Metaproteomics of Gut Fungi in Gnotobiotic Mice

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11 Abstract 150 words

 Intestinal fungi are a fundamental component of the gut microbiome and play important roles in mammalian host biology. At the same time, the contribution of gut fungi to host health and disease remains understudied due to their low abundance. In that respect, gnotobiotic animals with defined microbial populations of reduced complexity represent a well-suited model system that highlights the effects of low abundant gut fungi on host 17 physiology and other members of the microbial community. Here I present a label-free 18 quantitative metaproteomic approach for characterising simplified microbial communities in 19 gnotobiotic mice. The model allows for exploring various research questions on the role of gut fungi in disease pathogenesis, microbial ecosystem maturation, or host-microbiome crosstalk.

22 1. Introduction

23 The gut mycobiome defines the fungal portion of the gut microbiome, which constitutes less 24 than 0.1% of the human gut microbial ecosystem (1, 2). Despite being vastly outnumbered by 25 bacteria, fungal cells can be up to 100 times bigger in volume and contain up to 200 times 26 larger genome than most bacteria (3). The low abundant fungal species, therefore, have a 27 sizable impact on gut microbial community and intestinal homoeostasis (4, 5), as 28 documented by their roles in disease pathogenesis, including cancer (6), autoimmune (7), 29 metabolic (8), and neurological disorders (9). Characterisation of the interactions between 30 host, fungal, and other microbial cells in health and disease is thus essential for strategies 31 aiming to manipulate the gut microbiome for disease prevention and treatment.

 From the different omics approaches, metaproteomics are uniquely positioned to describe consequences of gut microbiome alterations by detecting host and microbial proteins simultaneously. Faecal metaproteomes of gnotobiotic mice colonised with defined microbial consortia exhibit signatures specific to the microbial status (10, 11), and provide information on various cellular pathways functional in the host gut epithelium and different microbial cells.

 Here I outline methodology for describing the effects of fungal gut colonisation in gnotobiotic 39 mice (Figure 1), including practical aspects of the experimental workflow. The protocol was 40 initially applied for the evaluation of gut colonisation with six fungal strains from taxa that 41 commonly colonise the human gut (12, 13) and that have been previously linked to atopy and 42 asthma risk (11, 14). The protocol can be adapted to answer research questions on the micro- ecology of specific gut fungal species or combined with different disease models in mice. In general, an appropriate sample processing protocol needs to be evaluated in the context of each study's aims and should consider unbiased methods for microbial protein enrichment and protein extraction efficiency. Also, the availability of the genomes for all microbial strains 47 used is critical for creating matched protein databases and correct assignment of proteins. Finally, the protocol will illustrate that data interpretation can be guided by several general statistical analyses but that it is also, from a large part, a creative process that is unique to the objectives of each specific research work.

71 2.4 Protein extraction

109 3. Methods

110 3.1 Gnotobiotic mice

- 111 1. Germ-free (GF) mice need to be housed at a dedicated gnotobiotic mouse facility, and
- 112 all the animal work must follow animal protocols approved by a corresponding
- 113 institution.
- 114 2. Selected microbial species are grown under anaerobic conditions in their respective 115 selective media until a stationary phase.
- 116 3. To generate gnotobiotic mice, female adult germ-free mice are orally gavaged twice,
- 117 three days apart, with 100 **μ**l of selected microorganisms (*e.g.*, strains of fungal
- 118 species of interest) or microbial consortia (Fig. 1, Note 1).
- 119 4. After the second gavage, mice are paired with gem-free males for mating in a 2:1
- 120 female: male ratio per cage. Two breeding pairs are used for each experimental group
- 121 (*i.e*., colonisation condition) producing on average 6 offspring (±3). (Note 2)
- 122 5. To ensure microbial colonisation with the desired consortia in the offspring, the
- 123 corresponding inoculum should be further spread on the dams abdominal and nipple
- 124 regions on days 3 and 5 after birth. Microbial engraftment can be confirmed by Sanger
- 125 sequencing of DNA isolated from faecal samples.
- 126 6. Mice are often kept at a maximum of five animals per cage and housed inside
- 127 gnotobiotic isolators. Standard conditions include a 12-h light/12-h dark cycle, 40%
- 128 relative humidity, 22–25 °C, and *ad libitum* access to sterile food and water.

- Figure 1 A gnotobiotic model for characterisation of fungal gut colonisation by label-free
- quantitative metaproteomics. Abbreviations of potential colonisation conditions indicated in
- circles: B, bacteria only; BF, bacteria-fungi; F, fungi only; GF, germ-free.

