## TITLE

2 Dynamics and drivers of mycorrhizal fungi after glacier retreat

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4 Please cite this paper as:

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- 6 Carteron, A. et al. 2024. Dynamics and drivers of mycorrhizal fungi after glacier retreat. New
- 7 Phytologist, DOI: 10.1111/nph.19682.

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83 Introduction: 1425

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#### SUMMARY

- The development of terrestrial ecosystems depends greatly on plant mutualists such as
  mycorrhizal fungi. The global retreat of glaciers exposes nutrient-poor substrates in
  extreme environments and provides a unique opportunity to study early successions of
  mycorrhizal fungi by assessing their dynamics and drivers.
- We combined environmental DNA metabarcoding and measurements of local conditions
  to assess the succession of mycorrhizal communities during soil development in 46
  glacier forelands around the globe, testing whether dynamics and drivers differ between
  mycorrhizal types.
- Mycorrhizal fungi colonized deglaciated areas very quickly (< 10 years), with arbuscular mycorrhizal fungi tending to become more diverse through time compared to ectomycorrhizal fungi. Both alpha- and beta-diversity of arbuscular mycorrhizal fungi were significantly related to time since glacier retreat and plant communities, while microclimate and primary productivity were more important for ectomycorrhizal fungi. The richness and composition of mycorrhizal communities were also significantly explained by soil chemistry, highlighting the importance of microhabitat for community dynamics.</li>
- The acceleration of ice melt and the modifications of microclimate forecasted by climate change scenarios are expected to impact the diversity of mycorrhizal partners. These changes could alter the interactions underlying biotic colonization and belowgroundaboveground linkages, with multifaceted impacts on soil development and associated ecological processes.

Key words: ecological succession, glacier forelands, soil, metabarcoding, ectomycorrhizal fungi, arbuscular mycorrhizal fungi

#### 112 INTRODUCTION 113 Glaciers have been retreating around the world for the past century, and more than half of the 114 world's glaciers are expected to be lost in this century (Hock et al., 2019; Rounce et al., 2023; 115 Bosson et al., 2023). While glacier retreat poses significant challenges, it is essential to 116 investigate the consequences associated with these changes. Understanding the dynamics of the 117 resulting large ice-free areas is vital for addressing the broader environmental impacts of glacier 118 retreats as they play a crucial role in mountain ecosystems as climate refugia, hosting unique 119 biodiversity and providing essential ecosystem services (Körner, 2004; Palomo, 2017; Cauvy-120 Fraunié & Dangles, 2019; Brighenti et al., 2021; Zimmer et al., 2022). With the projected 121 increase in deglaciated areas in the future, there is a need to better understand the consequent 122 biotic dynamics and predict the ecosystem development of deglaciated areas (Prach & Walker, 123 2020; Ficetola et al., 2021; Rumpf et al., 2022; Bosson et al., 2023). By understanding changes 124 in diversity and ecological processes, analyses of successional gradients could help define 125 effective strategies for management and adaptation of these newly exposed areas. However, in 126 order to draw general ecological patterns and measure biodiversity changes, it is necessary to 127 apply standardized sampling design on multiple glacier forelands around the globe (Chang & 128 Turner, 2019), but such analyses are lacking (Cauvy-Fraunié & Dangles, 2019). 129 130 Glacier retreat exposes new land for colonization of biota, which then diversifies, leading to 131 further soil development (Wietrzyk-Pełka et al., 2020; Khedim et al., 2021; Pothula & Adams, 132 2022). Colonisation by plants after glacier retreat is a crucial element in the formation of novel 133 ecosystems (Clements, 1916; Tansley, 1935). The soil biological crust as well as nurse plants 134 which facilitate the establishment of other plants, are essential in this process (Zimmer et al., 135 2018; Llambí et al., 2021). Mycorrhizal associations are the most common and important 136 mutualistic symbioses in terrestrial ecosystems (Martin et al., 2018) and play a key role in the 137 development of ecosystems (Chapin et al., 1994; Jumpponen et al., 2012; Benavent-González et 138 al., 2019). In nutrient-poor environments, mycorrhizal fungi can be particularly important for 139 enhancing plant growth and survival (Smith & Read, 2008; van der Heijden et al., 2015). 140 Mycorrhizas are known to play a key role in soil development, including biogeochemical 141 processes such as nutrient cycling and carbon sequestration (Read & Perez-Moreno, 2003; 142 Tedersoo & Bahram, 2019; Steidinger et al., 2019). Local-scale analyses from mid-latitude

143 glaciers have shown that non-mycorrhizal and facultative mycotrophic plants tend to 144 predominate immediately after glacier retreat, followed by an increase in mycorrhizal types and 145 in fungal species richness in older communities (Cázares et al., 2005; Oehl et al., 2011; Blaalid 146 et al., 2012). However, these trends are not always monotonous and may even appear 147 idiosyncratic (Helm et al., 1999; Trowbridge & Jumpponen, 2004). This is illustrated by the fact 148 that some mycorrhizal fungal taxa have been found to be indicators of both early (Rime et al., 149 2015) and late successional stages (Guerrieri et al., 2022b). Understanding the dynamics and 150 drivers of plant-fungal mycorrhizal associations is therefore pivotal for inferring key ecological 151 processes during early ecosystem development (Tedersoo & Bahram, 2019) but, so far, no 152 studies have analyzed variability in mycorrhizas in multiple independent ecological successions 153 following glacier retreat. 154 155 Many plants rely on mycorrhizal fungi, which are limited in their dispersal potential (Brundrett, 156 2002; van der Heijden et al., 2015; Tedersoo et al., 2020). Mycorrhizal fungi are highly 157 dependent on the presence of host plants to complete their lifecycle (van der Heijden et al., 158 2015). Therefore, in the case of newly exposed terrains, the mycorrhizal fungal community could 159 depend on the presence of host plants (Zobel & Öpik, 2014) and, similarly, the scarcity of 160 mycorrhizal fungal propagules may limit plant colonization (Dickie et al., 2013; Chaudhary et 161 al., 2018; Delavaux et al., 2021). Recently, the availability of mycorrhizal fungi has been shown 162 to play an important role in shaping island flora worldwide, the so-called "mycorrhizal filter" 163 (Delavaux et al., 2019). However, arbuscular mycorrhizal (AM) and ectomycorrhizal (EcM) 164 fungi, which are the two major mycorrhizal types (Brundrett & Tedersoo, 2018; Steidinger et al., 165 2019; Soudzilovskaia et al., 2020), differ in their nutrient-acquisition strategies, host specificity 166 and dispersal traits such as spore size (Kivlin, 2020). EcM fungi are expected to disperse better with their tiny spores (generally  $< 9,000 \, \mu \text{m}^3$ , on average  $> 2,000 \, \text{times smaller}$  than AM fungal 167 168 taxa), potentially enabling them to establish quickly in new habitats. In contrast, the presence and 169 development of AM fungi in plant roots could be favoured in early stages of ecosystem 170 development because of their lower host specificity compared to EcM fungi (Veresoglou & 171 Rillig, 2014; van der Heijden et al., 2015). Additionally, AM fungi associate with more than 172 70% of all plant species (van der Heijden et al., 2015; Soudzilovskaia et al., 2020) and are 173 expected to impose a lower energy cost to plant hosts in stressful habitats than EcM fungi

