# frontiers in MICROBIOLOGY

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Journal Name:	Frontiers in Microbiology
ISSN:	1664-302X
Article type:	Original Research Article
Received on:	06 Oct 2014
Accepted on:	28 Nov 2014
Provisional PDF published on:	28 Nov 2014
www.frontiersin.org:	www.frontiersin.org
Citation:	Zajc J, Džeroski S, Kocev D, Oren A, Sonjak S, Tkavc R and Gunde- cimerman N(2014) Chaophilic or chaotolerant fungi: a new category of extremophiles?. <i>Front. Microbiol.</i> 5:708. doi:10.3389/fmicb.2014.00708
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#### 19 Abstract

20 It is well known that few halophilic bacteria and archaea as well as certain fungi can grow at the highest concentrations of NaCl. However, data about possible life at extremely high 21 22 concentrations of various others kosmotropic (stabilizing; like NaCl, KCl and MgSO<sub>4</sub>) and chaotropic (destabilizing) salts (NaBr, MgCl<sub>2</sub> and CaCl<sub>2</sub>) are scarce for prokaryotes and almost 23 absent for the eukaryotic domain including fungi. Fungi from diverse (extreme) environments 24 were tested for their ability to grow at the highest concentrations of kosmotropic and chaotropic 25 26 salts ever recorded to support life. The majority of fungi showed preference for relatively high 27 concentrations of kosmotropes. However, our study revealed the outstanding tolerance of several fungi to high concentrations of MgCl<sub>2</sub> (up to 2.1 M) or CaCl<sub>2</sub> (up to 2.0 M) without 28 compensating kosmotropic salts. Few species, for instance Hortaea werneckii, Eurotium 29 amstelodami, Eurotium chevalieri and Wallemia ichthyophaga, are able to thrive in media with 30 the highest salinities of all salts (except for CaCl<sub>2</sub> in the case of *W. ichthyophaga*). The upper 31 concentration of MgCl<sub>2</sub> to support fungal life in the absence of kosmotropes (2.1 M) is much 32 higher than previously determined to be the upper limit for microbial growth (1.26 M). No 33 fungal representatives showed exclusive preference for only chaotropic salts (being obligate 34 chaophiles). Nevertheless, our study expands the knowledge of possible active life by a diverse 35 36 set of fungi in biologically detrimental chaotropic environments.

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- **Keywords**: Xerophiles, halophiles, kosmotropes, chaotropes, magnesium chloride, calcium chloride, life limit 44
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#### 46 **1. Introduction**

47 Water is essential to life, and life can only exist within a narrow range of water availability in a particular environment, expressed as water activity (a<sub>w</sub>). Water activity is the effective water 48 content expressed as its mole fraction, therefore pure water has  $a_w = 1$ , all the other solutions 49 have  $a_w < 1$ . Types and amounts of solutes present in the environment lower  $a_w$  to various values 50 and exert additional effects on the growth of microorganisms - causing osmotic pressure and/or 51 have toxic effects. The lowest a<sub>w</sub> known to support life is 0.61, measured for the xerophilic 52 53 fungus Xeromyces bisporus grown on sugar-based media (Pitt and Hocking, 2009), and also for some halophilic Archaea and Bacteria (Stevenson et al., 2014). Many fungi are able to thrive at 54 low a<sub>w</sub>, especially the numerous xerophilic filamentous fungi and osmophilic yeasts that grow 55 on drying foods or on foods with high concentrations of sugars (Pitt and Hocking, 1977; 2009). 56 In the past, fungi were not renowned for growth at high salt concentrations. However, after the 57

first record of fungi as active inhabitants of solar salterns were published (Gunde-Cimerman et al., 2000), the study of halotolerant and halophilic fungi expanded. Since that time numerous fungal species thriving in extremely saline environments around the globe have been described, most of them being halotolerant and extremely halotolerant, and few are obligate halophiles (reviewed in Zajc et al., 2012). The most halophilic fungus known to date is *Wallemia ichthyophaga* as it requires at least 10% NaCl and grows also in solutions saturated with NaCl (Zalar et al., 2005; Zajc et al., 2014).

Fungi have some common characteristics of osmotolerance, for instance they all employ the 65 »compatible solutes« strategy: they balance the osmotic pressure of the surroundings by 66 67 accumulating small organic molecules (compatible solutes), most commonly glycerol, and maintain low intracellular concentrations of salt (such as toxic Na<sup>+</sup> ions) (reviewed in Gostinčar 68 et al., 2011; Zajc et al., 2012). Sensing and responding to turgor stress (either due to organic 69 70 osmolytes or due to salt) is under the control of the high osmolarity glycerol (HOG) signalling 71 pathway in all halotolerant and halophilic fungi (Gostinčar et al., 2011). The activation of the 72 HOG pathway results in the production of glycerol, which restores the osmotic balance of the 73 cell (Hohmann, 2009). The cells are equipped with channels allowing for a quick expulsion of glycerol, as well as its active intake when required (Luyten et al., 1995; Ferreira et al., 2005). 74 As the concentration of glycerol is carefully regulated, this strategy allows more flexible 75 76 adaptations to changing salinity. Besides energetically costly synthesis of high concentrations of organic solutes, the cells also use much energy by using different efflux and influx systems 77 to actively eliminate surplus ions, to preserve membrane potential, regulate intracellular pH, 78 79 and maintain positive turgor of the cell. Hence, the alkali-metal cation transporters are of high importance of the osmoadaptation to extremely saline environments. In fact, the Na<sup>+</sup>- exporting 80 ATPase (EnaA) is the major determinant of salt tolerance in yeasts (reviewed in Ariño et al., 81 2010). In addition to the above active mechanisms, fungi also employ some strategies for 82 increasing their stress resistance that may be referred as passive - like clustering cells in 83 compact cell clumps (Palkova and Vachova, 2006; Kralj Kunčič et al., 2010), covering the cells 84 with abundant extracellular polysaccharides or increasing the thickness (Kralj Kunčič et al., 85 2010), and pigmentation (e. g. melanin) (Selbmann et al., 2005; Kogej et al., 2006) of the cell 86 wall. 87

As most hypersaline environments are rich in NaCl, salt tolerance of fungi and other microorganisms, and mechanisms of adaptations were generally tested by using only NaCl as the solute. Therefore, the responses to high concentrations of other chaotropic salts remained unknown. However, other salts such as MgCl<sub>2</sub> are also abundantly present in nature and can be important or even life-limiting. Salts in the environment not only lower the biologically

available water and cause toxicity due to the penetration of certain cations into the cell, but they 93 also modify structural interactions of cellular macromolecules. The Hofmeister series of ions 94  $(K^+>Na^+>Mg^{2+}>Ca^{2+}; SO_4^{2-}>HPO_4^{2-}>Cl^->NO_3^->Br^->ClO_3^->l^->ClO_4^-)$  describes the order 95 of the ability of ions to salt-out or salt-in proteins (Hofmeister, 1888; Kunz et al., 2004). This 96 phenomenon is based on direct interactions between ions and macromolecules and on 97 98 interactions between ions and water molecules in the first hydration shell of the macromolecule (Zhang and Cremer, 2006). Hofmeister effects of ions on biological structures are either 99 kosmotropic or chaotropic; chaotropes weaken electrostatic interactions and destabilize 100 biological macromolecules, whereas the contrary is true for the kosmotropes (reviewed in Oren, 101 2013). The difference among the kosmotropic effect of NaCl on one hand and the chaotropic 102 effect of MgCl<sub>2</sub> and CaCl<sub>2</sub> on the other hand might explain why high concentrations of Mg<sup>2+</sup> 103 and Ca<sup>2+</sup> are toxic even to the most halophilic microorganisms (McGenity and Oren, 2012). 104 However, to some extent the chaotropic effects of  $Mg^{2+}$  and  $Ca^{2+}$  can be counteracted by the 105 presence of kosmotropic ions (Williams and Hallsworth, 2009). In fact, few halophilic Archaea 106 can grow at high concentrations of MgCl<sub>2</sub>, but only in the presence of significant concentrations 107 of NaCl (Mullakhanbhai and Larsen, 1975; Oren, 1983; Oren et al., 1995). This confirms an 108 early study of interactions among kosmotropic and chaotropic ions on the growth of the 109 halophilic alga Dunaliella salina performed by Baas Becking, who discovered that toxicity of 110  $Ca^{2+}$  ions was diminished in the presence of sodium ions (Baas Becking, 1934; Oren, 2011). 111

