

Climate-induced long-term changes in the phenology of Mediterranean fungi

Hélène Vogt-Schilb, Franck Richard, Jean-Claude Malaval, Sylvie Rapior, Françoise Fons, Véronique Bourgade, Bertrand Schatz, Ulf Buentgen, Pierre-Arthur Moreau

► To cite this version:

Hélène Vogt-Schilb, Franck Richard, Jean-Claude Malaval, Sylvie Rapior, Françoise Fons, et al.. Climate-induced long-term changes in the phenology of Mediterranean fungi. Fungal Ecology, 2022, 60, pp.101166. 10.1016/j.funeco.2022.101166 . hal-03869086

HAL Id: hal-03869086 https://hal.science/hal-03869086

Submitted on 22 Jul 2024

HAL is a multi-disciplinary open access archive for the deposit and dissemination of scientific research documents, whether they are published or not. The documents may come from teaching and research institutions in France or abroad, or from public or private research centers. L'archive ouverte pluridisciplinaire **HAL**, est destinée au dépôt et à la diffusion de documents scientifiques de niveau recherche, publiés ou non, émanant des établissements d'enseignement et de recherche français ou étrangers, des laboratoires publics ou privés.



Distributed under a Creative Commons Attribution - NonCommercial 4.0 International License

Version of Record: https://www.sciencedirect.com/science/article/pii/S1754504822000277 Manuscript_f52c19cca68b2cc71a2fa714aed0f518

1 Climate-induced long-term changes in the phenology of Mediterranean fungi

- 2 Running head: Mediterranean fungi phenology
- 3 Hélène Vogt-Schilb^{a,b,c}, Franck Richard^{a*}, Jean-Claude Malaval^d, Sylvie Rapior^e, Françoise
- 4 Fons^e, Véronique Bourgade^f, Bertrand Schatz^a, Ulf Buentgen^{g,h,i}, Pierre-Arthur Moreau^j
- ³ CEFE UMR 5175, CNRS Univ Montpellier EPHE IRD, 1919 route de Mende, F-34293
- 6 Montpellier Cedex 5, France
- 7 ^b Biotope, 22 boulevard Maréchal Foch, 34140 Mèze, France
- ^c Faculty of Science, University of South Bohemia, Branišovská 1760, 37005 České Budějovice,
- 9 Czech Republic
- ^d Société d'Horticulture et d'Histoire Naturelle de l'Hérault, Parc à ballon 1 bâtiment A, 125
 rue du Moulin de Sémalen, 34000 Montpellier, France
- ¹² ^e Laboratoire de Botanique, Phytochimie et Mycologie. UFR des Sciences Pharmaceutiques et
- 13 Biologiques, CEFE UMR 5175, CNRS Univ Montpellier EPHE IRD, , Equipe Substances
- 14 Naturelles et Médiations Chimiques, 15 avenue Charles Flahault, CS 14491, 34093
- 15 Montpellier, France
- ^f Herbier MPU, Service du patrimoine historique, Université de Montpellier, 163 rue Auguste
 Broussonnet, 34090 Montpellier, France
- ^g University of Cambridge, Department of Geography, CB2 3EN, UK
- ¹⁹ ^h Swiss Federal Research Institute for Forest, Snow & Landscape (WSL), Zürcher Str. 111,
- 20 8903 Birmensdorf, Switzerland
- ¹ Global Change Research Centre and Masaryk University, 613 00 Brno, Czech Republic
- 22 ^jLaboratoire des Sciences Végétales et Fongiques, EA 4483 IMPECS, Faculté de Pharmacie,
- 23 Université de Lille, 59000 Lille, France
- Corresponding author: Franck Richard, franck.richard@cefe.cnrs.fr, Tel: +33 (0) 4 67 61 33
 00, fax: +33 (0) 4 67 61 33 36
- 26

27 Abstract

28 Long-term responses in the phenology of Mediterranean macrofungi to climatic changes are poorly documented. Here, we address this issue by comparing the fruiting patterns of 159 29 fungal species in Southern France between the first half of the 19th century and the first 30 31 decade of the 21st century. We used a trait-based approach to assess the influence of phenology and morphology of fungal fruit bodies and their site ecology and biogeography on 32 the response to climate change. We show that early autumnal fruiters, epigeous species and 33 34 species with affinities for cold climates now start to fruit on average 16.4, 17.3 and 17.3 d later compared to their emergence dates in the 19th century, while late fruiters, hypogeous 35 species and Mediterranean-restricted species did not change their fruiting date. Among 36 ecological guilds, saproxylic species and pine-associated mutualists delayed their autumnal 37 emergence by 32.5 and 19.2 d, likely in response to a delayed rewetting of litter and woody 38 debris after extended summer drought. Our results suggest that long-term climate warming 39 40 in the Mediterranean was accompanied by contrasting changes in the emergence of fungal 41 fruit bodies according to ecological guilds, sporocarp life-forms and forest types.

42 Index descriptors: Climate change, ectomycorrhizal fungi, herbarium, Mediterranean
43 ecosystems, mushrooms, phenology, saprotrophic fungi, traits-based analysis.

45

46 **1 INTRODUCTION**

47 Documenting long-term changes in biodiversity patterns is an essential and timely issue in ecology, and a particularly challenging research objective from a methodological 48 perspective (Heilmann-Clausen & Læssøe 2012). Regardless of this, the ecological plasticity 49 of ecosystems and species in response to long-term environmental changes have been 50 explored, mainly for plants (e.g. Chuine et al. 2000; Primack et al. 2004, see Cleland et al. 51 2007 and Schatz et al. 2016 for a review) and animals (Spark & Carey 1995; Delpon et al. 52 53 2018). In comparison, because long-term fungal datasets are particularly scarce, fungal records and herbaria have only been used to document the global warming during the 20th 54 century, and mostly since 1950 (see Boddy et al. 2014 for a review). So far, these organisms 55 have never been used to measure the consequences of the environmental changes since the 56 19th century's temperature depression, at the end of the Little Ice Age (Pages 2013). 57

Because many macrofungi produce ephemeral reproductive structures of short 58 59 endurance called fruit bodies (Straatsma et al. 2001), in response to rainfall events, sporocarps are valuable markers of the weather conditions at the collection time. This is the 60 61 reason why fungal herbaria and written records have been widely used in diachronic approaches to document the consequences of ongoing climate change on fungal diversity 62 (e.g. Boddy et al. 2014), mostly in Europe (e.g. Kauserud et al. 2008; Büntgen et al. 2012a; 63 64 Andrew et al. 2018) and North America (Diez et al. 2013). These studies consensually showed significantly delayed fruiting patterns of fungi during the 20th century in both 65 66 nemoral and boreal regions. However, fungi have never been used to place species-specific

67 responses to global climate change in a multi-centennial, long-term perspective, in the68 Mediterranean region.

69 The astonishing taxonomic diversity within the fungal kingdom encompasses a wide range of feeding modes, regarding the origin of the carbon they mobilize (mycorrhizal vs. 70 saprotrophic vs. parasitic, Bardgett and Wardle 2010) and within each feeding mode 71 72 regarding the range of substrates (e.g. leaves, wood, twigs, cones for decayers) and/or hosts (from highly specific to wide host range for mutualists and parasites, Bruns et al. 2002; 73 74 Taudiere et al. 2015). Previous studies showed that in Northern Europe and North America, 75 the amplitude of fungal fruiting delay in response to climate change was related to different 76 ecological traits as the feeding mode (saprotrophic vs. mycorrhizal species, Kauserud et al. 2012), for mycorrhizal fungi, the taxonomic range of hosts (e.g. angio- vs. gymnosperm, 77 78 Gange et al. 2007; evergreen vs. deciduous trees, Diez et al. 2013) and spore dimensions 79 (Kauserud et al. 2011; Andrew et al. 2016). However, a global approach, combining morphological and ecological life history traits of sporocarps, is still lacking. 80

In Mediterranean ecosystems, dry and hot summers delineate spring and fall rainfall 81 events that widely vary in intensity depending on years (Bolle 2012). In the Mediterranean 82 basin, the combination of a marked seasonality, long term fluctuations, and a diversified 83 84 geological mosaic, favored a concentration of biodiversity (Myers 2000), including an exceptional accumulation of endemic plants (Medail et al. 2019) and the emergence of 85 locally adapted fungal diversity (e.g. Norstedt et al. 2001; Loizides et al. 2016, 2019). In this 86 part of the world, summer drought is expected to increase in amplitude and duration during 87 the current century (IPCC 2007, Giorgi & Lionello 2008), with consequences for the endemic 88 plant and fungal lineages that emerged in one of the three hottest hotspots for conservation 89

