1	Multiscale heterogeneity in filamentous microbes
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13	Abstract
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15	Microbial cells within clonal populations can display different morphologies or carry out
16	different tasks. This heterogeneity is beneficial at the population level and allows microbes to
17	spread risk or separate incompatible activities. Heterogeneity is also evident in filamentous
18	bacteria and fungi, which form mycelial networks consisting of interconnected hyphae. Here,
19	heterogeneity is observed between clonal mycelial particles, between different zones of
20	colonies, between adjacent hyphae and even between adjacent compartments of individual
21	hyphae. In this review, we compare this multiscale heterogeneity in filamentous bacteria and
22	fungi and discuss the underlying mechanisms. These mechanisms might provide targets to
23	improve the exploitability of these organisms as cell factories in the biotech sector.

25 **1. Introduction** 

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One of the assumptions in microbiology was that cells in a monoclonal microbial population 27 28 would be phenotypically indistinguishable when provided with a constant environment. Over the last two decades, however, the development of high-throughput analytical techniques has 29 enabled microbiologists to study large numbers of cells at the individual level (Binder et al., 30 2017; Brehm-Stecher and Johnson, 2004; Davis and Isberg, 2016) and to unambiguously 31 32 demonstrate that processes such as metabolism, transcription, translation and protein secretion are heterogeneous in space and time across cells (Ackermann, 2015; Avery, 2006; 33 34 Smits et al., 2006; van Boxtel et al., 2017; Veening et al., 2008b; Wösten et al., 2013). Examples of these heterogeneities have been documented in a wide range of microorganisms, 35 including some of the best-characterized prokaryotic and eukaryotic model organisms (e.g. 36 Escherichia coli, Bacillus subtilis and Saccharomyces cerevisiae, amongst others) (Chastanet 37 et al., 2010; Elowitz et al., 2002; Levy et al., 2012; Maamar et al., 2007). While heterogeneity 38 has been mostly addressed in unicellular microbes, it is also evident in multicellular species. 39 40 In this review, we will focus on heterogeneities in filamentous microorganisms that are employed as cell factories in the industrial sector. We will discuss the consequences 41 (disadvantages and benefits) of these heterogeneities and the mechanisms through which 42 these are established. 43

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## 45 **2.** The consequences of phenotypic heterogeneity

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Phenotypic heterogeneity allows microbes to withstand environmental fluctuations and carry out specialized functions at the level of single cells. In their natural habitats, microbes are confronted with rapidly changing environmental conditions. The best-known mechanism to withstand such changes is to modulate gene expression (Jacob and Monod, 1961). Changes in gene expression can lead to profound phenotypic changes, including cellular differentiation. Many microbes, however, ensure that a number of cells within a clonal population already possess certain defensive traits, even when the corresponding environmental stimulus is not present (Philippi and Seger, 1989). As a consequence of this strategy, commonly referred to as bet-hedging, only a fraction of the cells will pay the cost (e.g. reduced metabolic proficiency) associated with the expression of those genes conferring potentially useful features. Should the environmental conditions become adverse and change in their favor, these cells would already be equipped to withstand the altered conditions and are therefore more likely to survive. This behavior is beneficial to the entire population (Grimbergen et al., 2015).

60 Bet-hedging and phenotypic heterogeneity have been extensively studied in Bacillus subtilis. This Gram-positive bacterium forms endospores when exposed to stress conditions 61 (e.g. starvation or the presence of toxins) (Errington, 2003; Higgins and Dworkin, 2012). These 62 spores are metabolically dormant and highly resistant to extreme temperatures, desiccation 63 64 and ionizing radiation. When environmental conditions suitable for growth are restored, spores germinate to establish colonies of vegetative cells. A bet-hedging control of sporulation has 65 two main advantages. On the one hand, it assures that not all cells commit themselves to 66 sporulation, which is notoriously a lengthy and irreversible process (Chastanet et al., 2010; 67 68 Russell et al., 2017). In this way, when only a fraction of the cells sporulates, the nonsporulating ones can quickly reinitiate growth in case the stress condition turns out to be 69 transient, hence preventing the population from becoming outnumbered by competitors. On 70 71 the other hand, since environmental changes are sometimes too harmful for the sporulation 72 process to complete, the stochastic initiation of sporulation ensures that some cells undergo 73 sporulation even in the absence of adverse conditions (Siebring et al., 2014; Veening et al., 2008c). 74

Another canonical example of the benefits of microbial individuality is that of bacterial persistence. A fraction of *Escherichia coli* cells forms metabolically dormant persister cells that are able to withstand various environmental insults, such as the prolonged exposure to antibiotics (Balaban et al., 2004), and to resume growth when the original conditions are restored (Fig. 1). Sub-populations of non-growing persisters that survive exposure to antibiotics have also been reported in *Salmonella* (Claudi et al., 2014; Helaine et al., 2014)

and *Mycobacterium* (Manina et al., 2015). The appearance of persisters can also occur when 81 82 cells are not challenged by antimicrobials (Balaban et al., 2004), although stressful conditions can enhance their abundance within a population (Dörr et al., 2010; Johnson and Levin, 2013; 83 Mulcahy et al., 2010). A similar strategy has been reported in Saccharomyces cerevisiae. 84 Within clonal populations of this yeast, certain individuals are characterized by lower growth 85 rates and concomitantly possess higher resistance to heat shock due to the accumulation of 86 the protecting disaccharide trehalose (Levy et al., 2012). Notably, experimentally tuning growth 87 88 rates of S. cerevisiae using chemostat cultures has highlighted that many of the genes 89 activated upon heat stress are also active under conditions of slow growth, which is again substantiated by the observation that cells that grow slowly are more resistant to heat stress 90 91 (Lu et al., 2009).

92 Recent studies have shown that bet-hedging strategies culminating in phenotypic 93 heterogeneity also become evident when microbial cells are exposed to fluctuating nutritional regimes (Kotte et al., 2014; Solopova et al., 2014; van Heerden et al., 2014). This is no surprise 94 when considering the rapidly changing nutritional conditions that microbial cells endure in their 95 96 natural environments. When exposed to mixtures of carbon source, microbes typically consume them in a sequential manner. As a consequence, distinct growth phases are 97 observed that are separated by a lag phase. During this phase, cells are believed to undergo 98 99 the physiological adaptations needed for the uptake and consumption of the second carbon 100 source. This behavior is known as diauxie (Monod, 1949). The diauxic shift in Lactococcus 101 lactis is explained by the fact that only a limited number of cells is able to metabolize the second carbon source. Interestingly, these cells emerge when the preferred carbon source is still 102 present (Solopova et al., 2014). The decision to commit to the metabolism of the less preferred 103 104 source depends on the metabolic state of the cell prior to the depletion of the preferred carbon source, while the number of cells enacting the shift is inversely proportional to the abundance 105 106 of the first carbon source. This mechanism provides an alternative explanation for the decades-107 old concept of metabolic adaptation during diauxic shifts, which may also be relevant for other 108 lag phases observed in microbiology.