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Two types of hypersaline brines are distinguished with respect to their origin of formation; 113 thalassohaline and athalassohaline (Oren, 2002). Thalassohaline waters, such as marine ponds, 114 salt marshes and solar salterns, originate by evaporation of sea water and are therefore 115 dominated by sodium and chloride ions. During the progression of evaporation, ionic 116 composition changes due to the consecutive precipitation of calcite (CaCO<sub>3</sub>), gypsum 117 (CaSO<sub>4</sub>·2H<sub>2</sub>O), halite (NaCl), sylvite (KCl) and final carnalite (KCl·MgCl<sub>2</sub>·6H<sub>2</sub>O) after their 118 solubilities have been surpassed (Oren, 2002; Oren, 2013). The major change in the ratio of 119 divalent and monovalent cations occurs when the total salt concentration exceeds 300 to 350 g 120  $1^{-1}$  and most of the sodium (as halite) precipitates. In the remaining brine, so-called bittern, the 121 dominate ion becomes  $Mg^{2+}$  (Oren, 2013). 122

123

While NaCl-rich (thalassohaline) environments are well known to support a rich biodiversity, 124 including of fungi, very little is known about the occurrence of fungi and other microorganisms 125 in athalassohaline, MgCl<sub>2</sub>- and CaCl<sub>2</sub>-dominated environments. Several fungi were isolated 126 from the magnesium and calcium-rich water of the Dead Sea (Oren and Gunde-Cimerman, 127 2012) (~2.0 M and ~0.5 M, respectively; total dissolved salts concentration ~350 g l<sup>-1</sup> (Oren, 128 2013); water activity ~0.683 (at 35 °C) (Hallsworth, personal communication)). However, most 129 frequently isolation media were supplemented with different NaCl concentrations (reviewed in 130 Oren and Gunde-Cimerman, 2012) rather than with chaotropic ions such as magnesium and 131 132 calcium. Recently fungal strains were isolated from the bittern brines of solar salterns (Sonjak et al., 2010), an environment earlier considered sterile due to the high concentrations of 133 magnesium salts (Javor, 1989). These fungal strains showed elevated tolerance to MgCl<sub>2</sub>, a 134 phenomenon not yet reported for fungi. This raised the issue of the existence of chaophiles 135 among extremophilic fungi. To address the question whether chaotolerant/chaophilic fungi may 136 exist, we have examined a range of them both from bitterns, the Dead Sea and other extreme 137 138 environments, as well as reference strains from culture collections for their ability to grow at high concentrations of various chaotropic as well as kosmotropic salts. 139 140

#### 141 **2. Material and methods**

142 2.1 Fungal strains

143 The fungal strains studied (listed in Table 1) include culture collection strains known for their 144 halotolerance and/or xerotolerance, and reference strains not known to be derived from 145 hypersaline or dry environments. In addition, we tested newly isolated strains from bitterns of 146 the Sečovlje (Slovenia) solar salterns. All fungal strains used are maintained in the Ex Culture 147 Collection of the Department of Biology, Biotechnical Faculty, University of Ljubljana 148 (Infrastructural Centre Mycosmo, MRIC UL, Slovenia).

149 2.2 Screening of the fungal growth in media of various salt concentration and composition

Strains were first inoculated on MEA without additional salts, except for the special strains that 150 are obligately xerophilic (Xeromyces bisporus FRR525/EXF-9116) or halophilic (Wallemia 151 ichtyophaga EXF-1059, -5676, -994, -6068, -8617 and W. muriae EXF-753, -2361, -8359, -152 951). For the latter two species, MEA was supplemented with 2 M NaCl, whereas for X. 153 bisporus MEA was supplemented with 30 % (w/v) glucose. After seven to fourteen days of 154 incubation at 24 °C in the dark, spore suspensions were prepared using spore suspension 155 solution (0.05 % (w/v) Tween 80, 0.05 % agar, 0.9 % NaCl). The optical density of the spore 156 suspensions were measured at 600 nm and adjusted to ~0.8. Spore suspension (50 µl) was added 157 to 2 ml of the liquid Malt Extract (ME) medium (pH 7) supplemented with various salts (NaCl, 158 KCl, NaBr, MgSO<sub>4</sub>, MgCl<sub>2</sub>, CaCl<sub>2</sub>) of indicated concentrations (NaCl: 2.0, 2.5, 3.0, 4.0, 5.0 M; 159 NaBr: 1.5, 2.0, 2.5, 3.0, 3.5, 4.0 M; KCl: 2.0, 2.5, 3.0, 4.0, 4.5 M; MgCl<sub>2</sub>: 1.5, 1.6, 1.7, 1.8, 1.9, 160 2.0, 2.1 M; MgSO<sub>4</sub>: 2.0, 2.5, 3.0 M; CaCl<sub>2</sub>: 1.0, 1.2, 1.5, 1.7, 1.9, 2.0 M), and incubated in 12 161 ml glass test tubes (covered with metal caps and thoroughly wrapped with parafilm) at 24 °C. 162 Inoculated media were examined for visible growth (either in a form of a submerged or surface 163 mycelium or culture turbidity due to growth of yeast cells) after 6 weeks. Negative controls 164 165 (sterile medium) for each salinity and salt type were included in the experiments. Cultures were examined by light microscopy using Olympus BX51 light microscope equipped with an 166 Olympus DP73 digital camera. 167

168 2.3 Data analysis using machine learning

The experiments described above resulted in a dataset with a total of 135 samples. Each of the 169 samples refers to a single fungal strain and is described with environmental conditions 170 (considered as independent or descriptive variables), and the fungal species encountered at each 171 sample (considered as the dependent or the target variable). More specifically, we used the 172 following descriptive variables: habitat (with the possible values of salterns, the Dead Sea, food, 173 freshwater, ice; human, or animal), pigmentation (non-melanized or melanized), cell 174 morphology (filamentous, polymorphic, yeast, or clumps), the lowest aw salt with observable 175 growth, the type of salt with the lowest a<sub>w</sub> still supporting growth, and the highest 176 concentrations of various salts still supporting growth (NaCl, KCl, MgCl<sub>2</sub>, CaCl<sub>2</sub> NaBr and 177 MgSO<sub>4</sub>). The target variable is the fungal species, described with its taxonomic rank. Taken 178 179 together, the samples included information from 94 different species from 31 different genera. 180

The generic data analysis task that we addressed was a task of predictive modeling, relating the 181 environmental conditions (descriptive variables) and the fungal species (target variable). We 182 have defined seven different scenarios for analysis. The descriptive variable(s) for each were 183 as follows: A) the highest concentrations of salts (NaCl, KCl, MgCl<sub>2</sub>, CaCl<sub>2</sub> NaBr and MgSO<sub>4</sub>), 184 B) habitat and salt concentrations, C) pigmentation, morphology and salt concentrations, D) 185 habitat, pigmentation, morphology and salt concentrations, E) habitat, lowest aw (type of salt), 186 lowest a<sub>w</sub> (value) and salt concentrations, F) habitat, lowest a<sub>w</sub> (type of salt and lowest a<sub>w</sub> value), 187 188 and G) all descriptive variables. 189

190 To analyze the data, we used the machine learning tool CLUS available for download at 191 http://clus.sourceforge.net. More specifically, we used predictive clustering trees (PCTs) for 192 hierarchical classification as models. PCTs are a generalization of decision trees – a machine 193 learning approach commonly used for classification. PCTs are tree-like structures that have 194 internal nodes and leafs. The internal nodes contain tests on the descriptive variables, while 195 leafs represent the predictions about the target variable. PCTs can solve more general task of 196 structured output prediction, including the task of hierarchical classification.

