Host-pathogen transcriptomics of macrophages, Mucorales and their endosymbionts: a polymicrobial pas de trois

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#### Abstract

Mucorales spores, the causative agents of mucormycosis, interact with the innate immune system to cause acute, chronic, or resolving infection. Understanding the factors that influence disease initiation and progression is key to understanding mucormycosis and developing new treatments. Complicating this, mucormycosis can be caused by a number of species that span the Mucorales genus and may be host to bacterial endosymbionts. This study sets out to examine the differences between two species in the Mucorales order by characterising their differential interactions with the innate immune system, and their interactions with environmental bacterial endosymbionts. Through a holistic approach, this study examines the transcriptional responses of Rhizopus delemar and Rhizopus microsporus, two of the most commonly diagnosed species, to innate immune cells. This study also examines the immune cell response and assesses the variation in these responses, given the presence or absence of bacterial endosymbionts within the fungi. We see that the fungal response is driven by interaction with innate immune cells. The effect of the bacterial endosymbiont on the fungus is species specific, with a minimal in the absence of stress, but strongly influencing fungal transcripts during interaction with innate immune cells. In contrast, we observe that the macrophage response varies depending on the infecting fungal species, but also depending on endosymbiont status. The most successful macrophages elicit a pro-inflammatory response, and we see that through germination inhibition macrophage survival is enhanced. This work reveals species-specific host responses to related Mucorales spores and shows that bacterial endosymbionts impact the innate immune cell response.


## Introduction

Mucormycosis is a devastating, environmentally acquired fungal infection caused by a variety of Mucorales species. Understanding the interaction between Mucorales spores and innate immune cells is key to understanding mucormycosis. Studies frequently focus upon the interaction of a single species of the Mucorales order with innate immune cells (Warris
et al. 2005; Chamilos et al. 2008; Schmidt et al. 2013; Kraibooj et al. 2014; Inglesfield et al. 2018). However, between Mucorales species, and across infecting isolates, numerous phenotypic and genomic differences can be observed (Hoffmann et al. 2013; Mendoza et al. 2014; Schwartze et al. 2014). Whether each species within this family employs the same mechanism to cause infection remains unclear, however the range of virulence profiles displayed across the family indicates there may be diversified mechanisms at work (Petraitis et al. 2013). For example, it has been shown that pathogenicity of these species is linked to the variable copy number of the gene encoding CotH, a family of cell surface proteins important for the spores' interactions with and adherence to endothelial cells. Ironscavenging and melanisation pathways have also been shown to play a role in pathogenicity (Chibucos et al. 2016, Andrianaki et al. 2018). In addition to fungal genome plasticity and transcriptional responses to host stimuli, fungal-host interactions can be further modulated by bacterial endosymbionts (Itabangi et al., 2019; Partida-Martinez \& Hertweck 2005). The majority of Mucorales species have been shown to harbour bacterial endosymbionts whose species can vary between Mucorales isolates (Ibrahim et al. 2008; Kobayashi \& Crouch 2009; Mondo et al. 2017; Itabangi et al. 2019). We have recently shown that a bacterial endosymbiont influences the outcome of Rhizopus microsporus infections in both zebrafish and murine models through modulation of both fungal and phagocyte phenotypes (Itabangi et al. 2019). However, the impact of endosymbiont on fungal and host transcriptional response remains unclear.

