1	Indoor green can modify the indoor dust microbial
2	communities
3 4 5 6 7	Indoor plants and home microbiota
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#### 45 **ABSTRACT**

Little is known about the potential role of indoor plants in shaping the indoor microbiota. 46 47 Within the ENVIRONAGE birth cohort, we collected settled dust and performed 16S and ITS 48 amplicon sequencing and qPCR measurements to characterize the indoor microbiota, 49 including bacterial and fungal loads and Chao1 richness, Shannon, and Simpson diversity 50 indices. For 155 households we obtained information on the number of indoor plants. We 51 performed linear regression models adjusted for several *a priori* chosen covariables. Overall, 52 an increase in indoor plants and density was associated with increased microbial diversity, but not load. For example, we found an increase of 64 (95%CI:3;125) and 26 (95%CI:4;48) 53 54 units of bacterial and fungal taxa richness, respectively, in households with more than three 55 plants compared to no plants. Our results support the hypothesis that indoor plants can 56 enrich indoor microbial diversity, while impacts on microbial loads are not obvious. 57 Practical implications:

- This research provides the basis for future studies that will clarify the relation between
   indoor plants and microbiota and explore health relevance of these indoor microbiota
   modifications through indoor green.
- 61 62
- Indoor plants can be used in efforts to enrich and diversify indoor microbial exposure.
- 63 Keywords : indoor, built environment, microbiota, indoor plants, diversity
- 64

### 65 Introduction

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67 The importance of studying indoor air quality becomes apparent when we consider that, in our current society, most of our time is spent indoors.<sup>[1]</sup> Moreover, most of our indoor 68 activities are within the comfort of our home environment. Therefore, investigating the 69 70 components of the indoor air and their connection to human health has been a research field 71 of emerging interest in recent years. One such airborne constituent that is of particular 72 interest is the microbial material present in the indoor air. Exposure to the indoor microbial 73 environment has been implicated in both protective and adverse health outcomes<sup>[2-10]</sup>, 74 indicating heterogeneity and complexity of the underlying components and associated 75 mechanisms. Therefore, further investigation is required, including identifying which factors 76 are important in shaping the indoor microbial community, to better understand how these 77 microscopic communities affect our health.

Several factors have already been identified as determinants of the indoor microbiota, 78 including elements related to the indoor environment<sup>[11-15]</sup> as well as outdoor surrounding 79 green spaces.<sup>[16-18]</sup> Some have hypothesized that indoor green, represented by the presence 80 of indoor plants, might be an important contributor to the indoor microbial composition.<sup>[19,</sup> 81 82 <sup>20]</sup> Indeed, plants have large and exposed surface areas capable of accommodating highly diverse microbial communities.<sup>[21-26]</sup> Furthermore, their leaves are in constant exchange with 83 the atmosphere, and their root-associated microbes have environmental degrading 84 properties.<sup>[27-30]</sup> There is, however, a lack of studies investigating the contribution of indoor 85 plants to the indoor microbial content, and the few available studies focus on experimental 86 research, closed and specialized high-density environments.<sup>[19, 20, 31, 32]</sup> Thus, more 87 88 comprehensive research is required, in particular including designs representing various real-

89 life conditions. The objective of our study was to explore whether indoor plants, when 90 considered in the context of complex household environments, contribute to the total 91 quantity and diversity of indoor bacterial and fungal communities.

#### 92 **2. Methods**

#### 93 2.1 Study design and population

94 The ENVIRONAGE (ENVIRonmental Influence ON AGEing in early life) birth cohort is an 95 ongoing longitudinal study initiated in 2010, that recruits mother-newborn pairs at delivery 96 in the East-Limburg Hospital (Genk, Belgium). This cohort was designed to investigate interactions of environmental exposures with molecular targets of ageing, molecular 97 98 signature in early life and clinical outcomes in childhood including cardiovascular and 99 cognitive function. Further information regarding the recruitment process and eligibility criteria is provided elsewhere.<sup>[33]</sup> When the child reaches the age of four, mother and child 100 101 are asked to participate in the follow-up phase, where we assess various individual health 102 outcomes and collect information on lifestyle characteristics. The study protocol was 103 approved by the ethical committee of the Hasselt University, and complied with the Helsinki Declaration.<sup>[33]</sup> We asked a subset of the mother-child pairs in the ENVIRONAGE birth cohort 104 105 to participate in an additional study between 2017 and 2018. This study required home visits, in order to collect settled dust samples, from which we measured indoor microbial 106 107 communities, and questionnaires to obtain information on indoor characteristics, including 108 the number of indoor plants. More specifically, we selected households of mother-child pairs 109 that already participated in the follow-up study up to one year prior to the home visit or had 110 planned follow-up in the near future. Additionally, we only included participants that did not

have planned indoor renovations during the sampling period and lived in the same home aswhen they participated or would participate in the follow-up phase.

