

Highlights

- Stone communities differ dramatically from surrounding soil and air communities
- Stone microbial communities are richer than soil and air communities
- Abundance of Cyanobacteria characterize stone microbial communities
- Stone communities share few rare taxa with soil and air
- Lithotype is the major determinant of the stone community structure

1 **The tombstones at the Monumental Cemetery of Milano select for a specialized**
2 **microbial community.**

3
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21
22 **Abstract**

23 Subaerial biofilms play a central role in the ecology and biodeterioration of many outdoor
24 monuments and pieces of art. It is well established that microorganisms can face a broad
25 range of stress by living in these subaerial environments, but their origin, taxa determinants
26 and physiological traits are debated.

27 Here, we hypothesized that the bacteria forming these biofilms originate from the surrounding
28 air and soil and that the selective pressure of a life on rocks shapes the community. To verify
29 this hypothesis, we studied the microbial communities of nine tombstones of the Monumental
30 Cemetery of Milano, by collecting samples in three seasons. We analyzed the structure of
31 these subaerial biofilms, compared them with the bacteria identified in the surrounding air and
32 soil and found that only few rare taxa are shared among the three compartments and have
33 been selected by the stone environment. In addition, we considered which parameters - among
34 temperature, humidity, light, season and lithotype - concur to structure the microbial
35 community.

36
37 **Keywords:** subaerial biofilm, stone, rock, Cyanobacteria, stress, microbial diversity

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39

40 **1. Introduction**

41

42 The interface between air and rocks is an ancient and ubiquitous habitat supporting subaerial
43 microbial growth as biofilms (Costerton and Woodely 2003; Gorbushina and Broughton
44 2009). Subaerial biofilms play a central role in the ecology of alpine and desert environments,
45 soil and rhizosphere (Dang and Lovell, 2009; Wieler et al. 2019), but also in the
46 biodeterioration of many outdoor monuments and pieces of art in stone, thus being a reason of
47 concern for the conservation of our cultural heritage (Polo et al. 2012; Schreerer et al. 2009).
48 The first microorganisms to colonize rocks are able to exploit the little moisture and
49 compounds in the air, given the poor availability of water and organic material (Villa et al.
50 2016). In addition, rocks surface offers very little shelter - just pores and cracks in the stone
51 surface – thus exposing these microorganisms to UV and dramatic temperature changes
52 (Walker and Pace 2007).

53 In response to these stressful conditions, microorganisms on rocks typically grow as a well-
54 organized multispecies community protected by a matrix of exopolymeric substances
55 (Gorbushina 2007). Here, microorganisms distribute according to their nutritional and growth
56 needs, the interactions are enhanced and the external stresses are mitigated by the presence of
57 the matrix (Dang and Lovell, 2009). Compared to other biofilms, subaerial biofilms growing
58 on rocks have very distinctive characteristics. Because of the broad range of stress they face,
59 these subaerial biofilms are characterized by low taxonomical diversity, but high synergy and
60 metabolic activity (Villa et al. 2015). Phylogenetically, subaerial communities growing on
61 rocks are very similar throughout geographically separated regions, suggesting that the rock
62 colonizers have a cosmopolitan distribution, and that, once they are transported to the rock,
63 they adapt to the environment to form specialized biofilms (Walker and Pace 2007;
64 Gorbushina and Broughton 2009). Microorganisms composing the subaerial biofilms on rock
65 are able to tolerate drought, UV exposure and temperature fluctuations, thanks to the
66 production of pigments, exopolymeric substances and efficient DNA repair systems (Pointing
67 and Belnap 2012; Gómez-Silva 2018). It has been also shown that the permeability, the
68 mineral composition and the texture of a rock, as well as its surface geometry and the degree
69 of shading, shape the structure and the composition of these microbial communities (Guillitte
70 1995; Miller et al., 2012; Brewer and Fierer 2018). In addition, the airborne contribution to
71 the development of subaerial biofilm cannot be neglected, especially in urban environments,
72 where the presence of organic pollutants can be used as a carbon and energy source (Saiz-
73 Jimenez, 1999; Mitchell and Gu, 2000).

74 Despite the importance of these communities for the ecology of rocks and the conservation of
75 our cultural heritage, the origin of the microorganisms forming subaerial biofilms on rocks is
76 still open for discussion. In arid and hyperarid regions, Wieler and colleagues reported that
77 the taxonomic composition of biofilm communities is very different from the dust and the
78 surrounding soil, suggesting that biofilms microbes are not simply deposited by dust, but they
79 are actively responding to the rock selective pressure (Wieler et al. 2019). To the best of our
80 knowledge, no other studies explore the origin of microorganisms in rock subaerial biofilms
81 and verify the possibility that these communities are formed by air- and soil-borne bacteria,
82 but strongly shaped by the selective pressure of a life on rocks.

83 To verify this hypothesis in an urban environment, we studied the microbial communities of
84 nine outdoor tombstones of the Monumental Cemetery of Milano, by collecting samples in
85 three seasons. We analyzed the structure of these subaerial biofilms and compared them with
86 the bacteria identified in the surrounding air and soil, in order to clarify if the bacteria on
87 stones originate from the surrounding environments and which phylotypes have been selected
88 by the rocks' conditions. In addition, we considered which parameters (temperature,
89 humidity, light, season and lithotype) could have concur to structure the microbial

90 community. By investigating the microbial presence of three interconnected compartments
91 (stones, soil and air), we provide a complete picture of the environmental niche of rocks.