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We selected PCTs to model the data because of the specific task at hand. Namely, we used the 198 199 taxonomic rank of the fungi species to create a hierarchy of classes, where different species can belong to the same genera. This clearly defines the prediction task as a task of hierarchical 200 classification. The predictive clustering trees are able to exploit the information contained in 201 the taxonomic rank of the species during the model construction. Furthermore, the PCTs are 202 easily interpretable predictive models. Detailed information about predictive clustering trees 203 for hierarchical classification has been published before (Vens et al., 2008; Kocev et al., 2013; 204 205 Levatić et al., 2014).

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For each scenario, we have constructed a PCT for hierarchical classification. The PCTs for scenarios A, C, D and F are given in Figure 1. The internal nodes contain tests on individual environmental conditions (e.g.,  $MgCl_2 > 1.8$ ) and leaves correspond to a specific combination of environmental conditions. In each leaf, the species encountered under the given conditions are listed.

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## 213 **3. Results**

214 3.1 Screening of the fungal growth at various salts

We have selected 135 fungal strains covering 94 different species and 31 genera. Amongst the 215 genera with the highest number of strains were *Cladosporium* (23), *Aspergillus*, *Wallemia* (both 216 14) and *Penicillium* (10). The selected strains were previously isolated from different aqueous 217 environments that contain high concentrations of salts (44 strains from salterns, 47 strains from 218 the Dead Sea and also 13 strains from the subglacial ice) and from freshwater (6 strains). 219 Additionally, we have included fungi from various habitats (25 representatives) including food, 220 skin (agents of mycoses), and animals. Among the strains from the Dead Sea almost half (22) 221 belong to the genus *Cladosporium*. We have tested growth of these strains on salts that act as 222 kosmotropes (NaCl, KCl and MgSO<sub>4</sub>) and chaotropes (CaCl<sub>2</sub>, MgCl<sub>2</sub> and NaBr) that are present 223 in these hypersaline environments. The highest concentrations of salts that allowed growth of 224 individual strains are presented in the Table 1. The microscopic growth characteristics of the 225 selected fungal representatives (cell clumps forming W. ichthyophaga EXF-994; a black yeast 226 Hortaea werneckii EXF-225; and filamentous Eurotium repens EXF-2132 and Cladosporium 227 228 cladosporoides EXF-1824) are represented in Figure 2.

229 3.2 Predictive clustering trees for fungal growth

The predictive clustering trees obtained with the machine learning analysis are presented in Figure 1. When the highest concentrations of salts at which fungi were able to thrive (scenario A) were used as the only descriptive variables, the decision tree identified chaotropic salts as the most limiting for fungal growth (Figure 1 (A)). The most limiting turned out to be MgCl<sub>2</sub> which was at the top of the decision tree, whereas CaCl<sub>2</sub> and NaBr occupied internal nodes. In addition, pigmentation (melanized and non-melanized) and cell morphology (yeast, filamentous, polymorphic and clumps) (scenario C, D and F; PCT for scenarios C and D is

given in Figure 1 (B), while for scenario G in Figure 1 (C)) turned out to be key features 237 influencing fungal distribution. Finally, when all the descriptive variables were used (including 238 239 the lowest water activity and the type of salt at the lowest water activity to support growth), pigmentation was again the key variable, whereas morphology divided fungi at internal nodes 240 and finally the lowest water activity and the type of salt in the medium with the lowest a<sub>w</sub> led 241 242 to the leaves (Figure 1 (C)). Among non-melanized filamentous representatives, the ability to grow at KCl > 3.0 M and among non-melanized non-filamentous yeasts NaCl > 2.5 M turned 243 out to be the key variables (Figure 1 (B)). Among melanized filamentous fungi, the genus 244 *Cladosporium* predominated, whereas for so called "black yeasts" the ability to grow at NaCl 245 > 3.5 M was the criterion to differentiate *H. werneckii* from *Aureobasidium* sp., *Exophiala* sp., 246

- 247 *Phaeotheca* sp. and *Phaeococcomyces* sp. (Figure 1 (B)). When habitat was added to the other
- variables, almost no changes occurred in the tree (scenario B, D and F; Supplemental figure 1).

#### 249 4. Discussion

250 Few studies have addressed the issue of the tolerance of microorganisms to chaotropic conditions over the years (reviewed in Oren, 2013). Searching for the chaophilic strains from 251 the hypersaline deep-sea Discovery Basin, an environment with the highest salinity ever found 252 253 in the marine environments – the brine is almost at saturated levels of  $MgCl_2$  (5.15 M) (van der Wielen et al., 2005), did not reveal any prokaryotic representatives (Hallsworth et al., 2007). 254 Instead, a fungus X. bisporus, with the lowest a<sub>w</sub> limit so far reported to support life (Pitt and 255 256 Hocking, 2009), was the first described species of having the preference to chaotropic conditions/solutes as it was able to grow in highly chaotropic media containing up to 7.6 M 257 258 glycerol (Williams and Hallsworth, 2009) and was markedly intolerant to NaCl (Pitt and 259 Hocking, 1977). Importantly, its growth on chaotropic solutes like MgCl<sub>2</sub> and CaCl<sub>2</sub> was not tested. 260

Indeed, fungi are promising candidates for chaophiles as they can thrive in the environments,
such as crystallizer ponds of solar salterns (Gunde-Cimerman et al., 2000; Butinar et al., 2005a;
Butinar et al., 2005b), hypersaline water of the Dead Sea (reviewed in Oren and Gunde-Cimerman, 2012) as well as the brine channels of sea ice (Gunde-Cimerman et al., 2003; Sonjak
et al., 2006). As these fungi have not previously been examined for their ability to grow in
media dominated by chaotropic ions, we have carried out an extensive screening of tolerance
to various salts.

Our search for the chaophilic characters of fungi based on their isolation from bittern brines 268 (Sonjak et al., 2010), residual water after the precipitation of NaCl, which is highly enriched 269 with magnesium salts, mostly MgCl<sub>2</sub>. These brines were long considered sterile as high 270 concentrations of  $Mg^{2+}$  are often toxic for biological systems. However, it was shown recently 271 that bittern brines of the Sečovlje salterns (Slovenia) are not completely free of living 272 273 microorganisms. They harbour different filamentous fungi, Cladosporium spp., black and other yeasts, albeit their abundance and biodiversity is low when compared to the hypersaline water 274 of the salterns (Sonjak et al., 2010). The lower diversity and abundance might be a consequence 275 of a combination of various factors in situ, such as prolonged exposure to solar radiation and 276 magnesium, its life-limiting effect and nutrient availability. 277

However, the ionic composition of the bittern brine is not completely unfavorable for microbial growth despite extremely low water activity (0.737); the level of toxic ion  $Mg^{2+}$  is compensated by a relatively higher concentration of Na<sup>+</sup>. An outstanding discovery here was that these fungi isolated either from brine rich in MgCl<sub>2</sub> or NaCl were able to grow at high concentrations of MgCl<sub>2</sub> (1.5 M) (Sonjak et al., 2010) – higher than previously reported for prokaryotes (1.26 M MgCl<sub>2</sub>) (Hallsworth et al., 2007). This observation led to the study of the ability of a list of fungi, composed of the isolates from the Dead Sea and the reference strains from our culture
collection, to grow in media with low aw due to high concentrations of not only kosmotropic
salts (NaCl, KCl, MgSO<sub>4</sub>) but also chaotropic salts such as NaBr, MgCl<sub>2</sub> and CaCl<sub>2</sub>.