In total, we were able to contact 233 mothers of the 284 eligible households. Overall, 189 mothers accepted to participate, resulting in a participation rate of 81%. Due to logistic constraints, we were not able to collect the Petri dishes for eight households. Of the Petri dish samples of remaining 181 homes, two house dust samples were excluded post collection because of irregularities during the sampling period, two other samples because the amount of dust was too low, and one sample was excluded because it exceeded the maximum sampling period of nine weeks.

Of the 176 households with information on the microbial measurements, we had complete information on household characteristics and the number of indoor plants present in the living room for 155 participants. Additionally, we investigated the association between the indoor plant density, described by the number of indoor plants per square meter (m<sup>2</sup>) of living room, and the microbial indices within a subset of the 128 households. We excluded 27 households because we received no information on the average surface area of their living room.

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#### 128 2.2 Indoor dust microbial communities

We placed two sterile, open-faced Petri dishes (91x16mm) in the household's living room to collect settled dust over an average period of 6 to 8 weeks. To reduce the impact of seasonal variation, we restricted the sampling period to spring months (April to June)<sup>[34]</sup>, which resulted in house visits being done during two years: spring 2017 and spring 2018. The Petri dishes were placed distant from major air flows and at an average height of two meters.<sup>[35]</sup> Upon collection, the Petri dishes were sealed and stored at -20°C, to be further processed in

the summer of 2018 as described in detail elsewhere.<sup>[16]</sup> After processing, samples were 135 shipped frozen on dry ice to the Finnish Institute for Health and Welfare (Kuopio, Finland), 136 137 where DNA extraction was conducted, as described in the supplemental material. DNA was 138 stored at -20 °C until sequencing. The DNA extracted from dust samples and empty control petri dishes was shipped frozen to the sequencing service partner LGC Genomics (Germany), 139 who did the library preparation and sequencing. The V4 region of the bacterial 16S rRNA gene 140 was amplified using 515F/806R primers.<sup>[36]</sup> For fungi, the Internal Transcribed Spacer (ITS) 141 ITS1 region was amplified using ITS1F/ITS2 primers.<sup>[37]</sup> 16S and ITS amplicon data was 142 analyzed by standard dada2 pipeline version 1.8.<sup>[38]</sup> The PCR procedure and sequencing 143 protocol, as well as sequence processing and downstream bioinformatics are detailed in the 144 supplemental material and have been described in our earlier publication.<sup>[16]</sup> 145

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147 The alpha diversity within samples, including Chao1, Shannon and Simpson metrics, were calculated in QIIME software version 1.9.1<sup>[39]</sup>, applying rarefaction values of 1495 sequences 148 for bacteria and 3956 sequences for fungi, respectively, to normalize for between sample 149 150 differences in sequencing depth. The Chao1 metric is an abundance-based estimator of 151 species richness within a sample, using the frequency of rare species detected to infer total 152 species richness. The other two alpha metrics, Shannon and Simpson, utilize the species 153 richness to incorporate it with the species evenness, a measurement of the homogeneity of 154 species abundance but to a different extent. Whereas the Shannon index is more sensitive to species richness, the Simpson index emphasizes species evenness.<sup>[40]</sup> 155

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We used quantitative PCR (qPCR) to calculate the total Gram-positive and Gram-negative
bacterial loads as well as fungal loads in the settled dust samples, as described in detail in the

159 supplement. We determined the numbers of microbial cell equivalents (CE) in the samples 160 using relative quantification, utilizing the internal standard to adjust for the presence of DNA 161 inhibitors and/or variability in DNA extraction efficiency.<sup>[41]</sup> Results were normalized for 162 sampling surface area, i.e. surface area of the Petri dishes, and sample accumulation duration, 163 and expressed as CE per m<sup>2</sup> settling surface area per day, referred to hereafter as microbial 164 load.

