1 Addition of insoluble fiber to isolation media allows for increased metabolite diversity of

- 2 lab-cultivable microbes derived from zebrafish gut samples
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- 4 **Short title:** Fiber increases metabolite diversity of microbes derived from zebrafish guts
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Addition of insoluble fiber to isolation media allows for increased metabolite diversity of lab-cultivable microbes derived from zebrafish gut samples

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23 Abstract:

24 There is a gap in measured microbial diversity when comparing genomic sequencing 25 techniques versus cultivation from environmental samples in a laboratory setting. Standardized 26 methods in artificial environments may not recapitulate the environmental conditions that native 27 microbes require for optimal growth. For example, the intestinal tract houses microbes at 28 various pH values as well as minimal oxygen and light environments. These microbes are also 29 exposed to an atypical source of carbon: dietary fiber compacted in fecal matter. To investigate 30 how the addition of insoluble fiber to isolation media could affect the cultivation of microbes from 31 zebrafish intestines, an isolate library was built and analyzed using the bioinformatics pipeline 32 IDBac. The addition of fiber led to an increase in bacterial growth and encouraged the growth of 33 species from several phyla. Furthermore, fiber addition altered the metabolism of the cultivated 34 gut-derived microbes and induced the production of unique metabolites that were not produced 35 when microbes were otherwise grown on standard isolation media. Addition of this inexpensive 36 carbon source to media supported the cultivation of a diverse community whose specialized 37 metabolite production may more closely replicate their metabolite production in vivo.

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Keywords: gut microbes, *in vitro* cultivation, insoluble fiber, natural products, zebrafish,
metabolomics

42 Introduction:

Over the past 40 years, scientists searched for alternative strategies to increase the diversity of microbes isolated from environmental samples in a laboratory setting. Dubbed in 1932 as "the great plate count anomaly", Razumov *et al.* noted that there was a large discrepancy between the viable plate count of aquatic bacteria on petri dishes compared to direct microscopic counts from the same environmental habitat.¹ As more researchers reiterated the lack of a diverse community *in vitro*, confirming the phenomenon, a need for modifications in the cultivation process were imperative to improve isolation.

50 There are numerous variables that can be altered such as pH, salinity, temperature, 51 oxygen levels, incubation time, and carbon and nitrogen substrates to create an in vitro environment that better represents the *in vivo* environment.² Microbes have evolved to live in 52 53 niche environments and their survival is dependent on the available simple or complex carbon 54 and nitrogen substrates. Therefore, if a laboratory medium is lacking the main organic 55 substrates that a microbe has evolved to use, this may help contribute to the plate count anomaly as the microbe may fail to grow in vitro. One of the earliest examples in altering the 56 57 carbon substrate in a medium is the addition of the water-insoluble fraction of Alfalfa hay to petri 58 dishes. This addition lead to an increase in colony counts of the microbes that colonize the rumen of cattle.³ Others contain substrates such as glass or cotton-fibers as an alternative for 59 agar to evade fluctuating seaweed prices.^{4,5} Altering carbon sources gained further attention in 60 61 the mid-2000's with reports that modifying the organic carbon substrate in media recipes altered microbe growth and sporulation of environmental isolates.^{6,7} This catalyzed a variety of studies 62 63 that altered media to increase bacterial production of pharmaceutically relevant molecular 64 classes, escalate potential biodiesel sources, as well as encourage growth of specific bacterial species from animal microbiomes.^{8–10} This research solidified the foundation for what is now 65 66 common practice to utilize several media when attempting to cultivate microbes from 67 environmental samples (Figure S1). Recent studies have revealed that utilizing different organic carbon substrates can alter bacterial metabolism, leading to the discovery of novel compounds
 and potential biofilm inhibitors.^{11,12}

70 Taking these developments into consideration, we were interested in cultivating the 71 zebrafish gut microbiome to build a library of bacteria for testing in high-throughput antimicrobial and biofilm assays.^{13,14} When considering the native environment of vertebrate intestines, the 72 73 main components of the system include the dietary nutrients entering the system for digestion 74 and the indigestible nutrients that represent the fecal matter. Therefore, for microbes living in 75 the intestinal tract, dietary fiber may serve as a large resource of nutrients and carbon. To 76 optimize bacterial cultivation and isolation from zebrafish intestines, we utilized four types of 77 media varying in nutrient density. Interestingly, the addition of organic insoluble fiber to the least 78 nutrient medium led to an increase in the number of colonies observed on isolation plates as 79 well as an increase in the diversity of colony morphologies.