Among the extremophilic fungi included in our study, 104 (almost 80% of the strains) were able to grow at concentrations of MgCl<sub>2</sub> higher than 1.5 M, and among these 16 (12%) were able to grow at the highest concentrations of MgCl<sub>2</sub> ( $\geq$  2.0 M). Next, 56 (41.5% of the strains) were capable of growth at concentrations of CaCl<sub>2</sub> higher than 1.5 M, with two of these able to grow at the highest concentration (2.0 M).

The decision trees (more specifically PCTs) obtained by machine learning analysis in various 292 scenarios (Figure 1) revealed key types of salts influencing the ability of growth of fungi. The 293 most important salts for the limitation of fungal diversity turned out to be the chaotropic salts 294 MgCl<sub>2</sub>, CaCl<sub>2</sub>, and NaBr, whereas KCl and NaCl appeared to be the least limiting and were not 295 present in the nodes of the decision tree. The first decision tree (Figure 1 (A)) revealed that 37 296 strains, including 11 strains of H. werneckii and W. ichthyophaga can cope with MgCl<sub>2</sub> 297 concentrations higher than 1.8 M. Here, the majority of strains of W. ichthyophaga were unique 298 299 in their ability to tolerate the highest concentrations of MgCl<sub>2</sub>, but not CaCl<sub>2</sub>; whereas almost all strains (except for one instance) of H. werneckii could grow at the highest concentrations of 300 all tested salts. Another key variable distinguishing the tested fungal strains is pigmentation, 301 which is at the top of the decision tree using all the variables available. However, melanization 302 303 is known for its role in UV and other stress responses including in osmoadaptation in halotolerant fungi (Jacobson and Ikeda, 2005; Kogej et al., 2007). Melanin impregnates the 304 305 outer layer of the cell wall, this decreasing the porosity of the cell wall in order to retain more 306 glycerol, which is most often the main compatible solute (Kogej et al., 2007). Next, cell morphology also appeared high in the decision trees. The ability to form dense clumps of 307 meristematic cells, as observed for W. ichthyophaga and Phaeotheca triangularis, also impacts 308 309 the ability of fungi to live in stressful conditions (Wollenzien et al., 1995; Palkova, 2004; Palkova and Vachova, 2006). 310

A simple determination of the type of salt to allow growth of individual strains at the lowest a<sub>w</sub> 311 revealed that the largest number of fungi thrived in the media with the lowest aw when NaCl 312 (52; 38.8 %) or KCl (42; 31.3 %) were used as the main solutes. On the contrary, less than 10% 313 of strains were able to grow in the presence of chaotropic salts, MgCl<sub>2</sub> (10; 7.5%) and CaCl<sub>2</sub> 314 (2; 1.5%), at their lowest a<sub>w</sub>. This again emphasizes the life-limiting effects of chaotropic salts. 315 Whether these fungi have the preference for chaotropic salts is inconclusive, as most of them 316 are able to grow also at the highest concentrations of other – kosmotropic – salts. Nevertheless, 317 the fact that they are not only tolerating but growing at such high concentrations of magnesium 318 and/or calcium salts makes these strains the most chaotolerant organisms described so far. 319

320 For comparison, the highest concentration of salts to support growth of X. bisporus given our results (Table 1) were 2.5 M NaCl, 3.5 M KCl, 2.5 M MgSO<sub>4</sub> and 2.5 M NaBr, albeit growth 321 was poor. In addition it was also able to grow at 1.5 M MgCl<sub>2</sub> and 1 M CaCl<sub>2</sub>. For the inhibition 322 of growth of X. bisporus the  $a_w$  of the medium was clearly not the determining factor – the 323 lowest a<sub>w</sub> of media tested in our study was 0.867 for medium containing 3.5 M KCl, which is 324 far above its lowest a<sub>w</sub> enabling growth in a glycerol-based medium (Pitt and Hocking, 1977). 325 Here, it seems that high concentrations of salt, regardless of their chao- or kosmotropicity, limit 326 the growth of X. bisporus, which clearly prefers sugar-based media as previously reported. Its 327 chaophilic character on organic solutes such as glycerol (Williams and Hallsworth, 2009) must 328 329 be reconsidered with caution when addressing ionic chaophilic solutes. Poor growth in the presence of salt might be a consequence of the absence of a gene coding for Na<sup>+</sup>-exporting 330

- in multiple copies and/or is differentially expressed in the extremely halotolerant *H. werneckii* (Gorjan and Plemenitaš, 2006; Lenassi et al., 2013) and the halophilic *W. ichtyophaga* (Zajc et al., 2012)
- al., 2013).

Hortaea werneckii is a representative of the polyphyletic group of black (melanized) yeasts that 335 have filamentous and yeast-like growth. It is able to grow across the whole range of NaCl 336 concentrations, from 0 M to saturation, with a broad optimum from 1 M to 2.4 M NaCl (Butinar 337 338 et al., 2005b), and it is thus considered to be the most extremely halotolerant fungus so far described (reviewed in Gostinčar et al., 2011). Amongst all of the melanized fungi H. werneckii 339 is the most abundant in the hypersaline water of salterns (Gunde-Cimerman et al., 2000). Our 340 screening revealed that *H. werneckii* strains are able to grow at the highest tested concentrations 341 of salts; in media saturated with kosmotropes (5.0 M NaCl, 4.5 M KCl, 3.0 M MgSO<sub>4</sub>) and the 342 highest tested concentrations of chaotropes (2.1 M MgCl<sub>2</sub>, 1.7 M CaCl<sub>2</sub> and 4.0 M NaBr) (Table 343 344 2 and Figure 2). This exceptional ability might be linked to the redundancy of plasma membrane Na<sup>+</sup> and K<sup>+</sup> transporters encoded in its duplicated genome (Lenassi et al., 2013). 345

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347 The genus Aureobasidium (de Bary) G. Arnaud is a wide-spread osmotolerant (Kogej et al., 2005) representative of black yeast associated with numerous habitats from hypersaline waters, 348 Arctic glaciers, plant surfaces and household dust (reviewed in Gostinčar et al., 2014). In the 349 350 genus, recently four new species were introduced A. pullulans, A. melanogenum, A. subglaciale and A. namibiae in (Gostinčar et al., 2014). All of them are described as polyextremotolerant 351 (Gostinčar et al., 2010; Gostinčar et al., 2011) capable of surviving also hypersaline conditions 352 353 (Gunde-Cimerman et al., 2000). The maximum concentrations of NaCl supporting growth of A. pullulans was reported to be 2.9 M NaCl (Kogej et al., 2005). Our study confirmed the upper 354 limit of NaCl for Aureobasidium sp. and revealed its ability for growth at high concentrations 355 356 of KCl (4.0 M) and MgSO<sub>4</sub> (3.0 M), but not extremely high concentration of MgCl<sub>2</sub> (lower than 1.5 M) and CaCl<sub>2</sub> (up to 1.2 M). Aureobasidium spp. can thus be considered kosmophilic. 357 Recent genome analysis uncovered a large repertoire of plasma-membrane transporters in the 358 four Aureobasidium species (Gostinčar et al., 2014). A. melanogenum, which is heavily 359 melanized, is able to grow at the highest concentrations of all salts among the four tested species 360 of the genus Aureobasidium, and the least melanized A. subglaciale on the other hand thrives 361 at the lowest. Here, it seems that melanization is required for the highest salt tolerance. The role 362 of melanin in osmoadaptation was shown previously by modifying the permeability of the cell 363 wall in order to retain the compatible solute glycerol (Jacobson and Ikeda, 2005; Kogej et al., 364 2006). 365