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#### 166 2.3 Household plants

167 Information on the number of indoor plants in the living room and surface area (m<sup>2</sup>) of the 168 living room was obtained via a questionnaire. The surface area was calculated by the 169 participants. In case they had an open kitchen connected to the living room, the calculations 170 excluded the kitchen area. Because the distribution of the number of indoor plants was 171 skewed, we further stratified this variable into three categories, i.e., having no plants, having one to three plants and having more than three plants. Moreover, this categorization helped 172 173 us to investigate the microbial communities when comparing households with a lot of plants 174 versus households with none or few plants. Additionally, we calculated the number of plants per m<sup>2</sup> of living room and divided this variable into tertiles representing low (0 plants/m<sup>2</sup>), 175 176 middle  $(0.02 - 0.06 \text{ plants/m}^2)$  and high  $(>0.06 \text{ plants/m}^2)$  indoor plant density.

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#### 178 **2.4 Covariables**

179 Information on household characteristics such as the number of household members, having 180 an open kitchen connected to the living room, pet ownership and ventilation system was 181 obtained by means of a questionnaire. We divided pet ownership into having a furry pet, 182 defined as having a cat, dog, rabbit, hamster or guinea pig, or not. The type of ventilation

system was separated into the use of passive ventilation or other (i.e mechanically supported 183 ventilation). Previous studies have shown that air pollution can modify the indoor microbiota 184 and plant-associated microbiota<sup>[42, 43]</sup>, thus we modeled black carbon exposure ( $\mu g/m^3$ ) 185 concentrations via a spatial temporal interpolation method (kriging)<sup>[44]</sup> for each household in 186 187 combination with a dispersion model. The interpolation method uses land-cover data 188 obtained from satellite images (CORINE land-cover data 189 set; <u>http://www.eea.europa.eu/data-and-maps/data/corine-land-cover-2006-clc2006-100-</u> 190 m-version-12-2009) and pollution data collected from a governmental stationary monitoring network (<u>http://www.irceline.be/</u>). Coupled with a dispersion model<sup>[45, 46]</sup> that uses emissions 191 192 from point sources and line sources, this model chain provides high-resolution concentration 193 values, and the validation statistics explained more than 74% of the temporal and spatial 194 variability for black carbon in the Flemish Region of Belgium.<sup>[47]</sup>

195 We obtained information on nature and green space exposure within a 50 m buffer around 196 the household's addresses based on the Land-use Map of Flanders 2012 (Flanders 197 Department of Environment and Spatial Development) and the Green Map of Flanders 2012 198 (Agency for Geographic Information Flanders, AGIV), respectively, using the Geographic 199 Information System (GIS) ArcGIS 10 software. The Land-use Map of Flanders contains 200 functional information about the use of the ground cover and is divided into 22 land use classes. We created a new artificial classification "nature" that is defined as the sum of the 201 202 proportions of the following 10 classes: thickets and bushes; poplars; deciduous, coniferous 203 and alluvial forests, semi-natural grassland, heath, swamp, coastal dune and bay mud 204 (Supplemental Table 1). However, none of the ENVIRONAGE households are surrounded by 205 coastal dune or bay mud; thus these two classes did not contribute to the nature variable in

206 our study. The Green Map of Flanders contains high-resolution (1x1m) information derived 207 from a segment-based classification using aerial ortho-photographs of 2012. The overall 208 green space area, including all non-agricultural vegetation, was further divided into low-209 growing green (less than three m in height) and high-growing green (i.e. all vegetation more 210 than three m in height).

In addition, we calculated relative taxa abundances on various taxonomic levels using the obtained numbers of sequence reads per amplicon sequence variant (ASV) normalized for the total number of sequence reads within a given sample. Subsequently, we performed a sourcetracking analysis to estimate the percentage contribution of human-derived bacteria within the dust samples, by totaling the relative abundance of 11 family-level, human skin and oral cavity indicator taxa within each sample as described earlier by Dunn et al. (2013), further referred to as the human source proxy (HSP) (Supplemental Table 2).<sup>[48]</sup>

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#### 219 2.5 Statistical analysis