While disease can be caused by several species in the Mucorales order, Rhizopus delemar and Rhizopus microsporus are responsible for the majority of infections (Liu et al. 2018). Risk factors for developing the disease include, but are not limited to: innate immune cell deficiencies, uncontrolled diabetes, immune suppression, skin barrier breaches and iron overload (Baldin \& Ibrahim 2017). With limited antifungal treatments effective against these invasive infections, there is often a need for surgical debridement or amputation (Spellberg et al. 2016). In disseminated cases, mucormycosis may present with a mortality rate of over 90\% (Mendoza et al. 2014). Reports of chronic mucormycosis have also emerged, affecting both immunocompromised and immunocompetent patients (Alan et al. 2019). The innate immune response to Mucorales spores is key to infection control: macrophages are required to induce a differential immune response on contact with Rhizopus spp. and may inhibit germination or kill hyphal forms upon contact in healthy individuals (Ghuman \& Voelz 2017; Andrianaki et al. 2018). Single and multi-species studies have shown that phagosome maturation is arrested by melanin within the cell walls of Aspergillus spp. and Rhizopus spp., however iron limitation allows macrophages to more effectively kill Rhizopus spp.(Liu et al. 2015; Ibrahim et al. 2010; Andrianaki et al. 2018). Several works comparing Aspergillus spp. to Rhizopus spp. have revealed similar immunostimulatory capacities, but differences in their responses to host stress (Warris et al. 2005; Chamilos et al. 2008; Schmidt et al. 2013; Kraibooj et al. 2014). Exploring and understanding fungal responses to the host is essential to improving our understanding of mucormycosis, yet it remains unclear how Mucorales species respond to, and interact with, the innate immune system, and to what extent this varies by species.

Our work explores the interplay between the innate immune system, $R$. delemar, and $R$. microsporus using isolates of both species found to harbour bacterial endosymbionts (Itabangi et al. 2019). We investigate the differences between these two fungal species, how
they respond transcriptionally to innate immune cells, and how their respective bacterial endosymbionts affect this interaction. We also investigate the transcriptional response of innate immune cells to these infectious spores and determine how this interaction is influenced by the presence of an endosymbiont. We reveal a large difference between the fungal transcriptional profiles of $R$. delemar and $R$. microsporus during in vitro monoculture. There is a small conserved response to exposure to innate immune cells, including key changes in cell wall genes, consistent with germination. Conversely, we see that the host innate immune response differs significantly between fungal species and is also influenced by the presence or lack of an endosymbiont. The innate immune response to $R$. delemar and R. microsporus mirrors the relative aggressiveness of infection between these two species. We also observe that through the activation of innate immune cells, or upon inhibition of chitin synthase, we can improve the ability of innate immune cells to control the fungal spores. Our work represents a broad analysis of the transcriptional interplay between innate immune responders and infectious Mucorales spores, revealing species-species differences which question the current model of 'one species represents all', when it comes to mucormycosis.

## Results

## Experimental Design

We set out to investigate paired transcriptional responses of host and fungal cells, whilst also exploring the influence of the endosymbiont on this interaction (Figure 1a). Fungal spores from Rhizopus delemar and Rhizopus microsporus were either cured via ciprofloxacin treatment to remove the bacterial endosymbiont (cured) or maintained in media permissive to bacterial endosymbiosis ( wt ). Cured spores were passaged twice in the absence of ciprofloxacin to limit the impact of the drug on transcriptional responses. The cured and wt spores of both R. delemar and R. microsporus were allowed to swell in sabouraud broth until $95 \%$ of the population had reached mid isotropic phase. Due to the differences in germination rates between the species (Figure 1b), this occurred at 2 hours for R. delemar and 4 hours for $R$. microsporus. Swollen spores were then used to infect the J774.1 murine macrophage-like cell line. Fungal spores were co-cultured with macrophages for one hour, after which unengulfed spores were removed, and phagocytosed spores were incubated within the macrophages for a further two hours. The cells from the resulting infection were processed to explore their transcriptional response to this infection scenario (Figure 1a). Macrophages that had phagocytosed fungal spores were isolated and sequenced via the 10X Genomics Chromium Single Cell Sequencing platform. Macrophages left unexposed to the fungi were used as a negative control. RNA was also isolated from fungal spores (cured and wt) which had been engulfed by macrophages, and this was sequenced with a bulk RNA-Seq approach. Unexposed fungi (cured and wt) were incubated in macrophage media for a matched time and used as a negative control. The data shows the fungal response to phagocytosis by macrophages, as well as the fungal response to the presence of its endosymbiont. The macrophage response to the two species is also revealed, a response which appears to differ when the endosymbiont is present for both fungal species.