While bet-hedging is beneficial in unpredictable and fluctuating environments, 109 phenotypical heterogeneity can also be advantageous in non-fluctuating conditions, for 110 instance when different processes have to be carried out simultaneously within a clonal 111 112 population. This so-called division of labor is characterized by the coexistence of subpopulations of cells specialized in performing complementary tasks (van Gestel et al., 113 2015a, b; Zhang et al., 2016). Under nutrient-limiting conditions, B. subtilis secretes subtilisin 114 E, which degrades proteins into small peptides that are accessible to all community members 115 116 (Veening et al., 2008a). Single-cell measurements have revealed that only a minority of cells produce and secrete this protease, indicating that only a few members of the clonal population 117 pay the cost associated with its production. It is not yet clear whether this strategy represents 118 a form of pure altruism whereby the producing cells pay the production-associated costs for 119 120 the benefit of the entire population, or whether it represents a cooperative behavior in that both the producer and the recipient cells mutually benefit from each other. Numerous are the other 121 reported examples where some cells pay the cost for the benefit of the entire population; these 122 include Salmonella enterica (Arnoldini et al., 2014; Diard et al., 2013), Myxococcus xanthus 123 124 (Velicer et al., 2000), and certain protozoans (Strassmann et al., 2000). M. xanthus represents perhaps the most spectacular example of the commitment of subsets of cells within a given 125 population to a specific function. In the presence of excess nutrients, M. xanthus establishes 126 a motile group of cells called a swarm. The swarm explores the environment to forage for 127 128 nutrients or predate on other bacteria (Reichenbach, 1999). Upon starvation, growth is 129 arrested, and a developmental program is initiated that culminates in the formation of sporebearing fruiting bodies. Three distinct subpopulations of cells contribute to the formation of 130 fruiting bodies. While only 10% of cells differentiate into spores, roughly 30% form peripheral 131 132 rods on the outer surface of the fruiting body, while the remaining fraction undergoes programmed cell lysis (Nariya and Inouye, 2008; O'Connor and Zusman, 1991; Wireman and 133 Dworkin, 1977). The fact that such a major fraction of the population undergoes PCD is a 134 remarkable example of social behavior, with the lysing cells providing nutrients and energy for 135

sporulation to complete and in turn ensure the propagation of their genome (Berleman et al.,2006; Wireman and Dworkin, 1977).

In some microorganisms, division of labor is employed as a strategy to perform 138 139 incompatible metabolic processes (de Lorenzo et al., 2015; Johnson et al., 2012; Levine et al., 2013). The best-known example of this strategy is the spatial segregation of nitrogen fixation 140 and photosynthesis in cyanobacteria (Mitsui et al., 1986) (Fig. 1). The nitrogenase enzyme 141 required for nitrogen fixation is sensitive to oxygen, the product of photosynthesis. For this 142 143 reason, some cyanobacteria generate specialized cells called heterocysts, which are specialized in nitrogen fixation while lacking the oxygenic photosystem (Adams, 2000). 144 Heterocysts also have a different cell wall composition that contributes to the exclusion of 145 oxygen to protect the nitrogenase enzyme (Kumar et al., 2010). On the other hand, non-146 heterocystous cyanobacteria separate photosynthesis and nitrogen fixation by temporally 147 segregating the two incompatible processes (Berman-Frank et al., 2001). 148

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## **3.** Mechanisms underlying individuality in unicellular microbes

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When compared to higher multicellular eukaryotes, the regulation of gene expression in 152 microorganisms (especially in prokaryotes) appears to be controlled by only a handful of 153 mechanisms. As a consequence, one would expect any given gene to be expressed at a 154 155 similar level in isogenic microbial cells exposed to the same environmental conditions. 156 However, it is well accepted that bacterial gene expression is subject to intrinsic noise. In a pioneering study that paved the road for the nascent field of microbial heterogeneity, cells of 157 E. coli were engineered to express two distinguishable fluorescent proteins under control of 158 159 the same promoter. Major differences in the expression of these reporters were detected both within and between cells, indicating that gene expression is subject to intrinsic fluctuations 160 (Elowitz et al., 2002). It is interesting to note that the level of transcription negatively correlates 161 with the heterogeneity in fluorescence emission, indicating that intrinsic noise is more 162 163 pronounced at low transcriptional levels. Extensive work has shown that a considerable degree

of heterogeneity between microbial cells originates from the fact that transcription and 164 translation occur in so called pulses or "bursts" (Blake et al., 2003; Cai et al., 2006; Golding et 165 al., 2005; Ozbudak et al., 2002). Since these stochastic pulses are asynchronous between 166 167 cells, distinct subpopulations can evolve and coexist. A number of studies on B. subtilis have shown how pulsating genetic circuits control processes such as the development of 168 competence, the onset of sporulation, and the response to environmental stresses (Levine et 169 al., 2012; Locke et al., 2011; Süel et al., 2007; Young et al., 2013). Notably, single cell 170 171 measurements in both prokaryotic and eukaryotic microbes have revealed disparities in the degree of transcriptional noise between different genes within a single cell. These disparities 172 are seemingly not arbitrary, as the transcription of housekeeping genes is generally less noisy 173 than that of genes associated with stress or dispensable metabolic functions (Newman et al., 174 2006; Silander et al., 2012; Taniguchi et al., 2010). 175

Phenotypic heterogeneity between cells can also originate from transcriptional 176 differences caused by cellular processes. Several studies have shown that physiological 177 factors such as growth rate and cell cycle stage can substantially influence gene expression 178 179 (Berthoumieux et al., 2013; Slavov and Botstein, 2013). Single-cell studies have recently shed light on the importance of the feedback of growth in causing heterogeneity. For example, 180 fluctuations in the expression of metabolic genes can lead to fluctuations in the growth rate of 181 individual cells, which in turn not only perturb the expression of other metabolic genes, but also 182 183 of unrelated gene networks (Kiviet et al., 2014; Klumpp and Hwa, 2014; Tan et al., 2009). 184 Deterministic choices can also be a source of cell-to-cell heterogeneity. For example, metal ion scarcity leads to a growth arrest in newborn daughter cells of S. cerevisiae (i.e. cells which 185 have not budded yet). As a consequence, two populations of cells emerge: older dividing cells 186 187 and younger non-dividing cells (Avraham et al., 2013). This is explained by the fact that the vacuole, which is the reservoir for metals, is not propagated to daughter cells, while it is 188 maintained in the mother cells which keep dividing. This strategy results in higher fitness under 189 zinc-limiting conditions than in a mutant strain where vacuole segregation occurs 190

homogeneously. In the latter case, zinc is diluted in fact to an extent that eventually impedescellular division.