80 Though the zebrafish gut microbiome varies slightly throughout development, once 81 adulthood is reached, the gut microbiome is heavily conserved and strongly colonized by y-Proteobacteria, Firmicutes, and Fusobacteria.^{15,16} Using the high-throughput bioinformatics 82 83 pipeline IDBac,¹⁷ we isolated and analyzed 118 individual colonies from the zebrafish gut 84 microbiome. IDBac analysis showed that our cultivation technique generated a taxonomically diverse library, reflecting that of previous metagenomic studies of the zebrafish gut microbiome, 85 86 vide supra. Confirmation of a subset of the isolates with 16S rRNA gene sequencing showed 87 that out of the 118 bacterial colonies isolated, our library represents bacterial isolates from three 88 phyla. In this study we show that addition of insoluble fiber to low nutrient agar can increase the 89 number of microbes isolated from vertebrate intestines. This simple, affordable addition also 90 alters the specialized metabolite production of bacterial isolates allowing the bacteria to produce 91 different metabolites that may be more similar to those produced in vivo in an in vitro environment.¹⁸ 92

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94 Results

95 Addition of insoluble fiber to low nutrient agar plates increases bacterial growth. To 96 cultivate gut-derived microbes from zebrafish intestines, four types of agar media were used to 97 target both fast and slow growing bacteria. Plates varied in nutrient density with high vitamin 98 freshwater (HVF), NTF, SNF + fiber, and simple nutrient freshwater (SNF) decreasing in nutrient density respectively (**Figure 1**).^{7,19} Over 100 individual colonies were isolated over three months 99 100 of growth to construct a zebrafish gut microbiome library. Addition of fiber to the least nutrient 101 medium (SNF) led to a 1.7-fold increase in bacterial colony growth, surpassing the highest 102 nutrient medium (HVF). Dissection of two healthy zebrafish intestines and two plating 103 techniques in triplicate led to the isolation of 23, 38, 36, and 21 individual colonies from the HVF, NTF, SNF + fiber, and SNF plates, respectively. 104

105 IDBac analysis reveals that addition of insoluble fiber supports a diverse cultivation of 106 gut microbes from agar plates. Library isolates were prepared for bioinformatics analysis 107 using IDBac, a matrix-assisted laser desorption/ionization time-of-flight (MALDI-TOF) mass 108 spectrometry pipeline that allows for rapid analysis of microbial proteins and specialized 109 metabolites.^{17,20} The standard IDBac workflow uses a 70% aqueous formic acid solution to lyse 110 cells but we found that this procedure was not efficient at lysing the more mucoid bacterial colonies isolated.²⁰ A trifluoroacetic acid (TFA) extraction prior to plating samples for analysis 111 112 was the most effective method to consistently collect viable MS fingerprint profiles for IDBac 113 analysis.²¹ Measuring proteins in the 3,000 to 15,000 Da range. IDBac organized the microbial isolates into a pseudo-phylogeny dendrogram based on MS fingerprint protein similarity.¹⁷ 114 115 Figure 2 highlights 82 of the 118 bacterial isolates from our library. 16S rRNA sequencing was 116 performed on a subset of isolates. In tandem, these analyses confirmed the generated library is 117 diverse containing a minimum of 15 identified species within three phyla: Actinobacteria, 118 Proteobacteria, and Firmicutes.

119 Metabolite association network highlights changes in metabolite production with

120 different carbon sources. The IDBac pipeline also generates metabolite association networks 121 (MANs) for rapid visualization of metabolite production and allows for a simple comparison between bacterial isolates grown in different conditions.²⁰ Figure 3A shows a dendrogram 122 123 highlighting 16 isolates that were grown on ISP2 agar, commonly used for lab cultivation, or SNF + fiber agar plates.²² In a MAN, nodes correspond to ions detected in a sample and the 124 125 relationships between production across strains or conditions are visualized as arrows 126 connecting nodes. The MANs of two isolates (Figure 3B; N2015 and S2008) imply that both 127 have unique specialized metabolite production potential and when grown on agar supplemented 128 with fiber, there is an increase in the unique specialized metabolites detected. The MAN for 129 isolate SF2016 (Figure 3C), which was cultivated from a SNF + Fiber plate, is a robust producer 130 of specialized metabolites. Interestingly, when comparing the two conditions, there is a larger 131 number of nodes detected when grown without fiber.