174 (Tedersoo & Bahram, 2019). Dispersal limitation and habitat tolerance are critical drivers of 175 ecological successions (Makoto & Wilson, 2019), and even though EcM fungi should better 176 disperse than AM ones, AM host plants tend to be favoured and more abundant in stressful and 177 early stages of development (Cázares et al., 2005; Lambers et al., 2008; Tedersoo & Bahram, 178 2019). Examining patterns of mycorrhizal fungi following glacier retreat at the worldwide scale 179 would allow a simultaneous comparison of the early dynamics between mycorrhizal fungal 180 types. 181 182 Spatial and temporal patterns of community dynamics following the glacier retreat include 183 changes in the number of taxa at a local site (alpha-diversity) and modifications of community 184 composition (beta-diversity) over time. However, these patterns are contingent on the identity of 185 the organisms or the target communities (Cauvy-Fraunié & Dangles, 2019; Hanusch et al., 186 2022). For instance, the richness of spiders and vascular plants can increase fourfold over a 187 century, while the increase in richness is much smaller for dipterans (Pothula & Adams, 2022). 188 Also, the diversity of mycorrhizal fungi is expected to change over time, although patterns 189 emerging from both EcM and AM taxa are complex. For example, while Jumpponen et al. 190 (2002) observed that the number of EcM fungal sporocarps increases with time since glacier 191 retreat, data based on high-throughput sequencing of root-associated fungi portray a context-192 dependent picture, with patterns depending on the proglacial area sampled (Blaalid et al., 2012; 193 Davey et al., 2015). Similarly, the number of AM taxa has been observed to increase towards 194 older sites only in part of the analyzed glacier forelands (Trowbridge & Jumpponen, 2004; Oehl 195 et al., 2011), suggesting a strong influence of local conditions. A comprehensive integration of 196 alpha- and beta-diversity analyses is therefore needed to understand soil biodiversity responses to 197 glacier retreat, and such analysis must also consider local conditions like microhabitat that can 198 significantly influence soil communities (Oehl et al., 2011; Blaalid et al., 2012; Jumpponen et 199 al., 2012; Rime et al., 2015; Wietrzyk-Pełka et al., 2020). To this aim, fine-scale data integrating 200 information on both biotic and abiotic components of proglacial environments is necessary, but 201 challenging to obtain (Ficetola et al., 2021; Marta et al., 2023). 202 203 The aim of our study was to assess the dynamics and the drivers of mycorrhizal fungi in order to 204 assess how they establish after the retreat of glaciers, and how biotic and abiotic factors locally

drive their alpha- and beta-diversity. We analyzed a large number of post-glacial chronosequences from different regions of the world in order to find common patterns characterizing ecosystem development (Jumpponen et al., 2012; Ficetola et al., 2021; Marta et al., 2023) as well as to facilitate predictions of global shifts in mycorrhizal types and associated ecological processes (Tedersoo & Bahram, 2019). To this aim, we implemented a global-scale standardized dataset based on environmental DNA (eDNA) metabarcoding, by conducting a comprehensive inventory of 1251 plots in 46 independent chronosequences on forelands of mountain and high-latitude glaciers (Fig. 1), spanning from 1 to ~500 years since the time of glacier retreat. Even though EcM fungal species are able to disperse better, we hypothesized that AM fungi would dominate immediately after glacier retreat because AM host plants tend to predominate early in succession (Lambers et al., 2008; Tedersoo & Bahram, 2019). We further hypothesized that time since glacier retreat and vegetation features would be major drivers of mycorrhizal fungal diversity. Local abiotic characteristics, such as soil physico-chemical properties, may further shape the microhabitats these fungi experience, thus we expect that abiotic factors are additional drivers of mycorrhizal diversity, jointly with spatial factors (Bahram et al., 2015; Davison et al., 2015). **METHODS** 

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- 223 Sample collection
- From 2014 to 2020, we collected soil samples from 1251 plots within 265 sites located in the
- forelands of 46 mountain and high-latitude glaciers (Fig. 1) from five continents, including
- regions with different climatic conditions and rates of glacier retreat (Zemp et al., 2019).
- 227 Information on times of deglaciation over the past centuries in these forelands is available from
- 228 Marta et al. (2021).

- 230 In each glacier foreland, we selected three to 17 suitable sites (mean = 5.8 sites per foreland, SD
- = 2.5) that became ice-free from 1 to 483 years before sampling. For each site, the age since
- glacier retreat was used as a proxy of the time available for ecosystem development; i.e. we used
- a chronosequence approach for the study of ecological successions (space-for-time substitution;
- Walker et al., 2010). At each site, we established 2-10 plots (mean = 4.7 plots, SD = 0.8) of 1
- 235 m<sup>2</sup>, evenly spaced at a distance of 20 m, where possible. Within each plot, we collected five soil

