1	THE RAMAZZINI INSTITUTE 13-WEEK PILOT STUDY ON GLYPHOSATE AND
2	ROUNDUP ADMINISTERED AT HUMAN-EQUIVALENT DOSE TO SPRAGUE DAWLEY
3	RATS: EFFECTS ON THE MICROBIOME
4	
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- 54 **Running title**: Effect of glyphosate and Roundup on gut microbiome of pups
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- 60

#### 61 ABSTRACT

#### 62 Background

Glyphosate-based herbicides (GBHs) are broad-spectrum herbicides that act on the shikimate pathway in bacteria, fungi, and plants. The possible effects of GBHs on human health are the subject of an intense public debate for both its potential carcinogenic and non-carcinogenic effects, including its effects on microbiome. The present pilot study examines whether exposure to GBHs at doses of glyphosate considered to be "safe" (the US Acceptable Daily Intake - ADI - of 1.75 mg/kg bw/day), starting from *in utero*, may modify the composition of gut microbiome in Sprague Dawley (SD) rats.

70 Methods

Glyphosate alone and Roundup, a commercial brand of GBHs, were administered in drinking water at doses comparable to the US glyphosate ADI (1.75 mg/kg bw/day) to F0 dams starting from the gestational day (GD) 6 up to postnatal day (PND) 125. Animal feces were collected at multiple time points from both F0 dams and F1 pups. The gut microbiota of 433 fecal samples were profiled at V3-V4 region of 16S ribosomal RNA gene and further taxonomically assigned and assessed for diversity analysis. We tested the effect of exposure on overall microbiome diversity using PERMANOVA and on individual taxa by LEfSe analysis.

78 Results

79 Microbiome profiling revealed that low-dose exposure to Roundup and glyphosate resulted in 80 significant and distinctive changes in overall bacterial composition in F1 pups only. Specifically, 81 PND31. corresponding to pre-pubertal in relative at age humans, abundance 82 for Bacteriodetes (Prevotella) was increased while the Firmicutes (Lactobacillus) was reduced in 83 both Roundup and glyphosate exposed F1 pups compared to controls.

84 Conclusions

This study provides initial evidence that exposures to commonly used GBHs, at doses considered safe, are capable of modifying the gut microbiota in early development, particularly before the onset of puberty. These findings warrant future studies on potential health effects of GBHs in early development such as childhood.

89

# 90 **KEYWORDS**:

91 Roundup; Glyphosate; Gut microbiome; Early developmental stage

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#### 93

#### 94 BACKGROUND

95 Glyphosate (IUPAC chemical name N-(phosphonomethyl) glycine) is the active ingredient of the most widely applied herbicide worldwide, glyphosate-based herbicides (GBHs), including the 96 best-known formulation Roundup. The substance glyphosate was initially discovered in 1950 by 97 98 a Swiss chemist, Henri Martin, at the pharmaceutical company Cilag [1]. Its herbicidal properties 99 were not discovered for another 20 years. Since glyphosate was patented in 1974 by Monsanto as a herbicide, approximately 9.4 million tons of GBHs have been sprayed, nearly half a pound of 100 101 glyphosate on every cultivated acre of land globally[2]. Furthermore, after the introduction of 102 genetically modified (GM) crops that are glyphosate-tolerant in 1996, usage of GBHs has 103 skyrocketed; about two-thirds of the total GBHs usage took place in recent decades. According to 104 the National Academy of Sciences report[3], in 2014 alone, annual glyphosate usage in agriculture 105 industry exceeded 110 million kilograms. Besides GM crops, farmers also apply GBHs on non-106 GM crops in order to accelerate the harvest. This practice, also known as desiccation, has led to

107 significant dietary exposure to the residues of glyphosate and its primary metabolite AMPA108 (aminomethylphosphonic acid)[4, 5].

109 The primary herbicidal function of glyphosate is to inhibit a key plant enzyme, namely 5-110 enolpyruvylshikimate-3-phosphate synthase (EPSPS). This enzyme participates in the 111 biosynthesis of aromatic amino acids (phenylalanine, tyrosine and tryptophan) via the shikimate 112 pathway in bacteria, fungi, and plants. The only enzyme known to catalyze a similar reaction in 113 bacteria is the enzyme MurA (UDP-N-acetylglucosamine enolpyruvyl transferase, EC 2.5.1.7), 114 which catalyzes the first committed step in the synthesis of the peptidoglycan layer of the bacterial 115 cell. Growth and survival of bacteria relies on the functionality of the enzyme MurA that is the 116 target of the broad-spectrum antibiotic fosfomycin. Glyphosate appears to occupy a binding site 117 of MurA, mimicking an intermediate state of the ternary enzyme-substrates complex[6]. The similarity between the two enolpyruvyl transferases EPSPSe and MurA appears to clarify the 118 119 antibacterial activity of Glyphosate. As the EPSPS-driven pathway does not exist in vertebrate 120 cells, many scientists and environmental regulating agencies believed that glyphosate would 121 impose minimal risks to mammals, in particular, humans [7–9]. For this reason, the shikimate 122 pathway has been the target for the development of new anti-microbial and anti-parasite agents. In 123 fact, glyphosate formulation has been patented as anti-parasite drug [10]. However, several 124 emerging evidence suggested that glyphosate or GBHs (such as Roundup) can adversely affect 125 mammalian biology via multiple mechanisms[11–13]. Downstream analyses of the functional 126 interactions between the host and its microbiome are starting to provide mechanistic insights into 127 these interactions. The mechanisms in which the enteric microbiome modulates specific effects on 128 the host is not completely clear, although several mediators have been suggested as potential 129 vehicles for such influence and might behave as effectors, enzyme cofactors and signal molecules.