Representatives of the cosmopolitan genus *Cladosporium* are frequently found in habitats 366 characterized by low a<sub>w</sub>, like foods preserved with sugar or salt (Samson et al., 2002), salt 367 marshes of Egypt, in the rhizosphere of halophytic plants, and the phylloplane of Mediterranean 368 plants (Abdel-Hafez et al., 1978). They are therefore considered xerotolerant with 0.82 being 369 the minimal aw for growth of *Cladosporium sphaerospermum* (Hocking et al., 1994). 370 *Cladosporium* spp. are among the most abundant melanized fungi throughout the year in the 371 solar salterns in Sečovlje (Gunde-Cimerman et al., 2000; Butinar et al., 2005b) and Cabo Rojo 372 in Puerto Rico (Cantrell et al., 2006). Five species of the genus Cladosporium were isolated 373 374 from the Dead Sea (reviewed in Oren and Gunde-Cimerman, 2012). The highest concentration of NaCl for in vitro growth of various representatives of the genus Cladosporium was reported 375 to be 2.9 M to 3.5 M (Zalar et al., 2007). Strains of the genus *Cladosporium* exhibited variable 376 377 tolerance to different types of salts, ranging from the lowest concentrations used in the study to the highest (Table 2). The highest growth concentrations of kosmotropic NaCl, KCl and MgSO4 378

among *Cladosporium* spp. are respectively 2.5 - 4.0 M, 2.5 - 4.5 M and 2.0 - 3.0 M. Two strains, *C. tenuissimum* EXF-1943 and *C. cladosporoides* EXF-1824, were able to grow at 2.0 or 2.1 M McCh and 1.7 M CoCh (Figure 2)

 $and 1.7 M CaCl_2 (Figure 2).$ 

Species of the basidiomycetous genus Wallemia Johan-Olsen can be found in a wide variety of 382 environments characterized by low aw (Samson et al., 2002; Zalar et al., 2005), such as dried, 383 salty and sweet foods like chocolate, indoor and outdoor air in urban and agricultural 384 environments, hypersaline water of the salterns on different continents and salt crystals (Zalar 385 et al., 2005). Two species of the genus Wallemia, W. muriae and W. ichthyophaga, are obligate 386 xerophiles with the a<sub>w</sub> growth ranges 0.984 - 0.805 and 0.959 - 0.771, respectively (Zalar et al., 387 2005), whereas W. sebi is xerotolerant with the ability to grow in media without additional 388 solutes (aw growth range: 0.997 - 0.690) (Pitt and Hocking, 1977). However, in media 389 supplemented with NaCl as the major solute, the lowest aw for the growth of W. sebi was 390 reported to be 0.80 (Zalar et al., 2005) corresponding to 4.5 M NaCl. W. muriae can grow up 391 392 to 4.3 M NaCl, while W. ichthyophaga can thrive only in media with NaCl above 1.7 M, has an optimum at 2.6 to 3.5 M NaCl and can grow up to saturating levels of NaCl (5.2 M) (Zalar et 393 al., 2005; Zajc et al., 2014). Here, we determined that strains of W. ichthyophaga grew well at 394 highest concentrations of NaCl (above 4.0 M), NaBr (4 M) and saturated KCl and MgSO<sub>4</sub>, but 395 show quite a variability when cultivated at different concentrations of chaotropes like MgCl<sub>2</sub> 396 397 and CaCl<sub>2</sub> (Table 2 and Figure 2). A type strain from the hypersaline waters of salterns (W. *ichthyophaga* EXF-994) grew also at the 2.1 M MgCl<sub>2</sub>, whereas it was not able to tolerate high 398 399 concentrations of calcium (not even 1 M CaCl<sub>2</sub>). W. ichthyophaga is indeed the most halophilic fungus ever described. Interestingly, its genome analysis showed that the life in extremely 400 saline environments is possible even with low number of cation-transporter genes, and seems 401 402 independent of their low transcription and non-responsiveness to variable salinity. In this case, the role of passive barriers against high salinity conditions seems crucial. The cell wall is 403 404 unusually thick, the cells are joined into thick multicellular clumps and the cell-wall proteins, 405 hydrophobins, are among the highly expressed genes in saline environments (Zajc et al., 2013).

The filamentous fungi of the order Eurotiales, comprised of teleomorphic genera Eurotium and 406 Emericella, and the anamorphic Aspergillus and Penicillium, are commonly found in different 407 salterns around the World (Cantrell et al., 2006; Butinar et al., 2011) as well as in the Dead Sea 408 (reviewed in Oren and Gunde-Cimerman, 2012). Tolerance for high salt concentrations has 409 been known for many food-borne species (Tresner and Hayes, 1971). The representatives of 410 411 Aspergillus and Penicillium are most abundant at salinities below 1.7 M NaCl in the solar salterns (Butinar et al., 2011); however, the in vitro determined salinity growth ranges of the 412 Eurotium spp. are broad, ranging from 0 up to 4.7 M (Butinar et al., 2005c). Given our results 413 414 the highest concentrations of salts in which species from the order Eurotiales are able to thrive are highly diverse, ranging from the lowest to highest concentrations tested depending on 415 individual strain (see Figure 2 for Eurotium repens EXF-2132). However, all strains were 416 capable to grow in concentrations higher than 3.0 M NaCl, 3.5 M KCl, 2.0 M MgSO<sub>4</sub>, 2.5 M 417 NaBr and even over 1.5 M MgCl<sub>2</sub> and 1.2 M CaCl<sub>2</sub> (except in one incident in the case of MgCl<sub>2</sub> 418 419 and CaCl<sub>2</sub>). Few halophilic Archaea can grow at high concentrations of MgCl<sub>2</sub>, but only in the presence of significant concentrations of NaCl (Mullakhanbhai and Larsen, 1975; Oren, 1983; 420 Oren et al., 1995). For instance, Haloferax volcanii is tolerant to high magnesium as growth is 421 still possible at 1.4 M Mg<sup>2+</sup> in the presence of 2 M Na<sup>+</sup> (Mullakhanbhai and Larsen, 1975). 422 Also, Halobaculum gomorrense is moderately tolerant to  $Mg^{2+}$  with optimal growth at 0.6 to 423 1.0 M Mg<sup>2+</sup> in the presence of 2.1 M NaCl (Oren et al., 1995). Another archaeon isolated from 424 the Dead Sea, Halobacterium sodomense, has an extremely high magnesium requirement. It 425 grows optimally even at 1.2 M MgCl<sub>2</sub> and 2.0 M NaCl and still grows, albeit poorly, at 1.8 M 426 MgC1<sub>2</sub> and 1.7 M NaCl and at 2.5 M MgC1<sub>2</sub> and 0.5 M NaCl (Oren, 1983). The upper 427

concentration of solely MgCl<sub>2</sub> still supporting life was suggested to be 2.3 M and it based on 428 the presence of specific mRNA indicators of active life, (Hallsworth et al., 2007). However, the 429 430 highest concentration of MgCl<sub>2</sub> (without compensating kosmotropes) showing microbial growth (after 18 months of cultivation) of deep-sea Discovery brine samples was 1.26 M 431 (Hallsworth et al., 2007). Given the fact that it was not uncommon for fungi to thrive at 432 433 concentrations of MgCl<sub>2</sub> higher than 1.5 M without compensating NaCl, it is clear that fungi are truly tolerant to magnesium. Some of these were able to grow at 2.1 M MgCl<sub>2</sub>, a 434 concentration that is close to the chaotropicity limit of possible life (2.3 M) (Hallsworth et al., 435 2007). 436