236 subsamples at a distance of 1 m (Fig. S1). The soil was sampled to a depth of 0-20 cm, and litter 237 was excluded, as well as other plant materials. The subsamples from the same plot were pooled, 238 resulting in a composite soil sample of ~200 g per plot. After homogenization of the composite 239 sample, 15 g of soil were taken and placed within 6 hours in a sterile box to be dried with 40 g of 240 silica gel. This method allowed reliable preservation of eDNA (Guerrieri et al., 2021). An 241 additional soil sample at each plot was also taken for soil chemistry analyses. 242 243 Biotic and abiotic conditions 244 Habitat characteristics were determined at the plot level by estimating primary productivity, 245 plant diversity, soil temperature, topographic wetness index and, for a subset of 32 glacier 246 forelands (out of a total of 46), soil chemistry. Total nitrogen (N) concentration was measured 247 for each plot by elemental analysis (Flash2000 OEA analyzer, ThermoFisher). Soil pH was 248 measured using a pH-meter from a suspension composed by 4 g of soil and 10 ml of bi-distilled 249 water. Depending on pH values, two different methods were used to measure assimilable 250 phosphorus (P) through inductively coupled plasma mass spectrometry (iCAP RQ ICP-MS, 251 ThermoFisher): the Bray and Kurtz method (Bray & Kurtz, 1945) for samples with pH < 6.5 and 252 the Olsen method (Olsen, 1954) for samples with pH  $\geq$  6.5. As an indicator of primary 253 productivity, we used the normalized difference vegetation index (NDVI), which is known to be 254 positively related to annual aboveground net primary production (Paruelo et al., 1997). Yearly 255 maximum productivity was retrieved from the optical satellite data acquired by Sentinel-2 (ESA, 256 COPERNICUS, S2) at 10 m resolution and averaged over the 2016-2019 period using Google 257 Earth Engine and the rgee R package (Aybar et al., 2022). Because proglacial areas tend to have 258 complex topography and lengthy snow cover, yearly maxima were preferred over standard 259 masking algorithms in order to remove the noise caused by cloudiness (Lillesand et al., 2015). 260 Plant diversity was estimated based on the plant MOTU data (see next section for details). Fine-261 scale subsurface soil temperature (5 cm below surface) was estimated using a global 262 microclimatic model approach, calibrated using data-loggers placed in 175 stations from polar, 263 equatorial and alpine glacier forelands, as described in Marta et al. (2023). As a proxy of 264 potential soil moisture, we used the topographic wetness index (TWI) calculated with the 265 dynatop R package (Smith & Metcalfe, 2022), based on the ASTER Global Digital Elevation 266 Model (version 3, Abrams et al., 2020) with 1 arc-second resolution (~30 m at the equator). The

- TWI is based on the slope and the upstream contributing area. It has been found to correlate also
- 268 with factors other than soil moisture such as plant species composition or soil pH, and its ability
- 269 to predict soil moisture varies as a function of the focus environment and the algorithm used
- 270 (Kopecký et al., 2021), hence analysis using the TWI should be interpreted with care. To account
- 271 for the potential impact of regional tree mycorrhizal type dominance (regional mycorrhizal
- dominance, hereafter) on alpha-diversity dynamics, we obtained the percentage of EcM and AM
- tree types (calculated as the percentage of tree basal area) for each foreland, based on model
- 274 projections at  $1^{\circ} \times 1^{\circ}$  resolution (Steidinger *et al.*, 2019).

- 276 DNA sequences acquisition
- 277 The molecular and bioinformatic workflows are detailed in Guerrieri et al. (2022b) for fungi and
- in Cantera et al. (In press) for plants. Briefly, sequences were obtained after the following steps:
- 279 (i) mixing soil samples collected at each plot with phosphate buffer (Taberlet *et al.*, 2012). (ii)
- 280 Extraction of eDNA using the NucleoSpin® Soil Mini Kit. (iii) PCR amplification in four
- replicates with the Fung02 primer pair, targeting the ITS1 region for fungi (forward: 5'-
- 282 GGAAGTAAAAGTCGTAACAAGG-3', reverse: 5'-CAAGAGATCCGTTGYTGAAAGTK-
- 283 3') (Epp et al., 2012) and the Sper01 primer targeting the chloroplast trnL-P6 loop for vascular
- plants (forward: 5'- GGGCAATCCTGAGCCAA-3', reverse: 5'-
- 285 CCATTGAGTCTCTGCACCTATC-3') (Taberlet et al., 2007). PCR reactions included
- bioinformatic blanks, extraction and amplification of negative controls, and positive controls (see
- below). (iv) Library preparation and sequencing of purified samples using the MiSeq (fungi; 2 ×
- 288 250 bp) and HiSeq 2500 (plants;  $2 \times 150$  bp) Illumina platforms. Positive controls consisted of
- 289 16 non-tropical plant species belonging to 15 families (Taxaceae, Lamiaceae, Salicaceae,
- 290 Polygonaceae, Betulaceae, Oleaceae, Pinaceae, Caprifoliaceae, Pinaceae, Aceraceae, Poaceae,
- 291 Rosaceae, Brassicaceae, Geraniaceae, Ericaceae) and two fungal strains (Saccharomyces
- 292 *cerevisiae, Cryptococcus neoformans*) at known concentrations. The positive controls were used
- 293 to confirm that PCRs correctly amplified the present taxa.

- 295 The bioinformatic workflow was conducted using OBITools software (Boyer et al., 2016). As in
- 296 Guerrieri et al. (2022), paired-end reads were first assembled with the illuminapaired ended
- 297 program and only sequences with an alignment score > 40 were kept and then assigned to the

corresponding PCR replicate before dereplication. Singletons were discarded as well as artefacts that had lower and/or higher length than expected (i.e. sequences <68 bp for fungi and <10 or >220 bp for plants). We also discarded sequences containing ambiguous bases. The remaining high-quality sequences were clustered into molecular operational taxonomic units (MOTUs) considering optimal thresholds of intra- and inter-specific variations at 95% for fungi and at 97% for plants (Bonin et al., 2023). These thresholds identified the distribution of sequence similarities among different individuals belonging to the same species, and among different species belonging to the same genus. This allows to minimize the risk that different sequences of the same species are assigned to different MOTUs (over-splitting) while balancing the risk that different species are grouped in the same MOTU (over-merging). On the basis of the analysis of various clustering thresholds using sequences extracted from the EMBL (version 140) database (Bonin et al., 2023), 95% emerged as the threshold balancing over-splitting and over-merging for Fung02, and 97% for Sper01 (Bonin et al., 2023). For each marker, we built a reference database by running in silico PCRs on the public sequence database EMBL (version 140) using the ecoper program (Ficetola et al., 2010) and allowing a maximum of three mismatches per primer. The obtained databases were curated to keep only sequences assigned at the species, genus and family levels. For each MOTU, we made a taxonomic assignment using the *ecotag* program of the OBITools (Boyer et al., 2016). In order to limit the presence of contaminants (Ficetola et al., 2015; Boyer et al., 2016; Zinger et al., 2019), MOTUs were not included in the analyses if they had: i) a best identity score below 80% and total read count in the dataset below five (based on bioinformatic blanks) for fungi; or ii) a best identity score below 90% and total read count below eight for plants. In addition, MOTUs were not included if they were detected in only one PCR replicate of the same sample or in more than one extraction or amplification of negative controls (potential false positives and contaminants; Ficetola et al., 2015; Zinger et al., 2019). Finally, we summed the four PCR replicates to obtain the final MOTU table following the relaxed stringency method (Mächler et al., 2021). Mycorrhizal type assignation We assigned mycorrhizal types using the FUNGuild database (Nguyen et al., 2016). From the