- 155 4. To disrupt released cellular DNA that would interfere with downstream protein
- 156 quantification, the supernatants are sonicated 3 x for 10s with 20s resting intervals on 157 ice.
- 158 5. Sonicated samples ae centrifuged at $18,000 \times g$, 4° C, for 10 min, the supernatants
- 159 collected, and protein concentration is measured by using a spectrophotometer.
- 160 3.4 Sample preparation for the proteomic analysis
- 161 The cell lysates of faecal microbiota-enriched samples are processed according to Filter-
- 162 Aided Sample Preparation protocol (18, 19).
- 163 1. Cell lysates containing 500 µg of total protein are incubated with 10 mM DTT in 100
- 164 mM Ammonium Bicarbonate (ABC) at the solution to total protein ratio (v/w) 1:10 for
- 165 45 min at 56°C without shaking.
- 166 2. YM-30 Microcon filter units are condition by adding 100 µl of urea buffer and
- 167 centrifuge at $14,000 \times g$ for 5 min.
- 168 3. The denatured protein samples from step 1. are mixed with 200 µl urea buffer in the 169 filter units and centrifuged at $10,000 \times g$ for 15 min.
- 170 μ 4. After discarding the eluate, the filtration units are washed once with 200 μ l urea buffer
- 171 $(10,000 \times g, 15 \text{ min}).$
- 172 5. The filtrate is discarded and 100 µl of 0.05 M iodoacetamide added to each sample.
- 173 The samples are then mixed at 600 rpm for 1 min in a thermo-mixer, and incubated
- 174 without mixing in the dark for 20 min,
- 175 6. The filter units are washed with 100 µl urea buffer three time, followed by three 176 washes with 100 μ l 50 mM ABC (10,000 \times g, 10 min).
- 177 7. Proteins are digested on the filter unit with trypsin in 40 mMABC (enzyme to protein 178 ratio (v/w) of 1:100) at 37°C for 18 h.
- 179 8. The released peptides are collected by adding 50 µl of MS grade water followed by 180 centrifugation at 14,000 x *g* for 15 min. Repeat this step twice.
- 181 9. The resulting peptide mixtures are cleaned up by using C18 solid-phase extraction 182 cartridges.
- 183 183 10. The collected samples are dried at 30°C in a vacuum concentrator and store at -80°C 184 **until further analyses.**
- 185 185 11. Prior to LC-MS/MS analysis, resuspend the peptide samples by following instructions
- 186 from chosen proteomic facility, for example by adding 1 µl of 100% formic acid and 19 187 μ l of 2% ACN or only in 1% formic acid.
- 188 188 12. An aliquot of the tryptic digests can be used to determine the concentration of the 189 **peptide mixtures by using colorimetric peptide assay kit.**

190 3.5 LC-MS/MS

- 191 The MS/MS analysis is typically carried out at a dedicated proteomic facility by personnel 192 operating the instruments. An example of a potential LC-MS/MS run setup is on an Orbitrap 193 Fusion Lumos Tribrid mass spectrometer operated with Xcalibur software and coupled to 194 Easy- nanoflow liquid chromatography 1200 system (Thermo Fisher Scientific). Below is an 195 example of an LC-MS/MS analytical run; however, each proteomic facility will have own
- 196 protocols matching their instrumentation and specific quality controls (Note 5).
- 197 1. Load 2 µg tryptic peptide sample onto a pre-concentration column (for example, 198 Acclaim PepMap 100, 2 cm ×75 µm i.d. nanoViper column, packed with 3 µm C18

- 199 beads) at a flow rate of 2μ /min of solvent A (0.1% formic acid and 3% acetonitrile in 200 LC-MS grade water).
- 201 2. Separate the peptides by a biphasic acetonitrile gradient (flow rate of 300 nl/min) on a
- 202 C18 analytical column (e.g., 75 μm x 50 cm; PepMap RSLC C18). Specifically, apply
- 203 solvent B (0.1% formic acid in 80% LC-MS grade acetonitrile) during a 120 min
- 204 gradient from 5 to 40% (5% to 28% in 105 min followed by an increase to 40% B in 15
- 205 min) at a flow rate of 0.3 μ L/min to elute the peptides.
- 206 3. The separated peptides are directly electrosprayed using 2.1 kV voltage into the ion 207 transfer tube (300°C) of the MS instrument operating in positive mode.
- 208 4. Operate the mass spectrometer in data-dependent acquisition mode to automatically 209 switch between MS and MS/MS acquisition.
- 210 5. Full scans are acquired at 120,000 Full-Width at Half Max resolution to detect the
- 211 precursor ions having m/z between 375 and 1,575 (Scan Range) and a +2 to +7 charge
- 212 (automatic gain control at 4×10^5 and maximum injection time 50 ms).
- 213 6. Precursor selection: The Orbitrap is operated using the top speed mode with a 3 sec
- 214 cycle time. The most intense precursor ions presenting a peptidic isotopic profile and
- 215 having an intensity threshold of at least 5,000 are isolated using the quadrupole and
- 216 fragmented by higher-energy collisional dissociation (HCD, 30% collision energy) in
- 217 the ion routing multipole.
- 218 7. The fragment ions (MS2) are then analysed in the ion trap at a rapid scan rate
- 219 (automatic gain control at 1×10^4 and maximum injection time 35 ms).
- 220 8. Target ions already selected for MS/MS are dynamically excluded for 45s to avoid the
- 221 acquisition of the same precursor ion having a similar m/z (plus or minus 10 ppm).