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Fungi from diverse environments (salterns, Dead Sea, ice, freshwater and other) can not only 438 tolerate but also thrive at high concentrations of salts, which are either kosmotropic like NaCl, 439 KCl and MgSO<sub>4</sub> or- to biological systems more toxic - chaotropic like NaBr, MgCl<sub>2</sub> and CaCl<sub>2</sub>. 440 A few representatives of various species, such as H. werneckii, E. amstelodami, E. chevalieri 441 and W. ichthyophaga were able to thrive in media with the highest tested salinities of all salts 442 (except in CaCl<sub>2</sub> in case of *W. ichthyophaga*). In addition, several fungi (Aureobasidium spp., 443 *Exophiala* spp.) exert a tendency towards kosmotropes, as they are able to grow at relatively 444 high concentrations of NaCl, KCl and MgSO<sub>4</sub>, but not at high concentrations of chaotropes, 445 like MgCl<sub>2</sub> and CaCl<sub>2</sub>. However, no fungal representatives showed the preference for the 446 highest concentrations of only chaotropic salts but not for the kosmotropic, *i.e.* being obligately 447 chaophilic. Nevertheless, our study revealed many representatives of the novel group of 448 chaophiles among fungi, which thrive well above the highest previously determined 449 concentration of MgCl<sub>2</sub>. The ability to grow in the presence of high concentrations of another 450 potent chaotrope - CaCl<sub>2</sub> was addressed for the first time. This expands our knowledge of 451 452 possible life performance under diverse and most extreme environmental parameters.

#### 453 **Conflict of interest**

- 454 The authors declare that they have no conflict of interests.
- 455

## 456 Acknowledgements

457 The authors acknowledge financial support from the state budget through the Slovenian Research Agency (Infrastructural Centre Mycosmo, MRIC UL, and Young Researcher Grant 458 to JZ). The study was also partly financed via the operation "Centre of excellence for integrated 459 approaches in chemistry and biology of proteins" number OP13.1.1.2.02.0005, financed by 460 European Regional Development Fund (85% share of financing) and by the Slovenian Ministry 461 of Higher Education, Science and Technology (15% share of financing). The authors (SD and 462 DK) would like to acknowledge the support of the European Commission through the project 463 MAESTRA - Learning from Massive, Incompletely annotated, and Structured Data (Grant 464 number ICT-2013-612944). The authors thank also to Mojca Šere for the highly appreciated 465 technical assistance. The authors declare that they have no conflict of interests. 466

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646

Strain accession no.	Genus	species	Habitat	The	nighest co	ncentration growtl	n of salt h (M)	with obs	Type of salt with the lowest a <sub>w</sub> supporting	The lowest a <sub>w</sub> supporting growth	
				NaCl	KCl	MgCl <sub>2</sub>	CaCl <sub>2</sub>	NaBr	MgSO <sub>4</sub>	growth	(value)
EXF-2277	Acremonium	strictum	salterns	2	3	0.75	0.5	2	3	KCl	0.885
EXF-174	Alternaria	alternata	salterns	3	3	0.75	1.2	2.5	1.5	NaCl	0.884
EXF-2340	Alternaria	arborescens	salterns	2	3	1.5	1	2	3	KCl	0.885
EXF-2332	Alternaria	infectoria	salterns	2	2.5	1.5	1.2	2.5	3	MgSO <sub>4</sub>	0.886
EXF-1730	Alternaria	sp.	Dead Sea	2.5	3	0.75	1.2	2	2	KCl	0.885
EXF-2318	Alternaria	tenuissima	salterns	3	3	1.5	1.2	2	3	NaCl	0.884
EXF-5007	Aspergillus	caespitosus	salterns	4	4.5	1.9	1.5	3	3	NaCl	0.825
EXF-6616	Aspergillus	candidus	salterns	4	4.5	1.5	1.2	3.5	2.5	NaCl	0.825
EXF-6615	Aspergillus	flavipes	salterns	3.5	4.5	1.5	2	3	2.5	CaCl <sub>2</sub>	0.830
EXF-1751	Aspergillus	flavus	Dead Sea	3	4	1.6	1.5	2.5	3	KCl	0.849
EXF-1760	Aspergillus	niger	Dead Sea	3.5	4	1.5	1.5	3	3	KCl	0.849
EXF-5077	Aspergillus	ochraceus	salterns	4	4.5	1.7	1.7	3.5	3	NaCl	0.825
EXF-138 (226)	Aspergillus	penicillioides	salterns	3.5	3.5	1.5	1.5	2.5	2	NaCl	0.854
EXF-1946	Aspergillus	proliferans	Dead Sea	4	4.5	2.1	1.9	3	3	MgCl <sub>2</sub>	0.808
EXF-1752	Aspergillus	sclerotiorum	Dead Sea	4	4.5	1.9	1.7	3.5	3	NaCl	0.825
EXF-1847	Aspergillus	sydowii	Dead Sea	4	3.5	1.9	2	4	3	NaBr	0.803
EXF-5006	Aspergillus	tubingiensis	salterns	4	4	1.9	1.7	2.5	3	NaCl	0.825
EXF-189	Aspergillus	ustus	salterns	4	4	2	1.2	3	3	MgCl <sub>2</sub>	0.822
EXF-4284	Aspergillus	versicolor	salterns	4	4.5	1.5	1.7	3.5	2.5	NaCl	0.825
EXF-4303	Aspergillus	wentii	various	3.5	4	0.75	1.5	3	2	KCl	0.849
EXF-3400	Aureobasidium	melanogenum	freshwater	3	3	1.5	1.2	3	2	NaBr	0.861
EXF-8429	Aureobasidium	melanogenum	freshwater	2.5	3.5	1.5	1	2	2	KCl	0.867
EXF-3382	Aureobasidium	melanogenum	salterns	3	3.5	1.7	1.5	3	3	NaBr	0.861
EXF-3405	Aureobasidium	melanogenum	various	2.5	4	0.75	0.5	2	2	KCl	0.849
EXF-3398	Aureobasidium	namibiae	various	2.5	3	0.75	1.2	2	2	KCl	0.885

 Table 1. The highest concentrations of various salt for a list of fungi.