132 Growth of gut microbes with insoluble fiber significantly increases the number of unique 133 metabolites produced. High resolution liquid chromatography mass spectrometry (HR-LC-MS) 134 of bacterial extracts from library isolates, SF2016, N2105, and S2008, were analyzed using 135 XCMS, a metabolomic platform for statistical analyses of HR-LC-MS data. Through pairwise 136 comparisons, XCMS can determine features (ion and retention time pair) that are up regulated 137 in one extract versus another and visualize these differences via a cloud plot. As seen in Figure 138 4A & B, a cloud plot compares the total ion chromatograms (TIC) of two samples (i.e SF2016 139 grown on fiber agar vs. fiber agar control). Upregulated features are denoted by a circle and the 140 darker the color of the circle, the more significant the signal. The cloud plot in Figure 4A 141 highlights 49 features that are significantly upregulated by SF2016 when grown on fiber agar 142 versus the 15 features observed when grown on non-fiber medium (p<0.001; Figure 4B). 143 Similar cloud plots with the isolates N2015 and S2008 exhibit the increased trend with more 144 features when the isolates were grown on fiber agar (p<0.001; Figures S2 & S3). Using XCMS 145 meta-analysis, the number of significant features produced by the three isolates were organized

into a Venn diagram to visualize the number of features unique to a specific isolate or shared
between two or more (Figure 4C & D). When comparing the number of features produced by
SF2016, N2015, and S2008 on fiber agar versus ISP2, the isolates had a 3.2, 3.3, and 1.5 fold
change in features from growth with insoluble fiber.

150 **Discussion**:

151 Microbial libraries for high-throughput drug discovery screening are typically generated 152 using two to six isolation media, varying in nutrient density, which select for fast or slow growing bacteria from an environmental sample.²³⁻²⁶ To generate a diverse library of gut-derived 153 154 cultivable microbes from the zebrafish intestine as well as capture the unique metabolite 155 production of this community, it is important to consider the carbon source(s) in the media. With 156 dietary fiber being a highly abundant substrate for microbes colonizing the intestines, a fourth 157 type of medium was utilized that incorporated the addition of insoluble fiber into SNF (the least 158 nutrient medium). Using four types of media varying from high nutrient density to low, HVF, 159 NTF, SNF + Fiber, and SNF respectively, 118 bacterial colonies were isolated to constitute a 160 zebrafish gut microbiome library (Figure 1). The addition of wet-autoclaved insoluble fiber (20 161 g/L) lead to an increase in the growth of individual bacterial colonies (Table S1). The highest 162 yield of bacterial isolates were collected from the average nutrient medium (NTF) however, the 163 addition of fiber to the SNF lead to nearly an identical isolate yield (Table S1). Of note, the 164 addition of fiber is a minimal and inexpensive addition compared to media typically used in 165 environmental isolations (Table S2).

The potential taxonomic and specialized metabolite diversity of the cultivated isolates were assessed to confirm whether the isolates matched previous metagenomic sampling studies.^{15,16} To investigate the newly generated library, a bioinformatics platform known as IDBac was used to characterize the isolates. The IDBac workflow and software were designed to rapidly collect protein and specialized metabolite profiles of microbial libraries produced from environmental samples utilizing a MALDI-TOF mass spectrometer.^{17,20} Of the 118 isolates, 82

172 were examined using the IDBac workflow to organize the microbial library (Figure 2). The 173 remaining 36 isolates were not analyzed due to either poor data quality collection during MALDI-174 TOF MS analysis or failure to recultivate from the initial glycerol stock (**Table S1**). Based on the 175 MS protein fingerprints of the isolates, the newly constructed library represents three phyla. 176 However, a number of isolates did not group into distinct branches nor with the IDBac in-house library that is built primarily from freshwater sponge-isolates,¹⁷ cheese microbes,²⁷ and wild fish 177 gut-derived microbes.²⁴ Therefore, 16S rRNA sequencing on a subset of isolates in this library 178 179 was performed to confirm the identity of a subset of the isolates and provide insight towards 180 whether the cultivation efforts did support the growth of a diverse, gut microbe library (Table 181 S4). Addition of taxonomic information gathered from 16S rRNA sequencing analysis to Figure 182 2 supports the groupings formed from IDBac analysis.