The generation of phenotypic heterogeneity and multi-stability have also been the 193 194 subject for numerous mathematical models. Such models are important for better understanding the principles behind bet-hedging and provide predictive value that can be 195 tested experimentally. Recent models include the stochastic nature of cellular processes and 196 provide a powerful framework for understanding phenotypic switching between different 197 198 cellular states. We here wish to refer to some excellent papers for readers interested to learn more about this aspect (see e.g. Henson, 2003; Jia et al., 2014; Meister et al., 2014; Wilkinson, 199 200 2009, and references therein).

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### 202 4. Heterogeneity in filamentous organisms

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204 The features of phenotypic heterogeneity discussed in the previous sections relate to unicellular microorganisms, the cells of which are, at least under most conditions, spatially 205 206 separated from one-another. In contrast, many multicellular microbes such as filamentous actinomycetes and fungi grow by means of interconnected filaments that only physically 207 separate into unicellular propagules during the reproductive phase (Claessen et al., 2014). 208 From a morphological perspective, the mode of growth of filamentous actinomycetes is similar 209 210 to that of filamentous fungi. This is the reason why, despite bearing the structural features of 211 bacteria, actinomycetes were originally believed to be fungi (Goodfellow et al., 1983). In contrast to most unicellular organisms, filamentous fungi and actinomycetes possess a 212 complex life cycle characterized by distinct developmental stages and the co-existence of 213 214 different specialized cells. Both kinds of microorganisms propagate via spores, dormant cells equipped to withstand harsh environmental conditions (Barka et al., 2016; Walker and White, 215 2005). Spores germinate under favorable conditions, leading to germ tubes that elongate to 216 form thread-like cells called hyphae. Hyphae of filamentous fungi and actinomycetes have a 217 diameter of about 2-10 µm and 0.5-2 µm, respectively. They elongate at their tip (or apex), 218

while new hyphae emerge subapically by branching (Flärdh, 2010; Riquelme, 2013). The 219 220 combination of apical growth and branching yields an interwoven cellular network called a 221 mycelium. The growing vegetative mycelium (also called substrate mycelium) colonizes the 222 environment by radiating leading hyphae from peripheral regions of the colony. The encountered polymeric substrates are degraded by means of secreted hydrolytic enzymes and 223 the degradation products are internalized by the cells to serve as nutrients (Barka et al., 2016). 224 When nutrients become scarce, colonies of filamentous microbes develop into complex 225 226 multicellular consortia of different cell types (Chater, 1998; Krijgsheld et al., 2013a; Kues and Liu, 2000). For instance, while the peripheral regions of *Streptomyces* colonies proceed with 227 vegetative growth, more central and non-growing parts of the colony undergo an ordered 228 process of chemical and morphological differentiation (Borkovich and Ebbole, 2010; Manteca 229 et al., 2005a). Such chemical differentiation is responsible for the production of various 230 secondary metabolites, many of which are exploited for commercial use (Barka et al., 2016; 231 Bérdy, 2005; Hopwood, 2007) (see below). Coinciding with this chemical differentiation, 232 specialized aerial hyphae emerge on the colony surface. The aerial hyphae of actinomycetes 233 234 differentiate into chains of unigenomic spores, while those of fungi form more elaborate asexual (e.g. condidiophores) or sexual reproductive structures (e.g. mushrooms). 235

When grown in close proximity to certain yeasts (e.g. S. cerevisiae) or when faced with 236 conditions of nutrient scarcity, some streptomycetes (i.e. the best-studied and industrially the 237 238 most relevant representatives of the actinomycetes) form so-called "exploring" cells. These 239 cells can travel over nutrient-void abiotic surfaces and promote the spreading of colonies over large surfaces (Jones et al., 2017). Despite being morphologically similar to aerial hyphae in 240 that they do not branch, exploratory hyphae miss the hydrophobic coating which is distinctive 241 242 of aerial structures, and hence represent a new cellular type with features of both vegetative and aerial hyphae. This functional differentiation is reminiscent of a bet-hedging strategy, with 243 explorer cells allowing dispersal in those cases in which sporulation might be too costly or take 244 too long to complete (Jones and Elliot, 2017). 245

Although the distinction in structure and function between vegetative and reproductive 246 hyphae has been known for many decades (Chater, 1998), we are now beginning to 247 understand that heterogeneity is also evident in mycelial aggregates growing in liquid 248 249 environments, between zones of mycelia, between adjacent hyphae within a colony zone and even between compartments of a single hypha. In the following sections we will first describe 250 methodologies used to study heterogeneity in filamentous microbial populations before 251 discussing intra- and inter-hyphal heterogeneity in the vegetative mycelium of streptomycetes 252 253 and filamentous fungi on solid substrates. We will then discuss heterogeneity in liquid-grown mycelia and its effect on production performances of commercially valuable products. 254

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#### 4.1 Techniques for studying phenotypic heterogeneity in filamentous microbes

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The analysis of heterogeneity relies on techniques that enable the gualitative and guantitative 258 assessment of physiological traits at the single cell level. Microfluidics and flow-cytometry 259 260 approaches have contributed strongly to the study of phenotypic heterogeneity in unicellular 261 microbes (Ackermann, 2015; Avery, 2006; Davis and Isberg, 2016). Microfluidics systems use miniaturized growth chambers that allow growth of various cell types in a finely controlled 262 microenvironment (Delvigne et al., 2017). Because of this feature, differences observed 263 between cells can exclusively be attributed to intrinsic cellular heterogeneity and not to varying 264 265 environmental conditions. Most microfluidics devices can easily be accommodated in various 266 type of microscopes which, in turn, allows to finely track growth of single cells, but also to use fluorescent reporters (i.e. fluorescent proteins and dyes). Different concepts have been 267 developed in recent years, encompassing a large range of sizes and designs (Grunberger et 268 269 al., 2014; Hol and Dekker, 2014; Reece et al., 2016; Wu and Dekker, 2016). The use of microfluidics for studying filamentous organisms is limited (Grünberger et al., 2013), which 270 relates to the fact that mycelia typically form large multicellular structures formed by hyphae 271 growing and branching in three dimensions. As a result, the mycelium easily grows out of the 272

crafted chambers. Microfluidic approaches would be feasible only by confining growth to twodimensions, which could however dramatically affect the physiology of the mycelium.

