0765 and PP_0766 contribute to catalyzing
224	the hydrolysis of fatty esters, accounting for the missing catabolic step of butyl stearate and

Tween 20. This hypothesis is bolstered somewhat by the co-localization of PP\_0765/PP\_0766
near fatty acid catabolic genes in *P. putida* KT2440 and many other *Pseudomonads* (Figure S3).
Future work will need to be done to biochemically characterize the potential enzymatic activity
of these proteins.

229

#### 230 Short Chain Fatty Acid Catabolism.

231 In our genome-wide fitness assays, the mutant fitness patterns of C6 or shorter fatty acid 232 carbon sources had lower Pearson correlation between one another than the correlations within 233 long and medium-chain fatty acids (Figure 1). These global differences reflect what appear to be 234 discrete preferences in beta-oxidation enzymes for growth on short chain fatty acids. Fitness data 235 suggest that while both CoA-ligases PP 0763 and PP 4559 are required for growth on 236 hexanoate, only PP 0763 is required for growth on valerate (Figure 2). Furthermore, the 237 putative positive regulator of PP 0763, LuxR-family transcription factor PP 0767, also showed 238 a significant fitness defect (-2.0) when grown on both valerate and hexanoate (Figure 2). 239 PP 0370 seems to be the acyl-CoA dehydrogenase largely responsible for hexanoate catabolism, 240 though PP 3554 mutants also have minor fitness defects. The dehydrogenation of valeryl-coA 241 appears to be distributed between the activities of PP 0368, PP 0370, and PP 3554, with no 242 single acyl-CoA dehydrogenase mutant demonstrating a strong fitness defect when grown on 243 valerate (Figure 2). Interestingly, though previous biochemical analysis had demonstrated that 244 PP 2216 has activity on C4-C8 acyl-CoA substrates with a preference for shorter chain lengths 245 (46), we observed no fitness defects for PP 2216 mutants when grown on any fatty acid carbon 246 source (Figure 2).

247	It appears that the role of enoyl-CoA hydratase or hydroxyacyl-CoA dehydrogenase may
248	be distributed across multiple enzymes for both hexanoate and valerate. Growth on hexanoate
249	resulted in moderate fitness defects in mutants disrupted in the predicted enoyl-CoA hydratases
250	PP_2136, PP_2217, and PP_3726; however, for mutants grown on valerate, there were almost no
251	observable fitness defects for any of the enoyl-CoA hydratase enzymes examined in the study,
252	suggesting that for this chain length significant functional complementation exists between the
253	fadB homologs (Figure 2). Fitness data suggest that PP_2136 (fadB), PP_2214 (a predicted type
254	II 3-hydroxyacyl-CoA dehydrogenase), and PP_3755 (a 3-hydroxybutyryl-CoA dehydrogenase)
255	may all be involved in the dehydrogenation of 3-hydroxyhexanoyl-CoA (Figure 2), while there
256	appears to be a distribution of <i>fadB</i> -like activity when it comes to the dehydrogenation of 3-
257	hydroxyvaleryl-CoA, with PP_3755 showing only a slight fitness defect on valerate.
258	Intriguingly, mutants disrupted in the predicted type-2 acyl-CoA dehydrogenase PP_2214
259	showed apparent increased fitness when grown on valerate (Figure 2). As with heptanoate,
260	fitness data from mutant pools grown on valerate or hexanoate suggest that both PP_2137 and
261	PP_3754 may catalyze the terminal thiolase activity of these substrates. The lack of pronounced
262	fitness phenotypes for the beta-oxidation steps of both valerate and hexanoate underscores the
263	necessity for further in vitro biochemical interrogation of these pathways.
264	Both the butanol and butyrate metabolism of <i>P. putida</i> have been studied in detail
265	through omics-level interrogation across multiple strains (28, 29). Previous work showed that
266	during growth on n-butanol, which is later oxidized to butyrate, three CoA-ligases are up-
267	regulated: PP_0763, PP_3553, and PP_4487 (acsA-1 - an acyl-CoA synthase) (29). However, our
268	butyrate carbon source experiments only revealed strong fitness defects in PP_3553 mutants

269 (Figure 2, Figure 3A). The same work found that PP\_3554 was the only upregulated acyl-CoA

270 dehydrogenase, which agrees with the strong fitness defect we observed in mutants of that gene 271 (29). That prior work did not find upregulation of any enoyl-CoA hydratase in *P. putida* grown 272 on butanol, but this is likely reflective of redundancy in this step; we observed fitness defects in 273 multiple genes, including PP 2136, PP 2217, and PP 3726, with mutants in PP 2217 274 demonstrating the most severe fitness defect (Figure 2, Figure 3A). Hydroxyacyl-CoA 275 dehydrogenase PP 2136 and 3-hydroxybutyryl-CoA dehydrogenase PP 3755 (hbd) have both 276 been shown to be upregulated during growth on butanol (29). While our data showed fitness 277 defects in both of these genes, the defect of PP 3755 mutants was much more severe. Three 278 different thiolases (PP 2215, PP 3754, and PP 4636) and the 3-oxoacid CoA-transferase atoAB 279 were previously observed to be upregulated during growth on butanol, but of these genes, only 280 PP 3754 (*bktB*) had a strong fitness defect, implying that it is the main thiolase for the terminal 281 step of butyrate catabolism (Figure 2, Figure 3A).

282 The inability of the RB-TnSeq data to clearly show which enzymes are likely responsible 283 for specific beta-oxidation reactions suggest multiple enzymes may catalyze these steps. In 284 addition to the lack of genotype to phenotype clarity in the enzymes responsible for the catabolic 285 steps, we observed additional phenotypes within our fitness data that portray a complex picture 286 of short chain fatty acid metabolism in *P. putida*. The TetR-family repressor paaX (PP 3286) 287 was shown to have a negative fitness score when mutant pools were grown on fatty acids with 288 chain lengths C7 or below (Figure S4). PaaX negatively regulates the *paa* gene cluster encoding 289 the catabolic pathway for phenylalanine (47, 48), implying that presence of phenylalanine 290 catabolism impedes growth on short chain fatty acids. It is therefore somewhat surprising that no 291 individual mutant within the paa gene cluster shows a fitness increase when grown on short

chain fatty acids, though no robust fitness data exists for *paaJ* (PP\_3275 - a 3-oxo-5,6didehydrosuberyl-coA thiolase) (Figure S4).