EXF-150	Aureobasidium	pullulans	salterns	3	4	0.75	1.2	2	3	KCl	0.849
EXF-2481	Aureobasidium	subglaciale	ice	2	2	0.75	1.2	1.5	2	KCl	0.922
EXF-1830	Bjerkandera	sp.	Dead Sea	1.5	3	0.75	0.5	0.75	1.5	KCl	0.885
EXF-6603	Candida	glabrata	various	2	2.5	0.75	0.5	1.5	2	KCl	0.903
EXF-1987	Candida	parapsilosis	Dead Sea	3.5	4	1.6	1.7	3	2.5	KCl	0.849
EXF-517	Candida	parapsilosis	salterns	3	3.5	1.7	1.2	3	3	NaBr	0.861
EXF-1574	Candida	parapsilosis	ice	3	4	1.7	1.2	3	3	KCl	0.849
EXF-253	Chaetomium	globosum	salterns	2	2.5	0.75	1	0.75	1.5	KCl	0.903
EXF-1060	Cladosporium	aff. herbarum	Dead Sea	4	4.5	1.5	1.5	3	3	NaCl	0.825
EXF-2036	Cladosporium	aff. herbarum	Dead Sea	3	4	1.7	0.5	2.5	2.5	KCl	0.849
EXF-1930	Cladosporium	aff. inversicolor	Dead Sea	2.5	2.5	0.75	1.2	4	1.5	NaBr	0.803
EXF-2034	Cladosporium	aff. sphaerospermum	Dead Sea	4	4.5	1.5	1.7	3	3	NaCl	0.825
EXF-1728	Cladosporium	cladosporioides	Dead Sea	4	3.5	0.75	1	2.5	3	NaCl	0.825
EXF-1071	Cladosporium	cladosporoides	Dead Sea	3.5	4	1.9	1.7	3.5	3	NaBr	0.832
EXF-1824	Cladosporium	cladosporoides	Dead Sea	4	4.5	2	1.7	3	3	MgCl <sub>2</sub>	0.822
EXF-1081	Cladosporium	halotolerans	Dead Sea	4	4.5	1.5	1.7	3	3	NaCl	0.825
EXF-2513	Cladosporium	halotolerans	ice	3.5	4.5	1.8	1.5	3.5	3	KCl	0.831
EXF-572	Cladosporium	halotolerans	salterns	3	4	1.5	1.2	2.5	3	KCl	0.849
EXF-1066	Cladosporium	herbarum	Dead Sea	4	4.5	1.5	1.7	3	2.5	NaCl	0.825
EXF-1000	Cladosporium	langeronii	various	2.5	3.5	0.75	1	3	3	NaBr	0.861
EXF-2287	Cladosporium	macrocarpum	salterns	2.5	3.5	0.75	1.2	4	2.5	NaBr	0.803
EXF-1736	Cladosporium	ramotenellum	Dead Sea	3.5	4.5	0.75	1.7	3	2	KCl	0.831
EXF-335	Cladosporium	salinae	salterns	3	4.5	1.8	1	2.5	3	KCl	0.831
EXF-1079	Cladosporium	sp.	Dead Sea	4	4.5	1.5	1.7	3	2.5	NaCl	0.825
EXF-1741	Cladosporium	sp.	Dead Sea	2.5	4	1.5	1.5	3	2	KCl	0.849
EXF-2012	Cladosporium	sp.	Dead Sea	3.5	4	1.5	1.5	3	3	KCl	0.849
EXF-2015	Cladosporium	sp.	Dead Sea	3.5	4.5	1.5	1.7	3	2	KCl	0.831
EXF-2016	Cladosporium	sp.	Dead Sea	3.5	4	1.5	1.5	3	2.5	KCl	0.849
EXF-2038	Cladosporium	sp.	Dead Sea	4	4	1.5	1.2	3	2.5	KCl	0.825

EXF-2040	Cladosporium	sp.	Dead Sea	2.5	3	0.75	0.5	2	2	KCl	0.885
EXF-1986	Cladosporium	sp.	Dead Sea	2.5	3	0.75	1	1.5	2	KCl	0.885
EXF-1997	Cladosporium	sp.	Dead Sea	3.5	4.5	1.7	1.7	3	2.5	KCl	0.831
EXF-7632	Cladosporium	sp.	salterns	4	4	1.8	1.7	3	3	NaCl	0.825
EXF-7634	Cladosporium	sp.	salterns	4	4	1.8	1.5	3	3	NaCl	0.825
EXF-7635	Cladosporium	sp.	salterns	4	4	1.8	1.5	3	3	NaCl	0.825
EXF-2037	Cladosporium	sphaerospermum	Dead Sea	4	4.5	1.5	1.5	3	2.5	NaCl	0.825
EXF-1735	Cladosporium	tenellum	Dead Sea	3.5	3.5	0.75	0.5	2.5	2.5	NaCl	0.854
EXF-1943	Cladosporium	ttenuissimum	Dead Sea	3.5	4.5	2.1	1.7	2.5	3	$MgCl_2$	0.808
EXF-6893	Cryptococcus	albidus	various	3.5	3.5	1.5	1	1.5	3	NaCl	0.854
EXF-2008	Cryptococcus	albidus var. kuetzingii	Dead Sea	3.5	3.5	1.5	1.2	2.5	2.5	NaCl	0.854
EXF-8012	Cryptococcus	diffluens	freshwater	2.5	2.5	1.5	1	1.5	3	MgSO <sub>4</sub>	0.886
EXF-3360	Cryptococcus	magnus	ice	1.5	2.5	1.5	1.2	1.5	3	MgSO <sub>4</sub>	0.886
EXF-3792	Cryptococcus	victoriae	salterns	2.5	2.5	1.5	1	2	3	MgSO <sub>4</sub>	0.886
EXF-1928	Emericella	purpurea	Dead Sea	4	4.5	2.1	1.9	3.5	3	MgSO <sub>4</sub>	0.808
EXF-1929	Emericella	purpurea	Dead Sea	3	4	1.5	1	3	2.5	KCl	0.849
EXF-1840	Eurotium	amstelodami	Dead Sea	4	4.5	1.9	1.5	2.5	3	NaCl	0.825
EXF-5620	Eurotium	chevalieri	various	4	4.5	2.1	1.9	4	3	NaBr	0.803
EXF-1453	Eurotium	herbariorum	salterns	4	4.5	1.9	1.7	3.5	3	NaCl	0.825
EXF-2132	Eurotium	repens	Dead Sea	4	4	2.1	1.5	2.5	2.5	MgCl <sub>2</sub>	0.808
EXF-441	Eurotium	rubrum	salterns	4	4	1.9	1.7	3.5	2.5	NaCl	0.825
EXF-5573	Exophiala	dermatitidis	freshwater	2.5	2.5	0.75	0.5	0.75	3	MgSO <sub>4</sub>	0.886
EXF-2060	Exophiala	oligosperma	ice	3	3	1.5	1.2	2.5	3	NaCl	0.884
EXF-5575	Exophiala	phaeomuriformis	freshwater	2.5	2	0.75	1	1.5	3	MgSO <sub>4</sub>	0.886
EXF-4024	Exophiala	xenobiotica	ice	1.5	1.5	1.8	1.7	1.5	3	MgSO <sub>4</sub>	0.886
EXF-2275	Fusarium	aff. equiseti	salterns	2	2.5	1.5	1.5	2	3	MgSO <sub>4</sub>	0.886
EXF-2254	Fusarium	graminearum	salterns	2	2.5	1.5	1.2	1.5	3	MgSO <sub>4</sub>	0.886
EXF-132	Hortaea	werneckii	various	5	4.5	2.1	1.2	4	3	NaCl	0.766