While microfluidic approaches are valuable for studying the behaviour of individual 275 276 cells, flow cytometry allows for the rapid analysis of large numbers of cells. Multiple parameters are analysed, including cell size, granularity, and fluorescence. As in the case of microfluidics, 277 suspended cells or cell aggregates (mainly encountered in filamentous microbes) sense a 278 constant environment in well-mixed submerged cultures, which allows to directly designate the 279 280 observed heterogeneity as an intrinsic property of the system under analysis. Notably, conventional flow cytometers are not suitable for the analysis of mycelial particles, due to the 281 large size of these structures. However, a number of cytometric apparatuses are nowadays 282 available that were specifically developed for large objects and have been successfully used 283 284 to study differences between mycelial particles within populations of filamentous microbes (de Bekker et al., 2011b; Petrus et al., 2014; van Veluw et al., 2012). These approaches are 285 286 however limited to the discrimination of heterogeneity between distinct particles and lack the resolution to study heterogeneity within individual particles. To study heterogeneities at a lower 287 288 scale (e.g. between distinct filaments in individual particles), fluorescence microscopy-based approaches are most commonly used. Alternatively, laser capture microdissection (LCM) can 289 be used to collect individual mycelial sections or even individual filaments, which can be 290 subsequently analysed in a comprehensive manner using -omics or next generation 291 292 sequencing techniques (de Bekker et al., 2011a; de Bekker et al., 2011b).

One other technique to study heterogeneity in filamentous microbes is nanoscale secondary ion mass spectrometry (nanoSIMS). nanoSIMS provides information on the molecular and isotopic compositions of various types of biological samples with a high spatial resolution (He et al., 2017; Nunez et al., 2017). This technique has recently been used to detect differences in carbon assimilation between adjacent cells of the non-branching actinomycete *Microthrix parvicella* (Sheik et al., 2016). NanoSIMS can thus be used to characterize metabolic differences between cellular compartments along hyphae.

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301 4.2 Heterogeneity in the vegetative mycelium of filamentous organisms on solid substrates

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303 The vegetative mycelium of fungi and streptomycetes simultaneously performs a large number 304 of different tasks. Besides producing and secreting enzymes for nutrient assimilation, mycelia transport nutrients and chemically differentiate to produce a plethora of secondary metabolites 305 (Barka et al., 2016; Borkovich and Ebbole, 2010; Hopwood, 2007). Given that many of these 306 metabolites are of great value to industry, much attention has traditionally been focused on the 307 308 optimization of production performances in filamentous microbes. However, research in this direction has often been performed using "blind" screening procedures rather than strain 309 optimization strategies based on a deep knowledge of the producing organism (Papagianni, 310 2004). What has for instance been largely ignored so far is where the production of all these 311 312 compounds occurs within the mycelium, and how approaches to increase productivity correlate with changes in the localization of production. 313

The vegetative mycelium of several Streptomyces species is heterogeneous with 314 respect to cellular morphology and physiology. More specifically, the vegetative growth of 315 316 streptomycetes has been found to encompass two phases during which different cell types are formed (Manteca et al., 2005a, b). The young mycelium that is established after spore 317 germination is highly compartmentalized. The approximately 1-µm-wide compartments are 318 thought to be separated by membrane structures and/or thin peptidoglycan-containing septa 319 320 (Yagüe et al., 2013; Yagüe et al., 2016). This first compartmentalized mycelium, called MI 321 mycelium, undergoes an ordered process of dismantling, which is followed by a second growth phase during which a multinucleated mycelium is established (MII). The cellular compartments 322 in this mycelium are significantly larger than those formed in the MI mycelium (Manteca et al., 323 324 2005b). Following growth, the MII mycelium undergoes a new round of dismantling, while the remaining viable hyphae form reproductive aerial hyphae that grow into the air (Manteca et al., 325 2007; Manteca et al., 2005a). Both death rounds are the effect of a regulated cell suicide 326 process, which bears close analogies to that of apoptosis in eukaryotic cells. This resemblance 327 328 is illustrated by indicators such as the disruption of the cell wall and the cell membrane, the 329 degradation of DNA and the release of the cytoplasmic content into the extracellular medium (Manteca et al., 2006). A proteomic characterization of the first apoptotic process in S. 330 coelicolor has highlighted that the majority of the S. coelicolor proteins involved in the first 331 332 apoptotic process localize at the cell wall, which thus seems to represent the first target to be dismantled during the PCD process (Manteca et al., 2010). Other proteins participating in cell 333 dismantling are enzymes involved in the metabolism of fatty acids, various hydrolases, 334 catabolic enzymes, and proteases. The activity of these enzymes is accompanied by an 335 336 increase in membrane permeability and the subsequent leakage of cytosolic components into the extracellular medium. While the process of cellular dismantling has been observed and 337 described in several streptomycetes, virtually nothing is known about its regulation and how it 338 spatially and temporarily correlates with other processes, such as antibiotic production. 339

Heterogeneity in the vegetative mycelium of filamentous fungi grown on solid 340 substrates occurs between zones of a colony, between neighboring hyphae within a zone and 341 between compartments of a single hypha (Fig. 2). The first reports on inter-zonal heterogeneity 342 focused on protein secretion within the vegetative mycelium of Aspergillus niger and 343 344 Phanerochaete chrysosporium. Secretion of the starch-degrading enzyme glucoamylase was found to be spatially confined to the peripheral zone of A. niger (Wösten et al., 1991), while 345 lignin peroxidases were found to be released within the central zone of colonies of 346 P. chrysosporium (Moukha et al., 1993a; Moukha et al., 1993b). Later studies revealed that 347 348 each zone of an A. niger colony has its own secretome composition (Krijgsheld et al., 2012). 349 For instance, 6 and 10 proteins are at least 4-fold more and less abundant, respectively, in the outer zone when compared to an intermediate zone. Interestingly, zonal differences in 350 expression in A. niger colonies can be explained by both medium-dependent and medium-351 352 independent mechanisms (Levin et al., 2007). The concentration and nature of the carbon source determines about half of the variation in gene expression, whereas the other half is 353 attributed to differentiation processes in the vegetative mycelium (Levin et al., 2007). The 354 nature of these differentiation processes is not yet known. 355