183 Metagenomic studies of zebrafish intestines have shown that adults are colonized by a 184 multitude of bacteria with v-Proteobacteria, Firmicutes, and Fusobacteria as the most abundant members.^{15,16} 16S rRNA sequence analysis confirmed our cultivation strategy produced a 185 186 library that accurately represents the major components of the zebrafish gut microbiome with 187 representatives from the Firmicute, Actinobacteria, and Proteobacteria phyla (Figure 2). 188 Bacteria from the three phyla have been linked to the gut and overall organism health. 189 Firmicutes typically colonize the large intestines, primarily the colon, and are one of the most prevalent phyla represented in the gut microbiome.²⁸ They have documented roles in 190 fermentation of carbohydrates as well as lipid droplet formation for energy storage.^{29,30} In our 191 192 dendrogram we observe the same trend with a considerable number of our isolates grouped 193 into the Firmicute phylum (Figure 2). Of the Firmicutes isolated, B. subtilis was the most 194 abundant isolate in this phylum. During its lifecycle in the gut, B. subtilis is known to form spores in half the time it takes for a laboratory isolate.³¹ Thus, it is possible the increase in isolation of 195 196 B. subtilis in our library is due to the isolation of the more prolific, endogenous B. subtilis isolates 197 from zebrafish intestines. B. subtilis has also been shown to protect fish from the aquatic

pathogen Aeromonas hydrophila, which causes inflammation and steep mortality rates.³² With 198 199 A. hydrophila infections being a persisting problem in zebrafish research facilities, the protective 200 bioactivity of *B. subtilis* could contribute to the large representation of this species in our 201 isolation efforts.³³ Microbes responsible for maintaining homeostasis in the gut microbiome system fall under the Actinobacteria phylum.³⁴ These maintenance microbes, which also reside 202 203 in the colon, make up only a small portion of the gut microbiome community even though they hold a pivotal role in overall gut flora health.^{28,34} Once again, our dendrogram highlights the 204 205 successful isolation and profiling of at least three genera of Actinobacteria such as 206 Rhodococcus, Kocuria, and Mycolicibacterium (Figure 2).

207 Lastly, we observe Gram-negative Proteobacteria generally found in the small intestine. 208 This population is minor with respect to the rest of the gut microbiome because many 209 Proteobacteria are opportunistic and over colonization of these microbes has been strongly correlated with several human diseases.^{35,36} More specifically, we isolated and profiled 210 211 microbes such as Pseudomonas montelli, Aeromonas, and Shewanella that have been previously isolated from feces and from aquatic environments respectively.^{36,37} 212 No 213 representatives from the Fusobacteria phylum were isolated because the cultivation methods 214 used did not support the specific conditions needed to grow anaerobic bacteria. However, we 215 hypothesize that due to the observed increase in cultivation of aerobic bacterial growth in this 216 study, the same trend would hold if repeated with anaerobic conditions and would support the 217 growth of Fusobacteria.

Following grouping by MS protein fingerprints with IDBac, specialized metabolite diversity was investigated using a metabolite association network (MAN) that corresponds to the IDBac generated dendrogram. Using IDBac, a dendrogram was created grouping 16 isolates grown on ISP2 or SNF + Fiber agar (**Figure 3A**). Selecting isolates N2015 and S2008 on the dendrogram generated two MANs that correspond to each of the isolates (**Figure 3B**). The MANs show signals found in both conditions(shared nodes) and unique signals (single nodes)