92 93 **2. Materials and methods**

94 *2.1 Sampling*

95 Nine tombstones at the Monumental Cemetery of Milano (Italy) have been sampled in three
96 seasons (Table 1). For each tombstone and for each sampling campaign - July 2015,
97 December 2015 and April 2016 - two samples of subaerial biofilms and one sample from the
98 surrounding topsoil were collected. Subaerial biofilm samples were scraped from a surface of
99 the tomb of about 25 cm². Sampling point for each point were chosen as representative of the
100 visible patina on the statue and avoiding zone too degraded or that could alter the aesthetic of
101 the monument.

102 In July 2015, December 2015 and April 2016, two samples of 300 liters of air were collected
103 with an AGI-30 impinger (Ace Glass) with a flow rate of 4.55 l/min in 25 ml of phosphate
104 saline buffer (PBS) as described in Polo et al. (2012). During the sampling days, for each
105 tombstone, the temperature, the relative humidity and the exposure to light were recorded.

106 107 *2.2 DNA extraction*

108 Air samples were filtered through sterile polycarbonate membranes (pore size 0.2 mm), and
109 then put into tubes with 1.8 ml of lysis buffer and vortexed for 5 min. Total DNA was
110 extracted directly from stone surface samples and air samples as described by Ausubel et al.
111 (1994), with the addition of two cycles of mechanical lysis with bead beater (max speed, 30 s
112 each; Precellys 24, Bertin) and three thermal cycles -80°C/ +70°C before the addition of
113 lysozyme in order to break the cellular walls. DNA from soil samples was extracted with the
114 DNeasy PowerSoil (MO BIO, Qiagen).

115 The bacterial 16S rRNA regions V3 and V4 have been amplified with primers CS1_V3F
116 (341F) e CS2_V4R(806R). For each sample, three reactions of amplification have been run
117 and pooled.

118 119 *2.3 Sequencing Analysis*

120 Amplicons of the bacterial 16S rRNA regions V3 and V4 were sequenced at the Core Facility
121 of the University of Illinois (<http://www.rrc.uic.edu/>). The generated reads were
122 demultiplexed by sample, the adapters have been removed and quality filtered. The remaining
123 sequences were dereplicated, screened for chimeras and clustered into amplicon sequence
124 variants (ASV) using the DADA2 pipeline as described (Callahan et al., 2017;
125 <https://benjjneb.github.io/dada2/tutorial.html>). Taxonomy was assigned to each ASV with the
126 database Silva SSU 138 Ref.NR 99 (Quast et al., 2013). All ASVs not assigned to the
127 Bacteria kingdom have been removed prior to any other analysis. A summary of the reads
128 obtained, filtered and analyzed is presented in the Table A.1. Normalization was performed
129 by randomly sub-sampling ASVs to the number of reads present in the sample with the fewest
130 reads.

131 132 *2.4 Diversity and statistical analyses*

133 All diversity analyses were performed in the R environment using the packages vegan (v2.5-
134 1; Oksanen et al. 2018), phyloseq (McMurdie et al. 2013) and ggplot2 (Wickham et al. 2009).
135 Rarefaction curves of the observed ASVs and alpha diversity indices (Observed, Chao1;
136 ACE, Shannon, Simpson, Inversed Simpson, Fisher) were calculated.
137 Ordinations were created using non-metric multidimensional scaling NMDS (Ramette et al.
138 2007) applying the Bray–Curtis distance measure. Considering the small scatter of the
139 Shepard plot and the low NMDS stress value (stress = 0.147 for all samples and stress = 0.161

140 for tombs samples only), two dimensions were used to ordinate samples (Oksanen et al.,
141 2018). The effect of the environmental parameters on the community composition was
142 examined. The communities were evaluated using the envfit function (vegan) for correlation
143 with physical parameters and lithotypes of the stone substrate samples. The R code is
144 available as file A.2.

145 To determine the shared taxa among the three compartments (stone, soil and air), the ASVs
146 and taxa were imported into a relational database on MySQL server (version 8.0.22). Then
147 with the use of function and query, ASVs present at least in one sample for each compartment
148 have been subset and used to build Venn diagrams.

149

150 **3. Results**

151

152 *3.1 The tombstones at the Monumental Cemetery of Milano*

153 The microbial communities growing on the stone surface of nine tombs at the Monumental
154 Cemetery of Milano were analyzed by collecting two samples each, in summer (July 2015),
155 winter (December 2015) and spring (April 2016). The tombstones are made of different
156 lithotypes: calcitic-marble (tombs 1, 3, 6, 7, 9), limestone (tombs 2 and 5), feldspathic-arenite
157 sandstone (tomb 8) and granite (tomb 4) (Fig. 1). By the start of the sampling campaign, tomb
158 6 was completely restored and tomb 8 was in the process. For each sampling point, the
159 temperature, the relative humidity (RH) and the exposure to light were recorded (Table 1).
160 During spring, temperature ranged between 23°C and 30°C with 17% to 36 % RH; during
161 summer, temperature ranged between 31°C and 35 C with 43% to 51 % RH; during winter,
162 temperature ranged between 14°C and 21°C with 22% to 36 % RH. As expected, minimum
163 light exposure was recorded during winter and the maximum during summer, with important
164 variations among the tombs, depending on the position and orientation of the point sampled.

165

166 *3.2 The composition of the microbial communities on stones, in soil and air.*

167 To determine the composition of the microbial communities growing on the stone surface of
168 tombs and the microorganisms in the surrounding topsoil and air, reads from all samples were
169 pooled and processed together. A summary of the sequencing results is presented in the Table
170 A.1.