90 stakes (e.g. Loizides et al. 2019 for conservation stakes associated with endemic oaks and their highly specific ectomycorrhizal species). In this region, the ongoing climate warming 91 increases the severity and length (Ruffault et al. 2013) of summer drought, with 92 consequences for fruiting phenology and productivity (Büntgen et al. 2015; Alday et al. 2017; 93 Karavani et al. 2018). However, previous research investigated the effect of climate change 94 95 on fruiting phenology in this ecoregion from a decennial perspective (Buentgen et al. 2015), 96 and research devoted to secular phenological responses associated with the diversity of 97 fruitbody morphologies, in a biological, ecological and evolutionary perspective is still lacking. At the local scale, Mediterranean macrofungal communities bring together species 98 with contrasted biogeography, from typical Mediterranean to widely distributed species (e.g. 99 100 Norstedt et al. 2001; Richard et al. 2004). In these communities as in temperate (Smith et al. 101 2002; Moore et al. 2008) and boreal (Timling et al. 2014) ones, a wide range of fungal lifeforms co-occur, based on their morpho-anatomical (gastroid vs. agaricoid species), biological 102 (e.g. location relative to soil surface, epi- vs. hypogeous) and phenological (early- vs. late-103 104 fruiters) traits. In the Mediterranean, this diversity of life-forms evolved in response to 105 environmental conditions, with dry, warm environments governing the evolution of fruit 106 body morphology (Bruns et al. 1989). In particular, a hypogeous life-form (truffle-like fruit 107 bodies) is supposed to be an adaptation to heat and drought (Diez et al. 2002; Bui et al. 2020; 108 refer to Chevassut 1988 for a reference in the study area), and gastroid life-form (e.g. 109 puffballs, stinkhorns, in which enclosed spores are protected against desiccation) may have 110 recently diverged in many lineages as an adaptation to aridity (Bruns et al. 1989; Wilson et 111 al. 2011) and Mediterranean climate conditions (Justo et al. 2010). So far, the response of 112 the variety of fungal life-forms to the ongoing climate change has not been documented. 113 More generally, a comprehensive trait-based approach has not been applied to fungal long-

term diachronic data to measure the response of fungal life-forms to the ongoing climatechange in the Mediterranean area.

116 Diachronic comparison of fruiting patterns of fungi is methodologically challenging and requires high-quality sampling procedures (Heilmann-Clausen & Læssøe 2012). Thus, 117 118 erratic fruiting of species (Richard et al. 2004; Baptista et al. 2010; Alday et al. 2017), cryptic 119 nature of fruit bodies with respect to their size (from flashy macromycetes to micromycetes 120 virtually invisible to the naked eye; Halme & Kotiaho 2012) or location (*i.e.* position of the 121 structures regarding soil surface), highly variable among-species lifespan of fruit bodies (from perennial to ephemeral) and contrasted field identifiability (Lõhmus 2009) induce high 122 variation of detectability among species. In field surveys, different detectability rates of 123 species can provide important variation in the number of records (Lõhmus 2009), and 124 125 subsequent biases for evaluating species response in comparative approaches. In addition, assessing long-term changes increases the risk of comparing highly contrasted corpus of 126 taxonomic knowledge between investigated periods, with consequences on the quality of 127 field records for poorly described species. The methodological dimension and the 128 consequences of between-species variability of detectability have been widely investigated 129 130 for plants (McCarthy et al. 2013; e.g. Vogt-Schilb et al. 2016; Schatz et al. 2016). Contrastingly, the detectability of fungal fruit bodies remains scarcely explored (but see 131 132 Halme & Kotiaho 2012 for wood-inhabiting fungi), despite its importance to limit the risk of under-detection of species, and to improve the quality of monitoring datasets (e.g. Lõhmus 133 2009; Vogt-Schilb et al. 2016). 134

Here we used two high-resolution herbarium datasets assembled in the French Mediterranean region in 1821–1852 and 2001–2011. We fully characterized 159 fungal

137 species (75 ectomycorrhizal and 84 saprotrophic) by providing information about their ecology, biogeography, morphology, detectability in the field and status in the 19th century 138 regarding their presence in the taxonomic corpus (*i.e.* described in 19th century taxonomic 139 literature of the 19th century vs. not included in the available corpus). We used this matrix of 140 ecological traits to question the temporal patterns of fungal species fruiting in the French 141 142 Mediterranean region 170 y apart. We first hypothesized that an increased duration of 143 summer drought in the region (*i.e.* a significantly postponed restart of autumn rainfall; 144 Ruffault et al. 2013) preferentially delayed fruit body emergence of early- as compared latefruiting species. We secondly inferred that an increased severity of summer drought (*i.e.* an 145 increased occurrence of severe hydric stresses; Ruffault et al. 2013) prioritary impacted 146 fungal species poorly-adapted to drought, including epigeous rather than hypogeous species, 147 agaricoid more than gastroid morphology, species with small spore sizes rather than larger 148 ones, large fruitbodies rather than small ones and wide-geographical distribution more than 149 Mediterranean-restricted species (Table S1). As previously observed in temperate Europe 150 (Kauserud et al. 2012; Boddy et al. 2014), we inferred that climate change in the 151 Mediterranean differentially impacted saprotrophic and ectomycorrhizal species, among 152 153 mycorrhizal species, pine- and than oak associates and among saprotrophs, litter- and wood decayers. We finally assumed that differences in the detectability of species induced field 154 155 biases which impacted the intensity of the recorded phenological shifts of species (Lõhmus 2009; Heilmann-Clausen & Læssøe 2012). We then specifically compared the fruiting delays 156 157 of species with resistant sporocarps as compared to those producing ephemeral fruit bodies, 158 less visible species (inconspicuous species) as compared to more visible species (conspicuous species), and poorly known species in the 19th century, as compared to well-known species 159 160 in de Candolle's published corpus.

161 2. MATERIALS AND METHODS

162 Study area and sampling sites

The study was performed in the French Mediterranean region (continental France), in 163 an area centered in Montpellier, and extending from Béziers to Alès and from the 164 Mediterranean Sea coast to the Cévennes region (43°14'N-44°03'N, 2°36'E-4°28'E; Figure 165 166 1A). The present climate in Montpellier area is of Mediterranean type with a high seasonal variability, including mean monthly precipitation ranging from 16.4 mm (in July) to 96.8 mm 167 (in October), and mean temperatures ranging from 7.2 °C (in January) to 24.1°C (in July) 168 169 (Météo France). Study sites correspond to a set of private parks and public forest stands of at least one hectare in area each (Vogt-Schilb *et al.* 2018). Historical archives (Land registers) 170 and maps (Etat Major, available at https://www.geoportail.gouv.fr/) were used to locate 19th 171 172 century's sites.

In all, mycological data were collected at 285 sites, including 103 sites sampled over a 173 32-year period in the 19th century and 182 sites sampled over a 12-year period in the early 174 21st century; Figure 1, Table S2). During both sampling periods, referent mycologists 175 organized field surveys every week throughout the year. At each sampling date, 1.53 and 176 1.15 sites were visited in average, in the 19th and in the 21st century sampling periods, 177 respectively. For 71.9 and 88.4% of the sampling dates, only one site was visited in the 19th 178 and in the 21st century sampling periods, respectively. Among the 103 sites sampled during 179 180 the the 19th century sampling period, eight of them were discarded because they could not be located with certainty. Additionally, we excluded 79 sites (40 and 39 in the 19th and in the 181 21st century sampling periods, respectively) because they were localized outside of the 182 183 Mediterranean climatic domain (here delineated by the distribution of *Quercus ilex*; Quézel 184 & Médail 2017). Their inclusion into the dataset would have then generated ecological
185 heterogeneity within the dataset (see Figure S1 for a schematic view of the data filtering).

186 Analysis of 19th century herbarium

In the early 19th century, de Candolle exported Persoon's unified fungal 187 nomenclature to Montpellier, where he discovered and published 67 new fungal species (de 188 Candolle 1815). As director of the Botanical Institute in Montpellier from 1808 to his 189 departure to Geneva in 1816, he initiated several talented mycologists, who successively 190 contributed to the analyzed dataset (Moreau et al. 2011). Then, the 19th century herbaria 191 consisted of 1590 fungal records assembled from 1821 to 1852, and nowadays conserved at 192 the MPU Herbarium (Service du patrimoine historique, Université de Montpellier). Each 193 analyzed bundle included watercolor paintings (Icones Fungorum; Node-Véran 1820-1843; 194 Figure 1B), their associated descriptive notes and dried specimens (Figure 1C) and were 195 196 successively assembled by Delile (A.R. Delile, Icones Fungorum, unpublished volume, MPU 197 Herbarium), and Dunal (M.-F. Dunal, Flore de Montpellier, unpublished volume, MPU Herbarium) during the periods 1821-1857 and 1821-1845, respectively (Moreau et al. 2011). 198

Some of the dominant taxonomic groups currently considered in mycological surveys 199 were poorly considered by the mycologists of the 19th century, including many hypogeous 200 fungi, all genera of boletes, and species producing inconspicuous fruitbodies within the 201 Corticiaceae family (e.g. Tomentella, Sebacina). In our analysis, we included only the records 202 203 that were accurately located (*i.e.* ascribed to a given collecting site) and dated (*i.e.* ascribed 204 to a given collecting date) by collectors. All included collections were morphologically 205 analyzed and microscopically checked when necessary (e.g. in Figure 1C, without 206 microscopic analysis - spore shape, presence of clamps- it would have been impossible to

207 name this specimen - finally identified as *Amanita echinocephala*) prior to a taxonomic
208 assignation according to the current nomenclature (MycoBank database;
209 http://www.mycobank.org/).