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identified genera and families, the following ones were considered as EcM (ectomycorrhizal)

fungi: Austropaxillus, Cantharellus, Cenococcum, Clavulina, Cortinariaceae, Gomphidiaceae,

330 Tuberaceae (Nguyen et al., 2016). For AM (arbuscular mycorrhizal) fungi, the following 331 families and orders were considered: Acaulosporaceae, Archaeosporaceae, Archaeosporales, 332 Diversisporaceae, Diversisporales, Glomeraceae, Glomerales and Paraglomeraceae (Nguyen et 333 al., 2016). We note that dark septate endophytes are an additional group of potential symbiotic 334 fungi, but their identification based on a functional database is too limited to include them in the 335 present study. 336 337 Data analyses 338 At the plot level, we assessed alpha-diversity by calculating the number of MOTUs, representing 339 taxonomic richness, and the Shannon diversity index, which corresponds to diversity estimated 340 using Hill's number with q = 1. Diversity estimates using q = 1 are appropriate for eDNA 341 metabarcoding data, as they are robust to differences in bioinformatic treatments (Calderón-342 Sanou et al., 2020; Mächler et al., 2021). Analyses were performed on non-rarefied data 343 (McMurdie & Holmes, 2014), but we note that the diversity (q=1) values calculated on non-344 rarefied data are highly correlated with estimates obtained using rarefaction (Table S2). We used 345 linear mixed models to test the hypothesis that AM fungi colonize first. First, we quantified the 346 difference in diversity (estimated with q = 1) between AM and EcM fungi for each plot. Positive 347 values indicated greater diversity of AM communities, whereas negative values indicated greater diversity of EcM communities. The mixed model included the difference in diversity as the 348 349 independent variable, time was the independent variable, glacier and site nested within glacier 350 were random factors and with a Gaussian error distribution. We also used linear mixed models to 351 test the probability that AM and EcM fungi are present in the overall fungal community after 352 glacier retreat. In this case, presence/absence of at least one MOTU of either AM or EcM fungi 353 in each community was the dependent variable, time was the independent variable, glacier and 354 site nested within each glacier were the random factors, modeled assuming a Bernoulli 355 distribution. Models were implemented in the brms package (Bürkner, 2017). The models ran on 356 four parallel chains, each with a length of 10,000 iterations. A burn-in of 1,000 iterations, 357 thinning rate of 10, and uninformative priors provided by the brms package were used. 358 Convergence was assessed by visually inspecting the Markov chains, considering it satisfactory when  $\hat{R} < 1.01$ . The absence of spatial autocorrelation was evaluated by examining spline 359

Helvella, Inocybe, Lactarius, Leucophleps, Rhizopogon, Russula, Sebacinaceae, Suillus and

correlograms using the ncf package (Bjornstad & Cai, 2022). In principle, AM and EcM might show non-identical levels of variability or amplification rates with the tested primer, thus this analysis should be viewed as a comparison of their relative trends. To assess the potential impacts of time, glacier identity, habitat (i.e. productivity, plant diversity, N, P, pH, temperature, TWI) and regional mycorrhizal dominance on patterns of AM and EcM fungal alpha-diversity, we used a random forest algorithm fitting nonlinear multiple regressions with the randomForest (Cutler & Wiener, 2022) and rfPermute (Archer, 2022) packages. We set the number of bootstrap replicates (*ntree*) to 600, with convergence verified visually by assessing the cumulative error rate. The optimal mtry (number of variables randomly sampled as candidates at each split) was determined using tuneRF function and set at two for AM fungi and three for EcM fungi. Variable importance was based on the increase in the mean squared error (%incMSE), and their significance was estimated after 5000 repetitions. Plant alpha-diversity (q = 1) was calculated based on the plant MOTU data. For this analysis, we used data from 793 plots in 32 proglacial areas. We assessed the potential drivers of AM and EcM fungal beta-diversity (i.e. changes in community composition between plots belonging to the same foreland, N = 2031) using the generalized dissimilarity modelling (GDM) approach with the gdm package (Fitzpatrick et al., 2022). This approach is well suited to identify the drivers of community dissimilarity across plots and to analyse relationships potentially affected by non-linearity. Beta-diversity between the communities inhabiting different plots was related to differences in time and habitat variables, as well as to geographic distances. Furthermore, as a measure of plant community changes, we performed a principal coordinate analysis (PCoA) from the plant dissimilarity matrix using the Jaccard index and used the scores of the first axis for each plot as an explanatory variable. We focused on dissimilarities between pairs of plots located in the same foreland (i.e. pairs of plots located in different forelands were excluded from GDM), as our aim was to assess the factors determining community variation within each landscape. Regional mycorrhizal dominance was not included in this analysis, as all the plots within the same foreland share the same dominance values. Plots with zero MOTU of fungi or vascular plants were excluded. Variable significance was estimated after 1000 permutations.