171 16019 ASV have been identified by analyzing the microbial community on stones. Despite
172 the use of primers selective for Bacteria, we could not classify 1.1% of the ASV and 0.07%
173 have been assigned to the Archaea or Eukaryota domains after the taxonomic classification
174 and subsequently removed. The composition of the community varies according to the
175 sampled tombstone and the season, indicating a shift of the community structure with the
176 change of physical stimuli. At the phylum level, the microbial communities on the tombs
177 surface is generally dominated by Cyanobacteria (from 11% of the spring sample from tomb 4
178 to 77% of the summer samples from tomb 8, belonging to the class Oxyphotobacteria) and
179 Proteobacteria (from 8% of the winter sample from tombstone 6 to 51% of the summer
180 sample from tombstone 3; mainly from the class Alphaproteobacteria) (Table 2; Table A.3).
181 Except for the tomb 8, during spring the percentage of Cyanobacteria decreases compared to
182 winter's and often summer's samples (samples 3, 5, 6 and 9), corresponding to a general
183 increase in Bacteroidetes and Acidobacteria. For example, the microbial community of
184 tombstone 4 is dominated by Cyanobacteria and Proteobacteria in summer (67% and 21%
185 respectively) and winter (60% and 24% respectively), with a smaller presence of
186 Bacteroidetes (7 in summer and 4% in winter) and Acidobacteria (2% in summer and 4%
187 winter), while in spring, they represent the 11% of the community, mostly replaced by
188 Proteobacteria (47%), Bacteroidetes(20%) and a small fraction of Acidobacteria (7%).

189 Actinobacteria presence strongly increases during winter for all the tombstones, reaching 14%
190 in tombstone 9.

191 For each tombstone, a sample of the soil surrounding the tomb has been collected in
192 concomitance with the tombstone samples and the microbial community analysed.

193 Unfortunately, DNA extraction and sequencing were not successful for some of the samples
194 (spring samples for soil around tomb 1, 3, 6, 8, 9; summer samples for soil around tombs 4 to
195 8) and since the tomb 7 was surrounded by concrete, it was not possible to collect any soil
196 sample. The composition of the soil communities is much more variable than the one retrieve
197 from the stone, both depending on the sampling point and time. Despite the variability, in
198 most of the samples we can observe a strong presence of Proteobacteria (from 13% to 93%,
199 both Alphaproteobacteria and Gammaproteobacteria) and Actinobacteria (from 0% to 50%),
200 followed by Chloroflexi, Acidobacteria, Gemmatimonadetes, Bacteroidetes and Firmicutes.
201 Compared to the samples collected from the tombstones, it is evident the very low presence of
202 Cyanobacteria. The only exception is the soil sample collected close to the tomb 3 and 8
203 during winter, where Cyanobacteria reach the 73% and 8% respectively (Table 2; Table A.3).
204 For each season, two samples from air surrounding the sampling points have been collected
205 and analysed. The air samples are dominated by the presence of Proteobacteria, with lower
206 percentage of Acidobacteria, Actinobacteria and few others (Table 2). In summer Alpha and
207 Gammaproteobacteria constitute 67% of the air bacteria, while in winter the
208 Alphaproteobacteria reach 93% of the community and by spring the Gammaproteobacteria
209 take over with 98%. As for the soil samples, in the air Cyanobacteria are almost absent (Table
210 2; Table A.3).

211 In summary, the microbial communities in the three compartments -stone, soil and air- are
212 quite different in terms of dominating taxa. On tombstones, the communities are dominated
213 by Cyanobacteria and Proteobacteria. While the presence of Proteobacteria is shared among
214 the three compartments, it is striking how Cyanobacteria, abundant on stones, are almost
215 absent in air and soil samples.

216

217 *3.3 The diversity of the microbial communities on stones, in soil and air.*

218 In a microbial community, the presence of each microorganism is the results of its
219 interactions with other species and with the environment surrounding them (Hibbing et al.
220 2010). To describe these interactions, we established the richness of each sample from the
221 sequencing data. The alpha diversity of the microbial communities on stones, soil and air has
222 been explored with a number of different indexes (Table A.4), well represented and generally
223 in agreement with the observed phylotypes and Chao1 index that we report in Figure 2. As
224 evident in Figure 2A and 2B, stone communities are statistically richer than soil and air
225 communities. Despite the observed trend, the variability from sample to sample is high, both
226 in air, soil and stone communities. The variability for air and soil samples can be attributed to
227 the seasonality, since the samples collected during winter are the least diverse, having the
228 lowest observed number of phylotypes and Chao1 index. The decrease of richness during
229 winter is a trend shared only by a part of the stone samples, namely by samples collected on
230 tombs 1, 3, 5 and 6 (Fig. 2C and 2D). Since these four sampling tombs have different
231 lithotypes and physical parameter (temperature, light or relative humidity in Table 1), the
232 reduced diversity in winter cannot be ascribed to a single variable. Nevertheless, the tombs in
233 marble (with an asterisk in Fig. 2C and 2D) seem to support a community with higher
234 diversity (observed phylotypes from 78 ± 8 to 80 ± 4 ; Chao1 index from 213 ± 34 to $200 \pm$
235 22), except for the tomb 6 that has been recently restored and has one of the lowest diversity
236 among the tombs (observed phylotypes 56 ± 24 ; Chao1 index 108 ± 62). The less diverse
237 stone samples correspond to the tomb 4, a tomb in granite (observed phylotypes 62 ± 8 ;
238 Chao1 index 99 ± 24).