294 Mutants in MerR-family regulator PP 3539 showed very high fitness benefits (fitness 295 scores of 3.8 and 4.7 in two biological replicates) when grown on valerate. PP 3539 likely 296 increases expression of mvaB (PP 3540 - hydroxymethyl-glutaryl-CoA lyase), thus suggesting 297 that decreased levels of MvaB activity may benefit P. putida valerate catabolism. Unfortunately, 298 there are no fitness data available for *mvaB*, likely because it is essential under the conditions in 299 which the initial transposon library was constructed. The genes *hdb* and *bktB*, encoding the 300 terminal two steps of butyrate metabolism, are flanked upstream by an AraC-family regulator 301 (PP 3753) and downstream by a TetR-family regulator (PP 3756); the latter is likely co-302 transcribed with the butyrate catabolic genes (Figure 3B). When grown on butyrate, mutants in 303 both PP 3753 and PP 3756 show decreased fitness; however, previous work to evaluate global 304 fitness of *P. putida* grown on levulinic acid showed negative fitness values only for PP 3753, 305 *htb*, and *btkB* (Figure 3B). These results suggest that the TetR repressor may be responding to a 306 butyrate specific metabolite. Finally, across multiple fitness experiments, the TonB siderophore 307 receptor PP 4994 and the TolQ siderophore transporter PP 1898 showed fitness advantages 308 when grown on fatty acids, especially on hexanoate (Figure S5). Together, these results suggest 309 that a wide range of environmental signals impact how *P. putida* is able to metabolize short 310 chain fatty acids.

311

### 312 <u>Global Analysis of Alcohol Catabolism</u>

In addition to its ability to robustly catabolize a wide range of fatty acid substrates, *P*. *putida* is also capable of oxidizing and catabolizing a wide variety of alcohols into central

315 metabolism through distinct pathways. To further our understanding of these pathways, 316 transposon libraries were grown on a number of short n-alcohols (ethanol, butanol, and 317 pentanol), diols (1,2-propanediol, 1,3-butanediol, 1,4-butanediol, and 1,5-pentanediol), and 318 branched chain alcohols (isopentanol, isoprenol, and 2-methyl-1-butanol). Relative to growth on 319 fatty acids, fitness experiments of P. putida grown on various alcohols showed less correlation to 320 one another, reflecting the more diverse metabolic pathways used for their catabolism (Figure 321 **4A**). The initial step of the catabolism of many primary alcohols is the oxidation of the alcohol to 322 its corresponding carboxylic acid. The BioCyc database features 14 genes annotated as alcohol 323 dehydrogenases (PP 1720, PP 1816, PP 2049, PP 2492, PP 2674, PP 2679, PP 2682, 324 PP 2827, PP 2953, PP 2962, PP 2988, PP 3839, PP 4760, and PP 5210) (24). Fitness data 325 showed that the majority of these alcohol dehydrogenases had no fitness defects when grown on 326 the alcohols used in this study (Figure 4B).

327 The alcohol dehydrogenases that showed the most consistent fitness defects across 328 multiple conditions were the two PQQ-dependent alcohol dehydrogenases PP 2674 (pedE) and 329 PP 2679 (pedH), as well as the Fe-dependent alcohol dehydrogenase PP 2682 (viaY) (Figure 330 **4B**). Both *pedE* and *pedH* have been extensively studied in *P. putida* and other related bacteria, 331 and are known to have broad substrate specificities for alcohols and aldehydes (25, 26, 49). Their 332 activity is dependent on the activity of pedF (PP 2675), a cytochrome c oxidase that regenerates 333 the PQQ cofactor (25). In *P. aeruginosa*, a homolog of *yiaY* (*ercA*) was shown to have a 334 regulatory role in the expression of the *ped* cluster, and was not believed to play a direct 335 catabolic role (50). Recent work has validated that this function is conserved in P. putida (51). In 336 most conditions tested, disruption of *pedF* caused more severe fitness defects than either *pedE* or 337 *pedH* individually, suggesting they can functionally complement one another in many cases.

338	However, growth on 2-methyl-1-butanol and 1,5-pentanediol both showed more severe fitness
339	defects in <i>pedE</i> mutants compared to <i>pedF</i> (Figure 4B). In many other alcohols, including
340	ethanol and butanol, even disruption of <i>pedF</i> did not cause extreme fitness defects, suggesting
341	the presence of other dehydrogenases able to catalyze the oxidation (Figure 4B).
342	The transcriptional regulatory systems that activate expression of various genes in the <i>ped</i>
343	cluster could also be identified from these data. Mutants in either member of the sensory
344	histidine kinase/response regulator (HK/RR) two component system, pedS2/pedR2, showed
345	significant fitness defects when 2-methyl-1-butanol was supplied as the sole carbon source. This
346	HK/RR signaling system has been shown to activate the transcription of <i>pedE</i> and repress <i>pedH</i>
347	in the absence of lanthanide ions (52). Since lanthanides were not supplied in the medium, this
348	likely explains the fitness defect observed in <i>pedS2/pedR2</i> . The transcription factor <i>pedR1</i>
349	(agmR) was also found to affect host fitness when grown on various alcohols (Figure 5). This
350	gene has been identified in <i>P. putida</i> U as an activator of long chain (C6+) n-alcohol and
351	phenylethanol catabolism (53). In P. putida KT2440, pedR1 has been associated with the host
352	response to chloramphenicol, and its regulon has been elucidated previously (54). Our data
353	reflect the literature, indicating that <i>pedR1</i> functions as a transcriptional activator of the <i>ped</i>
354	cluster and <i>pedR2</i> functions as a specific regulator of <i>pedE</i> and <i>pedH</i> .
355	Unsurprisingly, the genes required for the biosynthesis of the PQQ cofactor were also
356	amongst the most co-fit (cofitness is defined as Pearson correlation between fitness scores of two
357	genes over many independent experimental conditions) with both pedF and yiaY. P. putida
358	synthesizes PQQ via a well-characterized pathway, starting with a peptide encoded by the gene
359	$pqqA$ (PP_0380) which is then processed by $pqqE$ , $pqqF$ , and $pqqC$ to generate the final cofactor
360	(Figure 4C). The three synthetic genes ( <i>pqqEFC</i> ) all showed significant fitness defects on the

361 same alcohols as the *pedF* mutants, while *pqqA* showed a less severe fitness phenotype (Figure 362 **4**C). However, the small size of *pagA* resulted in few transposon insertions, making it difficult to 363 draw confident conclusions. Two genes showed similar defective fitness patterns on select 364 alcohols: *pqqB*, which has been proposed to be an oxidoreductase involved in PQQ biosynthesis; 365 and *pqqD*, a putative PQQ carrier protein. Previous work regarding a PqqG homolog from 366 Methylorubrum extorguens suggested that it forms a heterodimeric complex with PqqF that 367 proteolytically processes PqqA peptides, although PqqF was sufficient to degrade PqqA on its 368 own (55). Fitness data from *P. putida* may support this hypothesis, as there was no observed 369 fitness defect in pqqG mutants when grown on any alcohol, suggesting that the bacterium is still 370 able to process PqqA with PqqF alone (Figure 4C).