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391 392 The following variables were log-transformed prior to modelling to reduce skewness: time since 393 glacier retreat, vascular plant alpha-diversity N, P, TWI and NDVI. Additional R packages used 394 for data wrangling and visualization included: dplyr (Wickham et al., 2017), ggplot2 (Wickham, 395 2016), ggspatial (Dunnington, 2018), ggrepel (Slowikowski et al., 2021), phyloseg (McMurdie 396 & Holmes, 2013), rnaturalearth (South, 2017), tidyr (Wickham & Henry, 2019) and vegan 397 (Oksanen *et al.*, 2017). 398 399 **RESULTS** 400 Colonization dynamics 401 Soil eDNA metabarcoding of the ITS1 region yielded a total of 43,104,065 high-quality filtered 402 fungal sequences that were grouped into 3331 MOTUs (Table S1), 563 of which were classified 403 as putative EcM or AM fungi (303 EcM and 260 AM fungal MOTUs). Overall, mycorrhizal 404 fungi were detected in 58% of the plots. The diversity of the overall fungal community rapidly 405 increases from a few MOTUs immediately after glacier retreat, up to ~200 MOTUs per plot after 406 100 years (Fig. S2). Just one year after glacier retreat, non-mycorrhizal fungi were already 407 present in more than half of the plots (Fig. S2). Mycorrhizal fungi were detected < 10 years after 408 glacier retreat, with a quick increase in the following decades (Fig. S2). In these recently 409 deglaciated plots, the first EcM fungi were detected after four years and the first AM fungi after 410 one year. Glomeraceae is the most common AM fungal family throughout the stages of 411 ecosystem development (Fig. S3). The five most abundant fungal families that include EcM 412 fungi were all present a few years after glacier retreat (Cortinariaceae, Inocybaceae, Russulaceae, 413 Sebacinaceae, Suillaceae; Fig. S3), while the EcM fungal families Clavulinaceae, Gloniaceae 414 and Rhizopogonaceae were only detected at later stages of development (> 36 years, Fig. S3). In 415 the early stages, AM and EcM fungi show similar richness (95% credible interval of their 416 difference in richness overlaps zero from 1 to ~50 years; Fig. 2) but, with time, the AM fungal 417 diversity tended to become higher compared to EcM fungi and the difference increased 418 afterwards (significant relationship; slope = 0.09, standard error = 0.03). The probability for AM 419 and EcM fungi to be present in the overall fungal community greatly increased with time since 420 glacier retreat (especially after 10 to 20 years; Fig. S4).

422 Environmental drivers of alpha-diversity 423 Random forest models suggested that the alpha-diversity of mycorrhizal fungi is explained by 424 local conditions, in addition to time and glacier identity (variation explained by the model being 425 49% and 51% for AM and EcM fungi, respectively; Fig. 3). All habitat variables showed 426 significant effects, except nitrogen concentration for EcM fungi (Table S3). For both mycorrhizal 427 types, chemical features of soil (N, P, pH) tend to have lower importance compared to the other 428 variables. Time since glacier retreat, productivity, soil temperature and regional mycorrhizal 429 dominance are the variables with the strongest influence on the diversity of both mycorrhizal 430 types. In addition, the local diversity of vascular plants is a particularly strong predictor of AM 431 fungal diversity. 432 433 *Environmental drivers of beta-diversity* 434 The beta-diversity of mycorrhizal fungi is related to the variation of multiple predictors (Fig. 4, 435 Table S4). The considered factors explain a substantial amount of beta-diversity of both AM and 436 EcM fungi (40-44%). Differences in time since glacier retreat are, by far, the main factor 437 influencing AM fungal community changes. Changes in pH, vascular plant community, 438 productivity and geographic proximity are also important for the beta-diversity of AM fungal 439 communities. In contrast, EcM fungal community variation is mostly explained by changes in 440 TWI, followed by geographic proximity and productivity. 441 442 **DISCUSSION** 443 Early dynamic of mycorrhizal fungi 444 The dynamics of mycorrhizal fungi during early succession have attracted great interest due to 445 their importance in ecosystem development (Allen et al., 1992; Nara, 2006; Jumpponen et al., 446 2012), along with the role played by nurse plants, the microtopography and the soil biological 447 crust (Zimmer et al., 2018; Llambí et al., 2021; Bayle et al., 2023). Glacier forelands are 448 nutrient-poor (Khedim et al., 2021; Pothula & Adams, 2022), and this poses unique challenges 449 for mycorrhizal establishment. The colonization of mycorrhizal fungi in deglaciated terrains 450 shows a delay compared to that of the overall fungal community. Both AM and EcM fungi, 451 however, manage to colonize quickly following glacier retreat, with the most abundant 452 mycorrhizal fungal families already present at the earliest stages of development (< 17 years).

These results highlight the remarkable speed at which mycorrhizal fungi can colonize these environments, even considering the limited amount of fungal propagules typically found in young glacier forelands (Oehl *et al.*, 2011; Jumpponen *et al.*, 2012). As for plant pollen, fungal spores might be transported by wind to glacier surfaces and released during glacier retreat (Surova *et al.*, 1992). The quick establishment of EcM fungi might be facilitated by their tiny spores, and this might also be true for some AM fungi showing specific traits, such as *Diversispora* and *Acaulospora* (Oehl *et al.*, 2011; Chaudhary *et al.*, 2020).

Contrary to our expectations, AM fungi did not exhibit a higher diversity during the early stages of succession (<50 years) compared to EcM fungi. Specific dispersal attributes, as well as low host specificity and low energetic cost paid by host plants (Tedersoo & Bahram, 2019), may be key features favouring establishment of mycorrhizal fungi in such resource-poor and extreme environments. The tight relationships between AM fungi and pioneer plants could be counterbalanced by their limited dispersion capacity compared to that of EcM fungi. Even though some mycorrhizal fungi are able to colonize quickly, our results stress the importance of time and habitat formation on the development of mycorrhizal fungal communities (Cázares & Trappe, 1994; Oehl *et al.*, 2011; Chaudhary *et al.*, 2018), as also found in glacier forelands for other organisms such as ground beetles and nematodes (Brambilla & Gobbi, 2014).

Plants as drivers of mycorrhizal fungal diversity?

Both AM and EcM fungi have been reported to associate with plant species that are found in

barren substrates at the earliest stages of succession following glacier retreat. However,

colonization of plant roots by mycorrhizal fungi in such environments is often scarce (< 10%;

Cázares et al., 2005; Oehl et al., 2011). Some mycorrhizal plant species have the ability to

establish and grow in proglacial areas even without their fungal symbionts (Fujiyoshi et al.,

477 2011; Oehl et al., 2011), allowing these facultative nonmycorrhizal plants to bypass the

"mycorrhizal filter" (Delavaux et al., 2019). This suggests that the diversity of mycorrhizal fungi

might be shaped by plant diversity, as supported by the strong relationship between mycorrhizal

diversity and plant richness.

If plant hosts are capable of colonizing the barren substrates of forelands before mycorrhizal fungi, they may drive the subsequent establishment of early fungal mycorrhizal communities, rather than the other way around (Oehl *et al.*, 2011; Jumpponen *et al.*, 2012).