For the statistical analyses we used the R environment.<sup>[49]</sup> In total, dust samples of 155 220 221 households were included in the analyses. We screened for outliers using a threshold of more 222 or less three times the standard deviation from the mean of the corresponding microbial 223 measures. We detected and removed two outliers for the bacterial and three outliers for the 224 fungal Simpson diversity index, and two outliers for the bacterial Shannon index. For microbial 225 load we detected two outliers for the gram-negative bacterial load, five outliers for the gram-226 positive bacterial, and two outliers for the fungal load. These microbial loads were then log-227 transformed (base 10) to better comply with linear model assumptions. To investigate the 228 relationship between the microbial indices and household plants we ran multivariableadjusted regression models, adjusting for *a priori* chosen covariables including the number of sampling days, the average outdoor temperature during the sampling period, furry pet ownership, ventilation method, ambient black carbon exposure during the sampling period, and having an open kitchen. Results are expressed as unit change [95% confidence interval (CI)] compared to the corresponding reference level. For the log-transformed microbial load measures, we back-transformed the estimates and expressed them as a percentage change (estimates presented in bold are statistically significant p < 0.05).</p>

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In an additional analysis, we investigated the relationship between the HSP and indoor plants
and ran a multivariable-adjusted regression model, adjusting for the aforementioned
covariables.

To investigate the association between indoor microbiota and indoor plants, independent from outdoor surrounding green we performed two sensitivity analyses.<sup>[16]</sup> Here, we additionally adjusted the model for either residential nature or high-growing green exposure in a 50 m buffer surrounding the household.

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#### 245 **3. Results**

Characteristics of the sampling and study homes are provided in Table 1. Indoor settled dust sampling was performed for a minimum of 29 days and a maximum of 64 days (median = 42 days). During this period, the median ( $25^{th}-75^{th}$  percentile) daily average outdoor temperature was 17.1 (14.9-18.4) °C and households had a median ( $25^{th}-75^{th}$  percentile) outdoor airborne black carbon concentration of 0.71 (0.61-0.87) µg/m<sup>3</sup>. Approximately half of the household had furry pets (49.7%) and the majority used passive ventilation (82.6%). Most of the households had one to three indoor plants in the living room (42.6%), while 34.8%

of the households had no indoor plants, and 22.6% had more than three plants. Regarding the microbial communities assessed from indoor dust, bacterial diversity was found to be higher than fungal diversity indices. The microbial richness and diversity metrics were overall positively and strongly correlated with each other, both for bacteria and fungi. In contrast, microbial load was overall negatively correlated with the corresponding bacterial or fungal diversity indices (Supplemental Figure 1).

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In Table 2 we provide an overview of the microbial diversity indices and microbial load per category of indoor plants and plant density without any adjustment. Here, we observed a dose response increase in all included diversity indices with an increasing number of plants and plant density in the household living room, with those increases being partially statistically significant. In contrast, the Gram-negative and Gram-positive bacterial loads in house dust non-significantly decreased with increasing number of plants.

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267 After adjustment for the *a-priori* selected covariables, we found significant positive 268 associations between bacterial and fungal diversity indices and indoor green, when 269 comparing households with more than three plants present in the living room to households 270 with no plants (Figure 1A-D and Supplemental Table 3). For bacterial and fungal Chao1 271 richness, we found an increase of 64 (95% CI: 3; 125) and an increase of 26 (95% CI: 4; 48) 272 index score units, respectively, in households with more than three plants compared to 273 households with no plants in the living room (Figure 1A). For the bacterial and fungal Shannon 274 diversity, we noticed a statistically non-significant increase of 0.32 (95% CI: -0.01; 0.65) and a statistically significant increase of 0.48 (95% CI: 0.12; 0.83) index score units, respectively, 275 276 when comparing households with more than three plants versus with no plants (Figure 1B).

For the fungal Simpson diversity index, we observed a significant increase of 0.04 (95% CI: 0.00; 0.07) units (Figure 1C). In contrast, the microbial load measures were negatively associated with indoor green, although this was not found to be significant (Figure 1D). In addition, none of the microbial measures were found to be significantly associated with the middle indoor plant category (1-3 indoor plants).

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283 Regarding indoor plant density, we found a statistically significant increase in bacterial Chao1 284 richness (68 units; 95% CI: 8; 129) similar to the analysis with indoor plant numbers, when 285 comparing households with a high indoor plant density compared to households within the 286 lowest category (Figure 1E). The trends for the other bacterial and fungal diversity indices 287 were very similar to the earlier presented results for number of indoor plants, but did not 288 reach statistical significance (Figure 1F-G). In contrast, the microbial load measures were 289 negatively associated with indoor plant density, although this was not found to be significant 290 (Figure 1H). In addition, none of the microbial measures were found to be significant with the 291 middle indoor plant density category.

