- 1 Temporal dynamics of *Candida albicans* morphogenesis and gene expression reveals
- 2 distinctions between in vitro and in vivo filamentation.
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- 4 Running title: C. albicans filamentation in vitro and in vivo
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24 Abstract

25 Candida albicans is a common human fungal pathogen that is also a commensal of the oral 26 cavity and gastrointestinal tract. C. albicans pathogenesis is linked to its transition from budding 27 yeast to filamentous morphologies including hyphae and pseudohyphae. The centrality of this 28 virulence trait to C. albicans pathobiology has resulted in extensive characterization a wide 29 range factors associated with filamentation with a strong focus on transcriptional regulation. The 30 vast majority of these experiments have used in vitro conditions to induce the yeast-to-filament 31 transition. Taking advantage of in vivo approaches to quantitatively characterize both 32 morphology and gene expression during filamentation during mammalian infection, we have 33 investigated the dynamics of these two aspects of filamentation in vivo and compared them to in 34 vitro filament induction with "host-like" tissue culture media supplemented with serum at 35 mammalian body temperature. Although filamentation shares many common features in the two 36 conditions, we have found two significant differences. First, alternative carbon metabolism 37 genes are expressed early during in vitro filamentation and late in vivo, suggesting significant 38 differences in glucose availability. Second, C. albicans begins a hyphae-to-yeast transition after 39 4hr incubation while we find little evidence of hyphae-to-yeast transition in vivo up to 24hr post 40 infection. We show that the low rate of in vivo hyphae-to-yeast transition is likely due to very low 41 expression of PES1, a key driver of lateral yeast in vitro, and that heterologous expression of 42 PES1 is sufficient to trigger lateral yeast formation in vivo.

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47 Importance

Candida albicans filamentation is correlated with virulence and is an intensively studied aspect of C. albicans biology. The vast majority of studies on C. albicans filamentation are based on in vitro induction of hyphae and pseudohyphae. Here we used an in vivo filamentation assay and in vivo expression profiling to compare the tempo of morphogenesis and gene expression between in vitro and in vivo filamentation. Although the hyphal gene expression profile is induced rapidly in both conditions, it remains stably expressed over a 12hr time course in vivo while it peaks after 4hr in vitro and is reduced. This reduced hyphal gene expression in vitro correlates with reduced hyphae and increased hyphae-to-yeast transition. In contrast, there is little evidence of evidence of hyphae-to-yeast transition in vivo.

68 Introduction

Candida albicans is a component of the human mycobiome that also causes disease in 69 70 both immunocompetent and immunocompromised patients (1, 2). The transition of C. albicans 71 from harmless commensal to invasive pathogen is associated with a morphological switch from 72 budding yeast to filaments comprised of both hyphae and pseudohyphae (3). In general, C. 73 albicans strains and mutants that show low rates of filamentation are more fit in the commensal 74 setting and less fit during invasive infection (4, 5). Over the years, filamentation has been one of 75 the most intensively studied C. albicans virulence traits (3). The vast majority of these studies 76 used one of a number of in vitro conditions to generate filaments. Recently, we developed an in 77 vivo imaging approach for the analysis of C. albicans filamentation during infection. In this 78 approach, C. albicans is inoculated directly into the subdermal ear tissue of the mouse (6). 79 Anatomically, this compartment is stromal tissue beneath an epithelium, in this case skin 80 epithelium, and shares many features with stromal tissue beneath colonized epithelium of the 81 mouth and GI tract. We have used this approach to identify the transcription factor network that 82 regulates filamentation in vivo (7) as well as to characterize the filamentation of clinical isolates 83 and protein kinase mutants (8, 9). These studies have revealed a number of important 84 differences in the genes required for filamentation in vivo compared to in vitro. For example, the 85 cAMP-Protein Kinase A pathway is absolutely required for in vitro filamentation in all inducing-86 media but is dispensable for filamentation in vivo (9).

The first goal of this work was to characterize the temporal dynamics of filamentous morphogenesis and associated gene expression in vivo beginning at early time points using the imaging assay. We coupled this with in vivo expression analysis using Nanostring nCounter technology to profile the expression of a set of 186 environmentally responsive genes over the same time periods (7, 9). This set of genes includes 57 (30%) hyphae-associated genes (7). Our previous Nanostring-based in vivo expression profiling of *C. albicans* infection of ear tissue,

kidney tissue and oral tissue at single time points has shown both similarities and differences
within these niches (9). Furthermore, expression profiles of in vitro hyphal induction also show
similarities and differences to in vivo expression.