371

### 372 Short chain alcohol metabolism

373 The metabolism of n-alcohols almost certainly proceeds through beta-oxidation using the 374 same enzymatic complement as their fatty acid counterparts. This relationship is reflected in the 375 high correlation in global fitness data between alcohols and fatty acids of the same chain length 376 (ethanol and acetate - r = 0.72, butanol and butyrate - r = 0.66, pentanol and valerate - r = 0.72). 377 However, given previous work and our fitness data, the initial oxidation of these alcohols 378 appears to be quite complex. Biochemical characterization of both PedE and PedH have shown 379 that both have activity on ethanol, acetaldehyde, butanol, butyraldehyde, hexanol, and 380 hexaldehyde (25). When grown on n-pentanol, mutants disrupted in *pedF* show severe fitness 381 defects, suggesting that PedH and PedE are the primary dehydrogenases responsible for pentanol 382 oxidation (Figure 4B, Figure 5A). However, when grown on either ethanol or n-butanol, both 383 the PQQ-dependent alcohol dehydrogenases (PQQ-ADHs) and pedF show less severe fitness

384 defects compared to when they are grown on pentanol (Figure 4B). This implies that other 385 dehydrogenases are also capable of these oxidations. One likely candidate may be PP 3839, 386 which shows a minor fitness defect when grown on n-butanol and has been biochemically shown 387 to oxidize coniferyl alcohol (Figure 4B) (56). Individual gene deletion mutants of either *pedF* 388 (PP 2675) or PP 3839 showed only minor growth defects when grown on either ethanol, 389 butanol, or pentanol as a sole carbon source (Figure 7). However, when both genes were deleted, 390 no growth was observed on these substrates, suggesting that the PQQ-ADHs and PP 3839 are 391 the primary dehydrogenases responsible for the oxidation of short chain n-alcohols (Figure 7). 392 It is ambiguous from our data and from previous work which enzymes are oxidizing the 393 aldehyde to the corresponding carboxylic acid. As mentioned previously, both PQQ-ADHs have 394 been biochemically shown to act on aldehydes and could catalyze the reaction, but the lack of a 395 strong fitness phenotype for both ethanol and n-butanol suggest they are not the only enzymes 396 capable of catalyzing this reaction. The genomically proximal aldehyde dehydrogenase pedI 397 (PP 2680) showed minor fitness defects when grown on ethanol and several other alcohols 398 (Figure 5, Figure 6A), but showed no fitness defects when libraries were grown on butanol or 399 pentanol. Another aldehyde dehydrogenase, aldB-I (PP 0545), showed virtually no fitness 400 defects when grown on any of the short chain n-alcohols tested here (Figure 6A). The lack of 401 any one obvious enzyme with a distinct fitness defect supports the notion that multiple enzymes 402 are present and able to catalyze the oxidation of these aldehydes. 403 While the metabolism of alcohols and their corresponding fatty acids are similar, their 404 fitness patterns showed distinct differences. When grown on acetate, mutants in gacS or gacA (PP 1650 and PP 4099 - a two-component (TCS) system), sigS (PP 1623 - the stationary phase 405

406 sigma factor sigma S), and *ptsH* (PP 0948 - a component of the sugar phosphotransferase system

407	(PTS)) showed large and significant fitness benefits, which were not apparent when grown on
408	ethanol (Figure 5B). The GacS/GacA TCS is widespread across many gram-negative bacteria,
409	and is believed to exert transcriptional control over a wide variety of functions, sometimes in
410	concert with a small RNA binding protein (CsrA) that exerts post-transcriptional control (57). In
411	Pseudomonads, the GacA/GacS TCS has been implicated in positively controlling sigS
412	expression in multiple species (58). In P. putida specifically, gacS mutations in strains
413	engineered to produce muconic acid have resulted in higher titers (59), but disruption of the gene
414	was also shown to completely abolish production of medium-chain length
415	polyhydroxyalkanoates (PHAs) (60). Growth on butyrate also showed that gacS, gacR, sigS, and
416	another component of the PTS (ptsP) had significant fitness benefits if disrupted, which was not
417	observed when the library was grown on butanol (Figure 5C). Interestingly, mutants in gacA and
418	gacS seemed to have fitness benefits when grown on either pentanol or valerate (Figure 5D).
419	Further work is necessary to precisely characterize the nature of the benefits that occur when
420	these genes are disrupted.
421	When grown on ethanol compared to acetate, relatively few genes not involved in the
422	oxidation of the short chain alcohols were found to be specifically and significantly unfit;
423	however, specific phenotypes for acetate catabolism were observed (Figure 5B). Mutants in
424	PP_1635 (a two-component system response regulator), PP_1695 (variously annotated as a
425	sodium-solute symporter, sensory box histidine kinase, or response regulator), and tal (PP_2168
426	- transaldolase) all showed fitness defects on acetate that were not observed when libraries were
427	grown on ethanol. The high cofitness between PP_1635 and PP_1695 observed across all
428	publicly available fitness data ( $r = 0.88$ ) and share homology to <i>crbSR</i> systems of other bacteria
429	where it is known to regulate acetyl-coA synthetase (61).

430 Much like ethanol and acetate, there were relatively few genes that showed specific 431 fitness defects when grown on butanol that were not also observed in butyrate. However, the 432 genes glgB (PP 4058 - a 1,4-alpha-glucan branching enzyme), and the co-transcribed PP 2354 433 and PP 2356 (annotated as a histidine kinase/response regulator (HK/RR), and histidine kinase 434 respectively) showed specific fitness defects when grown on butyrate relative to butanol. 435 PaperBLAST analysis of PP 2356 and PP 2354 did not reveal any publications that had 436 explored the function of this system, and thus further work will be needed to better characterize 437 its regulon (62). Mutants of genes encoding for three TCSs were found to be specifically unfit 438 when grown on pentanol when compared to valerate. PP 2683 (a two component HK/RR), and 439 pedR1 (PP 2665 - RR) were both specifically unfit and, as previously described, are involved in 440 the regulation of the *ped* cluster (Figure 5D). The gene *cbrB* (PP 4696 - sig54-dependent RR) 441 also showed pentanol-specific defects, and is known to regulate central carbon metabolism and 442 amino acid uptake in the Pseudomonads (63, 64).