EXF-2682	Hortaea	werneckii	various	5	4.5	1.9	1.5	4	3	NaCl	0.766
EXF-6651	Hortaea	werneckii	various	5	4.5	2.1	1.7	4	3	NaCl	0.766
EXF-225 (2000)	Hortaea	werneckii	salterns	4	4	2	1.7	4	3	NaBr	0.803
EXF-6602	Meyerozyma	guilermondii	various	4	4	1.5	0.5	2.5	2	NaCl	0.825
EXF-519	Meyerozyma	guilliermondii	salterns	3	4	1.5	1.7	2.5	2.5	KCl	0.849
EXF-2006	Meyerozyma	guilliermondii	Dead Sea	3.5	3.5	1.5	1.2	2.5	2.5	NaCl	0.854
EXF-518	Meyerozyma	guilliermondii	salterns	3	3.5	1.7	1.2	2.5	3	KCl	0.867
EXF-224	Paecilomyces	farinosus	various	2	3.5	0.75	0.5	1.5	1.5	KCl	0.867
EXF-4108	Penicillium	antarcticum	ice	3.5	4.5	1.5	1.5	3.5	2.5	KCl	0.831
EXF-6614	Penicillium	brevicompactum	salterns	4	4.5	1.5	1.5	3	2	NaCl	0.825
EXF-1774	Penicillium	chrysogenum	Dead Sea	4	4.5	1.9	1.7	3.5	3	NaCl	0.825
EXF-3655	Penicillium	comunae	ice	4	4	2.1	1.2	2.5	3	MgCl <sub>2</sub>	0.808
EXF-1778	Penicillium	corylophylum	Dead Sea	3.5	4	1.8	1.5	3	3	KCl	0.849
EXF-1788	Penicillium	crustosum	Dead Sea	4	4.5	1.5	1.2	3	2.5	NaCl	0.825
EXF-1781	Penicillium	glabrum	Dead Sea	4	4	1.7	1.9	3	2.5	NaCl	0.825
EXF-6613	Penicillium	nordicum	salterns	4	4	1.5	1.2	3	2.5	NaCl	0.825
EXF-3675	Penicillum	palitans	ice	4	3.5	1.6	1	2.5	2.5	NaCl	0.825
EXF-1822	Penicillium	stecki	Dead Sea	4	4.5	1.9	1.9	3.5	3	NaCl	0.825
EXF-3663	Phaeococcomyces	sp.	ice	2	3	0.75	1.2	0.75	1.5	KCl	0.885
EXF-6160	Phaeococcomyces	sp.	various	2	1.5	0.75	1	2	1.5	NaBr	0.919
EXF-206	Phaeotheca	triangularis	salterns	3.5	4	1.9	1.9	4	2.5	NaBr	0.803
EXF-657	Phoma	leveillei	various	4	4.5	1.5	1.2	2.5	2	NaCl	0.825
EXF-513	Rhodosporidium	babjevae	salterns	3.5	2.5	1.5	1.2	2.5	3	NaCl	0.854
EXF-3361	Rhodosporidium	iobovatum	ice	3	3	1.5	1.5	2	3	NaCl	0.884
EXF-6425	Rhodotorula	glutinis	various	2	2	1.5	1	1.5	3	MgSO <sub>4</sub>	0.886
EXF-1450	Rhodotorula	laryngis	Dead Sea	1.5	1.5	0.75	1.5	3.5	1.5	NaBr	0.832
EXF-3871	Rhodotorula	mucilaginosa	ice	2.5	2.5	0.75	1.2	2	3	MgSO <sub>4</sub>	0.886
EXF-5543	Rhodotorula	mucilaginosa	freshwater	2.5	2.5	0.75	1.2	2	3	MgSO <sub>4</sub>	0.886
EXF-6896	Rhodotorula	mucilaginosa	various	1.5	4	1.5	1.2	0.75	3	KCl	0.849

EXF-1630	Rhodotorula	mucilaginosa	ice	2.5	3	0.75	1.2	2	3	KCl	0.885
EXF-3527	Stachybotrys	atra	various	2	3	0.75	1	1.5	1.5	KCl	0.885
EXF-1811	Stereum	gausapatum	Dead Sea	1.5	1.5	0.75	0.5	0.75	1.5	nd	nd
EXF-1806	Trametes	versicolor	Dead Sea	1.5	1.5	0.75	1	0.75	1.5	CaCl <sub>2</sub>	0.952
EXF-1742	Trichoderma	aff. atroviride	Dead Sea	1.5	3.5	1.5	1.2	0.75	1.5	KCl	0.867
EXF-1444	Trichosporon	mucoides	salterns	3	2.5	1.5	1	2	1.5	NaCl	0.884
EXF-1447	Trichosporon	mucoides	Dead Sea	4	3.5	2	1.5	3.5	3	MgCl <sub>2</sub>	0.822
EXF-295	Trimmatostroma	salinum	salterns	4	4	1.7	1	3.5	3	NaCl	0.825
EXF-1835	Ulocladium	tuberculatum	Dead Sea	3.5	4	2	1.2	3	3	MgCl <sub>2</sub>	0.822
EXF-5753	Wallemia	hederae	various	5	4.5	1.8	1	4	2.5	NaCl	0.766
EXF-1059	Wallemia	ichthyophaga	various	5	4.5	1.9	1	4	3	NaCl	0.766
EXF-5676	Wallemia	ichthyophaga	various	5	4.5	2	1.2	4	3	NaCl	0.766
EXF-6069	Wallemia	ichthyophaga	salterns	3.5	4	1.9	0.5	2	2	MgCl <sub>2</sub>	0.836
EXF-6070	Wallemia	ichthyophaga	salterns	4	4.5	1.9	0.5	3	3	NaCl	0.825
EXF-8617	Wallemia	ichthyophaga	various	4	4.5	2	1	4	3	NaBr	0.803
EXF-6068	Wallemia	ichthyophaga	salterns	4	4.5	1.9	0.5	2	3	NaCl	0.825
EXF-994	Wallemia	ichthyophaga	salterns	5	4.5	2.1	0.5	4	3	NaCl	0.766
EXF-753	Wallemia	muriae	various	4	4.5	1.9	1.2	1.5	2.5	NaCl	0.825
EXF-2361	Wallemia	muriae	various	4	4.5	1.9	1.2	1.5	3	NaCl	0.825
EXF-8359	Wallemia	muriae	salterns	3.5	4.5	1.9	1.2	2.5	2.5	KCl	0.831
EXF-951	Wallemia	muriae	salterns	4	4.5	1.9	0.5	4	3	NaBr	0.803
EXF-956	Wallemia	sebi	various	4	4.5	1.9	1.5	1.5	2.5	NaCl	0.825
EXF-2298	Wallemia	sebi	salterns	4	4.5	1.5	1.2	2.5	2.5	NaCl	0.825
EXF-9116	Xeromyces	bisporus (T)	various	2.5	3.5	1.6	1	2.5	2.5	KCl	0.867

#### **Figure legends**

Figure 1. Visualization of the decision tree of fungal species obtained by machine learning tool CLUS when using (A) the highest concentrations of various salt (NaCl, KCl, MgCl<sub>2</sub>, CaCl<sub>2</sub> NaBr and MgSO<sub>4</sub>); (B) pigmentation (melanized, non-melanized), morphology (yeast, filamentous, polymorphic, clumps) and the highest concentrations of various salt (NaCl, KCl, MgCl<sub>2</sub>, CaCl<sub>2</sub> NaBr and MgSO<sub>4</sub>); and (C) when using all the descriptive variables as follows the highest concentrations of various salt (NaCl, KCl, MgCl<sub>2</sub>, CaCl<sub>2</sub> NaBr and MgSO<sub>4</sub>), habitat (salterns, Dead Sea, freshwater, various: ice, human associated, animal associated, food), pigmentation (melanized, non-melanized), morphology (yeast, filamentous, polymorphic, clumps) and the lowest aw (type of salt and value) with observable growth. The target variable was the fungal species (leaves of the decision tree). The number in the brackets defines the number of strains for model (A), (B) or (C).Figure 2. Micromorphological characteristics of liquid culture of four strains, namely Wallemia ichthyophaga (EXF-994), Hortaea werneckii (EXF-225), Eurotium repens (EXF-2132) and *Cladosporium cladosporoides* (EXF-1824) grown in malt extract medium without salt (control condition) and at their highest concentrations of salt that allow growth at 24 °C. Concentrations of various salts are indicated. The scalebar represent 20 μm.

Supplementary figure S1. Visualization of the decision tree of fungal species obtained by machine learning tool CLUS when using (A) habitat (salterns, the Dead Sea, food, freshwater, ice, human, or animal) and the highest concentrations of various salts (NaCl, KCl, MgCl<sub>2</sub>, CaCl<sub>2</sub> NaBr and MgSO<sub>4</sub>); (B) habitat, the lowest a<sub>w</sub> (type of salt), the lowest a<sub>w</sub> (value) and the highest concentrations of various salts; (C) habitat, the lowest a<sub>w</sub> (type of salt) and the lowest a<sub>w</sub> (value). The target variable was the fungal species (leaves of the decision tree). The number in the brackets defines the number of strains for model (A), (B) or (C).







Pigmentation = non - melanized