96 To further explore the similarities and differences between filamentation under in vivo 97 and in vitro conditions, we followed morphogenesis and gene expression over an identical 12hr 98 time course of in vitro and in vivo filamentation. Nanostring nCounter technology was used to 99 analyze gene expression for two primary reasons. First, genome-wide RNA-seg methods for the 100 direct analysis of C. albicans gene expression in infected tissue have not been developed. 101 Although a gene-enrichment strategy has been reported (10), its application to time course 102 analysis was cost prohibitive. Second, we were most interested in the temporal dynamics of a 103 set of well-studied hyphae-associated environmentally responsive genes; therefore, genome-104 wide characterization of expression was not necessary for our purposes (11). As such, this 105 approach limits the conclusions we can make about global patterns of gene expression.

106 A single in vitro filament-inducing condition was used and was chosen because it is 107 generally used in the field to approximate a host-like environment. Specifically, the tissue 108 culture medium RPMI 1640 supplemented with 10% bovine calf serum (BCS) was used and 109 incubations were performed at mammalian body temperature (37°C). Previous microarray-110 based expression profiling of the time course for in vitro C. albicans filamentation used rich medium (YPD or YEPD) supplemented with 10% BCS (12). It has become well-established that 111 112 the specific filament-inducing medium has a significant effect on both the regulatory pathways 113 and gene expression patterns involved in C. albicans filamentation (13). Indeed, those 114 considerations motivated our study of gene expression pattern in vivo.

To date, we have performed hundreds of in vivo imaging assays with WT cells, the majority of which examined filamentation at 24hr. In vitro, hypha begin to form lateral yeast cells

117 after ~4hr of induction; however, we have rarely observed lateral yeast cell formation in vivo. 118 Therefore, the second goal of this study was to explore the mechanistic basis underlying this 119 distinction between in vitro and in vivo morphogenesis. As detailed below, our data suggest that 120 C. albicans begin a hyphae-to-yeast transition that is correlated with a reduction in the 121 expression of hyphae-associated genes after ~4hr induction (14) and that this is likely to involve 122 PES1, a gene known to drive lateral yeast formation in vitro (15). In vivo, C. albicans cells 123 maintain expression of hyphae-associated dreams and have very low expression of PES1 124 throughout the time course, a result that explains why we find little evidence of the hyphae-to-125 yeast transition in vivo. Consistent with this model, we show that expression of PES1 from a 126 strong, heterologous promoter is sufficient to drive lateral yeast formation in vivo.

127 Results

In vivo filamentation is initiated rapidly and reaches steady state twelve hours after
 infection.

130 Stationary phase C. albicans SN250 labeled with NEON were injected into the 131 subdermal tissue of mice ears and imaged at 1hr, 2hr, 4hr, 8hr and 12hr post infection (Fig. 1A). 132 Germ tube-like cells with short filaments are initially observed in 60% of cells 1hr post-infection 133 (Fig. 1B&C). The percentage of cells that have a filamentous morphology increase slightly until 134 4hr at which a steady state ratio of filamentous cells to yeast cells was reached. Previously 135 reported data at 24hr indicate that there is little change in this ratio between 12hr and 24hr. The 136 length of the filaments increases over the first few hours of the time course (Fig. 1D) and reaches a steady state at 8hr. The median length remains constant between 8hr and 12hr and 137 138 comparison to previously reported data for 24hr indicates that the median length of the 139 population remains relatively stable to that time point.

140 The same time course experiment was conducted for in vitro filamentation by inoculating stationary phase cells into RPMI 1640 with 10% BCS at 37°C and fixing cells at each time point. 141 142 As expected, germ tubes are also initially observed in vitro after 1hr (Fig. 2A&B) but the 143 proportion of cells that have formed a germ tube is significantly less in vitro relative to in vivo conditions after 1hr (60% in vivo and 20% in vitro). The percentage of filamentous cells peaks at 144 145 4hr. In contrast to in vivo conditions, the percentage of filamentous cells then declines by $\sim 25\%$ 146 between 4hr and 12hr (p <0.05). Similar to in vivo filamentation, the median length of the 147 filaments increases over the first 4h to a steady state (Fig. 2C). These data indicate that in vitro 148 filamentation in RPMIS is slightly delayed relative to in vivo conditions and that the ratio of 149 filaments to yeast begins to decline after a peak at 4hr.

150 Expression profiles of in vivo and in vitro filaments evolve over the time course.

151 Nanostring nCounter methods were used to characterize the expression of 186 genes 152 and compared them to the yeast inoculum at 1, 2, 4, 8, and 12hr post-infection (Table S1) as 153 well as post filament induction in vitro (Table S2). The raw, normalized, and processed data are 154 provided in Tables S1&S2 for each time point. Differentially expressed genes were defined as 155 those with ± 2-fold change in expression with an FDR <0.1 as determined by the Benjamini-156 Yeuketil procedure when compared to expression in the yeast phase inoculum which was grown 157 overnight at 30°C in rich medium (yeast peptone with 2% dextrose, YPD). The time course of 158 transcriptional changes is summarized by volcano plots in Fig. 3A and 3B for in vivo and in vitro 159 conditions, respectively. The total number of differentially expressed genes at each time point is 160 indicated in Fig. 3A and 3B. We generated Venn diagrams to compare the genes upregulated 161 under in vitro conditions to in vivo at each time point as a way to assess the similarity and 162 differences between the two conditions at the same time point (Fig. 4A-E). At 1hr, the set of 163 genes induced by a statistically significant amount is low because of relatively high variability 164 (Table S1); this variability resolves by 2hr. As expected, the set of upregulated genes common