356 Growth at the outer zone of a fungal colony is supported by nutrients in the substrate while the carbon source is exhausted in the central parts of the colony (clearly, the same holds 357 for the mycelia of bacterial species). Here, the hyphae switch from growth on exogenous to 358 359 endogenous carbon (Pollack et al., 2008). This is accompanied by vacuolization, reduced growth rate, and a decrease of the hyphal diameter. Vacuolar degradation produces sufficient 360 endogenous carbon to support the formation of so-called secondary hyphae. In contrast to 361 streptomycetes, the endogenous carbon source is not released extracellularly and then 362 363 internalized by other hyphae, but it is transported to the tips of the newly formed filaments. This mechanism secures the nutrients for the fungus rather than enabling competing microbes to 364 absorb them from the environment. Yet, the autolysis of hyphae with the release of nutrients 365 in the medium may also take place in starving zones of colonies (Perez-Leblic et al., 1982). 366 Future studies are needed to reveal which strategy of nutrient recycling is the most dominant 367 368 in the fungal mycelium.

369 Enzyme secretion was initially believed to only occur in growing fungal hyphae (Wessels, 1993), whereas it is nowadays clear that it can also occur in non-growing zones of 370 a colony (Krijgsheld et al., 2013b; Levin et al., 2007). How proteins are released into the culture 371 372 medium by non-growing hyphae is not yet understood knowing that pores in the hyphal cell 373 walls are too small to enable proteins to freely diffuse (Wessels, 1988, 1993). In the case of 374 growing hyphae, such pores are not needed since proteins to be released in the culture 375 medium can co-migrate with the newly synthesized cell wall polysaccharides that are extruded 376 at the tips of growing hyphae and pushed from the inner to the outer part of the cell wall by the 377 turgor pressure and the addition of new cell wall material. Notably, although both growing and 378 non-growing colony zones can secrete proteins in the culture medium, not every zone does 379 so. The sub-peripheral zone of A. niger colonies is able to sporulate when environmental 380 conditions are favorable to enable this differentiation process. This zone does not secrete 381 proteins even when sporulation does not take place (Krijgsheld et al., 2013b). A strain of A. 382 niger in which the sporulation gene flbA is deleted is no longer able to asexually reproduce

383 and secretes proteins throughout the whole mycelium (Krijgsheld et al., 2013b). The flbA 384 deletion strain also shows a more complex secretome consisting of a number of proteins that are not secreted by the wild-type strain. Together, these observations indicate that sporulation 385 386 inhibits protein secretion in fungal colonies. From a functional perspective, this appears as coherent behavior. Once hyphae engage in sporulation, it would be inefficient to invest energy 387 in the secretion of enzymes involved in vegetative growth. To further study the phenomenon 388 389 of sporulation inhibited protein secretion, the impact of deletion of fluG in A. niger was studied 390 (Wang et al., 2015). This gene is at the start of the sporulation program in Aspergillus nidulans. Yet, the *fluG* mutant strain of *A. niger* was shown not to be affected in sporulation. However, 391 392 in contrast to wild-type A. niger, the deletion strain shows breakdown of starch under the whole colony. From these and other data it was concluded that FluG is a repressor of secretion in the 393 394 sporulation zone.

395 Immuno-localization showed that not every hypha within the outer zone of the A. niger 396 colony secretes glucoamylase (Wösten et al., 1991). Indeed, two types of hyphae were shown 397 to exist in this zone; hyphae that highly and hyphae that lowly express the glucoamylase gene (Vinck et al., 2005). This heterogeneity in expression was also observed for other genes 398 encoding hydrolytic enzymes (Vinck et al., 2011). In fact, those hyphae that highly express one 399 400 of the hydrolase genes were also found to highly express the other hydrolase-encoding genes. 401 In addition, they possess a higher transcriptional and translational activity when compared to 402 hyphae that show lower expression. Nevertheless, both types of hyphae show a similar growth 403 speed, indicating that for secretion to take place a higher transcriptional and translational 404 activity is needed. Our recent findings show that the hyphae showing lower transcriptional and 405 translational activity are also more resistant to heat stress (M Tegelaar, R Bleichrodt and HAB 406 Wösten, unpublished data). Thus, hyphae seem to show a division of labor strategy at the 407 periphery of Aspergillus colonies.

408 Division of labor is also evident between hyphal compartments of *A. niger* (Tegelaar 409 and Wösten, 2017). In this fungus, apical compartments are self-sustaining in growth. This

was concluded from the finding that the growth rate in these compartments remains unaffected 410 when they are mechanically detached from the rest of the hypha. Interestingly, the first 411 subapical compartments (up to eight) function as a backup system for growth by forming new 412 413 branches upon damage of the apical compartment (Tegelaar and Wösten, 2017). This backup system appears crucial in nature considering the fact that fungal colonies continuously explore 414 substrates that may locally be hostile for growth. By forming sub-apical branches that do not 415 416 grow parallel to the damaged hypha, but rather grow away from it, the organism can avoid a 417 second confrontation with the source of damage (i.e. a competing organism or a nutrient void 418 zone).

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### 420 4.3 Multilevel heterogeneity in liquid environments

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Fungi and streptomycetes produce respectively about 42% and 32% of the more than 23,000 422 423 known microbial bio-active compounds (i.e. compounds with antifungal, antibacterial, antiviral, antitumor, cytotoxic and immunosuppressive activity) (Barka et al., 2016; Hopwood, 2007; 424 425 Lazzarini et al., 2000). They also possess a remarkable capacity to produce and efficiently secrete various hydrolytic enzymes that allow them to degrade almost any naturally occurring 426 polymer (Anné et al., 2012; Hoffmeister and Keller, 2007). The ability of streptomycetes and 427 filamentous fungi to produce this treasure trove of commercially-valuable compounds and 428 429 enzymes has led to their large-scale industrial exploitation (Hopwood, 2007). In industry, 430 microbes are typically grown in large bioreactors. This choice is dictated by the fact that these systems provide the most reproducible and efficient manner to obtain high growth and 431 production rates, which are achieved through parametric control and the efficient provision of 432 433 nutrients and oxygen to cells. Notably, the continuous and often vigorous mixing of the culture medium creates a more homogenous environment for the mycelia when compared to growth 434 on solid substrates. Yet, gradients can still exist, especially with the large volumes that are 435 characteristic of industrial fermentation processes. Notably, heterogeneity in process 436 437 parameters (e.g. pH, temperature, concentration of biomass and nutrients) can result in physiological heterogeneity and the occurrence of culture segregation in a number of
microorganisms (Delvigne et al., 2009; Takors, 2012). In addition, fluctuating aeration regimes
have been shown to decrease product formation both in streptomycetes and filamentous fungi
(Larsson and Enfors, 1998; Yegneswaran et al., 1991).