224 that were detected when an isolate was grown with or without fiber. The MANs highlight that after removing nodes associated with matrix and the two types of mediums (controls), both 225 226 isolates produce more unique specialized metabolites on SNF + Fiber than ISP2 (Figure 3B). 227 Even though neither of these strains were originally isolated from SNF + Fiber plates but rather 228 NTF and SNF media respectively, the MAN infers that metabolite production is increased by 229 exposure to insoluble fiber during cultivation. Isolate SF2016 seems to be a prolific producer of 230 unique chemistry based on the generated MAN (Figure 3C). Interestingly, the MAN suggests 231 that SF2016 produces more unique specialized metabolites when grown on ISP2 medium rather 232 fiber medium. In the case of SF2016, this is an example of how cultivation through the addition 233 of insoluble fiber, allowed for the isolation of a prolific metabolite producer from the gut 234 microbiome.

235 Having used IDBac as a prioritization tool, we aimed to further investigate and quantify 236 the differences in metabolite production when gut microbes are grown on medium with insoluble 237 fiber. Bacterial extracts of isolates SF2016, N2015, and S2008 grown on fiber or ISP2 agar, 238 extracted, and analyzed via HR-LC-MS. The metabolomics platform XCMS was used to analyze 239 and run statistical analysis on these extracts allowing for the selection of features that are 240 significant (p<0.001) and abundant (based on fold change in intensities). XCMS can perform a 241 suite of statistical analyses and output several visual representations of these statistical results with one example being cloud plots.³⁸ Figure 4A shows a cloud plot comparing two TICs: 242 243 SF2016 grown on fiber agar (top) and a fiber agar control (bottom). When grown on fiber agar 244 SF2016 produces 41 features compared to 15 when SF2016 is grown on ISP2 (p<0.001; 245 Figure 4B). If the significance threshold is relaxed to a p<0.01, the number of significant 246 features between these two conditions are 174 and 49 respectively (Figure S3). Regardless of 247 the threshold set for significance, SF2016 consistently makes 3-fold or more features when 248 grown on medium supplemented with insoluble fiber than that without. The same trend holds 249 with isolate N2015 (Figure S4) with an increase in unique metabolite production when grown on

fiber agar. Interestingly, though S2008 does show unique metabolite production when grown on fiber agar, the cloud plot does not support that the addition of fiber lead to an increase in the number of metabolites produced, as observed in previous strains (**Figure S5**).

253 Using XCMS meta analysis, which was designed to prioritize interesting metabolite features from large metabolomic datasets, significant signals from each of the three isolates 254 were identified and organized into a Venn diagram.³⁹ Though SF2016 seems to be the most 255 256 prolific of the three isolates when grown with fiber (Figure 4C), it is clear that the same trend 257 holds in N2015 and S2008 with all three isolates showing an increase in metabolite production 258 when grown on a medium with insoluble fiber compared to ISP2 (Figure 4C & D, respectively). 259 Our HR-LC-MS results support that the addition of insoluble fiber to medium leads to an 260 increase in specialized metabolite production in a natural product laboratory workflow.

261 It is worth noting that there are differences in the number of observed specialized 262 metabolites between the IDBac MANs and the XCMS chromatograms. The differences in ions 263 observed can arise for a variety of reasons. Importantly, these are two different ionization 264 sources (MALDI vs electrospray ionization - ESI) and the exact mechanism by which ions are 265 produced is fundamentally different. Various functional groups on the specialized metabolites 266 themselves may favor one ionization method over the other and neither method is capable of 267 comprehensively ionizing every metabolite in a given extract. Secondly, the samples subjected 268 to the analyses are also fundamentally different. MALDI is incredibly fast (milliseconds per 269 sample) and utilizes a small amount of a microbial colony, this direct detection typically favors 270 singularly charged ions with little in-source fragmentation. Whereas ESI-LC-MS allows for a 271 concentration of the colony and surrounding agar, which likely captures a better sampling of 272 specialized metabolite production. Additionally, LC-MS analyses are time consuming with each 273 run taking at least 12 mins/colony extraction. This allows for separation of different isomers 274 which are not possible to distinguish in MALDI-TOF MS. However, ESI is known to give rise to 275 in-source fragments which may falsely increase the perceived number of specialized

276 metabolites in a given sample. All in all, while the overall numbers of specialized metabolites are 277 different, the trends hold across these orthogonal methods. So the most prolific producer 278 observed via the IDBac generated MAN yields the highest number of features in the ESI-LC-MS 279 analysis.