Such mediators include lipopolysaccharides, peptidoglycans, short-chain fatty acids, 130 131 neurotransmitters and gaseous molecules[14, 15]. Recent advances in characterizing the 132 composition and function of individual microbial species and complex microbial communities are 133 revealing the importance of microbial metabolism for the host immune system[16]. The gut 134 microbiota produces an extremely diverse metabolite repertoire (such as propionic acid, a short-135 chain fatty acids) from the anaerobic fermentation of exogenous undigested dietary components 136 (such as fibers) that reach the colon, as well as endogenous compounds that are generated by 137 microorganisms and the host[17]. The single layer of epithelial cells that makes up the mucosal 138 interface between the host and microorganisms allows microbial metabolic products to gain access 139 to and interact with host cells, and thus influence immune responses and disease risk, in particular 140 at high concentration [18].

141 GBHs have been reported to alter microbiota in soil[19], plants[20] and animals[21, 22]. A number 142 of studies have suggested that GBHs could act as antibiotics in the mammalian gut microbiome. Recent studies have raised concerns about the health effects of glyphosate on gut microbiota of 143 144 farm animal when fed feed containing residues of glyphosate. For example, farm animal studies 145 linked epidemics of C. Botulinum-mediated diseases in dairy cows[23] to glyphosate exposure. It 146 has been proposed that glyphosate has a potential inhibiting effect on growth of commensal 147 bacteria, normally occupying the gut of farm animals. For example, a reduction of such beneficial 148 bacteria could be a predisposing factor for Campylobacteriosis (campylobacter infection) 149 described as an emerging food-borne disease[24]. Poultry is a major reservoir and source of 150 transmission of campylobacteriosis to humans[22]. Furthermore, GBHs were also found to be 151 capable of inducing multiple-antibiotic resistance phenotype in potential pathogens[25]. Therefore, 152 GBHs may have the potential to modify the animal and human microbiota, which, in turn, could

153 influence human health. However, up to date, no direct evidence has been reported to suggest any 154 interplay between GBHs exposure and the microbiome in humans, especially during early 155 development or in animal models exposed to GBH with low dosage relevant to humans. As 156 denoted in the Developmental Origins of Health and Disease (DOHaD) paradigm[26], early 157 environmental exposures are important to human health. In particular, the prenatal and neonatal 158 period represent a narrow but critical window of susceptibility to myriad environmental exposures 159 and conditions with potentially lifelong impacts on health and disease. A number of human and 160 animal studies [27–29] associate several diseases with early-life imbalances of the gut microbiota, 161 but it was recently pointed out the need for further evidence that GBHs, in particular at 162 environmentally relevant doses, can result in disturbances in the gut microbiome of human and animal populations with negative health implications[30]. Furthermore, exploring the effects of 163 164 GBHs on the microbiota from early-life until adulthood in different windows of susceptibility, may give a more accurate portrayal of the microbial conditions that are involved in pathogenesis. 165 Possible alterations of the mammalian gut microbiota and its metabolites by environmental 166 167 concentrations of GBHs in early development, starting from *in utero*, have never been explored in 168 a controlled laboratory animal study. The present pilot study examines whether exposure to GBHs 169 at doses of glyphosate considered to be "safe", the US ADI of 1.75 mg/kg bw/day, defined as the 170 chronic Reference Dose (cRfD) determined by the US EPA [31], affect the composition and 171 diversity of the gut microbiome at early developmental stages in Sprague-Dawley rats.

172

173 **METHODS** 

174 **1. Experimental model** 

175 The entire animal experiment was performed following the rules by the Italian law regulating the 176 use and treatment of animals for scientific purposes (Legislative Decree No. 26, 2014. 177 Implementation of the directive n. 2010/63 / EU on the protection of animals used for scientific purposes. - G.U. General Series, n. 61 of March 14<sup>th</sup> 2014). All animal study procedures were 178 179 performed at the Cesare Maltoni Cancer Research Centre/Ramazzini Institute (CMCRC/RI) 180 (Bentivoglio, Italy). The study protocol was approved by the Ethical Committee of Ramazzini 181 Institute. The protocol of the experiment was also approved and formally authorized by the *ad hoc* 182 commission of the Italian Ministry of Health (ministerial approval n. 710/2015-PR). The 183 CMCRC/RI animal breeding facility was the supplier for the Sprague-Dawley (SD) rats. Female 184 breeders SD rats were placed individually in Polycarbonate cage (42x26x18cm; Tecniplast 185 Buguggiate, Varese, Italy) with a single unrelated male until evidence of copulation was observed. After mating, matched females were housed separately during gestation and delivery. Newborns 186 187 were housed with their mothers until weaning. Weaned offspring were co-housed, by sex and 188 treatment group, not more than 3 per each cage. Cages were identified by a card indicating: study 189 protocol code, experimental and pedigree numbers, dosage group. A shallow layer of white fir 190 wood shavings served as bedding (supplier: Giuseppe Bordignon, Treviso, Italy). Analysis of 191 chemical characteristics (pH, ashes, dry weight, specific weight) and possible contamination 192 (metals, aflatoxin, polychlorobiphenyls, organophosphorus and organochlorine pesticides) of the 193 bedding was performed by CONSULAB Laboratories (Treviso, Italy). The cages were placed on 194 racks, inside a single room prepared for the experiment at  $22^{\circ}C \pm 3^{\circ}C$  temperature and  $50 \pm 20\%$ 195 relative humidity. Daily checks on temperature and humidity were performed. The light was 196 artificial and a light/dark cycle of 12 hours was maintained. Husbandry factors stress-related were

197 controlled: rats were kept together (same room, same rack, no more than 3 per cage) and we did198 not relocate cages. Noise and handling time were minimized[32].