443 <u>Short chain diol catabolism</u>

444 Another group of industrially relevant alcohols with potential for biotechnological 445 production are short chain diols. These compounds have broad utility ranging from plasticizers to 446 food additives (65). As shown in Figure 5, most of the tested short chain diols result in 447 significant fitness defects in *pedR1*, indicating that some of the genes involved in these 448 metabolisms are in the PedR1 regulon. However, only 1,5-pentanediol had a strong fitness defect 449 in *pedF*, indicating that multiple dehydrogenases may act on the shorter chain diols. 450 Additionally, both 1,2-propanediol and 1,3-butanediol cause slight defects in mutants of the 451 aldehyde dehydrogenase PP 0545. Although there is some ambiguity as to which enzymes

452	initially oxidize the diols t	o their correspond	ling acids, the	e remaining step	os in 1,2-propanediol,
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453 1,3-butanediol, and 1,5-pentanediol catabolism are much more straightforward.

454	Oxidation of 1,2-propanediol yields lactate, and mutants in the L-lactate permease
455	PP_4735 ( <i>lldP</i> ) have a fitness of -4.3 when grown on 1,2-propanediol. Furthermore, under this
456	condition, mutants of the L- and D- lactate dehydrogenases PP_4736 ( <i>lldD</i> ) and PP_4737 ( <i>lldE</i> )
457	have fitness defects of -5.0 and -1.5, respectively. Since we provided a rac-1,2-propanediol as a
458	substrate, this likely explains the fitness defects observed in both dehydrogenases (66, 67). Given
459	these results, it appears that 1,2-propanediol is assimilated into central metabolism via oxidation
460	to pyruvate (Figure S6).
461	When grown on 1,3-butanediol, two oxidations of 1,3-butanediol result in 3-
462	hydroxybutyrate, and we observe fitness defects of -2.5 in the D-3-hydroxybutyrate
463	dehydrogenase PP_3073 and -1.8 in the neighboring sigma-54 dependent regulator PP_3075
464	(68). Dehydrogenation of 3-hydroxybutyrate results in acetoacetate, and we see a fitness defect
465	of -2.9 and -3.0 for the subunits of the predicted 3-oxoacyl-CoA transferase PP_3122-3 (atoAB).
466	This enzyme likely transfers a CoA from either succinyl-CoA or acetyl-CoA in order to generate
467	acetoacetyl-CoA. Regarding transport, mutants in the D-beta-hydroxybutyrate permease
468	PP_3074, located in the same operon as the 3-hydroxybutyrate dehydrogenase, have a fitness
469	defect of -0.9, while mutants in the RarD permease PP_3776 have a fitness of -1.2.
470	Following oxidation by the aforementioned PQQ-dependent dehydrogenases and
471	aldehyde dehydrogenases in the periplasm, an oxidized intermediate is likely transported into the
472	cell for the next steps in the catabolism. This is supported by the observation that mutants of the
473	predicted dicarboxylate MFS transporter PP_1400 and its two-component regulator PP_1401-2
474	have strong fitness defects on both alpha-ketoglutarate and 1,5-pentanediol. Furthermore, there is

475 a -4.7 fitness defect in mutants of the L-2-hydroxyglutarate oxidase PP 2910, which catalyzes 476 the second step in the glutarate hydroxylation pathway of glutarate catabolism. The glutarate 477 hydroxylase PP 2909, which catalyzes the first step of this pathway, has a much slighter 478 negative fitness of -0.6. This is expected, because glutarate can also be catabolized through a 479 glutaryl-CoA dehydrogenation pathway, so mutants in PP 2909 can simply divert flux through 480 the other catabolic route (12). Mutants in PP 2910 are unable to oxidize L-2-hydroxyglutarate to 481 alpha-ketoglutarate, and likely accumulate L-2-hydroxyglutarate as a dead-end metabolite. 482 1,4-butanediol catabolism has been previously studied; based on the results of expression 483 data and adaptive laboratory evolution, Li et al. proposed three potential catabolic pathways for 484 1,4-butanediol, including a beta-oxidation pathway (Figure 8) (30). Their evolved strains had 485 mutations in the LysR activator PP 2046 that resulted in overexpression of the beta-oxidation 486 operon PP 2047-51 (30). Interestingly, we found that when grown on 1,4 butanediol, transposon 487 mutants of the acyl-CoA dehydrogenase PP 2048 had significant fitness benefits and no CoA-488 ligase mutants showed significant fitness defects. However, a fitness defect of -1.0 in PP 0356 489 (malate synthase) mutants suggests that there may be flux through the beta-oxidation pathway to 490 glycolic acid and acetyl-CoA. A possible explanation for the positive fitness of PP 2048 mutants 491 is that the beta-oxidation pathway is suboptimal in the wild type, and it may be beneficial to 492 divert flux through the other pathway(s). This same reasoning could also explain the absence of 493 CoA-ligases with fitness defects; however, this also could be due to the presence of multiple 494 CoA-ligases capable of catalyzing that step. Mutants of the 3-hydroxyacyl-CoA dehydrogenase 495 PP 2047, a *fadB* homolog which likely catalyzes the hydration and dehydrogenation steps to 496 produce 3-oxo-4-hydroxybutyryl-CoA, had a strong fitness defect. When PP 2047 is non-497 functional, 4-hydroxycrotonyl-CoA likely accumulates as a deadend metabolite resulting in

decreased fitness. Li et al. also showed that deletion mutants of PP\_2046 are unable to grow on
1,4-butanediol (30). Our data suggests that this is because PP\_2049 appears to be the main
alcohol dehydrogenase acting on either 1,4-butanediol or 4-hydroxybutyrate, and is in the operon
under the control of PP\_2046. Although our fitness data suggests that both the oxidation to
succinate and beta-oxidation pathways occur, further work is necessary to determine if the
pathway to succinyl-CoA is involved in the catabolism.