280 One of the biggest challenges the field of natural products faces is the frequent rediscovery of known small molecules from environmental samples.⁴⁰ Since the discovery of 281 282 penicillin over 75 years ago, workflows which include cultivation of select genera mainly based 283 on morphological features or 16S rRNA followed by bioassay guided fractionation have been used to continue searching for new drug candidates and/or scaffolds.⁴¹ This workflow has been 284 285 historically successful in elucidating novel specialized metabolites produced in high titer by 286 environmental microbes. However, advances in technologies such as bioinformatics, mass 287 spectrometry, proteomics, and synthetic biology have improved our ability to identify bioactive 288 metabolites that are produced in smaller titers. A distinct limitation of these methods however, is their inability to detect or predict novel metabolites while assessing taxonomic diversity.⁴¹ 289 290 Therefore, it is important to consider how changes in cultivation techniques, such as altering 291 carbon sources, can alter the isolation of specific microbes as well as the abundance and 292 variety of metabolites produced. As discussed in the introduction, work has already been 293 completed showing that altering nutrients or growth conditions can lead to increases in 294 cultivation, altered specialized metabolism, and the discovery of putative drug candidates. Thus, 295 developing new methods to propagate microbial metabolite production prior to beginning natural 296 product discovery efforts could be vital to assisting future drug discovery.

With the goal of constructing a taxonomically and chemically diverse zebrafish gut microbe library, insoluble fiber was added to isolation medium as a carbon source. By providing this solid substrate during *in vitro* growth, we observed an increase in bacterial growth to isolate microbes from environmental samples. Harnessing the speed, accuracy, and sensitivity of the IDBac workflow, protein and metabolite profiles of the generated library supported that the

302 increase in cultivation observed from the addition of fiber encouraged growth of the gut 303 microbial community and suggested that providing insoluble fiber as a carbon source alters 304 metabolite production of these isolates. Metabolomic statistical analysis of three bacterial 305 isolates, SF2016, N2015, and S2008, confirmed that regardless of whether an isolate was originally cultivated from a SNF + Fiber plate, addition of insoluble fiber to growth medium lead 306 307 to an increase in metabolite production. Further analysis is required to determine if the increase 308 in metabolite production observed represents novel metabolites that have not been cultivated in 309 vitro or if this cultivation technique allows for metabolite isolation that has traditionally only been 310 observed in vivo. Work is ongoing to perform biological assays and identify constituents from 311 the cultivable zebrafish gut microbes with antimicrobial and biofilm inhibition activity.

312 Materials and Methods:

Agar plate preparation. Agar plates were prepared by following the medium recipes detailed in **Table S4**. Mediums were autoclaved for 45 minutes and cooled to 55°C prior to the addition of
25 mg/L of 0.22 micron sterile filtered nalidixic acid and cycloheximide (Sigma).

316 Dissection of Zebrafish Intestines. Animals were treated and cared for in accordance with the 317 National Institutes of Health Guide for the Care and Use of Laboratory animals. All experiments 318 were approved by the University of Illinois at Chicago Institutional Animal Care and Use Committee (IACUC). Two adult *casper* zebrafish (lacking pigmentation),⁴² were sacrificed at >90 319 320 days post fertilization with 0.1% tricaine solution for 10 minutes and bathed in 70% EtOH prior to 321 dissection. To dissect out intestines, a ventral incision was made from the front fin to the back 322 fin. If the fish was female, eggs were separated and removed to expose the intestines. Both 323 ends of the intestinal tract were cut and the tract was removed.

Intestinal sample plating. The intestines were transferred to a 1x PBS solution with three sterilized glass beads. This solution was vortexed for several minutes to break up the intestinal tissues. A 10-fold dilution of the intestinal solution was made before proceeding. Intestinal solution was plated in triplicate using two plating techniques (1) spreading or (2) serial spotting.

328 For (1) spreading, 100 μ L of the intestinal sample was pipetted to the agar and spread for even 329 distribution of the sample. For serial spotting (2), a sterilized cotton swab was dipped into the 330 intestinal solution and spotted throughout the plate. The entire plating procedure was then 331 repeated with the 10-fold dilution. Plates were left to grow for up to three months at room 332 temperature (~25°C).