to both in vivo and in vitro conditions at 1hr includes regulators of hyphae morphogenesis
(*BRG1*, *CPH1/2*, *TEC1*, & *UME6*) as well as hyphae-associated cell wall genes (*ALS1* & *HWP1*); see Table S1 graphs below (Fig. 5&6).

168 At early time points (Fig. 4A-C), the majority of genes upregulated in vivo are also 169 upregulated in vitro. However, a large proportion of genes are uniquely upregulated in vitro. For 170 example, one-third of the genes upregulated in vitro at 2hr were not upregulated in vivo. The set 171 uniquely upregulated in vitro is enriched for carbon metabolism genes (FDR 0.01, Benjamini-172 Yeuktiel: PCK1, GPD2, GAL1, ACS1, FBP1, Fig. 4F); PCK1 and FBP1 are involved in 173 gluconeogenesis and ACS1 is induced by low glucose (16), suggesting that glucose availability 174 may be distinct between in vitro and in vivo conditions at early time points. Further supporting 175 that possibility, AOX2, which is induced by low glucose conditions (17), was strongly 176 upregulated at the 1hr (59-fold increase relative to yeast, FDR = 0.005) and 2hr (22- fold-177 increase relative to yeast, FDR = 0.006) time points in vitro, while AOX2 expression is below the 178 level of detection in vivo (Table S1). At later time points in vivo, AOX2 (12 hr, 69-fold increase 179 relative to yeast, FDR = 0.02) and PCK1 were upregulated (12hr, 4-fold increase relative to 180 yeast, FDR = 0.05), suggesting that the cells begin to depend more on non-glucose carbon 181 sources as the time course progresses.

182 At the 12hr time point, more genes are uniquely upregulated in vivo compared to in vitro 183 (Fig. 4E). The set of 24 genes upregulated only in vivo at the 12hr time point is enriched for zinc (FDR: 2e⁻⁴; ZAP1, ZRT1 and PRA1) and iron (FDR: 2e⁻³; HAP3, FTR1, RBT5, and PGA7) 184 185 homeostasis (18, 19). Interestingly, filamentous growth associated genes are also enriched in 186 this set (FDR: 3e⁻⁴) including transcriptional regulators of filamentous growth UME6, AHR1, and 187 CPH2 and the hyphae-associated cell wall gene ALS3 (Fig. 4G). We were particularly struck by 188 the fact that UME6 expression was no longer upregulated after 12hr of induction in vitro. Indeed, 189 UME6 expression had returned to the near background levels of expression by 8hr of in vitro

induction and was not different than in yeast phase (Fig. 5A). *UME6* expression is required for the maintenance of hyphal elongation both in vitro and in vivo (7, 20). The decline in the expression of *UME6* after 8hr of in vitro hyphal induction suggests that the hyphal transcriptional program is reduced late in the time course whereas in vivo the activity of this program appears to be maintained longer.

The expression of hyphae-induced genes decreases over time in vitro and correlates with reduced filaments at those time points.

197 To further evaluate the possibility that the hyphal morphogenic and transcriptional 198 program was waning after 4hr in vitro but not in vivo, we compared the expression of 199 transcription factors that positively regulate filamentation in vitro and in vivo. In addition to 200 UME6, the hyphae-induced transcription factors (TFs) BRG1 and TEC1 are upregulated after 201 1hr exposure to RPMIS and 1hr post-infection in vivo (Fig. 5A-C). In vitro, the expression of all 202 three TFs peaks and then falls. In contrast, in vivo expression of UME6, BRG1, and TEC1 203 shows a slower slope of initial induction and then maintains relatively stable levels throughout 204 the time course. The hyphae-associated TFs CPH1 and CPH2 also follow the same pattern of 205 expression but are not as strongly induced (Tables S1 and S2). EFG1 is a critical regulator of 206 the hyphal transcriptional profile under many conditions (21). Interestingly, and in contrast to the 207 other three TFs, EFG1 expression is reduced relative to yeast phase both in vitro and in vivo 208 (Fig. 5D). Finally, expression of the repressor of filamentation NRG1 (22, 23) is also 209 downregulated under both conditions, although this downregulation occurs slightly more rapidly 210 in vivo (Fig. 5E).