210 Analysis of 21st century herbaria records

The 21st century herbaria records consisted of weekly collected information at 182 sampling sites which were located around Montpellier (Figure 1) and surveyed as part of a systematic mycological survey coordinated by J.-C. Malaval and the Société d'Horticulture et d'Histoire Naturelle de l'Hérault (SHHNH) from 2001 to 2011. These reports include recorded fungal species, their precise sampling location (GPS coordinates), their collecting date, and additional notes (*e.g.* fruit body abundance, ecology within the collecting site), pictures (samples and microscopy) and materials (herbarium samples) when necessary.

218 Trait assignation of fungal species

In total, 159 fungal species fruited in the selected sites during both 19th and 21st 219 220 century century sampling periods. Species were assigned as either ectomycorrhizal (75 species) or saprotrophic (84 species), using the available literature dealing with fungal 221 222 communities of Quercus ilex (e.g. Richard et al. 2004, 2005; Taudiere et al. 2015). For all 223 these species, we documented eight categories of life-history traits, *i.e.* fruiting seasonality, life-form and habit, fruit body and spore dimensions, feeding modes, geographical range, 224 225 detectability and identifiability of fruitbodies, in order to relate the variations in fruiting patterns of fungal species to taxonomic, biological and ecological features (Figure S1). 226

227 Based on the literature (*e.g.* Chevassut 1988, Richard et al. 2004) and two field guides 228 (Courtecuisse & Duhem 2007; Roux & Eyssartier 2011), each species was assigned as either

an early-fruiter (summer-early autumn fruiting, 73 species), or a late-fruiter (late autumnwinter fruiting, 17 species), or a species with no marked seasonal pattern of fruiting (69 species, Table S3, "fruiting seasonality"). Each species was assigned to a preferential phenological fruiting type as follows: early fruiters include all species with fruiting preferentially occurring in summer and early autumn, while late fruiters include all species with fruiting preferentially occurring in late autumn and winter (Table S3).

235 Regarding the life forms and habits, species were assigned to either above- (epigeous) or 236 below-ground (hypogeous) fruiters, according to the location of their fruitbodies related to the surface of soil (Table S3, "life forms"), or to either agaricoid (all fungi from the 237 Agaricaceae family, with exposed hymenium) or gastroid (fungi with a completely closed 238 239 hymenium; Table S3, "fruiting habit"). Regarding fruit body and spore dimensions, the mean 240 cap diameter (FBSize), fruit body shape (FBShape, calculated as the ratio between cap diameter and stem diameter), stem height (StemHeight), spore volume (SSize) and shape 241 (Sshape, calculated as the ratio between spore length and spore width) were calculated for 242 243 each species, as in Kauserud et al. (2011) and using the current literature (Roux & Eyssartier 2011). Regarding their ecology, all species were assigned to their trophic status 244 245 (ectomycorrhizal or saprotrophic). Ectomycorrhizal species were characterized regarding 246 their associated host tree species using a compilation of the available literature (e.g. 247 Taudiere *et al.* 2015). For this trait, our comparative analysis focused on pine specific (known to be strictly associated with Pinus spp., 10 species) and oak specific (known to be strictly 248 249 associated with Quercus spp., 16 species) species (Table S3, "Feeding modes"). Saprotrophic 250 species were subsequently ascribed to either wood-decaying or litter-decaying, depending 251 on their known interaction with the different compartments of the necromass (Table S3, 252 "Feeding modes") by compiling published datasets in the Mediterranean region (Malençon

253 & Bertault 1968; Laganà et al. 2002; Richard et al. 2004). The corresponding analysis excluded 123 species with no clear ecology (Table S3). Regarding the bioclimatic affinities, 254 255 fungal species were ascribed to either Mediterranean (*i.e.* with a distribution restricted to the Mediterranean bioclimatic domain; these species are hereafter called Mediterranean) or 256 temperate (*i.e.* for which the study area is located at the southern limit of their distribution 257 258 range; these species are hereafter called temperate) using the current biogeographical 259 affinities of species as a proxy (e.g. Courtecuisse & Duhem 2007; Roux & Eyssartier 2011; Table S3, "Geographical range"). We also compared fruiting patterns among fungal families 260 of ectomycorrhizal fungi (i.e. Amanitaceae, Cortinariaceae, Russulaceae, Tricholomataceae) 261 and saprotrophic fungi (Agaricaceae, Mycenaceae, Psathyrellaceae, non-ectomycorrhizal 262 Tricholomataceae) (Table S3, "Taxonomy"). At the species level, we restricted the analysis to 263 264 the most commonly observed species (*i.e.* that were observed at least three times at both sampling periods). 265

Additionally, we tested three attributes associated with the detectability and identifiability of fruit bodies, that could influence the sampling in the 19th century sampling period and reduce the detected phenological patterns of fungi, *i.e.* fruit body's lifespan (short *vs.* long lifespan before complete decaying), visibility (*i.e.* conspicuous *vs.* inconspicuous; Figure S1, "Fruitbody visibility") and nomenclature existence (Figure S1, "Identifiability"). For the latter, we distinguished species that were previously described by de Candolle (De Candolle & Lamarck 1805; De Candolle 1815) from poorly known species.

273 Assessment of the 19^{t_h} and 21^{st} century fungal phenologies

For the 159 species of fungi represented in the two sampling periods, the first fruiting date (*FFD*) and last fruiting date (*LFD*) of each species was yearly recorded and averaged over

each sampling. For each species, a difference in fruiting time *dFFD* (or *dLFD*) was calculated
as the difference between the mean *FFD* (or *LFD*) in the early 21st century and the mean *FFD*(or *LFD*) in the 19th century sampling period.

279 Analysed dataset

The analysed dataset consisted of two association matrices (Figure S1). The first [159 x 11] matrix recorded the correspondences between 159 species and 11 attributes (including eight biological and ecological attributes, and three attributes associated with their detectability, hereafter called *Trait association matrix*, Figure S1). The second [159 x 4] matrix associated 159 species with their FFD and LFD at each sampling period (hereafter called *Phenological matrix*, Figure S1).

286 Statistical analysis

For each of the eight categories of fungal traits, averaged FFD values were compared 287 between the 19th and the 21st century using Wilcoxon non-parametric- tests. The correlation 288 between biometrical traits (FBSize, FBShape, StemHeight, SSize, SShape) and phenological 289 response (dFFD) were analyzed using a Kendall Rank correlation test. In the particular case of 290 291 fruiting seasonality, the differences of monthly distribution of fruiting diversity between 292 early- and late-fruiting species during the two periods were compared using Watson twosample tests of homogeneity (package "circular" in R; Lund & Agostinelli 2010). To represent 293 294 the temporal dynamics of the fruiting communities, the monthly distribution of species richness was analyzed. The monthly distribution of species richness was compared between 295 the two sampling periods by calculating the Pielou's evenness index (package "vegan" in R). 296 297 All analyses were performed using R software (R development core team, version 2.15.0).

298

299 **3. RESULTS**

300

Temporal distribution of records and structure of the datasets

The analysis of the temporal distribution of fruiting events showed that the systematic weekly sampling carried out in 1821–1852 and 2001–2011 provided records from week 1 to week 52 for both periods (Figure S2). The lowest frequency of fruit body emergence was observed (1) during both periods during summer (*i.e.* mostly from week 24 to week 53) and (2) during the 21st century only, at the very beginning of autumn fruiting season (*i.e.* weeks 40-42; Figure S2).

The number of observed fruiting species per sampling date per site averaged 1.29 (from 1 to 8) and 15.08 (from 1 to 90) in 1821–1852 and 2001–2011, respectively (data not shown). When considering only those species which were recorded during both sampling periods, the number of observed fruiting species per sampling date per site was significantly lower on average in 1821–1852 (1.17 \pm 0.03) than in 2001–2011 (4.8 \pm 0.43, *P* < 0.001 by Wilcoxon test).

313

Climatic change in the study area

The analysis of the available climatic data in the Montpellier area since 1821 showed a significant increase in mean June-August temperatures, from 22.8 °C \pm 0.2 in 1840-1852 to 24.4 °C \pm 0.5 in 2001-2010 (W = 12, *P* = 0.003 by Wilcoxon test; www.meteofrance.fr; Figure 2). At the same time, summer precipitation slightly varied, from 68.4 mm \pm 12.4 on average during the period 1835-1852 to 76.9 mm \pm 16.2 on average during the period 2001-2010 (W = 73.5, *P*=0.58 by Wilcoxon test; www.meteofrance.fr). 320

Fruiting seasonality

Early fruiting fungi started fruiting significantly later in the early 21st century 321 compared with the 19^{th} century (FFD delayed by 16.4 ± 3.1 d by Wilcoxon non-parametric 322 test, P < 0.001; Table 1; see Table S4 for LFD data). This result was consistent when 323 considering only ectomycorrhizal fungi (FFD delayed by 12.0 ± 3.2 d (mean ± SE and 324 hereafter), P < 0.001 by Wilcoxon non-parametric test; Table 1) or saprotrophic (FFD delayed 325 by 25.3 ± 6.3 d, P < 0.001 by Wilcoxon non-parametric test; Table 1) species. Contrastingly, 326 FFDs of late fruiting species were not significantly delayed (Table 1). Early fruiting fungi 327 328 extended their fruiting period and the LFD was significantly delayed by 18.2 ± 3.2 days (P < 329 0.001 by Wilcoxon non-parametric test, Table S4).