199

# 200 2. Experimental protocol

201 Two groups of SD rat dams and relative pups were treated with either glyphosate or Roundup 202 diluted in drinking water at the glyphosate concentration of 1.75 mg/kg bw/day. There were in 203 total 24 F0 dams, entire litter at postnatal day (PND) 7 and PND 14, 108 F1 offspring at PND 31 204 and PND 57 and 60 F1 at PND 125 in this study. The F0 female breeders received the treatment 205 through drinking water from gestation day (GD) 6 to the end of lactation. During pregnancy and 206 lactation, embryos and offspring (F1) were all retained in the litter and might receive the test compounds mainly through their dams (F0). After weaning on PND 28 offspring were randomly 207 208 distributed in two cohorts: animals belonging to the 6-week cohort were sacrificed at PND  $73 \pm 2$ , 209 i.e. 6 weeks after weaning, animals belonging to the 13-week cohort were sacrificed at PND 125 210  $\pm$  2, i.e. 13 weeks after weaning. The F1 offspring might receive the treatment from their dams 211 starting from *in utero* and mainly through milk during lactation. After weaning, the offspring (F1) 212 were treated through drinking water until sacrifice.

The timeline of the experimental animal treatment and fecal sample collection is shown in Figure 1. As illustrated, rat fecal samples were individually collected from all animals of the F0 generation (8 dams) from each group before mating, at GD 5 (before the starting of the treatment), GD 13, lactation day (LD) 7 and LD 14. Fecal samples were also collected from 108 F1 pups, 18 males and 18 females from each group during lactation at PND 7 and PND 14 (corresponding to LD 7 and 14 for dams), before the achievement of puberty at PND 31, after puberty at PND 57 and in adulthood at PND 125. Due to technical difficulty to identify fecal samples from individual pups during lactation, only pooled samples at PND 7 and PND 14 were collected for each cage from the whole litter, not distinguished by gender. After weaning, fecal samples from each pup were individually collected. About 2–3 droppings, collected directly from the anus of each animal, were preserved in cryovials on an ice bed then stored at  $-20^{\circ}$ C until shipment on dry ice to the Icahn School of Medicine at Mount Sinai. Forceps used for collecting droppings were washed and cleaned using sterile water and 1% sodium bicarbonate between each sampling to avoid cross contamination.

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# 229 4. Bacterial 16S PCR and sequencing

Rat fecal DNA was extracted using the QIAamp PowerFecal DNA Kit (Qiagen, Valencia, CA) 230 231 following the manufacturer's instructions. Total DNA concentration was determined by Qubit 2.0 232 Fluorometer (Life technologies, Norwalk, CT). The phylogenetically informative V3–V4 region 233 of 16S rRNA gene was amplified using universal primer 347F/803R[33, 34] with dual-barcoding 234 approach previously described [35]. The integrity of the 16S PCR amplicons was verified by 235 agarose gel electrophoresis. The resulting ~460-bp sized amplicons were pooled and then 236 sequenced with the Illumina MiSeq 2x250 paired-end sequencing platform at OCS genome 237 technology center of New York University Langone Medical Center.

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#### 239 **5. 16S data analysis**

The sequencing data were merged and filtered to remove the merged reads with a length of <400bp or the quality score of < Q30 at more than 1 % of bases. Sequentially, all filtered high quality reads were split by dual-barcode and trimmed of primer regions using a self-defined bash script to

243 integrate several sequencing processing commands from fastx[36], OIIME[37, 38], and seqtk[39]. 244 Duplicated measurements of four sample were processed and sequenced using different barcodes 245 to test the sequencing reproducibility. Five blank samples were also sequenced and referenced to 246 filter the possible environmental contamination during the sample procession. The split high-247 quality reads were further processed by OIIME 1.9.0[37]. We used the command *pick\_open\_reference\_otus.py* with the defaulted green\_gene 97\_otus reference 248 249 sequences to cluster of >97% similar sequencing reads as an OTU using uclust[40]. Representative 250 sequences for each OTU were aligned using PyNAST and build the phylogenetic tree. Finally, the 251 QIIME generated biom-formatted OTU table contains the taxonomic information and absolute 252 counts for each identified taxon in each sample.

The diversity within each microbial community, so-called alpha-diversity, was calculated using 253 the Shannon Index[41] as metric and represented the measure of the diversity at the family and 254 255 genus level. The overall microbiome dissimilarities among all samples were accessed using the 256 weighted UniFrac distance matrices [42]. Non-metric multiple dimensional scaling (NMDS) were 257 used to visualize the dissimilarities. The permutational multivariate analysis of variance 258 PERMANOVA test [43], with the maximum number of permutations = 999, was performed to 259 assess the significance of the overall microbiome differences between groups by collection 260 timepoints and treatment. The PERMANOVA procedure using the [Adonis] function of 261 the R package vegan 2.0-5 [44] partitions the distance matrix among sources of variation, fits 262 linear models to distance matrices and uses a permutation test with pseudo-F ratios to obtain 263 the *p* values. Using the LEfSe method [45], we further selected the microbiome features 264 significantly associated to time of collection and treatments at various taxonomic ranks.