### 504 Branched chain alcohol metabolism

505 Due to their superior biofuel properties, branched chain alcohols have been targets for 506 metabolic engineering as potential alternatives to ethanol and butanol (69). Our fitness data 507 suggest that *pedE* and/or *pedH* oxidize 2-methyl-1-butanol to 2-methylbutyrate, which then 508 undergoes one round of beta-oxidation to produce acetyl-CoA and propionyl-CoA (Figure S7). 509 Most of the genes involved in 2-methylbutyrate beta-oxidation are located in the operon 510 PP 2213-PP 2217. With mutants having a fitness defect of -3.2, PP 2213 appears to be the main 511 acyl-CoA ligase acting on 2-methylbutyrate. Mutants in two predicted acyl-CoA 512 dehydrogenases, PP 2216 and PP 0358, show fitness defects of -1.1 and -2.6, respectively. The 513 enoyl-CoA hydratase PP 2217 has a fitness defect of -5.7 and the 3-hydroxyacyl-CoA 514 dehydrogenase PP 2214 has a fitness defect of -5.6. Finally, the acetyl-CoA acetyltransferase 515 appears to be PP 2215, with mutants having a fitness defect of -4.8. We also observed fitness 516 defects of -1.8 and -1.6 in mutants of the ABC transporters, PP 5538 and PP 2667, respectively. 517 Since 2-methylbutyrate is a known intermediate in the catabolism of isoleucine, we found that 518 the genetic data presented here closely mirror the previous biochemical characterization of this 519 system (70, 71).

520 *P. putida* can readily grow on isopentanol and isoprenol but not prenol (Figure 9A). All 521 three of these alcohols have been produced in high titers in *Escherichia coli* and other bacteria 522 because of their potential to be suitable replacements for gasoline (72, 73). RB-TnSeq data for 523 isopentanol and isoprenol showed severe fitness defects in genes of the leucine catabolic 524 pathway (Figure 10). This is unsurprising, as isopentanol can be generated from the leucine 525 biosynthetic pathway (74). Deletion of the PP 4064-PP 4067 operon, which contains the genes 526 that code for the conversion of isovaleryl-CoA to 3-hydroxy-3-methylglutaryl-CoA, abolished 527 growth on both isopentanol and isoprenol (Figure S8). Deletion of PP 3122 (acetoacetyl CoA-528 transferase subunit A) also abolished growth on isopentanol, and greatly reduced growth on 529 isoprenol (Figure S8). Taken together, these results validate that both of these alcohols are 530 degraded via the leucine catabolic pathway. Transposon insertion mutants in *pedF* showed strong 531 fitness defects on both isopentanol and isoprenol, suggesting that pedH (PP 2679) and pedE532 catalyze (PP 2674) the oxidation of the alcohols. Deletion mutants in *pedH* showed only a minor 533 delay in growth compared to wild-type when grown on either isopentanol or isoprenol, while 534 mutants in *pedE* showed a more substantial growth defect on both alcohols (Figure 9A). Deletion of pedF (PP 2675) prevented growth on both isopentanol and nearly abolished growth 535 536 on isoprenol when provided as a sole carbon source in minimal media (Figure 9A). When wild-537 type P. putida was grown in minimal media with 10 mM glucose and 4 mM of either 538 isopentanol, prenol, or isoprenol, each alcohol was shown to be readily degraded with concurrent 539 observation of increasing levels of the resultant acid (Figure 9B). Though P. putida was unable 540 to utilize prenol as a sole carbon source, it was still able to readily oxidize prenol to 3-methyl-2-541 butenoic acid, suggesting there is no CoA-ligase present in the cell able to activate this substrate 542 and channel it towards leucine catabolism (Figure 10). When wild-type *P. putida* was grown in

543 LB medium supplemented with 4 mM of each alcohol individually, all alcohols were completely 544 degraded by 24 hours post-inoculation (Figure 9C). In *pedF* deletion mutants grown under the 545 same conditions, the rate at which the alcohols were degraded was significantly slowed; however 546 after 48 hours ~50% of isopentanol, ~75% of isoprenol, and 100% of prenol were degraded 547 (Figure 9C). Uninoculated controls showed that no alcohol was lost at greater than 5% on 548 account of evaporation (data not shown). Future efforts to produce any of these alcohols in P. 549 *putida* will be heavily impacted by this degradation, and greater effort will need to be made to 550 identify other enzymes involved in the oxidation of these alcohols or other metabolic pathways 551 that consume them.

552 One mystery that remains is how isoprenol enters into leucine catabolism. GC-MS 553 analysis confirmed oxidation of the alcohol to 3-methyl-3-butenoic acid, but it is unclear what 554 the next step entails. Fitness data suggests that either PP 4063 or PP 4549 may attach the CoA 555 to isovalerate, but neither of these genes have strong phenotypes when mutant libraries are 556 grown on isoprenol (Figure 10). That PP 4064 (isovaleryl-CoA dehydrogenase) shows strong 557 negative fitness values when libraries are grown on isoprenol implies that its degradation goes 558 through an isovaleryl-CoA intermediate, however this fitness defect may be the result of polar 559 effects that disrupt the downstream steps (Figure 10). One possibility is that 3-methyl-3-560 butenoic acid is reduced to isovalerate in the cell; however, this seems unlikely since no 561 isovalerate was observed via GC-MS when P. putida was fed isoprenol and glucose. Two other 562 possible routes could result from the activation of 3-methyl-3-butenoic acid by an undetermined 563 CoA-ligase. If this CoA-ligase exists, it is interesting that it would have activity on 3-methyl-3-564 butenoic acid but not 3-methyl-2-butenoic acid, which accumules when P. putida is grown in the 565 presence of prenol. Once formed, the 3-methyl-3-butenyl-CoA could be directed into leucine

566 catabolism via either an isomerization to 3-methylcrotonyl-CoA or a reduction to isovaleryl-

567 CoA. Future work that leverages metabolomics to identify compounds that accumulate in leucine

568 catabolic mutants may reveal the missing steps and help narrow the search for their enzymes.

569 <u>Future Directions</u>

570 The large set of global fitness data generated in this study provide an extensive and 571 global overview on the putative pathways of alcohol and fatty acid degradation in P. putida. 572 Overall, our fitness data agree with previously published biochemical data that explored enzymes 573 in both fatty acid and alcohol metabolism. However, there are still many questions that our data 574 leave unanswered. Further investigation will be required to untangle and elucidate which specific 575 enzymes are biologically relevant in the beta-oxidation of short chain fatty acids. It is likely that 576 biochemical characterization of individual enzymes will be required to determine which of the 577 fad homologs catalyze these reactions. Another intriguing question is the function of PP 0765 578 and PP 0766. Biochemical interrogation and mutational analysis of the DUF1302 and DUF1329 579 family proteins are needed to determine whether these proteins indeed function as an esterase or, 580 as previously predicted, play some other role in outer membrane biogenesis (41). Additional work is also warranted to ascertain which of the proposed 1,4-butanediol catabolic routes the 581 582 wild-type organism actually uses and determine whether the beta-oxidation pathway is indeed 583 less preferable than the pathway to succinate.