239 Non-metric Multi Dimensional Scaling (NMDS) based on Bray–Curtis distance was used to
240 examine the strength of clustering of the microbial communities of stones, soil and air (Fig.
241 3A). The samples from the stones cluster tightly and separated from the soil and air samples,
242 confirming the differences observed with the alpha diversity indexes. If we focus our attention
243 on the samples from the tombs only (Fig. 3B), they better cluster according to the lithotype
244 (by colors) than to the season (by shape). The samples collected on marble tend to cluster
245 together, with the exception of the winter sample from tomb 6. As anticipated, tomb 6 was
246 completely restored just before the sampling campaign and this could be the reason for such a
247 diverse microbial community. While the samples collected on limestone partially overlap
248 with the samples from marble, the granite samples are very different.

249

250 *3.4 Shared taxa among stones, soil and air*

251 The microbial communities on tombstones, in soil and air shared a very limited subset of taxa.
252 The 52 shared ASVs represented the 3% of the stone, the 6% of the soil and the 39% of the
253 air ASVs (Fig. 4), and they are mainly Gammaproteobacteria, within the families of the
254 Xanthomonadaceae and Burkholderiaceae (Table A.5). Interestingly, the shared ASVs
255 correspond to taxa with low abundance in the stone communities. For example, ASV85 is the
256 most represented among the shared ASVs with 1562 reads, while ASVs exclusively present in
257 the stone communities are ten times more represented. On top of these 52 ASVs, stone
258 communities share only other 9 ASVs with air, corresponding to members of the phyla
259 Bacteroidetes, Cyanobacteria, Firmicutes, Proteobacteria. Stone and soil communities share
260 instead other 63 additional ASVs, corresponding to members of the phyla Acidobacteria,
261 Actinobacteria, Bacteroidetes, Cyanobacteria, Deinococcus, Firmicutes and Proteobacteria
262 (Table A.5). Despite these phyla are represented in both soil and stone communities, most
263 ASVs differ between the two compartments.

264

265 *3.5 Parameters affecting the microbial communities on tombstones*

266 Light, temperature and humidity are known to influence the development of microbial
267 communities. We evaluated the correlation between these environmental parameters during
268 the sampling campaign and the analyzed microbial communities on stones, soil and air, but
269 we did not find any statistical significance ($p>0.1$ for minimum and maximum light,
270 temperature and relative humidity). Nevertheless, the correlation with these parameters might
271 be complex and require more data to be revealed.

272 Two additional variables, the season and the lithotype, have been also evaluated as drivers of
273 the microbial communities on tombstones. While no correlation has been found for the season
274 ($p>0.1$), the microbial community composition correlates well with the lithotype of the
275 tombstones ($p=0.002$; Fig. A.6). Our analysis highlights the importance of the lithotype for
276 the development of subaerial microbial communities on stones.

277

278 **4. Discussion**

279

280 Stone surfaces exposed to air are challenging environment for microorganisms because of the
281 exposure to UV, the extreme temperature fluctuations and the low water and resources
282 availability (Viles and Cutler 2012). Bacteria in these communities are organized in biofilms,
283 structures that provide protections for physical stress and facilitate mutualistic interactions
284 (Gorbushina and Broughton, 2009).

285 In this study, we analyzed the subaerial biofilms growing on nine tombstones at the
286 Monumental Cemetery of Milano, in Italy, and compared them with the microbial
287 communities in the topsoil and the air surrounding the tombstones. The biofilms on the stones
288 are very different from the soil and air communities, both in their taxonomical composition

289 and diversity, being richer than soil and air communities. The diversity indexes of soil and air
290 microbial communities are comparable with others reported for similar communities in urban
291 environments. Urban topsoil is usually compacted by the use as walking paths and/or the
292 presence of a pavement, with a consequent reduction of the carbon, nitrogen and gas available
293 to support microbial growth, compared to deeper soil (Hu et al. 2018; Yu et al. 2019). In the
294 air, on the other hand, microorganisms are thought to survive shortly because of the exposure
295 to UV light and reduced water activity (Fahlgren et al. 2010), but recent studies in urban
296 regions revealed that are not necessarily less diverse (Duecker et al. 2018). It is thus no
297 surprising that stone communities yielded more diverse communities than soil and air and,
298 indeed, its diversity indexes are also comparable with other subaerial biofilms growing on
299 historical stones in temperate regions (Chimienti et al. 2016; Li et al. 2016; Schröer et al.
300 2020).

301
302 The bacterial communities in the three compartments are also different in terms of taxonomic
303 composition. As recurrently observed (Villa and Cappitelli 2019), biofilms on rocks were
304 composed of a core microbiome dominated by Cyanobacteria and Proteobacteria taxa.
305 Cyanobacteria are fundamental first colonizers and contributors to the ecosystem functions,
306 because of their photoautotroph metabolism, based on the ability to exploit light exposure for
307 energy and organic matter production and collecting micronutrients, oxygen, carbon dioxide
308 and water from the surrounding air (Crispim and Gaylarde 2005; Gorbushina and Broughton,
309 2009; Cappitelli et al. 2012). Within the stone communities, the most represented
310 Cyanobacteria family was the Chroococcidiopsaceae. Strains of this family are well-known
311 stone-dwelling microorganisms (Ennis et al. 2020), but they also inhabit even hot and cold
312 deserts, being able to survive radiations and desiccation, possibly because of thick multi-
313 layered polysaccharidic envelopes, efficient DNA repair systems and avoidance of protein
314 oxidative damage (Billi et al. 2000; Fagliarone et al. 2017). We observed that
315 Chroococcidiopsaceae, and Cyanobacteria in general, are very scarce in soil and air,
316 suggesting that the interaction between stone biofilms and the soil and air communities is
317 limited for phototrophs, and that it is within the biofilm communities on stones where these
318 bacteria are actively growing and flourishing. In addition to Cyanobacteria, stone subaerial
319 biofilms were also composed by abundant Proteobacteria, that, together with other phyla such
320 as Actinobacteria and Chloroflexi, are fundamental to maintain the nutrients balance in the
321 self-sustaining ecosystem of subaerial biofilms (Villa and Cappitelli 2019; Zanardini et al.
322 2019).