#### 266 **RESULTS**

No unexpected clinical signs or symptoms were observed in the experimental animals during the *in vivo* phase. In particular, no sign of changes in maternal behavior during lactation (nesting and nursing) were observed during the experiment. There was no clinical evidence of alterations in activity or behavior in pups. Body weight, water and feed consumption both in dams and pups were no different across the groups. Litter sizes were fully comparable among groups, with mean number of live pups: control group 13.6 (range 10-16); glyphosate group 13.3 (range 11-17); Roundup group 13.9 (range 11-16).

274 We extract the total DNAs from 433 SD rat fecal samples. Following the timeline illustrated in 275 Figure 1, 120 fecal samples were collected from 24 F0 dams in three treatment groups and at five time points (before mating, GD5, GD13, LD7 and LD14). From F1 pups, we collected 313 fecal 276 277 samples, in which 13 at PND 7, 24 at PND 14, 108 each at PND 31 and PND 57, and 60 at PND 278 125. We observed that the fecal samples of pups at PND 7 and PND 14 showed significant low 279 DNA yields (Supplemental figure 1A). We further performed microbiome survey on 433 SD rat 280 fecal samples, and 5 water blanks using bacterial 16S sequencing on Illumina MiSeq 2x250 pair-281 end platform. After merging and filtering by read length >400bp and the quality score > Q30 at 282 more than 99% of bases, we obtained  $\sim 2$  million high quality reads (the average number of 283 reads=4576 per sample with standard deviation=6567). The number of reads were not significant 284 different by exposure type (Supplementary figure 1A). The taxa composition was grouped by age 285 and the exposure types and summarized in Supplemental figure 1B. We also provided the complete 286 taxonomic OTU tables in Supplementary data.

The overall microbiome dissimilarity, defined by beta-diversity, was visualized by non-parametric
multi-dimensional scaling (NMDS) plot of all samples (Figure 2A), dams only (Figure 2B) and

289 pups only (Figure 2C). We found that the early postnatal samples at PND 7 and PND 14 were far 290 apart from the dams at LD 7 and LD 14 while the later postnatal samples at PND 31, PND 57 and 291 PND 125 were clustering with the dams (Figure 2A). The mean and variance of the within-292 community diversity ( $\alpha$  diversity) measured by Shannon index showed that the samples from dams 293 possessed higher, while early postnatal samples from pups showed lower  $\alpha$  diversity (Figure 2D). 294 Student t-test showed significantly increased  $\alpha$  diversity from PND 14 to PND 31(p-value<0.05) 295 for all treatment groups) but no differences between samples at same age but different treatment 296 group.

We compared the overall microbiome changes by treatment at different age groups from pups and 297 298 dams. Nonmetric multidimensional scaling (NMDS) plots visualized the overall microbiome 299 dissimilarities by treatment at PND 31 and 57 (Figure 3A). The PERMANOVA test was used at 300 each age group to test the significance of the differences at overall rat gut microbiome between 301 treatment and control. The test results (p-values shown in Figure 3B) showed that the overall 302 microbiome was significantly altered by both Roundup and glyphosate treatment compared to 303 controls. Similarly, we also found significant differences in microbiota between Roundup and 304 glyphosate exposed F1 pups. We also observed that the overall microbiome was significantly 305 different by sex at PND 125 (p-value=0.028, 0.007 and 0.013 by PERMANOVA test for 306 Glyphosate, Roundup and control group, respectively). To adjust for the sex effect, we performed 307 additional multivariable PERMANOVA test with both treatment and sex as predictive variables. 308 We found that those test results were consistent (Figure 3B). However, none of the F0 dam groups 309 showed significant differences in overall microbiota diversity...

The linear discriminant analysis effect size (*LEfSe*) analysis was performed using 16S sequencing
data from rat fecal samples in order to select particular discriminative features of the glyphosate

312 exposure. Consistently with the overall microbiome changes by exposure at different age groups 313 (Figure 3), we found several significant differential taxa features associated with exposure. In 314 particular, at PND 31, the results showed that the microbiota of both glyphosate and Roundup 315 exposed pups had significantly higher prevalence of *Prevotella* genus (*Bacteroidetes* phylum) and 316 Mucispirillum genus (Deferribacteres phylum) and lower prevalence of Lactobacillus genus 317 (*Firmicutes* phylum) and *Aggregatibacter* genus (*Proteobacteria* phylum) (Figure 4A 1-2). 318 However, some of the selected features were treatment specific. For instance, among the most 319 significant features with LDA score>3.0 and p-value<0.05, we found increased Blautia genus 320 (Firmicutes phylum) and decreased Streptococcus genus (Firmicutes phylum) and Rothia genus 321 (Actinobacteria phylum) only in glyphosate exposed PND 31 pups, but not in Roundup exposed 322 samples. In contrast, increased Parabacteroides genus (Bacteroidetes phylum) and Veillonella 323 genus (Firmicutes phylum) were only found in Roundup exposed pups, but not in glyphosate 324 exposed samples at PND 31. Between two exposures (Figure 4A 3), Roundup exposed pups 325 showed increased Clostridia class (Firmicutes phylum), in particular, Blautia genus and 326 Actinobacteria class (Actinobacteria phylum), in particular, Rothia and Bifidobacterium genera at 327 PND 31. Furthermore, we found the treatment associated taxa features were not consistent at 328 different postnatal time points. Many features selected at PND 31 did not appeared at PND 57 329 (Figure 4A 4-6, Supplementary Figure 2), suggesting the less stability of early-life microbiota and 330 continuous effect on gut microbiota by the exposure. When counting the total abundance % of the 331 significant differential taxa by treatments, the pups showed much higher impact by exposure than 332 the dams (Figure 4B).