333 *Gut microbe isolation.* Diversity plates were frequently monitored for new growth. New colonies 334 were transferred to ISP2 to purify to single colonies. Once the purity of the culture was 335 confirmed, a single colony was transferred to a liquid culture of ISP2 media. This liquid culture 336 was left to shake at 225 RPM at 25°C until the liquid culture was turbid. Once turbid, the liquid 337 culture was used to plate the isolate on ISP2 agar and frozen stocked.

338 IDBac sample preparation. From the pure isolates grown on ISP2 or SNF + fiber media, a 339 sterilized toothpick was used to transfer a portion of a bacterial colony to a sterilized 340 microcentrifuge tube containing 5 µL of HPLC grade TFA. Samples remained in TFA for 30 341 minutes to facilitate cell lysis and protein extraction. Following this incubation time, DI water (20 342 µL) and acetonitrile (30 µL) were added to each sample, briefly vortexed, and centrifuged at 343 10.000 rpm for two minutes. The supernatant (1.5 µL) was mixed with 1.5 µL of □-cyano-4-344 hydroxycinnamic acid (CHCA) matrix for a 1:1 ratio of sample to matrix. The 1:1 sample:matrix 345 mixture was then plated on a MALDI target plate in technical triplicate for IDBac analysis (1 µL). 346 Measurements were performed in positive linear and reflection modes on an Autoflex Speed 347 LRF mass spectrometer (Bruker Daltonics) equipped with a smartbeam-II laser (355 nm).

348 16S sequencing molecular analysis. Total genomic DNA was extracted using a commercially 349 Ultraclean Microbial available DNeasy Kit (Qiagen) following the manufacturer's 350 recommendations. Primer pair 27F (5'-CAGAGTTTGATCCTGGCT-3') and 1492R (5'-351 AGGAGGTGATCCAGCCGCA-3') were used to amplify the partial 16S ribosomal RNA (rRNA) gene sequence.⁴³ PCR conditions in a BioRad thermocycler were as follows: initial denaturation 352 353 at 95°C for 5 minutes, followed by 35 cycles of denaturation at 95°C for 15 seconds, annealing

at 60°C for 15 seconds, and extension at 72 °C for 30 seconds, and a final extension step at 72
°C for 2 minutes. Each amplified product was purified using QIAquick PCR Purification kit from
Qiagen, followed by Sanger sequencing. Data analyzed by Geneious V11.1.4 software.

357 IDBac protein analysis. To generate dendrograms, MALDI-TOF MS protein data was uploaded 358 to IDBac. The following settings were used to generate reported dendrogram: percent presence: 359 70, signal to noise ratio: 4, lower mass cutoff: 3,000, upper mass cutoff: 15,000, ppm tolerance: 360 distance algorithm: euclidean, clustering algorithm: ward.D2, 1000, used peak 361 presence/absence as grouping criteria.

362 IDBac Metabolite association networks. A new dendrogram was constructed in IDBac using 363 MALDI-TOF MS data collected on the 16 isolates that were grown on both fiber and ISP2 364 medium using the same settings as previously. For MANs, isolates SF2016, N2015 and S2008 365 were selected and the following settings were applied; percent presence: 70, signal to noise 366 ratio: 4, lower mass cutoff: 200, upper mass cutoff: 2,000, ppm tolerance: 1,000, sample 367 subtraction: Matrix. The network data was downloaded as a .csv file from IDBac and 368 importanted into Gephi version 0.9.2. This was repeated with sample subtraction being changed 369 to fiber and ISP2 agar controls. In Gephi, MANs for the same isolate were compared and nodes 370 corresponding to matrix or agar controls were manually removed to generate reported figures.

371 *Metabolite extraction from bacterial isolates.* Isolates SF2016, N2105, and S2008 were plated 372 on thin (3 mL of agar in 60 mm petri dish) SNF + Fiber or ISP2 media in duplicate. Samples and 373 control plates were grown for three days at 25 °C. Entire contents of petri dish extracted with 3 374 mL of MeOH and sonicated for 30 minutes. Crude extract were used for HR-LC-MS analysis 375 and stored at -20 °C. All extractions were performed in biological replicates (N =3).