Regarding the monthly distribution of diversity, a temporal shift in species richness 330 maximum was visually observable for early fruiting saprotrophic species only (Figure 3). For 331 ectomycorrhizal species, the highest number of fruiting species (accounting 43.7% of the 332 total number of species) was observed in November during the early 21st century, while a 333 more even pattern characterized the temporal distribution of diversity in the 19th century 334 sampling period (P < 0.05 by Watson test; Figure 3). Similarly, according to the Pielou's 335 evenness index, the temporal fruiting dynamics was also the most unevenly distributed 336 337 along the fruiting season for early fruiting ectomycorrhizal fungi from the early 21st century 338 (Pielou's evenness index = 0.78) compared to the monthly distribution of the ectomycorrhizal and saprotrophic fruiting species from the 19th century (Pielou's evenness 339 index > 0.95). Early fruiting saprotrophic species showed a similar trend, with a delayed peak 340 of the number of fruiting species from October (in the 19th century) to December (in the 341 early 21st century), but the difference was not significant by Watson test (Figure 3). A fruiting 342

interruption between January and March was, however evidenced for early fruiting saprotrophic species in the ancient period, that was absent in the early 21st century (Figure 3B). Late fruiting species did not show significant difference in the temporal distribution of fruiting species between the 19th and 21st century, for both ectomycorrhizal (Figure 3) and saprotrophic (Figure 3) species (Watson test, P > 0.05). However, some ectomycorrhizal (late fruiters) and saprotrophic (early and late fruiters) fungi fruited 1 month later in the early 21st century compared to the early 19th century (Figure 4).

350 Life forms and habits

As hypothesized, epigeous and hypogeous fungi showed contrasting phenological 351 352 patterns. While epigeous macromycetes currently start fruiting 17.3 ± 2.3 d later than during the ancient period (P < 0.001 by Wilcoxon non-parametric test), hypogeous fungi did not 353 significantly change their FFD between the two sampling periods (Table 1). In addition, 354 agaricoid and gastroid species showed contrasting phenological shifts. Species producing 355 356 agaricoid fruit bodies significantly delayed their fruiting by $16.7 \pm 2.5 \text{ d}$ (P < 0.001, Wilcoxon non-parametric test), while gastroid fungi did not significantly change their fruit body 357 emergence time (P > 0.05, Wilcoxon non-parametric test) between the two sampling periods 358 359 (Table 1).

360 Morphology

Regarding the correlations between the fruit body-spore dimensions and the fruiting time, dFFD was slightly positively correlated with the size (FBsize) and shape of the fruit body (FBshape), height (StemHeight) of fruit bodies and spore shape (Sshape), while negatively correlated with spore size (Ssize) (Figure S3). These correlations were, however, not significant (Kendall rank correlation test, P > 0.05).

366 Feeding modes

The analysis of fruiting time of fungal species with different feeding modes shows that in Mediterranean forests, ectomycorrhizal species associated with pines significantly delayed their fruiting start (FFD delayed by 19.2 \pm 6.1 d; *P* < 0.01 by Wilcoxon nonparametric test) since the early 19th century, whereas oak fungal symbionts did not change their FFD (Table 1). Regarding their feeding substrate, both wood-decaying fungi and litter decayers significantly shifted their fruiting start (Table 1).

373 Geographical range

Regarding the geographical range, temperate species delayed their fruiting time by 17.3 \pm 8.4 d (*P* < 0.05, Wilcoxon non-parametric test) since the 19th century in the study area (Table 1). In contrast, our analysis revealed no significant change in fruiting date for species with distribution restricted to the Mediterranean ecoregion (Table 1).

378 Taxonomy

379 For the ectomycorrhizal families, we observed a delayed start of fruiting by 19.1 ± 8.1 and 18.4 \pm 6.3 d for Amanitaceae (P < 0.05 by Wilcoxon non-parametric test) and 380 Russulaceae (P < 0.01 by Wilcoxon non-parametric test), respectively, since the 19th century 381 (Table 1). Contrastingly, FFD did not significantly differ between the two sampling periods 382 for the families Cortinariaceae and Tricholomataceae (Table 1). At the species level, and 383 regarding the most common species, six species within basidiomycete families (i.e. Astraeus 384 hygrometricus, Cantharellus cibarius, Clavulina cinerea, Gyroporus castaneus, Hebeloma 385 386 sinapizans, Phellodon niger) and one species in the ascomycetes (i.e. Helvella crispa) fruited later in the early 21st century compared to the 19th century (Figure 4). Among saprotrophic 387

388 families, significant changes in the start of fruiting were evidenced for Agaricaceae, with a 34.3 \pm 12.5 d delayed FFD during the early 21st century as compared to the 19th century (*P* < 389 390 0.01 by Wilcoxon non-parametric test, Table 1). Other families, including Mycenaceae, Psathyrellaceae and non-ectomycorrhizal Tricholomataceae did no significantly change their 391 phenology of fruiting since the 19th century (Table 1). At the species level, delayed starts of 392 fruiting occurred in seven saprotrophic species (i.e. Auricularia auriculae-judae, Auricularia 393 mesenterica, Hypholoma fasciculare, Lepista sordida, Mycena pura, Psathyrella candolleana, 394 Tapinella panuoides), whereas three species (Collybia butyracea, Lepista nuda, Psathyrella 395 prona) currently start to fruit earlier compared to the ancient period (Figure 4). 396

397

Fruit body detectability and identifiability

All the six categories of fungal species based on their detectability and identifiability 398 significantly changed their FFD (Table 1) and their LFD (Table S3) between the 19th and the 399 400 21st century. The FFD of both species with long and short lifespan was significantly delayed 401 by 20.6 ± 5.9 d (Wilcoxon non-parametric test P < 0.01) and 15.9 ± 2.4 d (Wilcoxon nonparametric test P < 0.01), respectively (Table 1). Significant shifts in FFD were also found 402 403 regarding the detectability, for conspicuous (14.9 \pm 2.2 d) and inconspicuous species (22.4 \pm 3.6 d) (Wilcoxon non-parametric test, P < 0.01, Table 1), and the identifiability of fungi with 404 well described (20.5 ± 3.1 d) and poorly known (11.8 ± 3.3 d) fungal species (Wilcoxon non-405 406 parametric test, P < 0.001, Table 1).

408 4 DISCUSSION

409 This study, based on the oldest fungal dataset in the Mediterranean, reveals that a close 410 interaction between the ongoing climate change and the various facets of fungal diversity shapes the phenological response of fungal species to temperature increase and extension 411 412 of summer drought length in the studied region. In the French Mediterranean region, climate warming increases the severity of summer drought, with consequences for the 413 phenology of early fruiters, but also for species with affinities for cold climates and/or 414 producing epigeous fruit bodies which delayed their fruiting time since the 19th century's last 415 temperature minimum. Contrastingly, Mediterranean 416 species and/or species 417 morphologically adapted to drought did not not change their fruiting phenology over time. Our analysis of potential detectability biases supports the use of ancient fungal herbarium 418 419 records as a valuable source of phenological data.

420 Fungal herbaria: opportunities and challenges for diachronic analyses

Herbaria are considered as relevant tools to track changes in phenological patterns of 421 422 organisms in response to climate changes (Lavoie & Lachance 2006; Diez et al. 2013) as they 423 provide high resolution temporal datasets (Meineke et al. 2018). Nevertheless, the use of 424 raw biological recording dates in long term diachronic analyses is challenging, particularly for 425 macrofungi (Halme & Kotiaho, 2012; Diez et al. 2013; Boddy et al. 2014; Chapman et al. 2015; 426 Daru et al. 2018; Andrew et al. 2018), as fruit body production can vary markedly between 427 years (Straatsma et al. 2001; Boddy et al. 2014) in particular in Mediterranean regions 428 (Richard et al. 2004; Baptista et al. 2010). Indeed, Diez et al. (2013) and Chapman et al. 429 (2015) showed respectively that uneven recording periods or too short recording duration could bias the apparent fruiting periods. In our study, the effect of erratic fruiting patterns 430

was limited by the length (12 and 32 y of sampling in the 19th century and the 21st century) 431 and the systematic weekly sampling. In addition, we limited the influence of potential 432 methodological biases on the phenological response of species by: (1) focusing the analysis 433 on species which were recorded at the two sampling periods and (2) restricting the sampling 434 area to a homogenous bioclimatic domain of Mediterranean oaks, including a set of 435 436 common sites (Figure 1). However, this site selection induced an incomplete overlap of areas sampled in the 19th and the 21st century, with sampling of ancient study sites concentrated 437 438 in a restricted area, as compared to the distribution of recent study sites.

439 When testing the influence of sporocarp detectability and identifiability on their recorded 440 fruiting patterns, we found that theses sampling biases impact neither the significance nor the direction of the effect, with slight differences in the amplitude of the measured delay 441 442 (Table 1). This result suggests that species producing poorly detectable sporocarps may be 443 considered as an integral part of fungal datasets used in diachronic surveys. However, using five estimators of the detectability of polypores, previous research showed that longevity 444 and identifiability of fruit bodies strongly affect the occurrence of species in datasets, and 445 highlighted the strong influence of the quality of sampling on the estimation of the 446 abundance of poorly detectable species (Lõhmus 2009). As a consequence, poorly 447 448 detectable species should be considered with caution, to limit potential biases for evaluating 449 species response in comparative approaches.