## Comparative genomics predicts alternative transcriptional responses

In order to better understand differential disease progression, we chose to compare $R$. delemar and $R$. microsporus, as they cause a large proportion of mucormycosis infections but appear morphologically dissimilar. $R$. delemar germinates more quickly than $R$. microsporus, with $50 \%$ of spores germinating by 3 hours, and a spore body size which reaches $12.8 \mu \mathrm{~m}$ over the course of germination (Figure 1b, c). R. microsporus germinates at a significantly slower rate, taking 6 hours for $50 \%$ of spores to germinate, with a final spore body size of $13.9 \mu \mathrm{~m}$ (Figure 1b, c). To better understand their relationship to one another, we compared the gene content to explore the similarity and differences between the two species. Previous work has established that the $R$. delemar genome ( $45.3 \mathrm{Mb}, 17,513$ genes) is larger, and contains an increased number of genes, compared to R. microsporus genome ( $26 \mathrm{Mb}, 10,959$ genes) (Ma et al. 2009; Mondo et al. 2017). Our results show that, compared to $R$. microsporus, the genome of $R$. delemar is enriched for genes with protein domains (PFAM) associated with ion binding, carbohydrate derivative binding, nucleic acid binding, cytoskeletal protein binding, poly(A) binding, NAD+ ADP-ribosyltransferase activity, protein kinase C activity, translation initiation factor binding and inorganic phosphate transmembrane transporter activity (Supplemental Figure S1, Figure 1d). R. microsporus is enriched for genes with protein domains corresponding to nucleoside phosphate binding, early endosome activity and DNA repair complex activity (Supplemental Figure S1, Figure 1d). The clear differences illustrated by genome size and gene content indicate the likelihood of alternative transcriptional responses.

Alternative transcriptional profiles are presented by $R$. delemar and R. microsporus in response to innate immune cells

First we examined overall trends in fungal responses to phagocytosis, obtained through our bulk RNA-Seq approach. We analysed the signal obtained from $R$. delemar and $R$. microsporus samples with principle component analysis (PCA) (Figure 2). We observed large differences between the transcriptomes of both fungal species, when exposed or unexposed to macrophages, while the presence or absence of their respective endosymbionts had a weak but differential effect on PCA. The presence or absence of the endosymbiont appears to have very little bearing on the transcriptional patterns displayed by $R$. delemar, as samples fell into two distinct clusters, most strongly influenced by macrophage status (Figure 2a). R. microsporus exhibits a similar trend upon exposure to macrophages, however the presence of the endosymbiont also influenced clustering (Figure 2b). We investigate the phenotypic consequences of this interaction in the companion paper by Itabangi et al., showing that the presence of the endosymbiont Ralstonia pickettii impacts fungal cell wall organization, resistance to host-relevant stress, spore germination efficiency, and pathogenesis (Itabangi et al., 2019). Therefore, we focus here on the transcriptional analysis of the host-pathogen-endosymbiont interaction across the two species.

There are 2,493 genes that are significantly differentially expressed (Log fold change $>2$; false discovery rate $<0.05$ ) in $R$. delemar across all conditions (Figure 3a), while $R$. microsporus only exhibits 40 genes significantly differentially expressed across all conditions (Log fold change > 2; false discovery rate < 0.05) (Figure 3b). The theme of a muted
transcriptional response from $R$. microsporus is also seen within pairwise comparisons of conditions. Pairwise comparisons of differential expression across each experimental condition show similar trends in responses between $R$. delemar and R. microsporus, however $R$. microsporus responds with a reduced gene set (Figure 4). Pairwise comparisons showed the biggest shift in transcriptional response when comparing phagocytosed fungal spores to those unexposed to macrophages, regardless of endosymbiont status. When phagocytosed (Supplemental Figure S2), R. microsporus upregulates genes enriched in GO categories corresponding to thiamine metabolism, sulfur metabolism, glycerol metabolism, alcohol dehydrogenase activity and transmembrane transporter activity (hypergeometric test, corrected $P$ value < 0.05 ). This is consistent with the fungal response seen to macrophage stress (Parente-Rocha et al. 2015), and the micronutrient scavenging response to nutritional immunity (Ballou and Wilson 2016; Shen et al., 2018; Andrianaki et al., 2018). Phagocytosed $R$. microsporus downregulated genes enriched in GO categories corresponding to rRNA processing, ribosome biogenesis and ribosome localization (hypergeometric test, corrected $P$ value < 0.05) (Supplemental Figure S2), consistent with growth arrest within the phagolysosome (Inglesfield et al. 2018; Andrianaki et al. 2018).