211 Consistent with the temporal pattern for the expression of hyphae-induced TFs in vitro, 212 the expression of hyphae-associated target genes *ALS3*, *ECE1*, *HWP1*, *HYR1* and *IHD1* show 213 the same peak and decline over time. Once again, the tempo for the expression of these genes

214 in vivo is distinct with a more gradual increase followed by relatively stable expression over the time course (Fig. 6A-E). We also examined the expression of the yeast-specific cell wall protein 215 216 YWP1 (24) over the time course to see if the reduced expression of hyphae-associated genes 217 was accompanied by a corresponding increase the expression of a yeast associated gene. As 218 shown in Fig. 6F, the expression of YWP1 declines in both in vitro and in vivo conditions and 219 remains low relative to yeast with a slight increase in expression under both conditions after a 220 nadir at 4hr. Thus, despite the reduction in the expression of hyphae-associated TFs and other 221 hyphae associated gene at later time points in vitro, expression of the YWP1 remains low at 222 those same time points relative to yeast phase cells. Overall, the decreased expression of 223 hyphae-associated genes at later time points correlates with the decrease in the proportion of 224 filaments after a peak between at approximately 4hr. The expression of the same genes in vivo 225 is stable over the same time period and also correlates with the stable extent of filamentation 226 over the same time points in vivo.

Over a 24hr time course in vitro filaments generate lateral yeast but in vivo filaments do not.

229 In vitro, yeast cells begin to emerge at subapical cell bodies in a process termed, the 230 hyphae-to-yeast transition. In our previous large-scale screen comparing in vivo filamentation 231 between TF mutants and WT in one-to-one competition experiments (over 150 replicates of WT, 232 ref. 7), we observed very few lateral yeasts on in vivo filaments at the 24hr point. Although the 233 hyphae-to-yeast transition remains a relatively understudied aspect of C. albicans 234 morphogenesis (14), lateral yeast formation is linked to the expression of PES1 (15). Pes1 is a 235 pescadillo protein that is required for yeast growth and lateral yeast formation as well as biofilm 236 dispersion (25). We, therefore, compared the expression of PES1 during in vitro and in vivo 237 filamentation. In vivo, PES1 expression drops dramatically to below or at background for the 238 majority of the time course (Fig. 7A). In contrast, PES1 expression initially increases during in

239 vitro induction and then falls to essentially background by 12hr post-induction. As reported by Shen et al., over-expression of PES1 from the TET- promoter leads to increased lateral yeast 240 241 cell formation during a variety of in vitro hyphae induction conditions (15). We, therefore, tested 242 if this was the case for RPMIS using the same strain generated by Shen et al (15); because 243 previous work indicated that lateral yeast formation tends to increase with time, we extended 244 this experiment to 24hr (14). Consistent with previous reports, the tetO-PES1 strain generated 245 more lateral yeast than a congenic strain with PES1 expressed (pWT-PES1) from its native 246 promoter at all time points (Fig. 7B).

247 To determine if increased expression of PES1 was sufficient to drive lateral yeast 248 formation in vivo, we labelled the tetO-PES1 and pWT-PES1 strains with NEON and iRFP, 249 respectively and inoculated a 1:1 mixture into the ear. In Fig. 7C, we show representative 250 examples of lateral yeast identified in vivo which can be compared to hyphal branching with is 251 shown in Fig. S1A. As shown in Fig. 7D, tetO-PES1 strain formed dramatically more lateral 252 yeast than the strain expressing PES1 from the native promoter. This suggests that the low 253 expression of *PES1* in vivo contributes to the near absence of lateral yeast and that increased 254 PES1 expression is able to drive lateral yeast formation in vivo. Interestingly, increased 255 expression of *PES1* in vitro under some conditions reduces hyphae formation and the length of 256 hyphae (15). However, the *tetO-PES1* strain formed hyphae to the same extent with similar 257 lengths as the comparator strain (Fig. 7E&F).

Finally, reduced cAMP-PKA pathway activity has also been shown to increase the hyphae-to-yeast transition in vitro (26, 27). We found that mutants lacking the PKA pathway components Cyr1 and Tpk1/2 are able to form filaments in vivo (9). We, therefore, examined these strains for in vivo lateral yeast formation but found no significant difference relative control strains (Fig. S1B&C). For these experiments, we compared the *tetO-PES1/pes1* Δ strained to the corresponding *pes1* Δ /*PES1* heterozygous mutant. Therefore, it is possible that the

heterozygous $pes1\Delta/PES1$ has lower lateral yeast formation due to haploinsufficiency (15). However, the lateral yeast formed by the $pes1\Delta/PES1$ mutant is not different than those formed by a SC5314-derived reference strain with both alleles of *PES1* (Fig. S1&C). Taken together, our data indicate that in the first 24hr of filamentation in vivo lateral yeast formation is extremely rare and that low *PES1* expression throughout the course of filamentation is likely to be a contributing factor.