We found a significant fruiting delay for both species forming resistant and fragile fruit bodies, for both species producing inconspicuous and conspicuous fruit bodies, for both poorly known and well described species in the ancient sampling period (Table 1). Interestingly, we highlighted a markedly lower fruiting shift for poorly documented species

during the 19th century than for species described by De Candolle and Lamarck (De Candolle & Lamarck 1805; De Candolle 1815). This result suggests that species identifiability may be used as a species trait which potentially biases the assessment of fruiting shift in long-term diachronic surveys. Our finding also highlights the substantial taxonomic upsets within the fungal kingdom during the 20th and the early 21st centuries (*e.g.* Vesterholt 2012), and its consequence for the quality of the sampling by fungal forayers (Heilmann-Clausen & Læssøe 2012).

461 The influence of species seasonality on fruiting phenology

In the study area, early fruiters significantly delayed their fruiting period between the 19th 462 and 21st century, in contrast to late-fruiters (Table 1). This result is in accordance with our 463 hypotheses concerning preferential effects of an extended drought on early-fruiting species 464 that first produce their fruit bodies at the end of summer. Thus, in the study area, the 465 severity of summer drought increased since the 19th century through the combined effects 466 467 of significant temperature increase (Figure 2) and extended drought duration (Ruffault et al. 2013). Our results in the Mediterranean area are consistent with the response of fungi 468 documented by Kauserud et al. (2008) in temperate areas. These authors evidenced a 30 d 469 fruiting shift of early-fruiting species with no shift for late-fruiting species. Interestingly, and 470 even if averaged values have to be considered with caution because of the above-mentioned 471 472 methodological biases, we observed a fruiting shift at the secular scale of similar amplitude 473 to previous studies investigating the same question at decennial scales (Gange et al. 2007; 474 Kauserud et al. 2008; Moore et al. 2008). This finding suggests that either most phenological 475 shifts are recent and similar in duration across Europe, or changes in the Mediterranean area during recent decades were less pronounced than in temperate regions. Tracking fungal 476

datasets of the intermediate period (*i.e.* early 20th, *e.g.* from de Seyne; Moreau *et al.* 2011)
may help to understand the temporal dynamics of phenological changes in the
Mediterranean area from 1820 to 2010.

480 Contrasting fruiting responses depending on feeding modes

When considering only early-fruiting fungi, the amplitude of fruiting delay for saprotrophic 481 482 species was almost twice that of ectomycorrhizal species (Figure 3). This confirms a previous study of Kauserud et al. (2012) indicating that saprotrophic guilds were much more 483 influenced by climatic variations than ectomycorrhizal fungi. The mecanisms underlying this 484 485 pattern remains unclear. Saprotrophic fungi acquire their nutrients from inert organic matter, especially from tree litter and dead wood (Smith & Read 2010) lying on forest floor, and are 486 487 then particularly exposed to environmental fluctuation, as well as to the highly variable availability and recalcitrant nature of soil organic matter (Courty et al. 2016) by comparison 488 489 to ectomycorrhizal species. Alternatively, this result may reflect differences in fruit body size 490 between saprotrophic and ectomycorrhizal species, and then differential carbon cost for reproductive investment between trophic modes (Bässler et al. 2015). We cannot exclude a 491 combined effect of fruit body size, but it is unlikely when considering the weak and not 492 significant relationship between phenological shift of species and the size of fruit bodies 493 494 (Figure S3).

When considering both early- and late-fruiting fungal species, both wood- and litter decaying fungi delayed their FFD (Table 1). The factors explaining this pattern are unclear, but may include different mechanisms such as water infiltration and evaporation limiting water storage in both wood and litter. It takes longer for wood than litterto rewet after drought, as shown in Harmon & Sexton (1995), while the water is less well stored in litter than in wood.

500 Based on 29-y-observations, Sato et al. (2012) found that wood-decaying fungi and litter-501 decaying fungi respond differently to environmental conditions, with more variable fruiting 502 phenology among genera of wood-decaying fungi. Regarding phenological patterns, more research is needed to understand the mechanisms underlying these contrasting patterns, 503 and their consequences for nutrient turnover and soil functioning. In particular, 504 505 complementary research focusing on the guild of wood decayer fungi, and distinguishing 506 among contrasting fruit body morphologies (*i.e.* polypores vs. corticioids vs. discomycetes vs. 507 pyrenomycetes vs. agarics vs. jelly fungi) and/or nutritional profiles based on enzymatic diversity (e.g. cellulolythic vs. ligninolythic) may advantageously complete the available 508 corpus, by providing valuable data about adaptative traits in response to drought (e.g. 509 510 Purhonen et al. 2017).

511 In the case of ectomycorrhizal fungi, we observed that fungi associated with Pinus spp. 512 significantly delayed their fruiting period while fungi associated with Quercus spp. poorly responded (Table 1). This influence of tree host on phenological shifts of fungi has been 513 514 previously documented by Diez et al. (2013), who found that the fruiting period of species associated with evergreen trees is more delayed than deciduous species. The process 515 underlying host effect is not clear, but one may argue that under *Pinus* spp. canopies, soil is 516 517 more exposed to environmental fluctuations including higher water evaporation and temperature variation as compared to evergreen oak forests. Thus, Q. ilex canopies provide 518 a particularly dense protection against incident light and favor moisture retention in soil 519 520 (Gass & Barnes 1998). These forest conditions may differently influence fruiting patterns of ectomycorrhizal fungi depending on their associated host. Other factors can explain these 521 differences in phenological fruiting patterns, including the contrasting distribution of oak 522

and pine ecosystems regarding topography and soil properties. Further investigations should
be carried out in the future to disentangle these factors.

525 Fruit body anatomy and life-form induced phenological response

526 As postulated, in our study, hypogeous fungi did not significantly delay their fruiting period, 527 while epigeous species showed a significant temporal shift (Table 1). Our findings suggest 528 that the higher protection against drought of hypogeous fungi may balance a phenological shift due to increased drought, the epigeous habit of macromycetes enabling long distance 529 dispersion of spores but exposing the reproductive structure to desiccation in contrast to 530 531 hypogeous species (Hibbett et al. 1997). Some studies investigated relationships between occurrence of hypogeous fungi and environmental conditions (Fogel 1976; Claridge et al. 532 533 2000; Büntgen et al. 2012b;), but comparison between epi- and hypogeous fruiting patterns 534 in response to environmental fluctuations remain scarce (Hawker 1954).

535 We also considered the fruit body form in distinguishing agaricoid-type from gastroid-type fruit bodies. It has been hypothesized that gastroid fruit body has evolved as an adaptation 536 537 to arid climates (Thiers 1984). From a mechanistic point of view, this enclosed hymenium enables a low surface to volume ratio that minimizes water loss during drought. The findings 538 539 of our study is in line with this hypothesis, as no significant phenological shift was observed 540 for gastroid compared to agaricoid species (Table 1). In addition, macroscopical 541 morphological traits, related to the fruit body and stalk (FBSize, FBShape, StemHeight) did 542 not show any correlation with fruiting patterns (Figure S3), agreeing with Kauserud et al. 543 (2011). Although it has been shown that morphological traits (e.g. cap size of fungi) are 544 related to hygrometric indexes (Gange et al. 2018), these traits seem not to be linked to a 545 fruiting response to climate change. From temperate to Mediterranean ecosystems, these

546 morphological traits thus consistently appear as poorly predictive proxies of the sensitivity of547 species to drought.

At the microscopical scale, we observed a non-significant negative relationship between SporeSize and dFFD (Figure S3). This finding contrasts with the pattern reported by Kauserud *et al.* (2011) who observed that once spore volume doubles, fruiting time advances 3 d earlier. Our result then poorly supports the hypothesis of Kauserud *et al.* (2011), who postulates that the higher spore volume, the higher the volume of stored water, and the higher the probability of spore germination success in dry environments.

554 **Conservation challenges and fungal diversity**

555 In our study, contrasting patterns of phenological response to climate change was evidenced among taxonomic groups of fungi. For the ectomycorrhizal guild, Russulaceae and 556 Amanitaceae demonstrated a marked delay, whilst no significant shift was observed in 557 558 Cortinariaceae and Tricholomataceae (Table 1). Interestingly, a rainfall exclusion experiment installed in the same sampling area showed a similar contrasting pattern when considering 559 560 the below-ground apparatus (i.e. ectomycorrhizal root tips) of Russulaceae and Cortinariaceae, the two dominant families of macromycetes (Richard et al. 2011). Thus, after 561 562 9 y of increased drought, a consistent response pattern was found for Cortinariaceae, which significantly increased in relative abundance on Q. ilex root systems, while Russulaceae 563 slightly decreased (Richard et al. 2011). Moreover, Buée et al. (2005) evidenced drought 564 565 resistance traits of Cortinariaceae species, such as higher abundance and metabolic activity 566 in summer when compared to winter periods. Considered altogether, these results suggest 567 that Cortinariaceae may be less sensitive to the ongoing climate change than Russulaceae,

568 and questions concerning possible effects on soil nutrient turnover, in relation to their 569 contrasting ability to hydrolyze complex sources of organic carbon (Courty et al. 2005).