To investigate the relationship between the HSP and the indoor plants we additionally performed regression models adjusting for the aforementioned covariables and found a statistically significant decrease of 4.34% (95% CI: -8.23;-0.45) of HSP in households with more than three plants compared to households with no plants in the living room (Supplemental Table 3).

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To investigate the independence of the association between indoor green, represented by the indoor plants, and indoor microbiota from outdoor green we performed two sensitivity analyses. In the first sensitivity analysis, we additionally adjusted for the residential nature

301 exposure (definitions see methods section) in a 50 m buffer surrounding the household. We 302 observed minimal changes to the originally observed associations (Supplemental Table 4). 303 In the second sensitivity analysis, we additionally adjusted the models for the residential high-304 growing green (that is vegetation exceeding growth height of three meters) exposure in a 50 305 m buffer surrounding the household. In this analysis, all earlier observed associations 306 remained significant, and some of the earlier borderline non-significant associations became 307 statistically significant, specifically the increase of bacterial Shannon diversity with an 308 increasing number of plants (0.33; 95% CI: 0.00-0.66), and the increase of fungal Shannon 309 diversity with higher indoor plant density (0.37; 95% CI: 0.00- 0.73) (Supplemental Table 5).

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#### 311 **5. Discussion**

Residences are typically characterized by a complex assembly of various indoor microbial determinants. The objective of this study was to investigate whether the presence of indoor plants is a determinant of indoor microbial loads and diversity in household settings. We show here that the presence of indoor plants was positively associated with indoor bacterial and fungal diversity but not indoor microbial loads, in settled dust collected in households located in Belgium.

Our primary finding was the increase in bacterial and fungal Chao1 richness and Shannon diversity index in households with more than three indoor plants, compared to households with no plants. Our basic models were adjusted for number of sampling days, average outdoor temperature and ambient airborne black carbon concentrations during the sampling period, furry pet ownership, use of passive ventilation, and having an open kitchen. The observed associations remained significant also after adjusting for number of household

members (data not shown) and close-by (50 m) outdoor green exposure, reinforcing the 324 325 independence of the observed associations between indoor green and the microbial 326 communities found in house dust. A previous experimental study by Mahnert et al. observed 327 bacterial diversity to be increased on surfaces, whereas fungal diversity in the sampled air was found to be decreased.<sup>[19]</sup> This decrease, however, was reported to be likely due to a 328 decrease in relative humidity over time within the enclosed system, which is not comparable 329 330 to the conditions of our home environments. Two earlier studies on indoor microbiota in 331 university dormitories in North-China explored associations of indoor microbiota 332 characteristics with having a plant in the room or not and found significantly higher bacterial 333 richness in floor dust, but not airborne settled dust, for dormitories with one or more plants.<sup>[31, 32]</sup>. No significant differences in bacterial community composition (beta-diversity) 334 335 were reported in these studies. In contrast to the positive associations with indoor microbial 336 diversity, we did not observe any significant relationship between the bacterial and fungal 337 load measures, i.e. the amounts of microbes, in house dust and indoor green, but rather saw 338 inverse trends for microbial loads and indoor plants. One could expect higher microbial loads 339 in house dust of homes that contain one or more potted plant compared to homes without 340 plants, but this was not the case in our study. Such effect might be more pronounced and 341 measurable in floor dust, where plant and soil particulate matter might represent a more 342 quantitative addition, while the analyses of indoor microbiota in our study was done from 343 airborne settled dust collected well above floor level. This rationale is supported by the 344 above-mentioned experimental study by Mahnert et al. where they found an increase in 345 microbial abundance on surrounding floor and wall surfaces, but no increase was observed in microbial abundance of indoor air.<sup>[19]</sup> Generally, we found inverse relationship between the 346 347 diversity and the microbial load measures. This might indicate that higher microbial loads in

house dust link to some extent to rather dominant taxa present at high relative abundance, 348 which in turn reduces measured indoor microbial diversity. Supporting this, our analyses 349 350 revealed significant positive associations between Gram-positive bacterial loads in house dust 351 and the number of household members, as well as the human source proxy, calculated as a 352 sum of eleven human-associated bacterial taxa from the sequencing data (Supplemental 353 table 6). This provides a coherent picture of the well documented effect of human occupants 354 being a major source of bacterial taxa in house dust, such as for example skin-associated Staphylococcus, Corynebacterium or Propionibacterium.<sup>[50, 51]</sup> 355