The mode-of-growth of streptomycetes and filamentous fungi in bioreactors is markedly 442 different when compared to solid substrates. Depending on the strain and culture setup, the 443 mycelium of these filamentous microbes can display a range of different morphologies (Braun 444 445 and Vecht-Lifshitz, 1991; Tresner et al., 1967; van Dissel et al., 2014). Many species, among which the industrial cell factories S. lividans and A. niger, can form dense mycelial particles 446 called pellets (also micro-colonies for filamentous fungi). These particles can have a diameter 447 larger than 1 mm, with the pellets formed by Aspergillus being generally larger than those of 448 streptomycetes (van Veluw et al., 2012; van Veluw et al., 2013). This mode-of-growth 449 promotes physiological heterogeneity due to the differential diffusion of oxygen, nutrients and 450 metabolic (by)products. One of the consequences of growth in dense pellets is that hyphae in 451 452 the central part of these particles are typically starved due to the limited availability of oxygen 453 and nutrients (Bizukojc and Gonciarz, 2015; Clark, 1962; Driouch et al., 2012; Gerlach et al., 1998; Wittier et al., 1986). The impact of nutrient and oxygen limitation on pelleted growth is 454 also evident in other multicellular communities (e.g. biofilms) formed by single or multiple 455 species (Kragh et al., 2016; von Ohle et al., 2010). The interplay between environmentally-456 457 determined heterogeneity and actively regulated development is however still obscure. In this 458 context, it is interesting to mention that cells residing within a biofilm structure have been found to be more heterogeneous as opposed to planktonic cells. In experiments with Pseudomonas 459 aeruginosa, phenotypical variation was found to arise when cells were cultured in the form of 460 461 biofilms. Although the factors inducing this heterogeneity are unknown, a recombinationdependent system was found to provide the source of genotypic variation leading to the 462 observed phenotypes. Furthermore, cells that had gained mutations after residing in biofilms 463 displayed more variation in swimming capability and enhanced resistance to a number of 464

465 environmental insults including oxidative stress and exposure to antimicrobials (Boles et al.,466 2004).

In addition to differential responses to environmental cues, deterministic choices may 467 468 also stimulate heterogeneous growth in liquid environments. Most Streptomyces strains do not sporulate in liquid-grown cultures; nevertheless, a certain degree of developmental and 469 physiological heterogeneity is evident throughout the mycelium. As on solid substrates, the 470 mycelial structure changes throughout growth, and is characterized by frequent 471 472 compartmentalization at early time points (Manteca et al., 2008; Manteca et al., 2005a). Following a round of cellular dismantling, a multinucleated mycelium is established which 473 contains fewer compartments. By this time, the production of antibiotics becomes noticeable. 474 Contrary to growth on solid substrates, neither is this newly established mycelium dismantled, 475 nor does sporulation occur. Gene expression profiling indicated however, that the majority of 476 transcripts identified on solid substrates are also present in liquid-grown cultures, including 477 478 activators of secondary metabolism and development (Yagüe et al., 2014). Together, these findings indicate that heterogeneity is common in liquid-grown streptomycetes. 479

480 Another form of heterogeneity was discovered in pellet-forming streptomycetes and fungi by analyzing large numbers of pellets with a flow cytometry approach. This revealed that 481 cultures of both filamentous fungi and streptomycetes contain at least two normally distributed 482 populations of pellets that differ in size (de Bekker et al., 2011b; van Veluw et al., 2012; van 483 484 Veluw et al., 2013) (Fig. 2). This heterogeneity is observed in a range of strains and growth 485 media, suggesting that it is inherent to the mode-of-growth of these organisms. Interestingly, gene expression in micro-colonies can also be described as a bimodal distribution. For 486 instance, two populations of A. niger micro-colonies exist in submerged cultures; one highly 487 488 and one lowly expressing the glucoamylase gene (de Bekker et al., 2011b). In Streptomyces coelicolor, 37 proteins were found to be significantly different in abundance between the 489 populations of large and small pellets. While 17 of these proteins are significantly 490 overrepresented in large pellets as opposed to the small ones, 20 are significantly 491 underrepresented (van Veluw et al., 2012). Several of the proteins that are over- or 492

493 underrepresented could be assigned to specific functional classes, with a number of stress-494 related proteins being overrepresented in the population of large pellets. The protein that is most strongly enhanced (around 30-fold) in the larger pellets is EqtD, a protein involved in the 495 496 biosynthesis of the rare amino acid ergothioneine. The synthesis of this molecule is rare in microbes, with a higher incidence in actinobacteria (including mycobacteria) and filamentous 497 fungi. The role of ergothioneine in these organisms is still obscure, but it has antioxidant 498 properties, which suggests that it might be involved in a stress-response mechanism. Other 499 500 stress-related proteins being overrepresented in the population of large pellets include polypeptides encoded by genes in the osdR locus, including the gene for the universal stress 501 protein (USP) (SCO0200) (van Veluw et al., 2012). Recent studies revealed that osdR controls 502 development and oxidative stress, and is functionally similar to DosR, the oxygen-sensitive 503 504 dormancy response regulator in Mycobacterium tuberculosis (Urem et al., 2016). It is interesting to mention that the classes of genes being differently expressed in *Streptomyces* 505 506 pellets are known to be subject to transcriptional noise in other microbes (see above).

507

### 508 5. Mechanisms underlying heterogeneity in filamentous microbes

509

#### 510 5.1 Inter-hyphal and inter-compartmental heterogeneity

511

512 The hyphae of streptomycetes and the higher fungi (i.e. ascomycetes and basidiomycetes) are 513 compartmentalized by cross-walls (also called septa). In streptomycetes, some of these crosswalls have channels, which potentially would allow streaming of cytoplasmic content, although 514 this has never been demonstrated directly (Bleichrodt et al., 2012; Celler et al., 2016; 515 516 Jakimowicz and van Wezel, 2012; Yagüe et al., 2016). In addition to cross-walls, recent work has shown that extended membranous structures are able to spatially and functionally 517 organize the vegetative mycelium of streptomycetes (Celler et al., 2016; Yagüe et al., 2016) 518 (Fig. 3). These cross-membranes are responsible for the formation of the alternating pattern 519 520 of viable and dead hyphae in the early MI mycelium and also block the diffusion of cytoplasmic

proteins in 29% of the cases. Cross-membranes might thus maintain heterogeneity between
compartments of the same cell by preventing molecules to mix by diffusion or streaming.