Indeed, the dynamics of mycorrhizal communities have been found to somewhat parallel that of local plant communities (Davey *et al.*, 2015). As expected, both alpha- and beta-diversity of mycorrhizal fungi showed a strong relationship with the diversity, composition and regional mycorrhizal dominance of plant communities (Figs. 3 and 4). The significant link between mycorrhizal fungal diversity and primary productivity further supports the role of plants in shaping the mycorrhizal fungal community, usually in primary succession (Zobel & Öpik, 2014).

Climate change induces vegetation expansion and increases plant biomass ("greening") at high elevations and could thus influence mycorrhizal fungal diversity, accelerating their colonization of these environments (Anderson et al., 2020; Rumpf et al., 2022). Mycorrhizal fungal diversity may be promoted by plant biomass, but also by plant richness depending on their host specificity (van der Heijden et al., 2015; Kivlin et al., 2022). In turn, a greater mycorrhizal fungal diversity can determine positive feedbacks on plant diversity and ecosystem functioning (van der Heijden et al., 1998), as mycorrhizal fungi are known to enhance plant survival and growth (Smith & Read, 2008), particularly in nutrient-poor environments (van der Heijden et al., 2008). However, climate change can also reduce vegetation in alpine ecosystems ("browning"), due to changes in precipitation patterns and reduced snow cover (Phoenix & Bjerke, 2016; Liu et al., 2021; Rumpf et al., 2022; Marta et al., 2023). Such browning could weaken the benefits provided by mycorrhizal associations by impeding mycorrhizal diversity, resulting in lower nutrient availability for the remaining plants, although some ruderal mycorrhizal fungy could persist (Hiiesalu et al., 2023). The overall responses of the ecosystems to climate changes ist thus difficult to predict, as it depends on the types of vegetation and mycorrhizas involved (Tedersoo & Bahram, 2019).

Contrasting responses between mycorrhizal types

The divergent responses of different mycorrhizal types to environmental stressors can be related to their contrasting roles in plant nutrition and protection (Mohan *et al.*, 2014; Tedersoo & Bahram, 2019; Bennett & Classen, 2020). These differences likely contribute to the varying importance of drivers shaping mycorrhizal fungal diversity following glacier retreat (Figures 3 and 4). Multiple factors affected the dynamics of mycorrhizal communities, including time, regional mycorrhizal dominance and local conditions such as productivity. In addition, the diversity of AM fungi was significantly influenced by plant diversity, while microclimate was

particularly important for EcM fungi. These findings highlight the interplay between mycorrhizal types, abiotic factors and plant-microbe interactions in shaping mycorrhizal community dynamics along environmental changes (Davey *et al.*, 2015; Rasmussen *et al.*, 2022; Kivlin *et al.*, 2022). Geographical distribution also plays a role, for instance with potential differences between forelands located in tropical *vs* temperate regions, or located in regions with climatic conditions supporting different mycorrhizal types (Steidinger *et al.*, 2019; Guerrieri *et al.*, In press).

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Differences between mycorrhizal types are also clear for beta-diversity (i.e. changes in community composition). That of AM fungi is mostly explained by time, whereas a microhabitat parameter (potential soil moisture) is the key factor for EcM fungi (Abrego et al., 2020). These results are congruent with AM fungi being more affected by dispersal limitations. In fact, a strong relationship between beta-diversity and time, after taking into account differences for key biotic and abiotic parameters, is often taken as evidence of a major role of dispersal limitation (Makoto & Wilson, 2019; Ficetola et al., 2021), which may determine time lags between glacier retreat, habitat development and the formation of AM communities. Conversely, for EcM fungi, habitat filtering could play a more important role (Davey et al., 2015; Castilho et al., 2020; Delavaux et al., 2021), even though both processes seem important. Consequently, AM and EcM richness and composition could respond differently to global changes. Given the close links between plant diversity and mycorrhizal diversity, these contrasting responses of AM and EcM fungi could be exacerbated if different plant species also show distinct responses to global changes (Fei et al., 2022). Nevertheless, the strong impact of plant communities on AM fungi, which are obligate biotrophs, could be counterbalanced by their lower host specificity (van der Heijden et al., 2015). Soil chemistry, temperature and moisture are additional drivers of alphaand beta-diversity of mycorrhizal fungi. As climate affects the rate of rock weathering (Walker et al., 2010) and, more generally, soil development, composition and biodiversity (Khedim et al., 2021; Guerrieri et al., In press), climatic modifications probably impact the dynamics and communities of mycorrhizal associations both directly and indirectly. AM fungi could be influenced indirectly by climate change through plant diversity changes, whereas the impact might be more direct for the EcM fungi because of their sensitivity to temperature and moisture (Tedersoo & Bahram, 2019).

### *Limitations of observational and eDNA approaches*

The use of a chronosequence approach (space-for-time substitution) to draw inferences on the evolution of ecosystems requires caution (Johnson & Miyanishi, 2008). Unmeasured factors such as disturbances (e.g. landslides), which often occur in glacial and periglacial environments, can also influence ecosystem development and might have affected our observations (Fickert & Grüninger, 2018; Wietrzyk-Pełka et al., 2020). In our sampling design, these impacts were minimized by avoiding locations known to have been affected by past disturbances (Marta et al., 2021). Furthermore, shifting climate conditions reduce our power and confidence in replicating past patterns of succession (Prach & Walker, 2020), as well as in predicting mycorrhizal dynamics and subsequent impacts on ecological processes that go beyond the coupling between plant and fungal partners (Fei et al., 2022). Nonetheless, chronosequence analysis remains the most appropriate approach for the study of ecosystem development over centuries (Walker et al., 2010; Poorter et al., 2021). Studies have suggested that the analyses of chronosequences provide results that are consistent with replicated community analyses of permanent plots (Foster & Tilman, 2000; Sytsma et al., 2023; Cantera et al., In press). Further research aiming at disentangling the effects of microbes on plants and vice-versa in proglacial environments could benefit from manipulative experiments on permanent plots to explicitly test causal relationships (Yang et al., 2021).