323 Air and soil samples instead were dominated by heterotrophic communities, as previously
324 observed in urban environments with taxa from the Proteobacteria, Actinobacteria,
325 Acidobacteria (for example, Xu et al. 2014; Yan et al. 2014; Gill et al. 2017; Brewer and
326 Fierer 2018; Yu et al. 2019). Despite the strong differences among stone, soil and air
327 communities, we could identify a small group of shared ASVs that belong to the
328 Proteobacteria families of Sphingomonadaceae and Xanthomonadaceae. Bacteria from these
329 taxa have metabolic capacities that could be advantageous to survive and grow in niches with
330 low nutrient availability and exposure to stressors. Several Sphingomonadaceae species can
331 degrade recalcitrant aromatic compounds and can produce exopolysaccharides that might be
332 used as a defense from desiccation and UV and temperature exposure, while some other
333 species can tolerate multiple stressors such as differences in pH, temperature and salt
334 concentrations (Glaeser and Kämpfer 2014; de Vries et al. 2019). In the Xanthomonadaceae
335 family, several ASVs belong to the *Lysobacter* genus, known for its gliding motility, slime
336 and exoenzymes production, such as chitinase (Reichenbach 2006), very useful abilities in a
337 subaerial biofilm growing on rocks. The identification of these bacteria as main constituent of
338 the shared community among the three compartments supports the hypothesis that only

339 metabolically versatile and flexible microorganisms are able to face the extreme conditions of
340 life on rocks, as suggested for fungi (Zakharova et al. 2013), and that probably fewer of them
341 can migrate from one compartment to the other. Similar observations have been reported also
342 for deserts, with very different soil and rock communities dominated by different phyla,
343 despite their proximity (Lee et al. 2016).

344 Our results reflect the strong niche filtering of rocks and possibly the presence of a microbial
345 seed bank. As previously demonstrated for biological rock crusts, soil and dust microbial
346 communities can be very different from biofilm communities, and still sharing a subset of
347 taxa that persist and form a subaerial biofilm (Wieler et al. 2019). The ubiquity and the
348 difference in abundance of the shared rare taxa identified (from very abundant in air and soil
349 to low abundant in stone communities) suggest that they might constitute a microbial seed
350 bank, a reservoir of rare taxa that activate and grow only under specific environmental
351 conditions (Lennon and Jones 2011). The identification of a seed bank has been previously
352 used to indicate directional recruitments driven by the water flow in a complex network of
353 soil, rivers and lakes (Ruiz-Gonzalez et al. 2017). Similarly, we could hypothesize that the
354 abundance of these rare taxa indicates the directional recruitment among the three
355 compartments, with the air and soil communities recruiting more from the seed bank than the
356 stones communities. This hypothesis seems to be supported also by the striking difference in
357 the Cyanobacteria presence, certainly recruited elsewhere than from air and soil communities.
358 Further studies will be necessary to confirm it and reveal its importance.

359 In this study, we also verified that nor seasons or any physical parameter among the
360 considered could shape the microbial communities in the three compartments so much to
361 justify their diversity. During winter, for example, we observed a reduction of diversity for all
362 soil and air samples, but only for some tombstone samples. The presence of the exopolymeric
363 matrix protecting microorganisms in the subaerial biofilms from temperature extremes and
364 enhancing water retention (Flemming and Wingender 2010; Nwodo et al., 2012) might
365 explain the higher stability and resistance of stone communities. On the other hand, we found
366 that lithotype was a driver for diversity within the subaerial biofilm communities growing on
367 tombstones. Samples collected from the granite tombstone (tomb 4), irrespectively of season,
368 enrich for a less diverse community than the other lithotypes, being composed by a minor
369 number of ASVs. It has been previously observed that bioreceptivity (the ability of a material
370 to be colonized by microorganisms, Guillite 1995) for granite is low and that microbial
371 communities are enriched with acid tolerant taxa (Brewer and Fierer 2018). While this might
372 be due to granite physical and chemical composition, the similar mineralogy of granite and
373 feldspathic-arenite sandstone suggests that other inherent properties of the stone must be
374 considered too, such as surface roughness, open porosity, capillary water and bulk density
375 (Miller et al. 2012; Vazquez-Nion et al. 2018). Since these properties are extremely variable
376 in rocks and artworks, it is very complex to establish with certainty the reason for a less
377 diverse community on the granite tombstone than on other lithotypes. In our study the
378 microbial communities of limestone and marble tombstones are mainly composed by
379 Cyanobacteria and Alphaproteobacteria. Compared to previous studies (Chimienti et al. 2016;
380 Mihajlovski et al. 2017; Brewer and Fierer 2018; Pinheiro et al. 2019), the presence of
381 Actinobacteria is lower, despite their abundance in the soil samples. In addition, since several
382 examples of limestones and marbles biodeterioration by phototrophs excretion of corrosive
383 organic acids have been reported in urban and temperate environment (reviewed in Warscheid
384 and Braams 2000), the constant and significant presence of Cyanobacteria is worrisome for
385 the conservation of these artworks. Two interesting cases are the marble tombstones 6 and 9
386 that, at the moment of the first sampling campaign (summer), have been recently restored. We
387 expected to observe a very low diversity community, composed by early colonizers, but the
388 diversity indexes and the taxonomic composition were instead in line with the other

389 tombstones. The presence of a microbial community very similar to older and more mature
390 communities present on not restored tombstones might be due to the high bioreceptivity of
391 marble or to the difficulty of completely removing the pre-existing community with the
392 available restoration methods.