Septa of filamentous fungi consist of invaginations of the cell wall that are ligned with 523 524 plasma membrane. Septa have a central pore of 50-500 nm (Moore and Mcalear, 1962; Shatkin and Tatum, 1959) that allows streaming of cytosol and even organelles, thus enabling 525 cytoplasmic mixing throughout the mycelium. Yet, the pores of Aspergillus can be reversibly 526 opened and closed by peroxisome-derived organelles called Woronin bodies (Bleichrodt et al., 527 528 2012) (Fig. 3). The absence of Woronin bodies prevents septal closure, thereby abolishing the possibility to maintain long-term heterogeneity in cytosolic composition between neighboring 529 compartments and/or hyphae (Bleichrodt et al., 2012). It should be noted that even an open 530 septum can maintain differences in cytosolic composition due to differential gene expression. 531 532 In this case, however, heterogeneity can be only maintained in a minutes time-frame. Yet, this may be sufficient for some developmental processes to be initiated (Bleichrodt et al., 2015a; 533 Bleichrodt et al., 2015b). Together, an arrest or reduction in cytoplasmic streaming between 534 adjacent compartments can maintain long term heterogeneity in RNA and protein composition. 535 536 Notably, the plugging of septa via Woronin bodies has no effect on inter-compartmental transport of glucose (Bleichrodt et al., 2015b). This is explained by the fact that Aspergillus 537 uses permeases to enable the selective transport of metabolites. In this scenario, inter-538 compartmental and inter-hyphal heterogeneous distributions are only obtained for those 539 540 components that cannot cross the selective plasma membrane of septa (e.g. large proteins, 541 ribosomes, organelles, and metabolites that lack a permease in the plasma membrane lining 542 the septal cross wall).

543

#### 544 5.2 Inter-pellet heterogeneity

545

546 The aggregation of distinct particles is a driving factor for generating size heterogeneity 547 between pellets. Aggregation in streptomycetes is mediated by extracellular glycans on the 548 surface of germlings and young mycelia (Zacchetti et al., 2016). These glycans are produced

under control of the cs/A/glxA operon and the mat cluster (Chaplin et al., 2015; de Jong et al., 549 550 2009; Petrus et al., 2016; van Dissel et al., 2015; Xu et al., 2008). The structure of the glycan produced by CsIA and GIxA is still unknown, while the polymer produced by the Mat proteins 551 552 is poly- $\beta$ -(1,6)-N-acetylglucosamine (PNAG) (van Dissel et al., 2018). Abolishing the formation of these glycans yields particles whose size is no longer bimodally distributed and that are 553 hence more homogeneous in size. Also, in filamentous fungi aggregation is a critical factor in 554 generating size heterogeneity. In this case, aggregation is a two-step process. The first phase 555 556 involves the aggregation of ungerminated spores and is followed by a second aggregation phase that occurs between germlings (Grimm et al., 2004). Mutants of A. niger affected in the 557 formation of spore-associated pigments yield more homogeneously-distributed pellets (van 558 Veluw et al., 2013). The underlying mechanism is not known but one wonders whether 559 filamentous microbes make use of size heterogeneity to optimally adapt to the environment. 560 Micro-colonies of different size might experience environmental stimuli differently and may thus 561 562 differently react to these cues.

563

# **6.** Parallels and differences between unicellular and multicellular systems

565

566 The cellular architecture of filamentous microbes generates layers of complexity that are rarely 567 observed in unicellular species and that result in the multiscale heterogeneity discussed in this review. As a result of this complexity, some of the well-described aspects of phenotypic 568 heterogeneity have not yet been characterized in filamentous microbes. Mechanisms 569 analogous to those reported in unicellular systems, such as intrinsic noise in transcription and 570 571 translation, are inherent to the behaviour of their machinery, and therefore a likely source of heterogeneity in any biological system, including filamentous microbes. Uniquely for 572 filamentous microorganisms is the syncytial nature of mycelia. The distribution of DNA (i.e. 573 nuclei in fungi or chromosomes in bacteria) may not only differ between compartments, but 574 575 also within compartments. This, in turn, would result in some regions possessing more copies of a given gene. Such dosage effects are known to bear a profound effect on decision making 576

in a number of cellular systems (Chai et al., 2011; Narula et al., 2015; Slager et al., 2014; 577 Soler-Bistue et al., 2015; Veening et al., 2006). Additionally, the positioning of nuclei can also 578 result in differential gene expression within single compartments. For instance, paired nuclei 579 580 in compartments of the mushroom-forming fungus Schizophyllum commune can migrate away from each other, resulting in changes in gene expression (Schuurs et al., 1998). Thus, while 581 some of the mechanisms involved in generating heterogeneity could be similar between 582 filamentous and unicellular microbes, some factors (e.g. the presence of inter-compartmental 583 584 streaming and multinucleate compartments) are probably unique for filamentous 585 microorganisms.

Differences in the mechanisms through which heterogeneities arise might also differ 586 between filamentous bacteria and filamentous fungi. Not only is gene regulation different 587 between bacteria and fungi, also their sizes differ. The cellular volume of a fungal filament is 588 roughly 100 times larger than that of a streptomycete given the 10-fold larger diameter of a 589 fungal hypha. This may affect the concentration of various intracellular species. As a 590 consequence, noise dynamics might differ in these systems. However, no quantitative data of 591 592 abundance of molecules exist that cause heterogeneity in filamentous microbes, thus hindering a direct comparison. 593

One of the most remarkable aspects of microbial phenotypic heterogeneity is its beneficial 594 role in increasing population fitness in the face of changing environmental conditions (see 595 596 section 2). It is currently unknown whether this is also true for filamentous microbes. Mycelial 597 heterogeneity may be beneficial in terrestrial soils, where spatial and temporal variations exist in for instance the availability of nutrients and oxygen, temperature, pH, and the amount of 598 growth-inhibiting compounds (Stoyan et al., 2000). Considering the saprophytic lifestyle of 599 600 most filamentous microbes and the close proximity of hyphae within a colony, one would predict a benefit for segregating functions across the colony. This would be particularly useful 601 for acquiring nutrients or secreting costly compounds that ultimately become available to all 602 surrounding hyphae. In this scenario, inter-hyphal heterogeneities in the secretion of enzymes 603 (as those observed in A. niger) might very well reflect a division of labour strategy, in that only 604

a subset of hyphae commit to the production of extracellular hydrolases, thereby liberating
nutrients that can be taken up by both producing and non-producing hyphae. Another example
where heterogeneity could provide fitness benefits to the colony is in the production of
antibiotics. However, this awaits further experimental evidence.