270 Discussion

271 Hyphal morphogenesis remains one of the most intensely studied aspects of *C. albicans* 272 pathobiology (3). Most of this work has taken advantage of the wide range of in vitro media and 273 conditions that induce the transition of C. albicans from a budding yeast morphology to the 274 filamentous hyphal and pseudohyphae. We have begun to characterize this transition in 275 mammalian tissue through the use of a in vivo imaging approach (6, 7, 8, 9). Here, we 276 compared the time-dependence of in vivo filamentation and in the setting of a commonly used 277 "host-like" induction condition (RPMI+10%BCS at 37°C). Although we have found some 278 significant differences between in vivo and in vitro conditions, it is important to first point out the 279 similarities, particularly during early time points. The rapid induction of positive regulators and 280 repression of the major repressor of filamentation is observed under both conditions. By 2hr, 281 there is significant overlap in the transcriptional responses based on a set of genes selected to 282 include hyphae-related genes and environmentally responsive genes.

Generally speaking, recent studies have emphasized the fact that many features of hyphal morphogenesis are dependent upon the specific conditions used to induce that transformation (13). In the two conditions we studied, it appears that glucose availability is low in vitro. This conclusion is a based on the rapid increase in the expression of genes related to gluconeogenesis and alternative carbon metabolism in vitro but not in vivo. One possibility for

this difference is that in vitro cultures have a fixed amount of glucose and other nutrients; once the fixed amount of glucose is depleted, the cells must switch to alternative carbon source metabolism. In vivo, *C. albicans* is in another organism that is delivering glucose and nutrients to its tissues and, as a result, delivering nutrients to *C. albicans*. After 12hr, genes such as that for alternative oxidase, *AOX2*, are beginning to be expressed at high levels, suggesting that the organism is experiencing reduced glucose delivery. This may be due to the beginning of abscess formation or tissue damage and necrosis, leading to disrupted blood flow in the region.

295 The most striking difference between these two conditions is that the expression of 296 positive transcriptional regulators of hyphae morphogenesis and their targets declines sharply in 297 vitro after a peak at the 4hr time point. This reduction in hyphae-associated gene expression 298 correlates with a reduction in the filament-to-yeast ratio between 4hr and 12hr in vitro. The 299 reduction in the filament-to-yeast ratio in vitro also correlates with the appearance of lateral 300 yeast and follows a peak in the expression of the positive regulator of lateral yeast cell 301 development, PES1. These observations suggest that the population of cells begins to express 302 features of the hyphae-to-yeast transition after ~4hr induction. In biofilm conditions, the lateral 303 yeast cells lead to dispersion of yeast cells into the media and we suggest that the increase in 304 lateral yeast cells between 2-4hr and the increase in planktonic yeast cells after 4hr may both 305 be due to the hyphae-to-veast transition (15, 25). Finally, the increase in lateral yeast formation 306 in a strain that overexpresses PES1 in vitro further supports the conclusion that this process is 307 governed, at least in part, by this protein.

In vivo, we observed very little evidence of the hyphae-to-yeast transition during the time course examined. Furthermore, we have observed very few lateral yeasts in vivo up to 24hr post-infection and the filament-to-yeast ratios are stable over the same time period (7). Once again, these morphological observations can be correlated with the expression patterns of positive regulators of hyphae and the best characterized positive regulator of lateral yeast

formation, *PES1*. Specifically, the expression of hyphae-induced transcriptional regulators (*BRG1*, *TEC1*, and *UME6*) increases over the first 1hr and then largely remains stable over the next 12hr and appears to maintain this pattern up to 24hr post infection based on previously reported data (7). This suggests that, in contrast to in vitro hyphae formation, the hyphal transcriptional program remains active throughout the first 12-24hr of in vivo infection.

318 PES1 expression rapidly drops to near undetectable levels in vivo and remains low over 319 the time course. Because lack of PES1 expression inhibits lateral yeast formation in vitro (15, 320 25), this low expression seems likely to contribute to the low numbers of lateral yeast in vivo. As 321 our data indicates, PES1 expression from a heterologous promoter drives lateral yeast 322 formation in vivo at a time point when it does not normally occur. Accordingly, this indicates that 323 PES1 expression is sufficient to trigger lateral yeast formation in vivo and strongly supports the 324 conclusion that low expression of *PES1* is likely to contribute, at least in part, to the low rate of 325 lateral yeast formation in vivo. This low level of PES1 expression is not unique to the ear 326 infection site and we have found similarly low levels of *PES1* expression in both infected kidney 327 and tongue 24hr post-infection (7, 9, 28). Because of its role in virulence, it seems likely that its 328 effects are most important after the initial establishment of infection. Indeed, Uppuluri et al. 329 concluded that the role of *PES1* is most important after the establishment of infection based on 330 the time dependence of its effect on fungal burden (29). Our observation of low expression of 331 PES1 in vivo is consistent with their findings and conclusions.