393

394 **5. Conclusions**

395 Our analysis clearly shows that the tombstones microbial communities are very different from
396 the microorganisms in the surrounding soil and air, irrespectively of the stone lithotype or the
397 season of the sampling campaign. The selective pressure of living on a stone surface exposed
398 to air is therefore the main driver of the microbial diversity in the system analyzed.

399 Nevertheless, we identified a core community of ASVs shared among the three compartments
400 – stone, soil and air – made of bacterial species particularly resistant to stress and flexible
401 enough to migrate from one compartment to the other. This observation supports the theory
402 that stone-dwelling microorganisms originate from the surrounding soil and air, and that rock
403 conditions pose as a strong selective pressure and select for specific taxa to build subaerial
404 biofilms.

405 Finally, as previously reported, we confirm that the lithotype is a major determinant of stone
406 microbial communities' structure, affecting their diversity more than season or other physical
407 parameters.

408

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420

421 **Declaration of competing interest**

422 The authors declare that they have no conflicts of interest.

423

424 **Appendix A. Supplementary data**

425 Supplementary data to this article can be found online.

426

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577
- 578 **Figure captions**
- 579 **Table 1** Summary of the physical parameter recorded for each tombstone in summer (July
580 2015), winter (December 2015) and spring (April 2016).
- 581 **Fig. 1** The nine tombstones from the Monumental Cemetery of Milano investigated in this
582 study. The number of each tombstone is indicated on the bottom left corner of each picture.

583 **Table 2** Relative abundance of the major phyla identified in bacterial communities from the
584 stones, in the soil surrounding the stones and the air in three seasons (summer, winter, spring),
585 expressed as percentage.

586 **Fig. 2** Alpha diversity of stone, soil and air samples. Boxplots of the observed phylotypes (A)
587 and the Chao1 index (B) for the stone, soil and air samples. Given a significant p -value
588 obtained by ANOVA analysis (p -value observed phylotypes = 0.0319; p -value Observed
589 phylotypes = 0.0962) obtained by ANOVA analysis, the Tukey's *post hoc* analysis was run
590 (Tukey's HSD, $p < 0.05$) and results are summarized with letters on top of boxplots: boxplots
591 sharing the same letter are not significantly different from each other. Observed phylotypes
592 (C) and Chao1 index (D) according to sample type (circle for air, triangle for soil and square
593 for stone) and season (spring in yellow, winter in blue and summer in orange). Asterisks in C)
594 and D) indicate the tombstones in marble.

595 **Fig. 3** Non-metric dimensional scaling (NMDS) ordination based on Bray–Curtis distance of
596 the microbial communities. (A) Microbial communities of stones, soil and air (stress =
597 15.7%), the distribution is colored according to the type of sample: red for stone, grey for soil
598 and yellow for air. (B) Microbial communities of stones only (stress = 16.1%), the
599 distribution is colored according to the lithotype and shaped according to the season. The
600 sample name is indicated with the type of sample, the sampling point and the season (Su, for
601 summer; W, winter; Sp, for spring).

602 **Fig. 4** Venn diagram showing the number of unique and shared ASVs in the three
603 compartments: stone, soil and air.

604

605 **Table A.1** Summary of the sequencing results as reads number (#) and percentage of the
606 initially obtained (%) after each bioinformatic step.

607 **File A.2** R code used in this study.

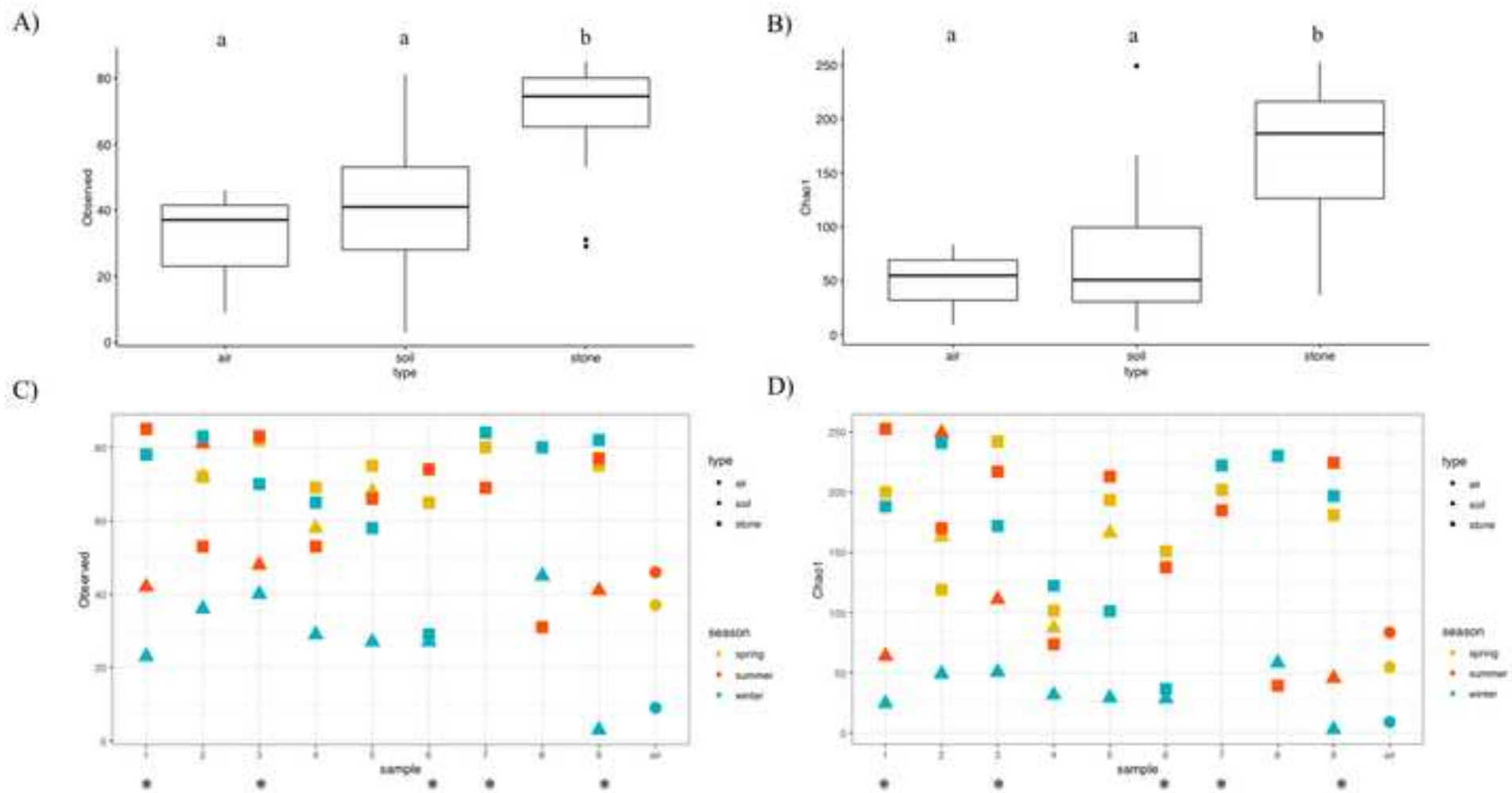
608 **Table A.3** Relative abundance of the major class identified in bacterial communities from the
609 stones, in the soil surrounding the stones and the air in three seasons (Su for summer, W for
610 winter, Sp for spring), expressed as percentage of each sample.