Comparisons of $R$. delemar conditions reveal that, upon phagocytosis, spores upregulate genes enriched in KEGG classifications corresponding to MAPK signalling, phenylalanine metabolism, tyrosine metabolism, glutathione metabolism and fatty acid synthesis (hypergeometric test, corrected $P$ value < 0.05 ). Upregulation of these processes is consistent with melanin biosynthesis (Eisenman et al. 2011; Andrianaki et al. 2018) and intra-phagosomal survival (Yadav et al., 2011; Lorenz and Fink, 2005). Unexposed R. delemar spores upregulate genes enriched in KEGG classifications corresponding to ketone body synthesis, protein processing via the endoplasmic reticulum, amino sugar and nucleotide sugar metabolism (hypergeometric test, corrected $P$ value $<0.05$ ). This is consistent with metabolic activation and cell wall biogenesis (Figure 5).
R. delemar and R. microsporus harbour distinct bacterial endosymbionts (Itabangi et al., 2019). When comparing transcriptional profiles of wt and cured spores incubated in serumfree DMEM (sfDMEM) for 3 hours (time matched to phagocytosis assay), we observed very few transcriptional changes in either species in response to curing (Supplemental Table 1). In $R$. delemar, a single gene, predicted to be a putative protein phosphatase, was repressed. In R. microsporus, three genes were induced: an autophagy-related protein, a C 2 H 2 zinc finger transcription factor, and ribosomal protein L2.

Despite these small changes, loss of the endosymbiont significantly impacted the transcriptional responses of both fungal species to macrophages (Figure 4). Specifically, we observed an overall increase in the number of fungal genes differentially regulated upon phagocytosis for both species. Exposure of wt $R$. microsporus to macrophages induced the expression of one gene with no known function and repressed 6 genes. The repressed genes include an autophagy-related protein and a zinc finger transcription factor, as well as 4 unannotated genes (Figure 4, Supplemental Table S1). In contrast, when cured R. microsporus spores were exposed to macrophages, 277 genes were significantly induced and 82 repressed, compared to unexposed cured spores (Figure 4). Induced genes were enriched (hypergeometric test, corrected $P$ value < 0.05 ) for the following GO categories: organelle organisation, pre-ribosome and ribosome activity, ATPase activity, hydrolase activity,
pyrophosphatase activity, helicase activity, nucleic acid binding, RNA metabolism, nitrogen metabolism, chromatin silencing. Repressed genes were enriched (hypergeometric test, corrected $P$ value < 0.05 ) for the following GO categories: oxidoreductase activity, hydrogen sulphide metabolism, glycolysis, sulphur metabolism, hexose catabolism, siderophore activity, iron assimilation, nitrogen metabolism, carboxylic acid metabolism. This suggests an overall failure to properly respond to host stresses such as iron starvation in the absence of the bacterial endosymbiont.