609

# 610 **7. Conclusions and future perspectives**

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Striking parallels exist between filamentous fungi and actinomycetes with respect to 612 613 morphology, heterogeneity and the architecture of mycelia. Despite the increasing number of studies, we have only started to dissect the mechanisms underlying heterogeneity in these 614 organisms. While cytoplasmic streaming in the fungal mycelium has been known for many 615 616 decades, it has only recently been reported in streptomycetes (Celler et al., 2016). Selective 617 blocking of this process, either via Woronin bodies in fungi or membranous structures in 618 actinomycetes, leads to physiological differences between adjacent compartments and zones 619 of the colony. One of the outstanding questions to address is how the external and internal 620 signals are processed and translated into changes in cytoplasmic streaming and phenotypic 621 heterogeneity. We believe that the developments in the field of microscopy will enable us to 622 obtain unprecedented insight into the molecular functioning of these compartment-separating structures within hyphae. 623

In this review we have described the different forms of heterogeneity that have been reported in filamentous fungi and streptomycetes. Interestingly, apart from inter-colony, interzonal, inter-hyphal and inter-compartmental heterogeneity one may expect the existence of intra-compartmental heterogeneity. Such heterogeneity may be promoted by increasing the compartmental length and reducing the number of nuclei (fungi) or chromosomes (filamentous bacteria). Alternatively, RNAs and pathways that determine the fate of RNA could be spatially and temporally localized in subcellular compartments. More knowledge about the dynamics of nucleic acids in filaments is thus of utmost importance to better our understanding ofheterogeneity.

While it is evident that heterogeneity is beneficial to filamentous microbes in natural 633 634 environments, this feature is undesirable in industry for two reasons. First, heterogeneity decreases controllability of the fermentation process, and secondly, several lines of evidence 635 indicate that morphology and specific productivity appear to be tightly coupled. For instance, 636 production performance can be increased by reducing morphological heterogeneity (size 637 638 distribution of pellets) in Streptomyces cultures (van Dissel et al., 2015; van Wezel et al., 2006; Wang et al., 2017; Wardell et al., 2002). Generally speaking, smaller micro-colonies are 639 preferable for the production of enzymes, while bigger ones are better suited for the production 640 of antibiotics (van Dissel et al., 2014). Promoting increased septation in S. lividans results in a 641 642 reduced pellet size and in turn in increased enzyme secretion (van Wezel et al., 2006). Interfering with mycelial aggregation also results in smaller mycelial particles and increased 643 protein secretion (van Dissel et al., 2015). While some of these phenotypes have solely been 644 explained as the result of the increased growth rates of smaller particles, part of the increased 645 646 production may be due to the reduced size heterogeneity. Likewise, increased homogeneity could also stimulate antibiotic production, given that mutants of Saccharopolyspora erythraea 647 that on average form larger pellets than the parental strain also produce more erythromycin 648 649 (Wardell et al., 2002). At the same time, we cannot exclude that hyphae within mycelia of liquid-650 grown cultures differentiate to fulfil specific functions. In this case, heterogeneous cultures may 651 be more productive. In light of this, it is critical to better understand the molecular mechanisms underlying heterogeneity in filamentous organisms, a quest that might be facilitated in the near 652 future by the increasing power of next-generation sequencing technologies applied at the 653 654 single cell level and the further advancement of high-end microscopy. Only once these mechanisms will have been unraveled, will we be able to tackle heterogeneity in non-natural 655 656 settings, with the alluring prospect of enhanced production performances in the biotech sector.

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- 663 **References**
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1079 Figure 1: Examples and benefits of microbial heterogeneity. A) Bet-hedging. Microbial clonal populations often contain persisters. Such dormant cells are beneficial in conditions 1080 counter-selecting growing cells, for instance due to the presence of an antibiotic. When the 1081 normal conditions return, these persisters initiate growth, thereby restoring the population. **B**) 1082 1083 Division of labor in cyanobacteria. Oxygenic photosynthesis and nitrogen fixation are chemically incompatible processes, since the oxygen produced through photosynthesis 1084 1085 inactivates the nitrogenase enzyme required for nitrogen fixation. Cyanobacteria physically separate these processes by forming specialized nitrogen-fixing cells called heterocysts. The 1086 1087 fixed nitrogen will diffuse to the neighboring cells, while heterocysts benefit from the organic carbon produced by cells engaging in photosynthesis. C) Production of secreted molecules. 1088 1089 The production and secretion of molecules that benefit the entire population is often carried 1090 out by only a subset of cells. In this example, some Bacillus subtilis cells secrete proteases 1091 that provide hydrolyzed nutrients to the whole population under nutrient-limiting conditions. It is not clear whether the non-secreting cells participate in other ways to the overall survival of 1092 the population. 1093

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1095 Figure 2. Multiscale heterogeneity in filamentous microorganisms. Heterogeneity has 1096 been demonstrated at different organizational levels in solid (A-C) and liquid-grown (D-F) 1097 cultures in filamentous microbes. Inter-zonal heterogeneity (A) is characterized by spatial 1098 differences in production (and/or secretion) of molecules in different zones of the colony. Heterogeneity is also evident between adjacent hyphae in the same region of the colony (**B**), 1099 and even between separate compartments of the same hypha (C). In liquid-grown 1100 environments, microcolonies (or pellets) are heterogeneous in size, coinciding with differences 1101 1102 in gene expression and protein secretion (**D**). Heterogeneity is also evident within pellets (**E**), some of which may be caused by the scarcity of nutrients and oxygen in the central parts of 1103 these structures. Like in solid-grown cultures, intercompartmental heterogeneity is observed 1104 within hyphae in liquid-grown cultures (**F**). 1105

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Figure 3. Compartmentalization is crucial for generating heterogeneity in filamentous organisms. Filamentous fungi and streptomycetes form hyphae that are compertmentalized by septa. In addition to septa, streptomycetes also form so-called cross-membranes for compartmentalization. In fungi, septa can be either open or closed depending on the presence of so called "Woronin bodies". Closed septa prevent molecules to freely diffuse between adjacent compartments. In streptomycetes, extended cross-membrane structures prevent cytoplasmic streaming, thereby generating heterogeneity within filaments.