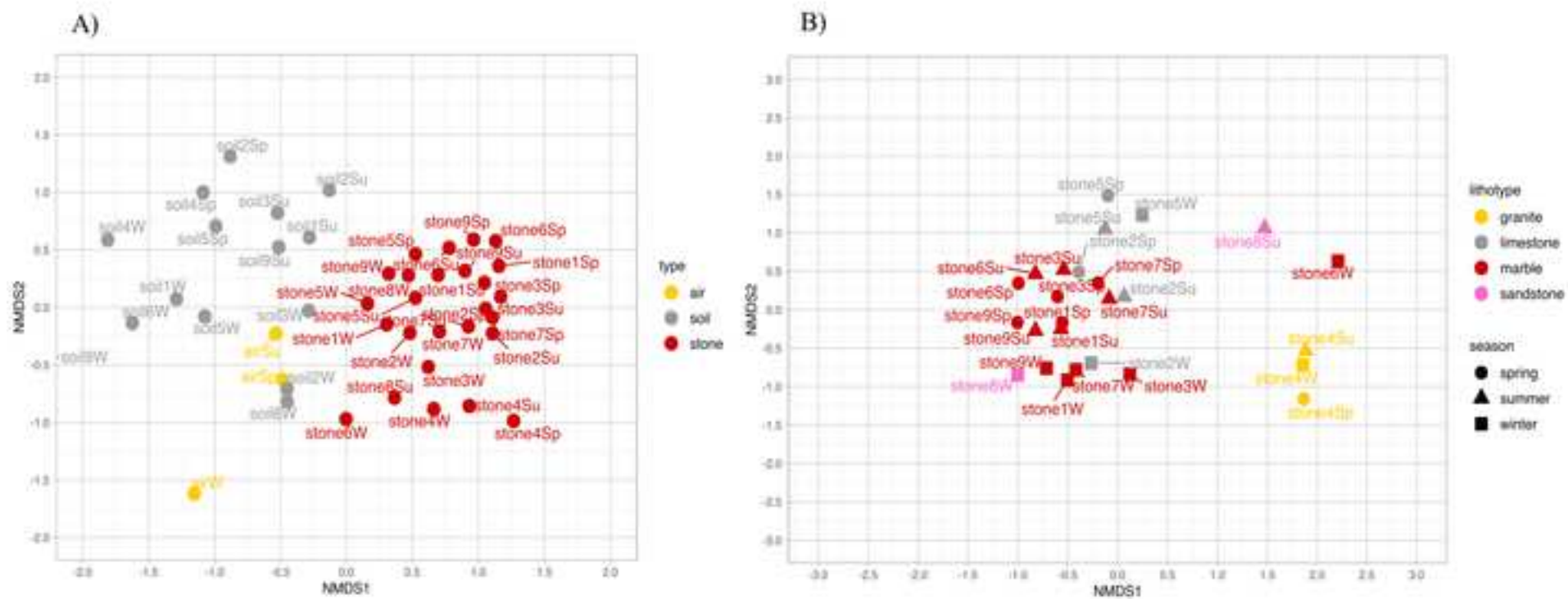
611 **Table A.4** Alpha diversity of stone, soil and air samples calculated indexes (Observed unique
612 phylotypes, Chao1, ACE, Shannon, Simpson, Inverse Simpson, Fisher), the variable
613 describing each sample (season, type, sampling point) and the average of the Observed unique
614 phylotypes and the Chao1 indexes per stone.