3.6 Protein identification and quantitation

- 245 and should be removed. Any other remaining proteins, whose origins are not
- 246 consistent with the type of microbial colonisation of a specific mice group should be
- 247 checked at the peptide level, to confirm whether these are valid identifications or not.
- 248 6. For protein quantification, only proteins with LFQ intensities in at least two biological
- 249 replicates and identified by a minimum of two unique peptides should be considered.
- 250 3.7 Data analyses
- 251 1. Before any analyses, the proteins LFQ intensities should be log2-transformed. To
- 252 correct for differences in the sample amounts injected into LC-MS/MS, the relative
- 253 protein amounts can be normalised by dividing each protein LFQ intensity by the 254 median intensity for all proteins in a given replicate (21).
- 255 255 2. To assess the biological variability of each experimental group, the Pearson 256 correlation coefficients based on the protein intensities of each sample can be 257 calculated in Perseus.
- 258 3. The statistical analyses can be performed on specific groups with defined microbial
- 259 status. Only relevant mice groups have to be used in the statistical analyses of
- 260 bacterial or fungal proteins, *e.g.*, only those mice groups colonised with fungi will be 261 used to analyse fungal proteins.
- 262 4. To identify proteins with levels that differ among the strains, analysis of variance
- 263 (ANOVA) can be used to compare the global mean level of each protein against its
- 264 corresponding amount in each condition. Standard settings for the ANOVA test in
- 265 Perseus include FDR calculations performed by a permutation-based procedure with
- 266 250 randomisations and a cut-off of 5%. To determine the exact pairwise differences

- 267 in protein levels, Tukey's honestly significant difference (THSD) should be performed on ANOVA-defined significant hits.
- 269 5. Perseus also allows for additional uni- and multivariate analyses such as principal component, multivolcano, or hierarchical clustering analyses.
- 271 6. The functional protein classification is usually be done using The Database for
- Annotation, Visualisation and Integrated Discovery (22) and Gene Ontology

enrichment (23).

- 274 7. To ensure open and fair science, the mass spectrometry proteomics data should be
- deposited to a repository database (*e.g*, ProteomeXchange).

277 Notes

278 1. A well-described bacterial consortium of mouse-derived strains that are persistent, 279 inheritable and elicit an immune response in mice similar to a complex microbiota is 280 the Oligo-MM12 consortium (24, 25). The method for mice colonisation with Oligo-281 MM12 includes preparation of the gavage inoculum under anaerobic conditions by 282 mixing 100 μl of 2-day-old microbial cultures of each species.

283 283 2. For evaluation of physiological changes induced by microbial colonisation, each

284 animal constitutes an individual biological replica in the gnotobiotic experiment.

285 However, for metaproteomics sampling, pooled stool sample collected from animals

286 housed in the same cage, and having the same microbial status, is often necessary

287 due to limited stool material that each animal can produce, and relatively large

288 volume of stool (at minimum 300mg) needed for metaproteomic sample processing.

289 The LC-MS/MS analysis can then be performed on replicates of pooled faecal samples

290 collected from mice that underwent the same microbial colonisation and were

291 housed in the same cage and gnotobiotic isolator.

292 3. Different enrichment methods, such as strategies based on double filtering (26) and 293 differential centrifugation (18), have been applied to concentrate microbial cells from 294 stool samples and shown to improve the overall depth of faecal metaproteome 295 measurement. However, the differential centrifugation step was later shown to cause 296 non-specific removal of microbial cells and proteins (27). Stool without a pre-

297 treatment thus might provide an unbiased representation of the microbial proteins

298 but lead to a lower number of proteins identified, decreased microbial diversity, and

299 overrepresentation of the nonmicrobial components (host and food). A critical

 4. A quality control step comprising of microscopic examination of Gram-stained fractions of the pellet should be included to confirm bacterial and fungal cell extraction.

- 5. For optimal performance, the LC-MS/MS instrumentation should be calibrated before each sample batch, for example, by injecting a commercial protein digest to control 308 the performance of the LC and the mass spectrometer before the samples are acquired.
- 6. The LFQ approach of Maxquant is based on accurate determination of spectrometric
- 311 signal intensities (extracted ion chromatograms XICs) of peptides and relies on
- measurements of the three-dimensional space of peptide ion intensity, m/z, and
- chromatographic elution time. However, for proteins at low abundance, XICs are often
- contaminated by nearby signals, and although a protein can still be identified, it
- might not be quantified because of low-quality data.

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