376 *HR-LC-MS data collection and XCMS analysis.* Biological extracts were pooled (1mg/mL) and 377 run on a Bruker Impact II qTOF with a C18 UPLC (Phenomenex) in two technical replicates. 378 The method for MS¹ data collection was as follows: solvent A (H20 with 0.1% formic acid) and 379 solvent B (ACN with 0.1% formic acid). 10% isocratic solvent B for 2 minutes, 10%-100%

380	gradient of solvent B for 8 minutes, 2 minute wash of 100% solvent B and 2 minute equilibration.
381	Data was converted to .mzXML from Bruker software Data Analysis and uploaded to the online
382	metabolomics platform XCMS. Pairwise comparisons of SF2016F vs Fiber agar, SF2016I vs
383	ISP2 agar, and SF2016F vs SF2016I were run using Parameter ID: UPLC/Bruker Q-TOF pos.
384	The same analysis was run for isolates N2015 and S2008. Cloud plots were generated with the
385	following settings; p-value: 0-0.001, fold change: ≥1.5, retention time: 1-12, intensity: ≥5,000.
386	For XCMS meta analysis, pairwise jobs of each of the three isolates versus the fiber control
387	were selected and run with the following settings; fold change \geq 1.5, max p-value \leq 0.001, max
388	intensity \geq 5,000, <i>m</i> / <i>z</i> tolerance 0.01, RT tolerance 60 secs. The same workflow was repeated
389	for meta analysis of each isolate with ISP2 control.
390	

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511 Figure Legends

512 Figure 1: Diversity plates of isolated gut microbes. Using four types of agar, we observed a

- 513 significant increase of bacterial growth in plates supplemented with insoluble fiber. The amount
- of growth observed in fiber supplemented plates (SNF + Fiber) was equivalent to that
- 515 documented in high vitamin plates (HVF).

516 Figure 2: IDBac constructed dendrogram of cultivated bacterial isolates from the

517 **zebrafish gut.** Our library is composed of over 80 isolates covering three phyla. To generate

the IDBac dendrogram the following analysis settings were used: percent presence: 70, Signal

to noise ratio: 4, Lower mass cutoff: 3,000, Upper mass cutoff: 15,0000, ppm tolerance: 1000.

- 520 Distance algorithm: euclidean, Clustering algorithm: ward.D2, used presence/absence setting
- 521 for dendrogram cladding.

522 Figure 3: Comparison of metabolite production with and without fiber. (A) IDBac

523 dendrogram of 16 isolates grown with or without fiber. (B) Metabolite association network (MAN) 524 of isolates S2008 and N2015 grown with and without fiber. (C) MAN of isolate SF2016

525 comparing the metabolites produced when grown with or without fiber. Any m/z nodes

- 526 corresponding to matrix or agar controls were subtracted prior to analysis. To generate the
- 527 MANs the analysis settings used were as follows: percent presence: 70, Signal to noise:4,
- 528 Lower mass cutoff: 200, Upper mass cutoff: 20000, ppm tolerance: 1000. Rather than displaying
- the MAN for the entire dendrogram, specific samples were highlighted and the corresponding
 MAN was downloaded to visualize in open graph platform Gephi (version 0.9.2) using the Yifan
- 531 Hu layout.⁴⁴ 532
- 533 Figure 4: Gut microbe growth on fiber agar increases specialized metabolite production.

534 HR-LC-MS data collected from metabolite extracts of library isolates SF2016, N2015, and

535 S2008 were analyzed using XCMS pairwise and meta analysis. (A) Cloud plot comparison of

536 SF2016 grown on fiber agar (top) and fiber agar control (bottom) highlighting significant

- 537 metabolites (dots) produced by SF2016 when grown on fiber agar. The intensity of color of a
- 538 circle correlates to the increased significance of the upregulated signal. (B) Cloud plot
- 539 comparison of SF2016 grown on ISP2 agar (top) and ISP2 agar control (bottom). The Venn
- 540 diagrams on the right represents the number of signals that are unique to each library isolate
- 541 when grown on (C) fiber agar or (D) ISP2 medium.