Our apparent inability to find strong evidence for the hyphae-to-yeast transition in vivo raises the interesting question: why not? A very simple explanation for the low rate of hypha-toyeast transition in vivo may be that the transition may occur later during infection. The high expression of positive transcriptional regulators indicates that hyphal transcriptional program is consistently maintained though out the 24hr period we studied. As such, it seems very possible that the hyphal program begins to wane later in infection, as it does in vitro. Our ability to collect

high resolution morphological data at time points beyond 24hr declines because *C. albicans*begins to form dense micro-abscesses in the ear tissue after 24hr (30).

In addition to providing insights into the dynamics of in vivo filamentation, our data have implications for the study of *C. albicans* filamentation in vitro. Specifically, the both the transcriptional and morphological features of the filamentation program in a given medium are likely to vary considerably over time, particularly in later time points. Therefore, it is important to be sure that the selected time point represents the specific stage of filamentation in which one is interested.

346 In summary, this works provides insights into the temporal dynamics of filamentation in 347 mammalian tissue, allowing the identification of similarities and differences with a widely 348 employed host-like in vitro conditions. Our previous work has found that there are significant 349 differences in the sets of TFs (7) and protein kinases (9) that regulate in vivo filamentation 350 relative to in vitro conditions. Many factors are likely to contribute to the differences in the 351 regulatory factors required for in vivo filamentation. Based on this work, it seems likely that 352 some of these differences could be due, at least in part, to the distinct environmental conditions 353 encountered during infection and differences in the tempo of morphogenesis.

354

355 Materials and methods

Strains and media. The SC5314-derived *C. albicans* reference strain SN250 was used for all experiments except for those involving *PES1* mutant strains. The *pes1* Δ /*PES1* and *tet0-PES1* strains (15) were generous gifts of Julia Köhler (Harvard) and are in the SC5314 background. All *C. albicans* strains were precultured overnight in yeast peptone dextrose (YPD) medium at 30°C with shaking. Standard recipes were used to prepare YPD (31). RPMI 1640 medium was supplemented with bovine calf serum (10% vol/vol). In vitro hyphal induction. For in vitro hyphal induction, *C. albicans* strain was incubated
overnight at 30°C in YPD media, harvested, and diluted into RPMI + 10% bovine calf serum at a
1:50 ratio and incubated at 37°C. Cells were collected at the different time points (e.g., 1hr, 2hr,
4hr, 8hr, and 12hr) and processed for microscopy or RNA isolation as described below.

366 In vitro characterization of *C. albicans* morphology. Induced cells were fixed with 1% (v/v) 367 formaldehyde. Fixed cells were then imaged using the Echo Rebel upright microscope with a 368 60x objective. The assays were conducted in triplicates on different days to confirm 369 reproducibility.

370 In vivo characterization of *C. albicans* morphology. These assays were performed as previously described (6). Briefly, 1 X 10⁶ WT *C. albicans* cells were inoculated intradermally in 371 372 mouse ear (3 mice/time point). Mice (3 mice/time point) were sacrificed at each time points, and 373 ears were harvested. One ear/mouse was immediately submerged into the ice-cold RNA later 374 solution and another ear used for the imaging. A multiple Z stacks (minimum 20) were acquired 375 and used it to score the yeast vs filamentous ratio. Round and/or budded cells were considered 376 "Yeast", whereas if the cells contain intact mother and filamentous which was at least twice the 377 length of the mother body, were considered "filamentous." Lateral yeast cells were distinguished 378 from branching hyphae by requiring lateral yeast cells to be no more than two cell body lengths 379 long and have curved than parallel cell walls (See Fig. 7C and Fig. S1A). A minimum of 100 380 cells from multiple fields were scored. Student's t test was performed to define the statistical 381 significance between the different time points. All animal experiments were approved by the 382 University of Iowa IACUC.

RNA extraction. In vitro and in vivo RNA extraction was carried out as described previously (7,
9). For in vitro RNA extraction, cells were collected at the different time points, centrifuged for 2
min at 10K rpm at room temperature and RNA was extracted according to the manufacturer

386 protocol (MasterPure Yeast RNA Purification Kit). For in vivo RNA extraction, mice were 387 euthanized, ear tissue harvested and the tissue placed into the ice-cold RNA-Later solution. Ear 388 tissue was then transferred to the mortar and flash frozen with liquid nitrogen. Using pestle, the 389 frozen was ground to the fine powder. The resulting powder was collected and 1 ml of ice-cold 390 Trizol was added. The samples were placed on a rocker at RT for 15 min and then centrifuged at 10K at 4[°] C for 10 min. The cleared Trizol was collected into 1.5 ml Eppendorf tube and 200 391 392 µl of RNase free chloroform was added to each sample. The tubes were shaken vigorously for 393 15 s and kept at RT for 5 min followed by centrifuge at 12K rpm at 4° C for 15 min. The cleared 394 aqueous layer was then collected to a new 1.5 ml Eppendorf tube and RNA was further 395 extracted following the Qiagen RNeasy kit protocol.