A similar impact of the endosymbiont was observed for $R$. delemar. While the overall fungal response to phagocytosis is characterized by a robust transcriptional response, induced genes in wt samples (1137 genes, Figure 4) were enriched for KEGG classifications corresponding to: alanine metabolism, PPAR signalling, aromatic compound biosynthesis and degradation, lysine metabolism, lipid metabolism, MAPK signalling, sugar metabolism, tyrosine metabolism, secondary metabolite biosynthesis (Figure 5). Repressed genes in wt samples (472 genes, Figure 4) were enriched for KEGG classifications corresponding to: carbohydrate metabolism, secondary metabolite biosynthesis, ketone body processing, protein processes, MAPK signalling (Figure 5). In contrast, induced genes in cured samples (1285 genes, Figure 4) were enriched for KEGG classifications corresponding to: Fatty acid metabolism, DNA replication, amino acid metabolism, glycan metabolism, pyruvate metabolism, secondary metabolite processing (Figure 5). Repressed genes in cured samples (878 genes, Figure 4) were enriched for KEGG classifications corresponding to: sugar metabolism, amino acid metabolism, lipid metabolism, MAPK signalling, NOD-like receptor signalling. Again, this suggests that the endosymbiont has an overall suppressive impact on fungal transcription in response to macrophage challenge.

Next, we directly compared the transcription patterns of genes shared across the two fungal species. When comparing the transcriptional responses of orthologous genes shared by $R$. delemar and R. microsporus, we saw only a small proportion behave similarly ( 213 genes). When phagocytosed, wt spores from both species upregulate orthologues genes involved in fatty acid catabolism, transcription, regulation via polymerase II, and organelle organization. Phagocytosed cured spores from both species upregulate orthologues genes involved in RNA processing, chromosome organization and condensed chromosome pathways. When unexposed, we see wt spores upregulate orthologous genes involved in translocation, protein binding, siderophore activity, cobalmin processing, and post-translational protein targeting. Cured unexposed spores upregulate orthologous genes with roles in siderophore activity and transferase activity. Overall, $R$. delemar and $R$. microsporus both respond transcriptionally to the presence of macrophages, however the size and composition of this response differs between species.

Finally, we examined the regulation of genes predicted to be involved in ferrous iron transport, as previous work has linked iron scavenging to survival within the phagolysosome (Andrianaki et al., 2018). There are 12 genes in the $R$. delemar genome with predicted ferrous iron roles. While 8 showed no significant change over the tested conditions, 3 (ROG3_006623, ROG3_007727, ROG3_011864) appeared highly expressed in wt and cured phagocytosed spores, compared to unexposed spores. The last gene, ROG3_009943, is highly expressed in wt spores unexposed to macrophages. Together, this suggests there
may be condition dependent specialization in the expression of ferrous iron transport in $R$. delemar.

Innate immune cell transcription varies with fungal species and endosymbiont presence

To investigate the innate immune response when challenged with $R$. delemar and $R$. microsporus, we carried out single cell RNA-Seq of J774.A1 murine macrophages, unexposed and exposed for 3 hours to the four types of pre-swollen spores (Figure 1a). Transcription of both challenged and unchallenged macrophages displayed underlying population heterogeneity (Supplemental Figure S3). To identify the transcriptional patterns of genes responding to the spores, we focused on the expression of a subset of genes previously identified as immune response genes (Muñoz et al. 2018). Principle component analysis of the aggregated transcriptional data shows there is a clear difference in transcription between macrophages that have and have not been exposed to the fungi (Figure 6). Across all exposed conditions, relative to unexposed macrophages, there was a profile consistent with cytokine activation, response to stimulus, and activation of the NF-Kb pathway. This was accompanied by repression of CCL5, which is involved in T-cell recruitment (Figure 7). However, different macrophage profiles can be seen in response to the two fungal species, and these are further influenced by the presence of the endosymbiont. While the response to wt $R$. delemar shows the most deviation from the macrophage-only control, exposure to cured $R$. delemar also elicited a strong and distinct macrophage response (Figures 6,7). Exposure to wt R. delemar elicits increased expression of general markers of activation, including GTPase activity and MHC class II protein binding (LAG3 repressor of T-cell activation, H2-M2, IFN-gamma induced IIGP1, MX1, KCTD14, PNP2), growth factor binding, IL1 receptor agonist activity and endocytosis (SERPINE1, ENG, FGFBP3, GM8898, GCNT2, IL1F6). Specifically, we observe modest increases in the expression of IFN- $\gamma$ responsive CXCL10 (3.1 fold) and IRG1/IRG11 ( 5.9 fold), pro-inflammatory SAA3 ( 3.5 fold), and ENPP4 ( 2.8 fold), but also induction of the M 2 polarizing PSTPIP2/21 ( 6.7 fold), the IL-4 responsive signaling modulator CISH (5.4 fold), and the vascular damage responsive F3/F31 (5.9 fold) (Martinez et al. 2013). These latter genes are not as strongly induced during exposure to $R$. microsporus, which may reflect the aggressive nature of infection by $R$. delemar relative to R. microsporus. In contrast, infection with cured $R$. delemar showed a decrease in the induction of these M2-polarisation markers (PSTPIP2, 3.5 fold relative to uninduced). The transcriptional profile is instead shifted to include increased transcription of genes involved in $G$ protein signaling and phosphoinositide binding (PDE7B, CCL1, SCARF1, RGS16, PLEKHA4) (Figure 7).