333

## 334 **DISCUSSION**

335 GBHs are the most applied herbicides worldwide; humans are commonly exposed to these 336 environmental chemicals at a wide range of doses depending upon the job setting (farming vs. food 337 consumption) and route of exposure (ingestion vs. inhalation). Environmental contamination from 338 GBHs is now ubiquitous and residues of glyphosate has been found in air[46], groundwater[47], 339 drinking-water[48], crops[49], food[50] and animal feed[51]. The possible effects of GBHs on 340 human health are the subject of an intense public debate, for both its potential carcinogenic and 341 non-carcinogenic effects, including endocrine disruption[52, 53], neurotoxicity[54], 342 developmental and reproductive toxicity[55], autoimmunity[56], gastrointestinal disorders [57], 343 obesity, diabetes [58-60], and other metabolic and cardiovascular disorders[61] and central 344 nervous system dysfunctions such as learning and memory impairment, anxiety, stress, depression [62]and autism[63]. These chronic pathologies (non-communicable diseases – NCDs) may occur 345 346 even at doses that are much lower than the ones considered during risk assessment, in particular during sensitive periods of life (such as fetal development)[7, 22]. 347

348 Recent advances in human microbiome research suggested that the gut microbiome is a key player in human metabolism[64–66]. It is thus reasonable to hypothesize that exposure to environmental 349 350 chemicals may modify the gut microbiome and its metabolites and ultimately influence human 351 health. Microbiota-generated metabolites and their cellular and molecular components are 352 increasingly being recognized as an essential part of human physiology, with profound effects on 353 the homeostasis of the host organism. Unfortunately, determining the concentrations of these 354 biologically active substances in target cells presents serious difficulties related to the extraction 355 and processing of samples, especially faecal material, and the limitations of currently available 356 measurement techniques[15]. Meta-omics and evolving computational frameworks will hopefully lead to the systematic prediction and discovery of more microbial metabolites and componentsinvolved in neuroendocrine, immune, metabolic, and epigenetic pathways.

Rats are proposed to be more representative of the human gut microbiota than mice because the gut bacterial communities of humanized rats more closely reflect the gut microbiota of human donors[67, 68]. We have previously used our animal model, SD rats, to study the effect of postnatal low-dose exposure to environmental chemicals on windows of susceptibility and on the gut microbiome. The study [69] showed the low-level phthalate, paraben and triclosan exposure altered the gut microbiome of adolescent rats. These results are consistent with other studies, indicating our animal model as a suitable model for studying microbiome[70, 71].

366 Since glyphosate has shown enzyme inhibition activity in plants and microorganisms, we therefore 367 postulate that low-dose exposure to glyphosate or GBHs may also modulate the composition of 368 the gut microbiome. In this study, when compared to the adult rat dams, the gut microbiome of 369 pups at PND 7 and 14 showed lower taxonomical richness but higher variance within sample and 370 higher sample-to-sample dissimilarity[69]. One pitfall of our study was that direct measurements 371 of exposure to GBHs in milk was not performed [72]. In our pilot study we simply reproduced the 372 human exposure, which includes lactation as only source of nourishment for pups from birth until 373 around PND 21. The shortcomings concerning the analysis of glyphosate in breast milk are mainly 374 related to the difficulty and stressing technical procedure for collecting milk from dams and to the 375 complex nature of the breast milk matrix. Indeed, milk is an aqueous mixture of carbohydrates, 376 proteins and fat. Analytical methods developed for watery matrices cannot be directly transferred 377 to breast milk. In April 2014, a non-peer-reviewed report was published, in which glyphosate in 378 breast milk of American mothers was detected in 3 out of 10 samples ranging from 76 to 166 379 ng/mL. In this study, the concentration of glyphosate in milk samples was determined by enzyme-

380 linked immunosorbent assay (ELISA)[73]. The limit of quantification (LOQ) of the assay was 381 given as 75  $\mu$  g/L in milk. Other studies, based on liquid chromatography-tandem mass 382 spectrometry (LC-MS/MS) and a gas chromatography-tandem mass spectrometry (GC-MS/MS) 383 methods, have found no evidence of transfer of glyphosate into milk. Both methods have been 384 fully validated and reported as suitable for the determination of glyphosate with an LOQ of 1 385 ng/mL[72, 74]. Nevertheless, future independent research is needed, considering different 386 educational and ethnic backgrounds, location of residence (e.g., urban compared with rural), 387 occupational and dietary glyphosate exposure and adequate sample size of the cohort.