396 NanoString® gene expression analysis. NanoString analysis was carried out as described 397 previously (7, 9). Briefly, in total, 40 ng of in vitro or 1.4 µg of in vivo RNA was added to a NanoString codeset mix and incubated at 65[°] C for 18 hours. After hybridization reaction, 398 399 samples were proceeded to nCounter prep station and samples were scanned on an nCounter 400 digital analyzer. nCounter .RCC files for each sample were imported into nSolver software to 401 evaluate the quality control metrics. Background subtraction was performed using negative 402 control probes to establish a background threshold, which was then subtracted from the raw 403 counts. The resulting background subtracted total raw RNA counts underwent a two-step 404 normalization process. First normalized against the highest total counts from the biological 405 triplicates and then to the wild type samples. Differentially expressed genes were defined as 406 those with \pm 2-fold change in expression with an FDR <0.1 as determined by Benjamini-Yeuketil 407 procedure when compared to expression in the yeast phase inoculum which was grown 408 overnight at 30°C in rich medium (yeast peptone with 2% dextrose, YPD).

409 Software. Quantitative image analysis was carried out using ImageJ software. GraphPad Prism
410 (V. 9.3.1) was used to plot the graphs and to perform the statistical tests.

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- 501

502 Data Availability Statement

503 All raw (source) data and normalized data large-scale expression data generated by Nanostring

- are provided in Supplementary Tables 1 and 2. The bright field and confocal microscopy Z-
- 505 stacks and images used to characterize *C. albicans* morphology at the different time points are

- 506 very large files that are not easily deposited or annotated for deposit in public repositories.
- 507 Therefore, the source data for the imaging figures are available from the corresponding author
- 508 to interested investigators on reasonable request.
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- 511
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- 514 Figure Legends

515 **Figure 1. Time course of in vivo** *C. albicans* **filamentation**. **A**. Diagram of time course

- 516 experiment. **B.** Representative 2-D fields from confocal microscopy of NEON-labeled SN250
- 517 strain in ear tissue at the indicated time points after infection. **C**. Quantification of percent
- 518 filamentous cells at the indicated time points. Asterisks indicated significant difference between
- time points (p < 0.05 *, ANOVA with Tukey's method of multiple comparison correction). **D.** The
- 520 length of filaments at the indicated time points. Asterisks indicate significant difference between
- 521 the groups ($p < 0.05^{\circ}$, Mann Whitney test).
- 522
- 523 Figure 2. Time course of in vivo *C. albicans* filamentation. A. Representative bright field
- 524 images of cell morphology following hyphal induction in RPMI tissue culture medium
- 525 supplemented with 10% bovine calf serum at 37°C for the indicated times. **B**. Quantification of
- 526 percent filamentous cells at the indicated time points. Asterisk indicated significant difference
- 527 between time points (p < 0.05 *, ANOVA with Tukey's method of multiple comparison
- 528 correction). **C.** The length of filaments at the indicated time points. Asterisks indicate significant
- 529 difference between the groups (p < 0.05 *, Mann Whitney test).
- 530

531 Figure 3. Nanostring analysis of gene expression over time for in vivo and in vitro

filamentation. Volcano plots showing genes with significant ($\log_2 \pm 1$; FDR<0.1, Benjamini method) increase (red dots) or decrease (blue dots) at the indicated time points for in vivo filamentation (**A**) and in vitro filamentation (**B**). Expression is normalized to yeast phase cells used to infect mice or inoculate in vitro cultures. The numbers in the two quadrants indicate total number of differentially expressed genes for that region of the plot.

537

538 Figure 4. Distinct patterns of upregulated genes during in vitro and in vivo filamentation.

539 Venn diagrams comparing the profiles of upregulated genes in vitro and in vivo at 1hr (A); 2hr

540 (B); 4hr (C); 8hr (D) and 12hr (E). F. Set of alternative carbon metabolism genes upregulated at

541 the 2hr time point during in vitro induction relative to yeast inoculum (* indicates FDR <0.1) but

not significantly different from inoculum in vivo. G. Set of hypha-associated genes upregulated

543 in vivo at the 12hr time point relative to yeast inoculum (* indicates FDR <0.1) but not

significantly different from inoculum in vitro. Bars indicate normalized mRNA counts from three

545 independent experiments with error bars indicating standard deviation.

546

547 Figure 5. Comparison the dynamics of expression for hyphae-associated transcriptional

regulators during in vitro and in vivo filamentation. **A**. Normalized mRNA counts for the

expression of UME6 (A), BRG1 (B), TEC1 (C), EFG1 (D), and NRG1 (E) at the indicated time
points. Bars indicate normalized mRNA counts from three independent experiments with error

551 bars indicating standard deviation.