These results suggest that some families, such as Cortinariaceae, weakly respond both above- and below-ground to short and long-term environmental fluctuations and remain inefficient candidates for indicating climate change cascading effect. Contrastingly, Russulaceae may be considered as potential integrative indicators of the consequences of climate change on soil biota.

Within families, fruiting shifts varied markedly among species. In Cortinariaceae, *Cortinarius torvus* fruited significantly later in the early 21st century as compared to the 19th century, in contrast to *Cortinarius castaneus*. These results are in accordance with the picture obtained below-ground by Richard *et al.* (2011), and above-ground by Diez *et al.* (2013), who highlighted high inter-specific differences in phenology within families and genera of fungi.

Our study detected that a few fungal species may be considered as potential 581 582 candidates to monitor the effect of climate change on fruiting of fungi in the Mediterranean. Candidates include Helvella crispa (ectomycorrhizal fungi), Auricularia mesenterica 583 584 (saprotrophic fungi) or Auricularia auriculae-judae (saprotrophic fungi) (Figure 4) which were (1) highly responsive, (2) frequent and widespread enough to be observed several years 585 586 during the monitoring period and (3) easily identifiable in the field. The responsiveness to 587 climatic change of Auricularia auriculae-judae has been previously observed since 1980 in 588 southern England (Gange et al. 2011), but the respective influence of global warming and 589 methodological biases remain under debate (Heilmann-Clausen & Læssøe 2012). Indeed, 590 long-lived and resistant Auricularia auriculae-judae fruit bodies make it difficult to

591 distinguish between fresh and old reproductive structures, and then compromise attempts592 for homogeneous sampling in diachronic surveys.

593 As suggested by Diez et al. (2013), concomitant factors combine their effect with those of climatic changes, including land-use changes, and influence fruiting patterns of fungi. In the 594 study area, marked temporal changes in land cover converted open vegetation, inherited 595 from centuries of intensive grazing into a mosaic of secondary oak (Quercus ilex) forests and 596 urban areas (Sirami et al. 2010; Vogt-Schilb et al. 2018). This change may have favored 597 598 mycorrhizal species associated with oaks, such as the late-fruiting Leccinellum lepidum 599 (Loizides et al. 2019). Interestingly, the fruiting frequency of this species increased during the 21st century compared to 19th century (data not shown). The observed patterns of this 600 Mediterranean species strictly associated with oaks may be related to the increasing of holm 601 602 oak covering the studied Mediterranean ecosystems under secondary succession (e.g. Sirami 603 et al. 2010; Vogt-Schilb et al. 2018), and not only a positive response to climate change.

604

605 Acknowledgments

This study was founded by a CIFRE convention (n°187/2011) between the French National Association for Research and Technology (ANRT) and Biotope Inc. We thank the Herbarium MPU-UM for the access to the watercolours and dried fungal specimens from the Dunal and Delile collection. We are particularly grateful to local mycological experts (SHHNH) for their contribution to the 21st century dataset. We thanks the Observatoire de Recherche Méditerranéen de l'Environnement (OREME) for its technical assistance and financial support of this research.

613

614 **References**

- Alday, JG, Bonet JA, Oria-de-Rueda JA, Martínez-de-Aragón J, Aldea J, Martín-Pinto P, ...
 Martínez-Peña F, 2017. Record breaking mushroom yields in Spain. *Fungal Ecology* 26:
 144-146
- Andrew C, Heegaard E, Halvorsen R, Martinez-Peña F, Egli S, Kirk PM, ... Boddy L, 2016.
 Climate impacts on fungal community and trait dynamics. *Fungal Ecology* 22: 17-25.
- Andrew C, Heegaard E, Gange AC, Senn-Irlet B, Egli S, Kirk PM, ... Boddy L, 2018. Congruency
 in fungal phenology patterns across dataset sources and scales. *Fungal Ecology* 32: 9 17.
- Baptista P, Martins A, Tavares RM, Lino-Neto T, 2010. Diversity and fruiting pattern of
 macrofungi associated with chestnut (Castanea sativa) in the Tras-os-Montes region
 (Northeast Portugal). *Fungal Ecology* 3(1): 9-19.
- Bardgett RD, Wardle DA, 2010. Aboveground-belowground linkages: biotic interactions,
 ecosystem processes, and global change. Oxford University Press.
- Bässler C, Heilmann-Clausen J, Karasch P, Brandl R, Halbwachs H, 2015. Ectomycorrhizal
 fungi have larger fruit bodies than saprotrophic fungi. *Fungal Ecology* 17: 205-212.
- Boddy L, Büntgen U, Egli S, Gange AC, Heegaard E, Kirk PM, Mohammad A, Kauserud H, 2014.
 Climate variation effects on fungal fruiting. *Fungal Ecology* 10: 20-33.
- Bolle HJ (Ed.), 2012. *Mediterranean climate: variability and trends*. Springer Science &
 Business Media.
- 634 Bruns TD, Fogel R, White TJ, Palmer JD, 1989. Accelerated evolution of a false-truffle from a 635 mushroom ancestor. *Nature* **339**: 140–142.
- Bruns TD, Bidartondo MI, Taylor DL, 2002. Host specificity in ectomycorrhizal communities:
 what do the exceptions tell us? *Integrative and comparative biology* 42(2): 352-359.
- 638Buee M, Vairelles D, Garbaye J, 2005. Year-round monitoring of diversity and potential639metabolic activity of the ectomycorrhizal community in a beech (*Fagus sylvatica*)640forest subjected to two thinning regimes. *Mycorrhiza* **15**(4): 235-245.
- Bui A, Orr D, Lepori-Bui M, Konicek K, Young HS, Moeller HV, 2020. Soil fungal community
 composition and functional similarity shift across distinct climatic conditions. *FEMS Microbiology Ecology* 96(12): fiaa193.
- Büntgen U, Egli S, Galván JD, Diez JM, Aldea J, Latorre J, Martinez-Pena F, 2015. Drought induced changes in the phenology, productivity and diversity of Spanish fungi. *Fungal Ecology* 16: 6-18.

- 647 Büntgen U, Kauserud H, Egli S, 2012a. Linking climate variability to mushroom productivity 648 and phenology. *Frontiers in Ecology and the Environment* **10**(1): 14-19.
- Büntgen U, Egli S, Camarero J, Fischer EM, Stobbe U, Kauserud H, Tegel W, Sproll L, Stenseth
 NC, 2012b. Drought-induced decline in Mediterranean truffle harvest. *Nature Climate Change* 2: 827–829.
- Chapman DS, Bell S, Helfer S, Roy DB, 2015. Unbiased inference of plant flowering phenology
 from biological recording data. *Biological Journal of the Linnean Society* **115**(3): 543554.
- 655 Chevassut G, 1988. Premiers résultats de l'étude écologique et coenologique des
 656 Macromycètes de la Chênaie verte méditerranéenne française. (*Quercetum ilicis* 657 gallo-provinciale). Bulletins de la Société Mycologique de France 104(2): 73-78.
- Chuine I, Cambon G, Comtois P, 2000. Scaling phenology from the local to the regional level:
 advances from species-specific phenological models. *Global Change Biology* 6(8):
 943-952.
- Claridge AW, Barry SC, Cork SJ, Trappe JM, 2000. Diversity and habitat relationships of
 hypogeous fungi. II. Factors influencing the occurrence and number of taxa.
 Biodiversity and Conservation 9: 175-199.
- 664 Cleland EE, Chuine I, Menzel A, Mooney HA, Schwartz MD, 2007. Shifting plant phenology in 665 response to global change. *Trends in ecology & evolution* **22**: 357-365.
- 666 Courtecuisse R, Duhem B, 2007. *Guide des champignons de France et d'Europe*. Delachaux et
 667 Niestlé, 476p.
- Courty PE, Pritsch K, Schloter M, Hartmann A, Garbaye J, 2005. Activity profiling of
 ectomycorrhiza communities in two forest soils using multiple enzymatic tests. *New Phytologist* 167(1): 309-319.
- Courty PE, Munoz F, Selosse MA, Duchemin M, Criquet S, Ziarelli F, Buee M, Plassard C,
 Taudière A, Garbaye J, Richard F, 2016. Into the functional ecology of ectomycorrhizal
 communities: environmental filtering of enzymatic activities. *Journal of Ecology* 104(6): 1585-1598.
- Daru BH, Park DS, Primack RB, Willis CG, Barrington DS, Whitfeld TJ, ... Davis CC, 2018.
 Widespread sampling biases in herbaria revealed from large-scale digitization. *New Phytologist* 217: 939-955.
- Delpon G, Vogt-Schilb H, Munoz F, Richard F Schatz B, 2018. Recent trends in the distribution
 of butterflies and dragonflies linked to recent habitat changes in Western Europe.
 Insect Conservation & Diversity 12(1): 49-68.
- 681 De Lamarck JB, de Candolle AP, 1805. *Flore française* (Vol. 5).
- 682 De Candolle AP, 1815. *Flore française. Ed, 3*.