To our knowledge, our finding that *P. putida* can consume both isopentanol and isoprenol are the first observations of this metabolism. If metabolic engineers wish to produce these chemicals in *P. putida*, these pathways will need to be removed. Critically, researchers will need to identify other enzymes that result in the oxidation of these alcohols or other routes of degradation within *P. putida*. How *P. putida* is able to utilize isoprenol, but not prenol, as a sole

589 carbon source is metabolically intriguing. One of our proposed pathways of isoprenol catabolism 590 requires the existence of a CoA-ligase that shows surprising specificity towards 3-methyl-3-591 butenoic acid with little to no activity on 3-methyl-2-butenoic acid. More work should be done to 592 leverage other omics-levels techniques to try to identify this hypothetical enzyme and 593 biochemically verify its activity. Finally, this data set as a whole will likely strengthen the 594 assumptions made by genome-scale metabolic models. Previous models of *P. putida* metabolism 595 have incorporated RB-TnSeq data to improve their predictions (17). This work nearly doubles 596 the number of available RB-TnSeq datasets in *P. putida* that are publicly available and will likely 597 contribute greatly to further model refinement. Ultimately, large strides in our understanding of 598 *P. putida* metabolism leveraging functional genomic approaches will provide the foundation for 599 improved metabolic engineering efforts in the future.

600

### 601 Methods

### 602 Media, chemicals, and culture conditions

603 General *E. coli* cultures were grown in lysogeny broth (LB) Miller medium (BD

Biosciences, USA) at 37 °C while *P. putida* was grown at 30 °C. When indicated, *P. putida* and

605 *E. coli* were grown on modified MOPS minimal medium, which is comprised of 32.5 μM CaCl<sub>2</sub>,

606 0.29 mM K<sub>2</sub>SO<sub>4</sub>, 1.32 mM K<sub>2</sub>HPO<sub>4</sub>, 8 μM FeCl<sub>2</sub>, 40 mM MOPS, 4 mM tricine, 0.01 mM

607 FeSO<sub>4</sub>, 9.52 mM NH<sub>4</sub>Cl, 0.52 mM MgCl<sub>2</sub>, 50 mM NaCl, 0.03 μM (NH<sub>4</sub>)<sub>6</sub>Mo<sub>7</sub>O<sub>24</sub>, 4 μM H<sub>3</sub>BO<sub>3</sub>,

608 0.3  $\mu$ M CoCl<sub>2</sub>, 0.1  $\mu$ M CuSO<sub>4</sub>, 0.8  $\mu$ M MnCl<sub>2</sub>, and 0.1  $\mu$ M ZnSO<sub>4</sub> (75). Cultures were

- 609 supplemented with kanamycin (50 mg/L, Sigma Aldrich, USA), gentamicin (30 mg/L, Fisher
- 610 Scientific, USA), or carbenicillin (100mg/L, Sigma Aldrich, USA), when indicated. All other

611 compounds were purchased through Sigma Aldrich (Sigma Aldrich, USA). 3-methyl-3-butenoic

612 acid was not available commercially and required synthesis which is described below.

### 613 <u>Strains and plasmids</u>

614 All bacterial strains used in this study can be found in Table 1 and plasmids used in this 615 work are listed in Table 2. All strains and plasmids created in this work are available through the 616 public instance of the JBEI registry. (public-registry.jbei.org/folders/456). All plasmids were 617 designed using Device Editor and Vector Editor software, while all primers used for the 618 construction of plasmids were designed using j5 software (76–78). Plasmids were assembled via 619 Gibson Assembly using standard protocols (79), or Golden Gate Assembly using standard 620 protocols (80). Plasmids were routinely isolated using the Qiaprep Spin Miniprep kit (Qiagen, 621 USA), and all primers were purchased from Integrated DNA Technologies (IDT, Coralville, IA). 622 Construction of *P. putida* deletion mutants was performed as described previously (18). 623 Plate-based growth assays 624 Growth studies of bacterial strains were conducted using microplate reader kinetic assays 625 as described previously (82). Overnight cultures were inoculated into 10 mL of LB medium from 626 single colonies, and grown at 30 °C. These cultures were then washed twice with MOPS minimal 627 media without any added carbon and diluted 1:100 into 500 µL of MOPS medium with 10 mM 628 of a carbon source in 48-well plates (Falcon, 353072). Plates were sealed with a gas-permeable 629 microplate adhesive film (VWR, USA), and then optical density and fluorescence were 630 monitored for 48 hours in an Biotek Synergy 4 plate reader (BioTek, USA) at 30 °C with fast 631 continuous shaking. Optical density was measured at 600 nm.

632 <u>RB-TnSeq</u>

633 RB-TnSeq experiments utilized *P. putida* library JBEI-1 which has been described 634 previously with slight modification(18). Libraries of JBEI-1 were thawed on ice, diluted into 25 635 mL of LB medium with kanamycin and then grown to an OD<sub>600</sub> of 0.5 at 30 °C at which point 636 three 1-mL aliquots were removed, pelleted, and stored at -80 °C. Libraries were then washed 637 once in MOPS minimal medium with no carbon source, and then diluted 1:50 in MOPS minimal 638 medium with 10 mM of each carbon source tested. Cells were grown in 10 mL of medium in test 639 tubes at 30 °C shaking at 200 rpm. One 500-µL aliquot was pelleted, and stored at -80 °C until 640 BarSeq analysis, which was performed as previously described (19, 40). The fitness of a strain is 641 defined here as the normalized log<sub>2</sub> ratio of barcode reads in the experimental sample to barcode 642 reads in the time zero sample. The fitness of a gene is defined here as the weighted average of 643 the strain fitness for insertions in the central 10% to 90% of the gene. The gene fitness values are 644 normalized such that the typical gene has a fitness of zero. The primary statistic t value 645 represents the form of fitness divided by the estimated variance across different mutants of the 646 same gene. Statistic t values of >|4| were considered significant. A more detailed explanation of 647 calculating fitness scores can be found in Wetmore et al. (40). All experiments described here 648 passed testing using the quality metrics described previously unless noted otherwise (40). All 649 experiments were conducted in biological duplicate, and all fitness data are publically available 650 at http://fit.genomics.lbl.gov.