356 Overall, our results indicate that indoor plants, similar to other indoor household members 357 such as humans and pets, can be considered an important dispersal source for microbial 358 communities. Moreover, our results suggest that household with more indoor plants are also 359 characterized by lower proportion of human-sourced bacteria in house dust. In our study, the 360 presence of plants indoors appeared to contribute to a gentle shift of the indoor microbiota 361 from human-sourced towards proportionally more environmentally sourced microbiota, which likely is a consequence of potted plants adding plant and soil associated taxa to indoor 362 363 microbial communities, leading to a proportional reduction of human-source taxa. This observation is particularly relevant for future research into indoor plant-associated 364 365 respiratory and allergic health implications, considering the contribution of either 366 environmentally-associated or human-associated taxa to the microbial environment might be differentially associated with health.<sup>[31, 52-54]</sup> To support that the observed associations are 367 368 explained by the presence of plants and not behavioral traits connected to keeping indoor 369 plants, we considered additional potential confounding factors such as socio-economic status, urbanicity, and cleaning habits but found minimal changes to the observed 370

associations (data not shown). These results - together with our earlier analyses of the impact 371 of surrounding green space<sup>[16]</sup>- help us gain insight into the relationship between the indoor 372 373 microbial content and green, both derived from surrounding green space and indoor plants. 374 The observed association between indoor plants and the indoor microbial diversity can, in part, be explained by the permanently exposed interface of the phyllosphere and other 375 above-ground plant organs capable of accommodating highly diverse microbial 376 communities.<sup>[21-26]</sup> Besides the extensive communication between above-ground plant 377 378 compartments and the air, the rhizosphere, represented as the root-soil interface, similarly 379 contains many different microenvironments supporting the growth of highly diverse microbial communities.<sup>[55]</sup> Moreover, research supports the potential of rhizosphere-related 380 381 microbial flora, similar to the microbiome of the phyllosphere, to directly or indirectly contribute to the composition of the microbiome in surrounding air.<sup>[56, 57]</sup> 382

383 In our analysis, we identified microbial richness-sensitive indices as being associated with 384 indoor plants, whereas we did not observe an association for the amount of microbes. This suggests that sourcing of plant-associated bacteria and fungi into the airborne indoor 385 386 microbiota appears to be a more subtle addition of bacterial and fungal taxa to the core indoor microbiota, rather than a considerable increase in microbial biomass in indoor 387 388 airborne dust. Our study was not able to address whether the increase in indoor bacterial and 389 fungal diversity with increasing number of plants was due to merely the increase of leaf and 390 soil surface area interacting with and sourcing microbes into indoor air. An alternative 391 explanation could be the differential assembly of microbial communities in different plant 392 species, resulting in niche microbial habitats accommodating many rare microbial taxa that could then be dispersed into indoor air.<sup>[58, 59]</sup>. Given that our study did not collect information 393

394 on size and species of indoor plants, we cannot further speculate on the predominant 395 mechanisms, but it is obvious that more research is needed to investigate the potential 396 mechanism by which indoor green can contribute to the indoor air-associated microbiota.

397 Considering the observed indoor green-related associations pertain to inhalable airborne 398 microbial agents, we hope this study will also motivate future research into potential health 399 implications. Previous research has shown that indoor microbial communities can have both 400 adverse, as well as protective effects on respiratory and allergic health. Visible mold, for example, has been associated with an increased risk of chronic respiratory disease.<sup>[5, 9]</sup> 401 402 However, the beneficial qualities of specifically the diversity of indoor microbiota represent 403 the most reproducible finding to date, when considering associations between indoor 404 microbiota and specifically child respiratory health. For example, higher fungal diversity has 405 been associated with a reduced risk of developing sensitization in early childhood, and 406 exposure to a more diverse (farm-like) bacterial environment could protect against development of allergic and atopic diseases.<sup>[10, 53, 54, 60, 61]</sup> Considering surrounding green 407 408 space accommodates highly diverse microbial communities, it has been proposed that the 409 microbiota act as an underlying mechanism explaining the observed associations between 410 residential green space and various health outcomes.<sup>[62, 63]</sup> Consequently, the potential of 411 indoor plants to enrich the indoor microbiota, similarly to our observations to surrounding green space<sup>[16]</sup>, identifies them as a potential, inexpensive and convenient tool to alter the 412 413 indoor microbiome and, subsequently, building occupant health, ideally with beneficial 414 outcomes. None of the latter can, however, be concluded or implied from the current 415 analysis, but we hope that the herein presented results will motivate and inform future 416 research along this pathway.