- Díez J, Manjón JL, Martin F, 2002. Molecular phylogeny of the mycorrhizal desert truffles
 (Terfezia and Tirmania), host specificity and edaphic tolerance. *Mycologia* 94(2): 247 259.
- Diez JM, James TY, McMunn M, Ibanez I, 2013. Predicting species-specific responses of fungi
 to climatic variation using historical records. *Global Change Biology* 19(10): 3145 3154.
- Fogel R, 1976. Ecological-studies of hypogeous fungi. 2. Sporocarp phenology in a western
 oregon douglas-fir stand. *Canadian Journal of Botany* 54: 1152-1162.
- Gange AC, Gange EG, Sparks TH, Boddy L, 2007. Rapid and recent changes in fungal fruiting
 patterns. *Science* 316: 71-71.
- 693 Gange AC, Gange EG, Mohammad AB, Boddy L, 2011. Host shifts in fungi caused by climate 694 change? *Fungal Ecology* **4**: 184-190.
- Gange AC, Heegaard E, Boddy L, Andrew C, Kirk P, Halvorsen R, ... Høiland K, 2018.
 Trait-dependent distributional shifts in fruiting of common British fungi. *Ecography* 41: 51-61.
- 698 Gass L, Barnes PW, 1998. Microclimate and understory structure of live oak (Quercus 699 fusiformis) clusters in central Texas, USA. *Southwestern Naturalist* **43**: 183-194.
- Giorgi F, Lionello P, 2008. Climate change projections for the Mediterranean region. *Global and Planetary Change* 63: 90-104.
- Halme P, Kotiaho JS, 2012. The importance of timing and number of surveys in fungal
 biodiversity research. *Biodiversity and Conservation* 21: 205-219.
- Harmon ME, Sexton J, 1995. Water-balance of conifer logs in early stages of decomposition.
 Plant and Soil 172: 141-152.
- Hawker LE, 1954. British hypogeous fungi. Philosophical Transactions of the Royal Society of
 London Series B-Biological Sciences 237: 429-546.
- Heilmann-Clausen J, Læssøe T, 2012. On species richness estimates, climate change and host
 shifts in wood-inhabiting fungi. *Fungal Ecology* 5(5): 641-646.
- Hibbett DS, Pine EM, Langer E, Langer G, Donoghue MJ, 1997. Evolution of gilled mushrooms
 and puffballs inferred from ribosomal DNA sequences. *Proceedings of the National Academy of Sciences* 94(22): 12002-12006.
- IPCC, 2007. Climate Change 2007: The Physical Science Basis. Contribution of Working Group
 I to the Fourth Assessment Report of the Intergovernmental Panel on Climate Change.
 Cambridge University Press, Cambridge.
- Justo A, Morgenstern I, Hallen-Adams HE, Hibbett DS, 2010. Convergent evolution of
 sequestrate forms in Amanita under Mediterranean climate conditions. *Mycologia* 102: 675-688.

- Karavani A, De Cáceres M, de Aragón JM, Bonet JA, de-Miguel S, 2018. Effect of climatic and soil moisture conditions on mushroom productivity and related ecosystem services in
 Mediterranean pine stands facing climate change. *Agricultural and Forest Meteorology* 248: 432-440.
- Kauserud H, Heegaard E, Büntgen U, Halvorsen R, Egli S, Senn-Irlet B, Krisai-Greilhuber I,
 Damon W, Sparks T, Norden J, Hoiland K, Kirk P, Semenov M, Boddy L, Stenseth NC,
 2012. Warming-induced shift in European mushroom fruiting phenology. *Proceedings*of the National Academy of Sciences of the United States of America 109: 1448814493.
- Kauserud H, Heegaard E, Halvorsen R, Boddy L, Hoiland K, Stenseth NC, 2011. Mushroom's
 spore size and time of fruiting are strongly related: is moisture important? *Biology Letters* 7: 273-276.
- Kauserud H, Stige LC, Vik JO, Okland RH, Hoiland K, Stenseth NC, 2008. Mushroom fruiting
 and climate change. *Proceedings of the National Academy of Sciences of the United States of America* 105: 3811-3814.
- Laganà A, Salerni E, Barluzzi C, De Dominicis V, Perini C, 2002. Fungi (macromycetes) in
 various types of Mediterranean forest ecosystems (Tuscany, Italy). *Polish Botanical Journal* 47(2): 143-165.
- Lavoie C, Lachance D, 2006. A new herbarium-based method for reconstructing the
 phenology of plant species across large areas. *American Journal of Botany* 93: 512 516.
- Lõhmus A, 2009. Factors of species-specific detectability in conservation assessments of
 poorly studied taxa: the case of polypore fungi. *Biological Conservation* 142: 2792 2796.
- Loizides M, Bellanger JM, Clowez P, Richard F, Moreau PA, 2016. Combined phylogenetic and morphological studies of true morels (Pezizales, Ascomycota) in Cyprus reveal significant diversity, including *Morchella arbutiphila* and *M. disparilis* spp. nov.
 Mycological Progress 15(4): 39.
- Loizides M, Bellanger JM, Assyov B, Moreau PA, Richard F, 2019. Present status and future of
 boletoid fungi (Boletaceae) on the island of Cyprus: Cryptic and threatened diversity
 unravelled by ten-year study. *Fungal Ecology* 41: 65-81.
- Lund U, Agostinelli C, 2010. Package 'circular'. Repository CRAN-R.
- 751 Malençon G, Bertault R, 1968. *Champignons du Maroc*. Institut scientifique chérifien.
- McCarthy MA, Moore JL, Morris WK, Parris KM, Garrard GE, Vesk PA, ... Yue B, 2013. The
 influence of abundance on detectability. *Oikos* 122: 717-726.

- Médail F, Monnet AC, Pavon D, Nikolic T, Dimopoulos P, Bacchetta G, ... Leriche A, 2019.
 What is a tree in the Mediterranean Basin hotspot? A critical analysis. *Forest Ecosystems* 6: 1-19.
- Meineke E, Davis CC, Davies TJ, 2018. The unrealized potential of herbaria for global change
 biology. *Ecological Monographs* 88: 505-525.
- Moore D, Gange AC, Gange EG, Boddy L, 2008. Fruit bodies: their production and development in relation to environment. *British Mycological Society Symposia Series* 28: 79-103.
- Moreau PA, Heriveau P, Bourgade V, Bellanger JM, Courtecuisse R, Fons F, Rapior S, 2011.
 Rediscovery and typification of the fungi from the Montpellier area that were
 illustrated by Michel-Felix Dunal and Alire Raffeneau-Delile (in French). *Cryptogamie Mycologie* 32: 255-276.
- Myers N, Mittermeier RA, Mittermeier CG, Da Fonseca GA, Kent J, 2000. Biodiversity
 hotspots for conservation priorities. *Nature* 403: 853-858.
- Norstedt G, Bader P, Ericson L, 2001. Polypores as indicators of conservation value in
 Corsican pine forests. *Biological Conservation* 99: 347-354.
- Pages 2k Consortium, 2013. Continental-scale temperature variability during the past two
 millennia. *Nature Geoscience* 6: 339-346.
- Primack D, Imbres C, Primack RB, Miller-Rushing AJ, Del Tredici P, 2004. Herbarium
 specimens demonstrate earlier flowering times in response to warming in Boston.
 American Journal of Botany 91: 1260-1264.
- Purhonen J, Huhtinen S, Kotiranta H, Kotiaho JS, Halme P, 2017. Detailed information on
 fruiting phenology provides new insights on wood-inhabiting fungal detection. *Fungal Ecology* 27: 175-177.
- Quézel P, Médail F, 2017. Ecologie et biogéographie des forêts du bassin méditerranéen.
 Elsevier, Paris, p 575.
- R Development Core Team, 2010. R: A Language and Environment for Statistical Computing
 (R Foundation for Statistical Computing, Vienna). Available at http://www.r project.org. Accessed June 10, 2013.
- Richard F, Moreau PA, Selosse MA, Gardes M, 2004. Diversity and fruiting patterns of
 ectomycorrhizal and saprobic fungi in an old-growth Mediterranean forest
 dominated by Quercus ilex L. *Canadian Journal of Botany* 82: 1711-1729.
- Richard F, Millot S, Gardes M, Selosse MA, 2005. Diversity and specificity of ectomycorrhizal
 fungi retrieved from an old-growth Mediterranean forest dominated by *Quercus ilex*.
 New Phytologist 166(3): 1011-1023.