552

553 Figure 6. Comparison the dynamics of expression for hyphae- and yeast associated

554 genes during in vitro and in vivo filamentation. A. Normalized mRNA counts for the

555 expression of ECE1 (A), HWP1 (B), ALS3 (C), HYR1 (D), IHD1 (E) and YWP1 (F) at the

556 indicated time points. Bars indicate normalized mRNA counts from three independent

557 experiments with error bars indicating standard deviation.

558

559 Figure 7. Heterologous expression of *PES1* is sufficient to induce lateral yeast formation

560 **in vivo. A.** Normalized mRNA counts for the expression of *PES1*. Bars indicate normalized

561 mRNA counts from three independent experiments with error bars indicating standard deviation.

562 **B**. Effect of heterologous expression of *PES1* on lateral yeast formation over time course of in

563 vitro hyphal induction. Bars indicate percentage of filaments with lateral yeast cells. * indicates

statistically significant difference between groups (two-way ANOVA corrected for multiple

565 comparisons with Sidak's test). **C**. Representative images of lateral yeast in vitro and in vivo. **D**.

566 Lateral yeast formation in vivo for *pes1*Δ/*PES1* and *tetO-PES1* 24hr post-infection. Bars indicate

567 means from two independent experiments with standard deviation indicated by error bars. ****

indicates p <0.0001 by Student's t test. E. Representative images of the pes1△/PES1 and tetO-

569 *PES1* mutant morphologies in vivo. **F**. Quantification of % filamentous cells and filament length

for the $pes1\Delta/PES1$ and *tetO-PES1* mutant strains. NS indicates no significant difference by

571 Student's t test (% filamentous cells) and Mann-Whitney test (filament length).

572

573 Supplementary Tables and Figure

574 **Table S1.** Nanostring data for in vivo time course with raw counts, background corrected

575 counts, normalized counts, fold change for each gene relative to either yeast phase, Student t-

test values, and FDR calculated by the Benjamini-Yekutieli method. Differentially expressed

577 genes were defined as those genes with ± 2 -fold change in expression with FDR <0.1.

578 Significantly upregulated genes are indicated by green fold change values at the time point in

579 which they are differentially expressed; red indicates downregulated at that time point.

580

581	Table S2. Nanostring data for in vitro time course with raw counts, background corrected
582	counts, normalized counts, fold change for each gene relative to yeast phase, Student's test
583	values, and FDR calculated by the Benjamini-Yekutieli method. Differentially expressed genes
584	were defined as those genes with \pm 2-fold change in expression with FDR <0.1. Significantly
585	upregulated genes are indicated by green fold change values at the time point in which they are
586	differentially expressed; red indicates downregulated at that time point.
587	
588	Supplementary Figure S1. A. Representative images of hyphal branching in vitro and in vivo.
589	Lateral yeast formation in vivo for cyr1 $\Delta\Delta$ (B) and tpk1 $\Delta\Delta$ tpk2 $\Delta\Delta$ (C) mutants 24hr post-
589 590	Lateral yeast formation in vivo for $cyr1\Delta\Delta$ (B) and $tpk1\Delta\Delta$ $tpk2\Delta\Delta$ (C) mutants 24hr post- infection. Bars indicate means from two independent experiments with standard deviation
589 590 591	Lateral yeast formation in vivo for $cyr1\Delta\Delta$ (B) and $tpk1\Delta\Delta$ $tpk2\Delta\Delta$ (C) mutants 24hr post- infection. Bars indicate means from two independent experiments with standard deviation indicated by error bars. There were no significant differences (p> 0.05) between groups by
589 590 591 592	Lateral yeast formation in vivo for $cyr1\Delta\Delta$ (B) and $tpk1\Delta\Delta$ $tpk2\Delta\Delta$ (C) mutants 24hr post- infection. Bars indicate means from two independent experiments with standard deviation indicated by error bars. There were no significant differences (p> 0.05) between groups by Student's t test.
589 590 591 592 593	Lateral yeast formation in vivo for <i>cyr1</i> $\Delta\Delta$ (B) and <i>tpk1</i> $\Delta\Delta$ <i>tpk2</i> $\Delta\Delta$ (C) mutants 24hr post- infection. Bars indicate means from two independent experiments with standard deviation indicated by error bars. There were no significant differences (p> 0.05) between groups by Student's t test.

Figure 1



В

Α

1hr

2hr

4hr

8hr



D



% Filamentous Cells





Figure 2

1hr 2hr 4hr 8hr 12hr Image: Second sec



Α





8hr

12hr





Figure 5





ż

Time (Hours)

Â

8

12

Ó

1

BRG1





Figure 6