388 Our results revealed that both glyphosate and glyphosate formulated Roundup, at doses admitted in humans, including children and pregnant women, significantly altered the microbiota diversity 389 390 and resulted in prominent changes at multiple taxon in exposed pups. However, those effects on 391 microbiota were not significant in the adult dams. Previous evidence has shown that the gut 392 microbiota at postnatal age is less stable than at adult age and it changes over the first several years of life[75]. The maturation of the gut microbiota has been proven to be affected by multiple factors, 393 394 for instance, diet, medications, host genetics, etc[76]. Disruption of the microbiota during its 395 maturation by low doses of various environmental chemicals has been showed to alter host 396 phenotypes, such as weight, metabolism and other disease risk[77]. Our data suggests that the 397 prepubertal age microbiota is more sensitive to GBH exposure compared to the adult microbiota, 398 therefore the postnatal age is likely a "window of susceptibility" for GBHs to modulate the gut 399 microbiome.

Furthermore, our results showed that the overall microbiome diversity and composition were significantly different between Roundup and glyphosate, suggesting possible synergistic effects of the mixed formulation on gut microbiota. As most of GBHs contains multiple surfactants and

adjuvants might act differently than glyphosate alone, it is not only important to understand the
individual effects of glyphosate, but also the synergistic impact of mixed formulations. In fact
adjuvants might act alone or in a synergistic manner and increase the toxic effects of
glyphosate[78–81].

407 In addition, both clinical and experimental studies showed impact of gut microbiota on the gut-408 brain axis (which mainly includes the immune, neuroendocrine, and neural pathways) [82–84] in 409 an age-dependent manner [85]. Gut bacteria communicating with the host through the microbiota-410 gut-brain axis could influence brain and behavior[86]. In particular, the changes at postnatal 411 microbiota may affect the neurous system, reflecting by changes in levels of pituitary hormones 412 including ACTH[83, 87], cortisol, BNDF[88] and etc. Sprague-Dawley rats represent an excellent animal model to explore these early-life effects as their microbiome is more similar to that of 413 414 humans than the microbiota profile of mice[67].

This study has some limitations. First, the actual levels of GBHs that reached the fetus during 415 416 gestation or through milk consumption postnatally by the offspring cannot be accurately estimated. 417 Second, we only collected maternal feces so that we cannot fully evaluate the role of maternal 418 microbiota in the fetal development without the maternal sample/data collection from oral, vaginal 419 and other body sites. Indeed, in recent years it is becoming apparent that, besides breast milk, other 420 sources could allow maternal-offspring microbial transfer. Rodents "inherit" their microbiomes in 421 a similar fashion to all placental mammals, including humans: through vaginal delivery and close 422 maternal association throughout the neonatal period (vertical transmission). Maternal vaginal, skin, 423 mammary fecal and oral microbiomes, microbial spreading in bedding are efficiently transmitted 424 to offspring and represent other possible mechanisms of maternal influences on pups intestinal 425 colonization[89]. Finally, the microbiome survey used a cost-effective 16S amplicon targeted

426 sequencing approach. This technique allows us to identify differential taxa compositions by 427 exposure only to genus level. Additional meta-genomics and meta-transcriptomic analysis may 428 need to visualize the functional and metabolic alternations and identify bacterial features at 429 species/strain level. In addition, given the differences in taxonomic composition of the 430 microbiomes of rats and humans, the extent to which the results of this analysis can be relevant to 431 humans is not clear. Future work should investigate how the route and concentration of exposure 432 impact the rat microbiome, and quantify how these perturbations may impact subsequent health 433 outcomes. Nevertheless, these data strongly indicate that GBHs exposure can exerts biological 434 effects early in development which may have long-lasting health effects later in life.

# 435 CONCLUSION

Our pilot study provides initial evidence that maternal exposure to commonly used GBHs, at doses currently considered as acceptable in humans, is capable of modifying the gut microbiota in rat pups, in particular before puberty (PND 31). Further long-term investigations are necessary to elucidate if the shift in the microbiota induced by GBHs exposure is contributing to the downstream other health effects. Nevertheless, understanding the microbiota changes during this critical window of susceptibility could be of great importance for disease prevention. The potential health effects of GBHs during development, such as childhood, warrant further investigation.

#### 443 **ABBREVIATIONS:**

GBH: Glyphosate-based herbicides; AMPA: aminomethylphosphonic acid; SD: Sprague-Dawley;
CMCRC: Cesare Maltoni Cancer Research Center; RI: Ramazzini Institute; US ADI: United States
Acceptable Daily Intake; GD: gestational day; LD: lactating day; GM: genetically modified; EU:
European Union; PND: Post Natal Day; EPSPS: 5-enolpyruvylshikimate-3-phosphate synthase;
DOHaD: Developmental Origins of Health and Disease; ELISA: enzyme-linked immunosorbent