- Richard F, Roy M, Sthultz C, Duchemin M, Joffre R, Selosse M-A, 2011. Ectomycorrhizal
 communities in a Mediterranean forest ecosystem dominated by Quercus ilex:
 seasonal dynamics and response to drought. *Annals of Forest Science* 68(1): 57-68.
- Roux P, Eyssartier G, 2011. *Le guide des champignons, France et Europe*. Edition Belin, Paris.
- Ruffault J, Martin-StPaul NK, Rambal S, Mouillot F, 2013. Differential regional responses in
 drought length, intensity and timing to recent climate changes in a Mediterranean
 forested ecosystem. *Climatic Change* 117: 103-117.
- Sato H, Morimoto S, Hattori T, 2012. A Thirty-Year survey reveals that ecosystem function of
 fungi predicts phenology of Mushroom fruiting. *Plos One* 7(11): e49777.
- Schatz B, Vogt-Schilb H, Munoz F, Geniez P, Hugot L, Pradel R, Richard F, 2016. Using the past
 to predict the future: the case of French Mediterranean orchids. In: *Climate change in the Mediterranean (COP22)*. IRD Editions, pp. 377-386.
- Sirami C, Nespoulous A, Cheylan JP, Marty P, Hvenegaard GT, Geniez P, Schatz B, Martin JL,
 2010. Long-term anthropogenic and ecological dynamics of a Mediterranean
 landscape: Impacts on multiple taxa. *Landscape and Urban Planning* 96: 214–223.
- Smith JE, Molina R, Huso MM, Luoma DL, McKay D, Castellano MA, Lebel T, Valachovic Y,
 2002. Species richness, abundance, and composition of hypogeous and epigeous
 ectomycorrhizal fungal sporocarps in young, rotation-age, and old-growth stands of
 Douglas-fir (*Pseudotsuga menziesii*) in the Cascade Range of Oregon, USA. *Canadian Journal of Botany* 80(2): 186-204.
- 809 Smith SE, Read DJ, 2010. *Mycorrhizal symbiosis*. *3rd Edition*. Academic Press, London, p 800.
- Sparks TH, Carey PD, 1995. The responses of species to climate over two centuries: an analysis of the Marsham phenological record, 1736-1947. *Journal of Ecology*: 321-329.
- Straatsma G, Ayer F, Egli S, 2001. Species richness, abundance, and phenology of fungal fruit
 bodies over 21 years in a Swiss forest plot. *Mycological Research* 105: 515-523.
- Taudiere A, Munoz F, Lesne A, Monnet AC, Bellanger JM, Selosse MA, ... Richard F, 2015.
 Beyond ectomycorrhizal bipartite networks: projected networks demonstrate
 contrasted patterns between early-and late-successional plants in Corsica. *Frontiers in plant science* 6: 881.
- 818 Thiers HD, 1984. The secotioid syndrome. *Mycologia* **92**:1–8.
- Timling I, Walker DA, Nusbaum C, Lennon NJ, Taylor DL, 2014. Rich and cold: diversity, distribution and drivers of fungal communities in patterned-ground ecosystems of the North
- American Arctic. *Molecular ecology* **23**(13): 3258–3272.
- Vesterholt J, 2012. Funga Nordica. Agaricoid, boletoid, cyphelloid and gasteroid genera.
 Nordsvamp, Copenhagen, 9811021.

- Vogt-Schilb H, Moreau PA, Malaval JC, Schatz B, Richard F, 2018. Effects of long-term
 landscape dynamics and city growth on biodiversity in the Mediterranean: the case
 study of Montpellier, France. *Urban Ecosystems*: 1-12.
- Vogt-Schilb H, Pradel R, Geniez P, Hugot L, Delage A, Richard F, Schatz B, 2016. Responses of orchids to habitat change in Corsica over 27 years. *Annals of botany* **118**: 115-123.
- Wilson AW, Binder M, Hibbett DS, 2011. Effects of gasteroid fruiting body morphology on
 diversification rates in three independent clades of fungi estimated using binary state
 speciation and extinction analysis. *Evolution* 65: 1305-1322.

833 Legends of figures

Figure 1. Sampling design and historical overview of the 19th century. (A) Localization of the 19th (1821-1852) and the 21st (2001-2011) century field records around Montpellier. The grey colours in the left map delineate the altitudinal range of the study area. (B) Painting of *Agaricus erythrosarcos Dunal (Lactarius deliciosus)*, Fontfroide, 28/10/1836, coll. Dunal, Herbier MPU–UM, (C) Dried specimen of "Agaric tout blanc" (*Amanita echinocephala*), Grammont, 11/1823, coll. Touchy, Herbier général MPU–UM. (D) Picture of *Omphalotus olearius*, a typical Mediterranean species.

Figure 2. Mean Summer temperatures (June-July-August) in downtown Montpellier since 1840. Shades represent the two field sampling periods. R² and p-value of the linear regression model is indicated.

844

Figure 3. Monthly distribution of fungal diversity in 1821–1852 and 2001–2011, according to the two ecological guilds: ectomycorrhizal (ECM) vs. saprotroph (SAPRO) and fruiting seasonality (early- *vs.* late-fruiting). The mean annual number of fruiting species is expressed in percentages.

Figure 4. Comparison of the first fruiting day of (A) ectomycorrhizal (ECM) guild and (B) saprotrophic (SAPRO) guild between the 19^{th} century (1821-1852) and the 21^{st} century (2001-2011), which are the most commonly observed in both periods (occurred in \ge 3 years). Each point represents the averaged first fruiting day of a species ± standard deviation.





Year





First fruiting day in the 19th century

First fruiting day in the 19th century

Table 1. Mean and standard error of the first fruiting day (FFD) and difference of FFD between the 21st and the 19th century (dFFD) of fungal species, depending on the taxonomy, fruiting seasonality, life-form and habit, ecology geographical range, detectability and identifiability of species. Statistical significance by Wilcoxon non-parametric test at P < 0.001, 0.01 and 0.05 is indicated by ***, ** and *, respectively. NS: not significant. The number (N) of species per category is indicated. ECM, ectomycorrhizal; sapro, saprotroph.

		N	FFD						dFFD			Wilcoxon test		
Trait			in the 19 th			in the 21 st						W	P	
			Mean		SE	Mean		SE	Mean		SE			
Taxonomy	Amanitaceae	11	295.7	±	4.7	314.8	±	4.6	19.1	±	8.1	22	0.012	*
	Cortinariaceae	7	319.8	±	7.8	319.4	±	2.9	-0.4	±	8.9	29	0.609	NS
	Russulaceae	10	304.8	±	3.5	323.1	±	3.7	18.4	±	6.3	11	0.004	**
	Tricholomataceae (ECM)	8	320.6	±	5.4	326.7	±	3.8	6.1	±	6.7	26	0.563	NS
	Agaricaceae	7	290.4	±	6.0	324.7	±	9.6	34.3	±	12.5	7	0.007	**
	Mycenaceae	8	322.1	±	7.4	328.5	±	4.5	6.4	±	7.9	23	0.370	NS
	Psathyrellaceae	9	313.2	±	5.4	327.9	±	8.1	14.7	±	10.7	26	0.222	NS
	Tricholomataceae (Sapro)	11	312.3	±	5.9	325	±	5	12.7	±	7.3	46.5	0.148	NS
Fruiting seasonality	Early-fruiting	73	307.6	±	2.6	323.9	±	2	16.4	±	3.1	1421.5	< 0.001	***
	Late-fruiting	17	324.9	±	4.6	327.5	±	3.8	2.6	±	6.3	134	0.730	NS
	Early-fruiting (ECM)	49	308.9	±	2.8	320.9	±	1.5	12.0	±	3.2	662.5	< 0.001	***
	Late-fruiting (ECM)	8	323.8	±	3.0	324.4	±	3.3	0.5	±	5.4	30.5	0.916	NS
	Early-fruiting (Sapro)	24	304.9	±	5.5	330.2	±	5.3	25.3	±	6.3	136	0.002	**
	Late-fruiting (Sapro)	9	325.8	±	8.4	330.3	±	6.6	4.5	±	11.3	39.5	0.965	NS
Life-form and habit	Epigeous	153	310.5	±	1.9	327.9	±	1.6	17.3	±	2.3	6500.5	< 0.001	**:
	Hypogeous	6	317.4	±	10	324.5	±	3.6	7	±	12.4	13	0.485	NS
	Agaricoid	129	308.9	±	2	325.6	±	1.6	16.7	±	2.5	4627	< 0.001	***
	Gastroid	11	311.9	±	7	330.1	±	3.6	18.3	±	9.8	30.5	0.053	NS
Feeding modes	Pinus spp. (ECM)	10	306.5	±	4.4	325.7	±	3.2	19.2	±	6.1	14.5	0.008	**
	Quercus spp. (ECM)	16	312.7	±	5.1	321.8	±	2.5	9.1	±	6.2	79	0.067	NS
	Litter decaying (Sapro)	52	307.6	±	3.6	324.6	±	2.2	17.0	±	4.4	767	< 0.001	***
	Wood decaying (Sapro)	28	316.8	±	4.6	348.3	±	5.1	31.43	±	5.9	143	< 0.001	***
Geographical range	Temperate	15	309.1	±	6.2	326.3	±	5.3	17.3	±	8.4	59.5	0.029	*
	Mediterranean restricted	22	311.6	±	5.1	319.9	±	2.6	8.3	±	6.3	176.5	0.127	NS
Fruitbody lifespan	Short duration	129	309.4	±	2.1	325.3	±	1.4	15.9	±	2.4	4699	< 0.001	***
	Long duration	29	316.4	<u>+</u>	4	336.9	±	5.1	20.6	±	5.9	231	0.003	**
Detectability	Conspicuous	121	309.5	±	1.9	324.4	±	1.5	14.9	±	2.2	4005.5	< 0.001	***
	Inconspicuous	38	314.7	±	5	338	±	3.9	22.4	±	3.6	437.5	0.003	**
Identifiability	Described	91	307.6	±	2.6	328.1	±	2.1	20.5	±	3.1	2005.5	< 0.001	***
	Undescribed	64	313.5	±	2.6	325.3	±	2.1	11.8	±	3.3	1348	< 0.001	***