To our knowledge, we are the first study to test the hypothesis that indoor plants could be 417 418 important determinants in shaping the indoor microbial communities in a natural setting, 419 including a wide variety of residential environments. Moreover, we included both indoor-420 related factors as well as outdoor green in our models, allowing us to better discern the 421 potential of indoor green in shaping the microbial communities of the indoor air. We were 422 able to detect significant changes in the indoor microbial indices with consistent uniform 423 associations while applying multiple models with varying covariates. However, we also 424 acknowledge several limitations of our study. Beyond the number of plants reported by home 425 household members, we had no additional and more specific information on the type and 426 size of the indoor plants present in the living room, determining the actual amount of 427 available vegetal surface area and their specific physical properties. It could be of interest to 428 expand the analyses of the effects of indoor plants on indoor microbiota beyond diversity 429 indices and quantity of microbes towards specific taxa contributions associated with the 430 presence of plants. To make such analysis meaningful, a larger number of homes and more 431 specific information on plant types would have been required, which was the reason for 432 leaving these aspects as subject for future investigations. The location of study homes in the ENVIRONAGE cohort was restricted to areas in Belgium - thus we cannot speculate on the 433 434 applicability of our study findings to other climatic, geographic and cultural settings in Europe 435 and worldwide. However, we were still able to detect significant changes in the indoor 436 microbial indices with consistent associations while applying multiple models with varying 437 covariables.

#### 438 **6. Conclusion**

439 This study provides further insights into the complex mechanisms determining the indoor 440 microbial composition, specifically with respect to the contribution of indoor plants to indoor 441 microbial diversity. Our results show that in addition to the earlier documented factors 442 related to building, occupancy and surrounding environment and green spaces, the indoor 443 green, represented by indoor plants, can be considered as an important microbial dispersal 444 source for microbial communities in home environments. Our results suggest that indoor 445 plants could potentially represent an inexpensive and convenient tool to enrich the indoor 446 microbiota, which in turn could have health relevance. However, more research is needed to 447 better understand the specific relation between indoor plants and indoor microbial 448 communities, particularly with respect to shaping indoor microbial composition in health-449 promoting ways considering also different age groups.

### 450 **Conflict of interest**

451 The authors report there are no competing interests to declare.

### 452 Author Contribution

YD was involved in writing the original draft. YD, KW and MV were involved in the investigation of the
study. YD and BJ performed formal analysis. YD, MT and LC were responsible for the methodology
and conceptualization and TN and LC were responsible for the supervision. All of the authors were
involved in writing-review and editing of the manuscript.

### 457 Data availability statement

458 The data that support the findings of this study are available from the corresponding author

459 upon reasonable request.

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# 609 Tables

### 610

#### 611 Table 1 Characteristics of the house visit

Microbial diversity	n(%)	min	P25	median	P75	max
Bacteria						
Chao1 richness	155	111	296	406	505	774
Shannon diversity index	153	4.93	6.59	7.12	7.65	8.57
Simpson diversity index	154	0.83	0.97	0.98	0.99	1.00
Fungi						
Chao1 richness	155	24	89	128	172	300
Shannon diversity index	155	0.66	2.70	3.38	4.05	5.57
Simpson diversity index	152	0.52	0.69	0.76	0.82	0.94
Microbial load						
Gram-negative bacterial load (CE/m <sup>2</sup> /day)	153	9683	148227	294609	486892	2786787
Gram-positive bacterial load (CE/m <sup>2</sup> /day)	150	437	83633	151756	273459	1010599
Fungal load (CE/m <sup>2</sup> /day)	153	155	20331	34762	62747	291253
Human source proxy, %	155	2.07	9.07	13.81	20.72	51.89
Characteristics of the sampling						
Period, days	155	29	40	42	46	64
Average Temperature, °C	155	13.2	14.9	17.1	18.4	19.4
Average ambient black carbon exposure,						
μg/m³	155	0.43	0.61	0.71	0.87	1.09
Characteristics of the household						
Surface area of the living room, m <sup>2</sup>	128	8.4	32	40	50	100
Having an open kitchen						
yes	117 (75.5)					
Pet ownership						
Presence furry Pets	77 (49.7)					
Passive Ventilation						
Passive ventilation	128 (82.6)					
Number of household members	147	2	4	4	4	7
Indoor plants						
Number of indoor plants						
no indoor plants	54 (34.8)					
1-3 indoor plants	66 (42.6)					
More than 3 plants	35 (22.6)					
Number of indoor plants per m <sup>2</sup>						
Low	44 (34.4)	0	0	0	0	0
Middle	42 (32.8)	0.02	0.02	0.03	0.04	0.06
High	42 (32.8)	0.06	0.08	0.12	0.12	0.37