Caution should also be taken when interpreting ecological data derived from eDNA metabarcoding (Zinger *et al.*, 2019). Although eDNA offers valuable information, it has some limitations, particularly in the estimation of microbial function and biomass. Encouragingly, previous investigations conducted in proglacial environments have demonstrated high concordance between eDNA-based analyses and traditional surveys, resulting in consistent biodiversity estimates (Cantera *et al.*, In press). In principle, our results may be influenced by the amplification of inactive or dead organisms retained in the soil. Nevertheless, studies on environments that experienced known changes of communities suggest that eDNA mostly represent the organisms living during the last few years (Foucher *et al.*, 2020; Ariza *et al.*, 2023), and the amplification of dead organisms probably has a limited effect in our study system, which spans multiple centuries of ecosystem evolution from barren substrates. Furthermore, the primers and the mycorrhizal database used are not free of biases toward specific taxa. For example, the ITS1 primers underamplify some groups of fungi (Nilsson et al., 2019). To limit this issue, we

used a modified version of ITS primers (Epp *et al.*, 2012), adapted to reduce bias on Glomeromycota (Taberlet *et al.*, 2018). Despite some limitations, general fungal ITS primers tend to offer good estimates of both EcM and AM fungal communities, and their relative responses to environmental variables (Berruti *et al.*, 2017; Lekberg *et al.*, 2018). Finally, the functional assignment of fungal sequences is an area of considerable promise within mycorrhizal research (Fei *et al.*, 2022; Tedersoo *et al.*, 2022; Baldrian *et al.*, 2022), still the interpretation of results should be taken with care, given that information on several taxa is still incomplete.

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#### Conclusion

Local biotic and abiotic factors deeply impact the successional dynamic of mycorrhizal fungi following glacier retreat at high elevations and latitudes. Time is not always the most important factor, highlighting the key roles of additional factors that contribute to the patterns observed within and across forelands, such as vegetation and microclimate. However, as many biological and chemical features of proglacial environments change through time, a key challenge is to assess the intricate co-variation among ecosystem attributes. Our study also stresses the importance of initial site conditions, glacier location (through the effect of local factors, such as regional climate or species pool) and surrounding environments in the formation of mycorrhizal symbiosis (Fig. 3; Cázares et al., 2005; Fujiyoshi et al., 2011; Jumpponen et al., 2012; Steidinger et al., 2019; Wojcik et al., 2021). A substantial part of mycorrhizal diversity patterns remained unexplained (models explained ~50% of variation), suggesting a role of stochastic processes (Wojcik et al., 2021) and/or unmeasured factors such as disturbances and biogeographical factors that require further study (Cázares & Trappe, 1994; Ficetola et al., 2021). The major role of plants in the dynamics of mycorrhizal communities highlights the need for research integrating data on plants and fungi to elucidate the mechanisms underlying ecosystem development. AM fungi exhibit a broad host range and associate with both trees and herbaceous plants (van der Heijden et al., 2015). This broad host spectrum can facilitate their establishment in proglacial areas even in the absence of trees, for instance above the tree line, compared to EcM fungi, which associate primarily with trees. On the other hand, some EcM trees, such as Salix spp., can colonize ice-free surface in less than 10 years (Fickert & Grüninger, 2018), and some herbaceous colonizers of glacier forelands are also known to associate with EcM fungi such as Bistorta vivipara (Davey et al., 2015). The complexity of interactions between early-colonizing plants

608 and mycorrhizal fungi highlights the importance of fine-scale sampling and detailed analyses 609 focusing on symbiotic interactions. A further step to improve our understanding of mycorrhizal 610 dynamics during ecosystem development would include the integration of multitrophic 611 interactions with herbivores, fungal feeders and other root symbionts such as nitrogen-fixing 612 bacteria and dark septate endophytes fungi. 613 The current and expected changes in the rate of glacier ice melt (Rounce et al., 2023; 614 Bosson et al., 2023) and in local climatic conditions (Marta et al., 2023) could affect mycorrhizal 615 partners and types differently, with the potential for causing a mismatch between aboveground 616 and belowground linkages and possibly disrupting the biotic interactions underlying biotic 617 colonization. Future studies integrating data from multiple taxonomic groups would be needed to 618 predict ecosystem-level impacts of these fast-changing habitats, considering the multifaceted 619 consequences on trophic networks and associated ecological processes. 620 621 DATA AND CODE AVAILABILITY 622 The custom code and the data to replicate the results are available at: 623 https://github.com/alexiscarter/mycorrhizal\_succession\_iceCommunities. 624 Raw sequencing data from ITS and trnL amplification are deposited at 625 https://doi.org/10.5281/zenodo.6620359 (Guerrieri et al., 2022a). 626 627 **FUNDING** 628 This study was funded by the European Research Council under the European Community's 629 Horizon 2020 Programme, Grant Agreement no. 772284 (IceCommunities), and by Biodiversa+, 630 the European Biodiversity Partnership under the 2021-2022 BiodivProtect joint call for research 631 proposals, co-funded by the European Commission (GA N°101052342) and with the funding 632 organisations MUR and ANR. 633 634 **AUTHOR CONTRIBUTIONS** 635 AG, SM, AB, RA, FA, RSA, PA, PAG, SCF, JLCL, PC, MCS, JC, JACR, CC, RCE, OD, AE, 636 SE, AF, LG, FG, MG, SH, NK, RIM, GP, FP, AR, NU, YY, VZ, AZ, AZ, PT, GAD, JP, WT, 637 MC and GFF acquired the data. AC and GFF analyzed the data and interpreted the results. AC