A similar change in macrophage polarization was observed during exposure to wt and cured R. microsporus. The phenotypic analysis of this is discussed more fully in Itabangi et al. 2019. For both wt and cured $R$. microsporus, expression of IFN- $\gamma$ responsive CXCL10, SAA3, and ENPP4 was comparable to unexposed macrophages. Compared to $R$. delemar, exposure to wt $R$. microsporus induced a more limited expression of genes with roles in cytokine activation, ERK1 and ERK2 regulation, and regulation of NF-kB cascade (Figure 7). There was also a weaker induction of the vascular damage responsive F3/F31 genes, and a relatively stronger upregulation of the PLA2G16 phospholipase, TRIM30D, SLC1A2 and the M2 polarizing IL-6. However, other key polarizing genes, particularly PSTPIP2/21, SAA3, and

ENPP4 were only weakly induced (Supplemental Table S2). Overall, this profile suggests a weak M1-like activation consistent with poor phagocytosis and reduced overall antifungal activity that we observe in macrophages interacting with endosymbiont-harbouring spores (Itabangi et al., 2019).

Finally, cured R. microsporus induced a strong pro-inflammatory response, which included upregulation of CXCL3, the neutrophil chemoattractant, consistent with our observations of differences in phagocyte recruitment in zebrafish upon infection with wt vs. cured spores (Itabangi et al., 2019). Markers of NF-kB activation were also strongly induced in this population. Cured $R$. microsporus also strongly induced the expression of TNFRSF8 (CD30), a marker of lymphocyte activation occasionally associated with subcutaneous fungal infections. Overall, this is suggestive of a shift to a more pro-inflammatory profile. In our companion paper, we observed that cured $R$. microsporus is more sensitive to phagocytemediated killing and phagocyte recruitment compared to wt (Itabangi et al., 2019). We therefore went on to test whether a more successful response to the spores could be mounted via the induction of a pro-inflammatory response.

## Chitin synthase inhibition and pro-inflammatory priming regulate infection outcome

R. delemar exhibits rapid germination followed by hyphal extension (Sephton-Clark et al., 2018). The transcriptional profile we observe here in macrophages exposed to R. delemar is consistent with a strong damage response, likely prompted by the germination of $R$. delemar spores. We therefore hypothesised that macrophages may be better able to control the infection if the fungi were slowed in their developmental progress. The necessity of genes involved in chitin synthesis and regulation appeared important for both R. delemar and R. microsporus in response to phagocytosis (Supplemental Figure S4). In previous work we also highlighted the importance of chitin synthase for germination (Sephton-Clark et al. 2018). When fungal spores were pre-treated with the chitin synthesis inhibitor Nikkomycin Z $(24 \mu \mathrm{~g} / \mathrm{ml})$, spores failed to germinate, displayed less chitin/chitosan in their outer cell wall (Supplemental Figure S5) and macrophage survival was increased at 7.5 hours post infection (Figure 8). At Nikkomycin Z concentrations lower than those used to pre-treat spores for phagocytosis, we see the spores are able to swell, however development appears halted after swelling (Supplemental Figure S5). As the macrophages are better able to control these spores, this suggests that spores undergoing the initial stages of germination may offer less of a challenge for the macrophages.