449	assay; LOQ: limit of quantification; LC-MS/MS: chromatography-tandem mass spectrometry;
450	GC-MS/MS: gas chromatography-tandem mass spectrometry; ACTH: Adrenocorticotropic
451	hormone; BDNF: brain-derived neurotrophic factor; LEfSe: Linear discriminant analysis Effect
452	Size; QIIME: Quantitative Insights Into Microbial Ecology; OUT: operational taxonomic unit;
453	PyNAST: Python Nearest Alignment Space Termination; NMDS: Non-metric multiple
454	dimensional scaling; LDA: Linear discriminant analysis; NCDs: non-communicable diseases.
455 456 457 458 459	DECLARATIONS
460	Ethics approval and consent to participate N/A
461	Consent for publication N/A
462	Availability of data and materials
463	16S rRNA gene sequencing information has been deposited into EMBL Nucleotide Sequence
464	Database (ENA) with Project ID PRJEB24653 (ERP106496).
465	Competing interests
466	The authors declare that they have no competing interests.
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471	Authors' contributions
472	QXM performed the fecal sample processing, PCR and library preparation, performed microbial
473	sequencing analysis and bioinformatics, and drafted the manuscript. FM, SP, DM participated in

474 the design of the study, performed the animal experiments and sample collection, and drafted the 475 manuscript. IM, AV, LB and LF performed the animal experiments and collected the samples. CL 476 helped to draft the manuscript. FB and JC supervised the study, participated in the design of the 477 study and helped to draft the manuscript. JH conceived of the overall study, supervised the overall 478 experiment, implemented the bioinformatics, and coordination and draft the manuscript. All 479 authors read and approved the final manuscript.

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488

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708 Figure Legends

709 Figure 1. Timeline of the experimental animal treatment and fecal sample collection.

710 Figure 2. The overall microbiome diversity. 2A, B, and C are non-metric dimensional scaling

711 (NMDS) plots visualize the overall microbiome dissimilarities (beta-diversity) between

712 individual rat across time. 2A. All samples from SD dams (pink) and pups (green) of three

treatment groups; 2B. All samples from SD dam rats only. Colors indicate sample collection

timepoint. BM: before mating; GD 5: gestation day 5; GD 13: gestation day 13; LD 7: lactation

715 day 7; and LD 14: lactation day 14. 2C. All samples from SD pup rats only. Colors indicate

sample collection timepoint. PND 7 to PND 125: postnatal day 7 to postnatal day 125. **2D.** Box

717 plots show the mean and variance of the within-community diversity (alpha-diversity) measured

718 by Shannon index in three treatment groups across all time of collections.

719 Figure 3. The effect of glyphosate exposure on overall microbiome diversity. 3A. NMDS

720 plots visualize the overall microbiome dissimilarities (beta-diversity) between individual rat of

three treatments at PND 31 and PND 57. **3B.** PERMANOVA test is performed to test the

significance among all three treatments (displayed in NMDS plots) and between two treatments

723 (values are listed in tables). The p-values in parenthesis were adjusted for genders. G:

724 glyphosate; R: Roundup; C: control water.

Figure 4. Differential microbial features selected via LEfSe between treatment. 4A. Clad
plots visualize the significant differential taxa features from phylum (inner circle) to genus (outer
circle) at PND 31 and PND 57. Color indicates the more abundant taxa under each condition. 4B.
The table lists the overall abundance of the significant differential taxa between treatment across
time.

# 733 Supplementary Figures

735	Supplementary Figure 1. 16S microbiome profiling. 1A. Dot plot shows the distribution of the
736	number of reads in three treatment groups. The Wilcoxon test significance between two groups
737	was listed in table on the right and the diagonal of the table shows the average reads of each
738	group. 1B. Box plot shows the mean and variation of total DNA concentrations from rat fecal
739	samples. 1C. Bar plot showed the mean abundance of microbial composition at phylum level for
740	each treatment and time of collection.
741	
742	Supplementary Figure 2. The changes of <i>lactobacillus</i> and <i>Prevotella</i> during the time of
743	sampling. Line plots show the mean and standard error of relative abundance% of Lactobacillus
744	(upper figure) and Prevotella (lower figure) during the time of sampling from PND 7 to PND
745	125.
746	
747	Supplementary data
748	Supplementary data 1. 16S OTU table in biom format
749	
750	
751	

	Fecal samples		Weeks (F1)																		
Exposure			m <sup>a</sup> ge	station	1	2	3	4	5	6	7	8 9	10	11	12	13	14	15	16	17	18
						PND 2 (wean				6											
6-week cohort		Before mating	GD 5	GD 13	LD 7º	LD 14°		ו קי ע	ND 31			PND 57									
	No.	12	12	12	12	12			48			48									
		Before mating	GD 5	GD 13	LD 7º	LD 14°		Þ	ND 31			PND 57								PND 125	5
13-week cohort					10	10	-														
	No.	12	12	12	12	12			60			60								60	
Total	No.	24	24	24	37*	48*			108			108								60	
<sup>a</sup> : m= mating																					