613 Table 2 Characteristics (median (IQR)) of the microbial diversity indices (bacterial and fungal Chao1, Shannon and Simpson index) and the microbial load (Gram-negative bacterial, Gram-

614 positive bacterial and fungal load) per category of indoor plant (no indoor plants, 1-3 indoor plants and more than 3 indoor plants) and per category of plant density (low, middle and high),
 615 with corresponding p-values for the trend.

	Number of Plants				Number of plants per m <sup>2</sup>			
	No plants (n = 54)	1-3 plants (n= 66)	More than 3 plants (n = 35)	p- value	Low (0 plants/m²) (n = 46)	Middle (0.02-0.06 plants/m <sup>2</sup> ) (n = 40)	High (>0.06 plants/m²) (n = 42)	p- value
Bacterial diversity			, , , , , , , , , , , , , , , , , , ,			, , ,	, , , , , , , , , , , , , , , , , , ,	
Chao1 richness	385 (231)	399 (198)	438 (144)	0.06	367 (249)	407 (219)	433 (145)	0.02
Shannon diversity index	7.11 (1.40)	7.05 (0.87)	7.40 (0.96)	0.049	6.99 (1.42)	7.08 (1.01)	7.32 (0.99)	0.05
Simpson diversity index	0.98 (0.03)	0.98 (0.02)	0.99(0.01)	0.80	0.98 (0.03)	0.98 (0.02)	0.98 (0.02)	0.29
Fungal diversity								
Chao1 richness	115( 60)	123 (93)	149 (65)	0.03	115(69)	116 (79)	142 (91)	0.38
Shannon diversity index	3.16 (1.27)	3.52 (1.54)	3.67 (1.20)	0.02	3.10 (1.24)	3.31 (1.31)	3.54 (1.45)	0.14
Simpson diversity index	0.73 (0.10)	0.76 (0.13)	0.77 (0.13)	0.03	0.73 (0.12)	0.75 (0.11)	0.76 (0.13)	0.16
Microbial load								
Gram-negative bacterial	313474							
load	(320495)	295240 (323252)	227125 (389420)	0.46	323054 (317057)	212840 (304560)	288039 (323550)	0.39
Gram-positive bacterial	183370							
load	(176473)	149975 (190579)	129805 (196076)	0.13	201157 (184150)	128700 (140640)	168132 (179199)	0.12
Fungal load	42963 (43866)	32248 (39738)	36456 (38100)	0.38	42963(44254)	28371 (25839)	37251 (38669)	0.58

## 624 Figure legend

625

626 Figure 1 (A-D) Overview of the number of plants in the living room (no indoor plants (reference level), 1-3 indoor plants 627 and more than 3 indoor plants) in association with the microbial diversity indices (bacterial (red) and fungal (blue) Chao1 628 richness (A) estimate, Shannon (B) and Simpson diversity (C) indices) and the microbial load (Gram-positive bacterial (dark 629 red), Gram-negative bacterial (light red) and fungal load (blue) D) (E-H) Overview of number of plants per m<sup>2</sup> divided into 630 tertiles (low (0 plants/m<sup>2</sup>) (reference level), middle (0.02-0.06 plants/m<sup>2</sup>), and high (>0.06 plants/m<sup>2</sup>) in association with the 631 microbial indices (bacterial (red) and fungal (blue) Chao1 richness estimate (E), Shannon (F) and Simpson diversity (G) indices) 632 and the microbial load (Gram-positive bacterial (dark red), Gram-negative bacterial (light red) and fungal load (blue) H). All 633 models were adjusted for number of sampling days, average outdoor temperature and ambient airborne black carbon 634 concentrations during the sampling period, furry pet ownership, use of passive ventilation, and having an open kitchen. 635 Results are expressed as unit change [95% confidence interval] compared to the corresponding reference level. For the log-636 transformed microbial load measures, we back-transformed the estimates and expressed them as a percentage change