#### 651 <u>GC-MS and GC-FID Analysis of Branched Alcohol Consumption</u>

To examine the oxidation of isopentanol, prenol, and isoprenol to their corresponding
acids 10mL of MOPS minimal medium supplemented with 10 mM glucose and 4mM of one of
each alcohol added were inoculated with a 1:100 dilution of overnight *P. putida* culture and
incubated at 30 °C with 200 rpm shaking. At 0, 12, 24, and 48-hours post-inoculation 200 μL of

656 media were sampled and stored at - 80 °C. Alcohols and fatty acids were extracted by acidifying 657 media with 10 µL of 10N HCl, followed by addition of an 200 µL of ethyl-acetate. To detect 658 alcohols and their corresponding carboxylic acids via GC-MS an Agilent 6890 system equipped 659 with a DB-5ms column (30- m×0.25 mm×0.25 µm) and an Agilent 5973 MS were used. Helium 660 (constant flow 1 mL/min) was used as the carrier gas. The temperature of the injector was 250 °C 661 and the following temperature program was applied: 40 °C for 2 min, increase of 10 °C/min to 100 °C then increase of 35 °C/min to 300 °C, temperature was then held at 300 °C for 1 min. 662 Authentic standards were used to quantify analytes. Determination of isopentanol, prenol, and 663 664 isoprenol consumption was conducted in 10mL LB medium with 4mM of either alcohol added. 665 Cultures were inoculated with a 1:100 dilution of overnight P. putida culture and incubated at 666 30 °C with 200 rpm shaking. At 0, 24, and 48 hours post-inoculation 200 µL of media were 667 sampled and stored at - 80 °C. The remaining concentration of each alcohol was determined by 668 GC-FID as previously described (83).

### 669 <u>Synthesis of 3-Methyl-3-Butenoic Acid</u>

670 To a 25-mL round bottom flask was added chromium(VI) oxide (0.69 g, 6.9 mmol) and distilled 671 water (1 mL). The reaction mixture was then cooled to 0 °C before concentrated sulfuric acid (0.6 672 mL, 10.5 mmol) was added dropwise, thus forming Jones reagent. The solution of Jones reagent 673 was then diluted to a total volume of 5 mL with distilled water. To a stirred solution of 3-methyl-3-buten-1-ol (0.59 g, 6.9 mmol) in acetone (7 ml) was added dropwise the Jones reagent at 0 °C. 674 675 After being stirred for 8 h at room temperature, the mixture was quenched with ethanol. The 676 mixture was then diluted with water, and acetone was evaporated in vacuo. The residue was 677 extracted with DCM, and organic layers were combined and washed three times with saturated aq. 678 NaHCO<sub>3</sub> solution. The aqueous phase was acidified with a 2 M aq. HCl solution to pH 2-3, which

was then extracted again with DCM. The extract was successively washed with water and brine, dried over MgSO<sub>4</sub>, and concentrated *in vacuo*. The residue was distilled (90 °C, 100 mTorr) to yield 3-methyl-3-butenoic acid as a clear oil. <sup>1</sup>H NMR (300 MHz, Chloroform-*d*)  $\delta$  4.92 (d, *J* = 19.1 Hz, 2H), 3.08 (s, 2H), 1.84 (s, 3H) (Figure 11).

683

#### 684 <u>Bioinformatic Analyses</u>

685 PaperBLAST was routinely used to search for literature on proteins of interest and related 686 homologs (62). All statistical analyses were carried out using either the Python Scipy or Numpy 687 libraries (84, 85). For the phylogenetic reconstructions, the best amino acid substitution model 688 was selected using ModelFinder as implemented on IQ-tree (86) phylogenetic trees were 689 constructed using IQ-tree, nodes were supported with 10,000 bootstrap replicates. The final tree 690 figures were edited using FigTree v1.4.3 (http://tree.bio.ed.ac.uk/software/figtree/). Orthologous 691 syntenic regions were identified with CORASON-BGC (87) and manually colored and 692 annotated.

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## 715 Contributions

- 716 Conceptualization, M.G.T., M.R.I., A.N.P.; Methodology, M.G.T., M.R.I., A.N.P., J.M.B,
- 717 P.C.M., A.M.D.; Investigation, M.G.T., M.R.I., A.N.P, M.S., W.A.S., C.B.E., P.C.M., J.M.B.,
- 718 Y.L., R.W.H., C.A.A, R.N.K, P.L.; Writing Original Draft, M.G.T., M.R.I., A.N.P.; Writing –
- 719 Review and Editing, All authors.; Resources and supervision, L.M.B., A.M., A.M.D., P.M.S,

720 J.D.K.

- 721 M.G.T., M.R.I., and A.N.P. contributed equally to this work. Author order was determined by
- the outcome of a MarioKart 64 tournament.

# 723 Competing Interests

J.D.K. has financial interests in Amyris, Lygos, Demetrix, Napigen, Maple Bio, and Apertor
Labs. C.B.E has a financial interest in Perlumi Chemicals.

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1006	Tabl	e 1: Strains used in this study.

Strain	Description	Reference
E. coli XL1 Blue		Agilent
P. putida KT2440	Wild-Type	ATCC 47054
<i>P. putida</i> $\triangle PP_2674$	Strain with complete internal in- frame deletion of PP_2674	This study
<i>P. putida</i> $\triangle PP_2675$	Strain with complete internal in- frame deletion of PP_2675	This study
<i>P. putida</i> $\triangle PP_2679$	Strain with complete internal in- frame deletion of PP_2679	This study
<i>P. putida</i> $\triangle PP_3839$	Strain with complete internal in- frame deletion of PP_3839	This study
<i>P. putida</i> ΔPP_2675ΔPP_3839	A double knockout of PP_2675 and PP_3839	This study
<i>P. putida</i> △PP_4064-PP_4067	Strain with complete internal in- frame deletion of the PP_4064- 4067 operon	This study
<i>P. putida</i> $\triangle PP_3122$	Strain with complete internal in- frame deletion of PP_3122	This study

## **Table 2: Plasmids used in this study.**

Plasmid	Description	Reference
pMQ30	Suicide vector for allelic replace Gm <sup>r</sup> , SacB	<u>81</u>
рМQ30 <u></u> ДРР_2674	pMQ30 derivative harboring 1kb flanking regions of PP_2674	This study
рМQ30 <u></u> ДРР_2675	pMQ30 derivative harboring 1kb flanking regions of PP_2675	This study
рМQ30 <u></u> ДРР_2679	pMQ30 derivative harboring 1kb flanking regions of PP_2679	This study
рМQ30 <u></u> ДРР_3839	pMQ30 derivative harboring 1kb flanking regions of PP_3839	This study
рМQ30 <u><u></u><u></u> <u></u><u></u> <u></u> <u></u> <u></u> <u></u> <u></u> <u></u> <u></u> </u>	pMQ30 derivative harboring 1kb flanking regions of PP_4064 and PP_4067	This study
рМQ30 <u><u></u><u></u><u></u><u></u><u></u><u></u><u></u><u></u><u></u><u></u><u></u><u></u><u></u><u></u><u></u><u></u><u></u><u></u><u></u></u>	pMQ30 derivative harboring 1kb flanking regions of PP_3122	This study