638 led the writing of the manuscript. All authors reviewed the drafts and gave final approval for 639 publication. 640 Correspondence and requests for materials should be addressed to AC 641 alexis.carteron@gmail.com 642 643 **COMPETING INTERESTS** 644 The authors declare no competing interests 645 646 **REFERENCES** 647 Abrams M, Crippen R, Fujisada H. 2020. ASTER Global Digital Elevation Model (GDEM) and 648 ASTER Global Water Body Dataset (ASTWBD). Remote Sensing 12: 1156. 649 Abrego N, Huotari T, Tack AJM, Lindahl BD, Tikhonov G, Somervuo P, Martin Schmidt N, 650 Ovaskainen O, Roslin T. 2020. Higher host plant specialization of root-associated endophytes 651 than mycorrhizal fungi along an arctic elevational gradient. Ecology and Evolution 10: 8989-652 9002. 653 Allen MF, Crisafulli C, Friese CF, Jeakins SL. 1992. Re-formation of mycorrhizal symbioses on 654 Mount St Helens, 1980–1990: interactions of rodents and mycorrhizal fungi. Mycological 655 Research **96**: 447–453. 656 Anderson K, Fawcett D, Cugulliere A, Benford S, Jones D, Leng R. 2020. Vegetation expansion 657 in the subnival Hindu Kush Himalaya. Global Change Biology 26: 1608–1625. 658 Archer E. 2022. rfPermute: Estimate Permutation p-Values for Random Forest Importance 659 Metrics. 660 Ariza M, Fouks B, Mauvisseau Q, Halvorsen R, Alsos IG, de Boer HJ. 2023. Plant biodiversity 661 assessment through soil eDNA reflects temporal and local diversity. Methods in Ecology and 662 Evolution 14: 415-430. 663 Aybar C, Qiusheng W, Bautista L, Yali R, Barja A, Ushey K, Ooms J, Appelhans T, Allaire JJ, 664 Tang Y, et al. 2022. rgee: R Bindings for Calling the 'Earth Engine' API. 665 Bahram M, Peay KG, Tedersoo L. 2015. Local-scale biogeography and spatiotemporal variability 666 in communities of mycorrhizal fungi. New Phytologist 205: 1454–1463. 667 Baldrian P, Bell-Dereske L, Lepinay C, Větrovský T, Kohout P. 2022. Fungal communities in soils 668 under global change. Studies in Mycology.

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# **FIGURES**

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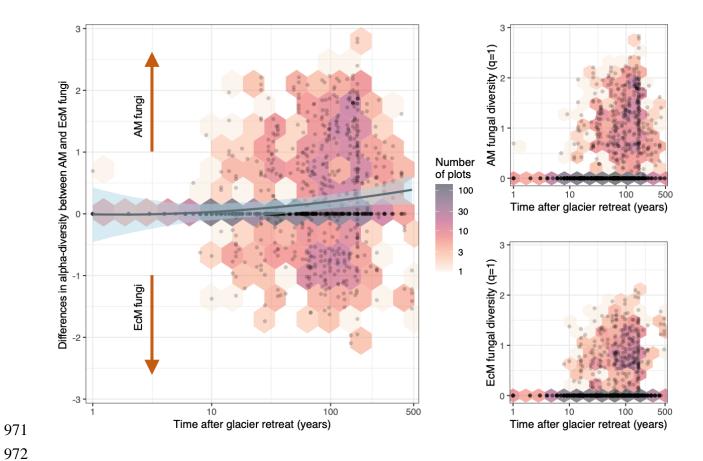
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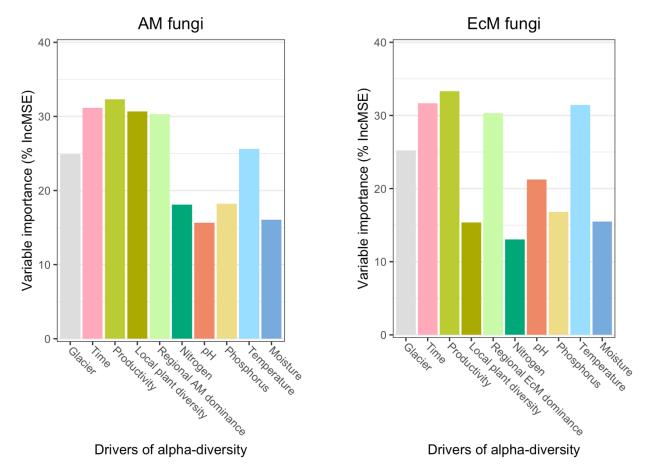
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Ferdinandbreen Platabreen Steindalsbre Sólheimajökull Midtdalsbreen 50°N Tiedemann Bara Shigri Gangotri Gongga Lobuche Latitude (°) Antisana 12 Carihuairazo Broggi Morteratsch Uruashraju Zongo Dammaglet Cipreses Franz Joseph Exploradores 50°S San Lorenzo Blanc-Noir o° Longitude (°) 60°E 120°W 60°W 120°E

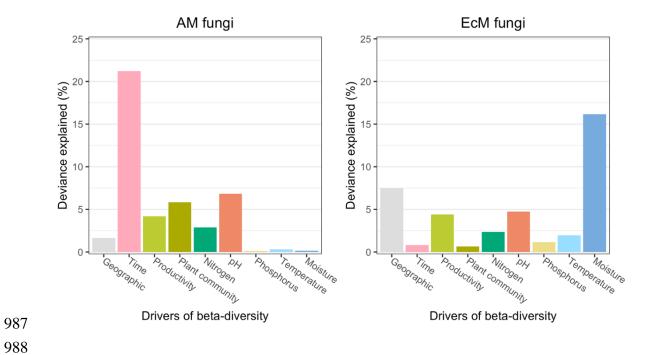
**Figure 1.** Location of the 46 glaciers whose proglacial areas were sampled for this study. The inset map shows a zoom into the European Alps range.



**Figure 2.** Differences in diversity (q = 1) between AM and EcM fungal communities (left panel) and observed diversity (right panels) after glacier retreat, calculated at the plot-level. In the left panel, points above zero represent a fungal community richer in AM fungi compared to EcM fungi, and the opposite for points below zero. In all panels, the x-axis is on a log scale. N = 1251 plots in 46 proglacial areas. The regression curve was obtained through a linear mixed model; shaded areas represent the 95% credible intervals of the regression.



**Figure 3.** Role of glacier identity, time after glacier retreat, soil chemistry (nitrogen, pH, phosphorus), regional tree mycorrhizal type dominance (regional AM or EcM dominance) and microclimate (temperature, moisture) on the alpha-diversity (q = 1) of AM and EcM fungi. Variable importance was determined by the increase in mean squared error (IncMSE) using random forest models. N = 793 plots in 32 proglacial areas. Variance explained was 49% and 51% for AM and EcM fungi, respectively. Mean of squared residuals was 0.22 and 0.11 for AM and EcM fungi, respectively. See Table S3 for more details.



**Figure 4.** Effects of geographical proximity, differences in time after glacier retreat, soil chemistry (nitrogen, pH, phosphorus) and microclimate (temperature, moisture) on the beta-diversity of AM and EcM fungi using global dissimilarity models (GDMs). The higher the deviance explained, the more important the variable is in explaining beta-diversity patterns. Only changes between plots in the same proglacial area were considered (N = 2031 in 32 proglacial areas). See Table S4 for more details.