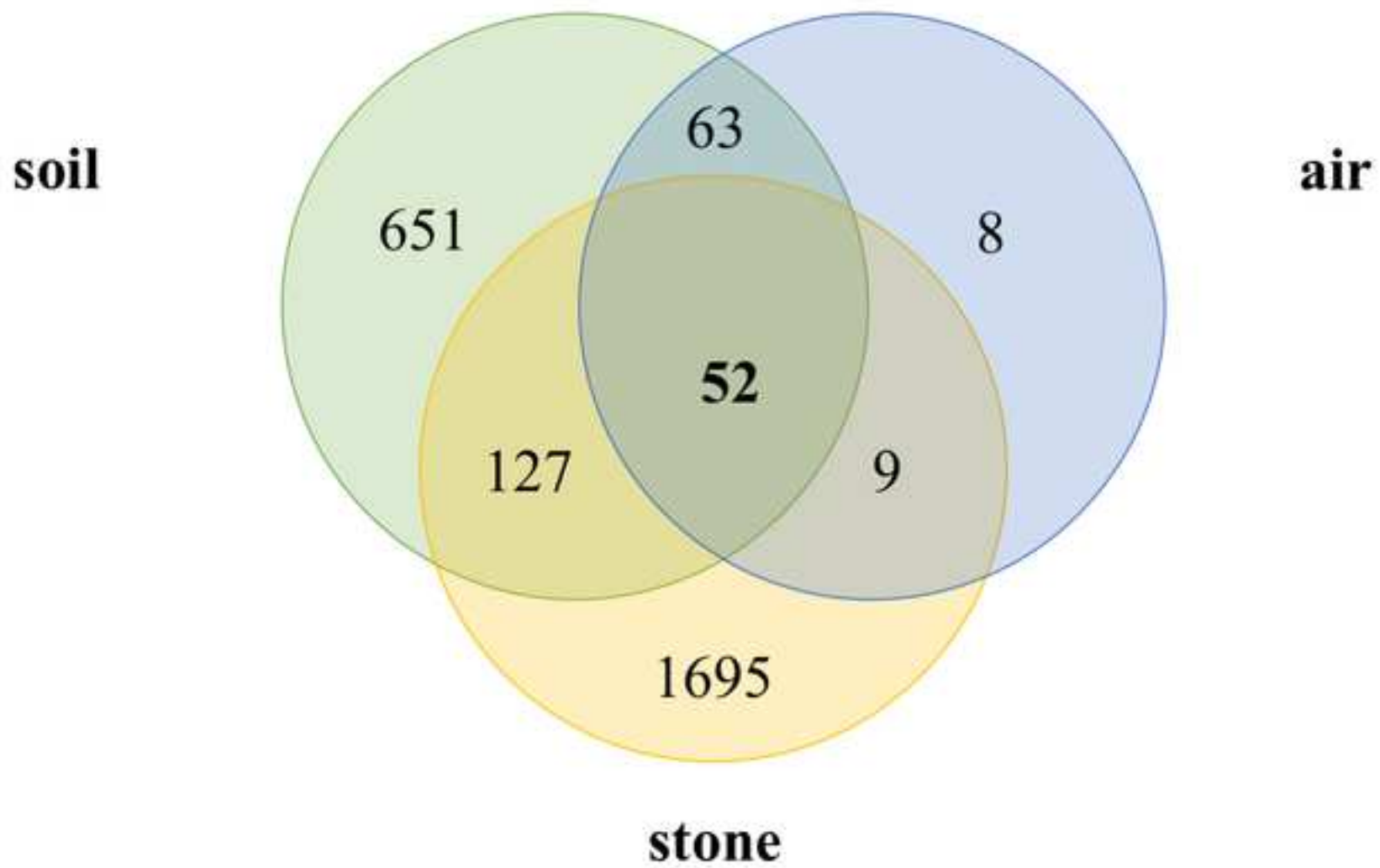
615 **Table A.5** List of unique and shared ASVs in the three compartments: stone, soil and air.

616 **Fig. A.6** Correlation between environmental parameters (minimum and maximum light,
617 temperature and relative humidity), season, lithotype, and microbial communities. The
618 lithotype is the only variable that significantly affects the microbial communities on
619 tombstones ($p=0.002$).









I D		Lithotype		max light (lux)			min light (lux)			temperature (°C)			relative humidity		
				summer	winter	spring	summer	winte r	sprin g	summe r	winte r	sprin g	summe r	winte r	sprin g
1	putto's	calcitic-marble		44610	94090	57760	16075	83460	48990	31.3	20.8	25.97	50.61	21.9	21.09
2	Arton's	limestone		17118	1404	7664	7976	1374	6398	32.61	17.13	27.08	48.84	27.76	20.87
3	de Daninos'	calcitic-marble		48870	44670	46550	9590	40080	28920	32.64	20.62	27.64	48.17	23.15	19.36
4	31-32-33	granite		49120	2450	92300	16140	1419	24170	32.88	19.22	27.18	50.81	29.88	20.59
5	71-72	limestone		1883	706	3151	1446	646	2262	31.74	14.6	27.06	50.13	35.9	17.12
6	Bernocchi's family	calcitic-marble	R	21760	3260	41870	20390	2885	22440	33.35	13.7	29.38	46.87	28.1	21.41
7	729	marble		9807	3316	7649	9371	3427	4093	35.37	18	27.5	42.97	27.1	20.19
8	Besenzanica's family	feldspathic-arenite sandstone		963	145	626	607	114	531	32.33	16	22.97	47.81	25.4	35.81
9	Toscanini's	marble	R	19560	2292	12668	17989	2217	12305	34.41	17.1	27.88	46.38	30.2	28.49

Table 1 Summary of the physical parameter recorded for each tomb in summer (July 2015), winter (December 2015) and spring (April 2016).