## 1010 Figure 1: cladogram correlation matrix of genome-wide fitness data of *P. putida* grown on fatty acids. The

1011 matrix shows pairwise comparisons of Pearson correlations of fitness data from *P. putida* KT2440 RB-TnSeq

1012	libraries grown on fatty acids as well as glucose. The legend in top left shows Pearson correlation between two
1013	conditions with blue showing $r = 1$ , and red showing $r = 0$ . The conditions were tested in duplicate and the data
1014	from each are numbered (1 & 2).
1015	
1016	Figure 2: Overview of fatty acid catabolic pathways of P. putida KT2440. The above diagram shows the
1017	catabolic steps of fatty ester and saturated/unsaturated fatty acid catabolism in P. putida KT2440, in addition to their
1018	connections to the glyoxylate shunt and the methylcitrate cycle. The heatmaps below show fitness scores when
1019	grown on fatty acids or glucose for the specific genes proposed to catalyze individual chemical reactions. Colors
1020	represent fitness scores, with blue representing positive fitness and red representing negative fitness.
1021	
1022	Figure 3: Putative pathways for short chain fatty acid catabolism in <i>P. putida</i> KT2440. A) Individual enzymatic
1023	steps that potentially catalyze the steps of beta-oxidation for short chain fatty acids, fitness scores are listed to the
1024	right of each enzyme when grown on either butyrate, valerate, or hexanoate. B) The operonic structure of <i>btkB</i> and
1025	hdb flanked by an AraC-family (PP_3753) and TetR-family (PP_3756). The heatmap shows fitness scores of the
1026	genes when grown on butyrate, butanol, or levulinic acid.
1027	
1028	Figure 4: Global analysis of alcohol metabolism in <i>P. putida</i> . A) Pairwise comparisons of Pearson correlations of
1029	fitness data from P. putida KT2440 RB-TnSeq libraries grown on alcohols as well as glucose grouped by overall
1030	similarity. Colors bar at top left shows the Pearson coefficient with 1 indicating greater similarity and 0 indicating
1031	greater dissimilarity. B) Heatmap shows the fitness scores of all alcohol dehydrogenases annotated on the BioCyc
1032	database as well as the cytochrome C PP_2675 when grown on various alcohols and glucose. C) Operonic diagram
1033	of the pqq cluster in P. putida and the corresponding biosynthetic pathway for the PQQ cofactor and D) How PQQ
1034	cofactors are regenerated by cytochrome C. Heatmap shows fitness scores for individual pqq cluster genes when
1035	grown on alcohols and glucose.
1036	
1037	Figure 5: Essentiality and regulation of the <i>ped</i> cluster. (Top) Heatmap depicting the fitness scores for genes in

1038 the *ped* cluster (PP\_2662 to PP\_2683) during growth on various short chain alcohols. (Bottom) Genomic context for

- the *ped* cluster in *P. putida* KT2440. Arrows depict transcriptionally upregulated genes of *pedR1* and *pedR2*. Blunt
  arrows point to genes predicted to be transcriptionally repressed in the condition tested.
- Figure 6: Analysis of short chain alcohol metabolism in *P. putida*: A) Putative genes involved in the initial
  oxidation steps of short chain alcohol assimilation in *P. putida*. PP\_2675 (PedF) is involved in the regeneration of
  the PQQ cofactor predicted to be necessary for these oxidation reactions of PP\_2764 (PedE) and PP\_2769 (PedH).
  Average fitness scores for two biological reps are shown next to each gene for ethanol (black), butanol (green), and
  pentanol (blue). Scatter plots show global fitness scores for ethanol versus acetate (B), butanol versus butyrate (C),
  and pentanol versus valerate (D).
- 1047

Figure 7: Validation of alcohol dehydrogenases involved in short chain alcohol metabolism Growth curves of
wild type (blue), ΔPP\_2675 (orange), ΔPP\_3839 (green), and ΔPP\_2675ΔPP\_3839 (red) strains of *P. putida*KT2440 on 10 mM ethanol (A), 10 mM n-butanol (B), and 10 mM n-pentanol (C). Shaded area represents 95%
confidence intervals (cI), n=3.

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Figure 8: Putative routes of 1,4-butanediol catabolism in *P. putida*. Putative genes involved in catabolism of 1,4butanediol in *P. putida*. Average fitness scores for two biological reps are shown next to each gene. The three CoAligases shown were proposed by Li et al.; there were no CoA-ligases that showed significant fitness defects on 1,4butanediol. \*PP\_2675 (PedF) is involved in the regeneration of the PQQ cofactor predicted to be necessary for these
oxidation reactions of PP\_2764 (PedE) and PP\_2769 (PedH).

1058

Figure 9: Isopentanol, Prenol, and Isoprenol consumption by *P. putida*. A) Growth curves of wild type (blue),
and ΔPP\_2674 (orange), ΔPP\_2675 (green), and ΔPP\_2679 (red) strains of *P. putida* on isopentanol (left), prenol

1061 (middle), and isoprenol (right). Structure of alcohols are shown above graphs. Shaded area represents 95%

1062 confidence intervals (cI), n=3. B) Concentrations of alcohols consumed and their corresponding carboxylic acids

1063 produced over time by wild type. Left panel shows isopentanol and isovalerate, middle panel shows prenol and 3-

- 1064 methyl-2-butenoic acid, and the right panel shows isoprenol and 3-methyl-3-butenoic acid. Structures of
- 1065 corresponding carboxylic acids derived from alcohol are shown in graphs. Error bars represent 95% cI, n=3. C)

47

1066	Consumption of isopentanol (left), prenol (middle), and isoprenol (right) by wild type and $\Delta PP_2675 P$ . putida over
1067	time. Error bars represent 95% cI, n=3.

1068

1069	Figure 10: Putative routes of isopentanol and isoprenol catabolism in P. putida. Diagram shows the proposed
1070	pathways for the catabolism of isopentanol and isoprenol. Average fitness scores of two biological replicates for
1071	individual genes can be found next to each gene. Fitness values for isopentanol are shown in blue, while fitness

1072 values for isoprenol and shown in green. Potential reactions that would bring isoprenol into leucine catabolism are1073 marked with a question mark.

1074

1075 Figure 11: NMR validation of 3-methyl-3-butenoic acid.

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