<sup>b</sup>: GD = Gestation Day

<sup>c</sup>: LD = Lactation Day

<sup>d</sup>: PND = Post Natal Day

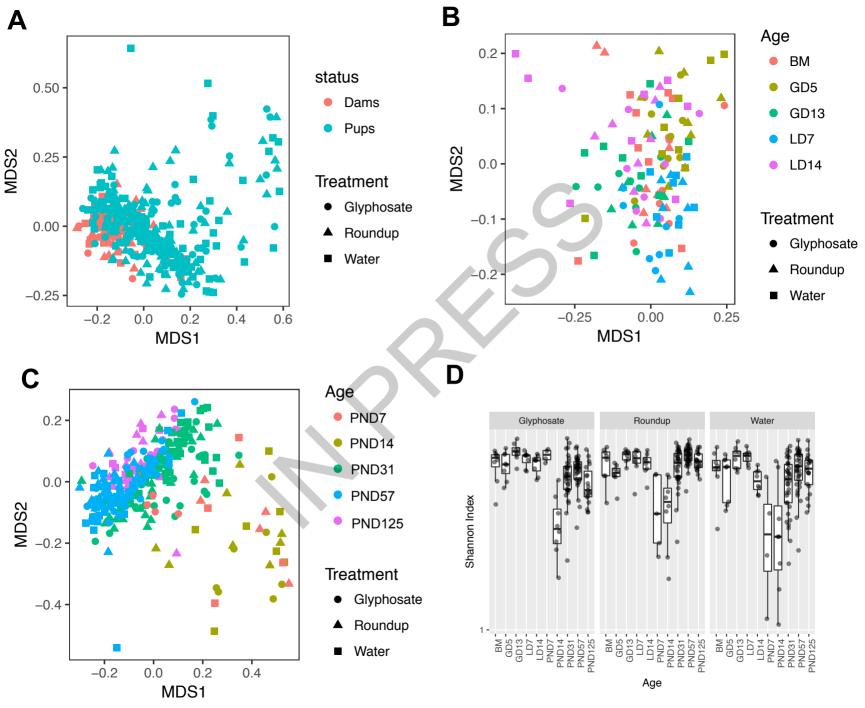
\*: At LD 7 and LD 14, respectively corresponing to PND 7 and PND 14 in newborns, fecal sampling were further collected from newborns (No. 13 at PND 7 and No. 24 at PND 14) and pooled for each cage from the whole litter, not distinguished by gender.

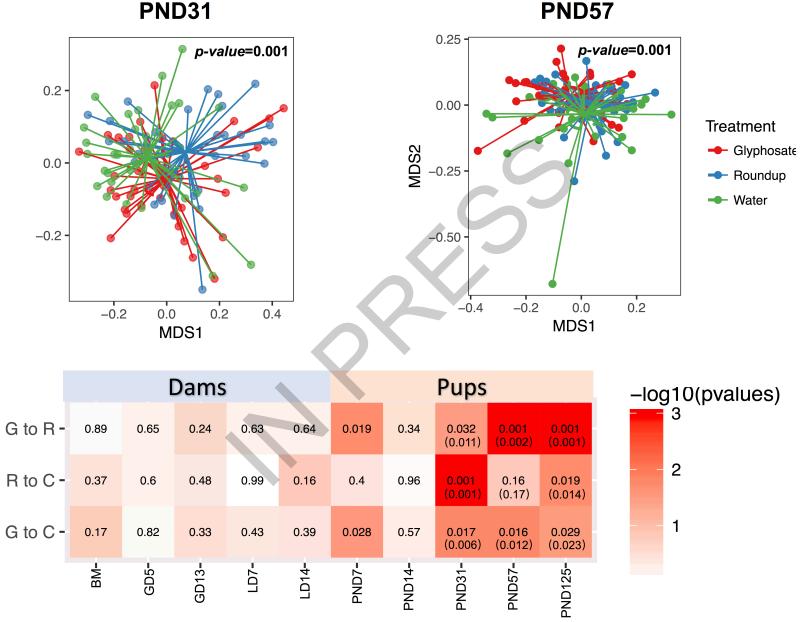
= White bars represent a non dosing period

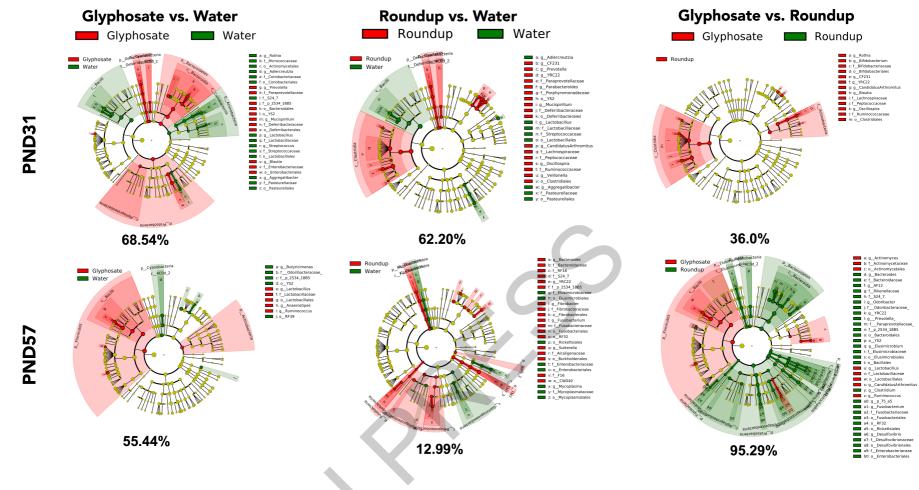
= Green bars represent period of F0 exposure (from GD 6 to the end of lactation)

= Dark bars represent period of F1 exposure (individually from weaning until final sacrifices)

= Fecal sampling







			Dams				Ρι	ıps		
G to R -	0.03	0	1.94	5.83	9.96	4.7	36	95.29	32.19	
R to C -	1.02	0	3.19	0.12	11.13	0.23	62.2	11.46	25.33	
G to C -	0.58	0	4.17	11.95	0.16	8.33	68.54	55.44	20.96	
	BM -	GD5-	GD13-	LD7-	LD14-	PND7&14-	PND31-	PND57-	PND125-	

Β