Our transcriptional data show a strong M2 alternative activation signal during R. delemarmacrophage interaction, but a weaker M2 polarisation during $R$. microsporus-macrophage interaction that was further shifted towards NF-kB-mediated M1 upon endosymbiont cure. We therefore hypothesized that shifting the macrophage polarization towards M1 classical activation might have a protective effect upon Mucorales infection. Consistent with this, the pre-treatment of macrophages with NF-kB activating lipopolysaccharide (LPS) significantly improved the ability of macrophages to control $R$. microsporus. At 7.5 hours post infection, $59.7 \%$ of macrophages survived when pre-treated with LPS, compared to $24.6 \%$ without (Figure 8).

## Discussion

In this work we show the fungal response to innate immune cells differs by species in the Rhizopodaceae family. Although R. delemar and R. microsporus share a small conserved response to exposure to macrophages, the majority of their response differs. We show that the ability to germinate prior to phagocyte control appears to be key to virulence, as blocking spore germination with the chitin synthase inhibitor Nikkomycin Z improves macrophage survival. A range of germination and virulence phenotypes can be seen throughout the Mucorales, and this highlights a need for further investigation into these differences, to better understand the infections they cause.

We have also shown that the fungal transcriptional response appears largely unperturbed by the presence, or lack, of an endosymbiont, in the absence of stress. However, the presence of an endosymbiont greatly effects the response of and to the host. It has been shown that endosymbionts influence asexual development and sporulation through the regulation of Ras2 (Mondo et al. 2017). While we observed limited changes in fungal transcription when comparing wt and cured spores, we did observe changes in the expression of fungal genes upon exposure to macrophages. In our companion paper, Itabangi et al show that the presence of an endosymbiont is important for virulence of $R$. microsporus. The endosymbiont enhances virulence through the secretion of an antiphagocytic factor. The endosymbiont also impacts organisation of the fungal plasma membrane, as well as environmental stress resistance and resistance to macrophagemediated killing (Itabangi et al., 2019). We show here that this is mirrored by the transcriptional response of the WT and cured spores of both Rhizopus species to macrophages, and in the macrophage response to infection.

As anticipated, activation of pro-inflammatory pathways increased macrophage survival in response to the spores. This consolidates several studies which demonstrate improved innate immune cell response to fungal pathogens when primed (Rogers et al. 2013; Municio et al. 2013; Blasi et al. 1995). It has been shown that the early immune response to a Mucor circinelloides infection is dependent on the formation of a pro-inflammatory TNF- $\alpha$ expressing granuloma-like structure that controls but does not kill spores in the zebrafish model (Inglesfield et al. 2018). Ungerminated Rhizopus spores are highly resistant to ROS/RNS which may mediate survival within granulomata. Consistent with this, the induction of a strong proinflammatory response by cured R. microsporus, hypersensitive to ROS/RNS stress, allows macrophages to better control the spores.

Interestingly, we see the chitin synthase inhibitor, Nikkomycin Z, is able to inhibit germination in both $R$. delemar and R. microsporus. This demonstrates the requirement of chitin synthase for spore development in these species. Treated spores swell, but do not polarise. The ability to germinate also has consequences for virulence. The ability of macrophages to control swollen spores, but not subsequently polarised ones, highlights that the developmental stage of the spore is key to innate immune success and control. Whilst many fungal pathogens are virulent in an ungerminated form, germination appears a key virulence factor for these filamentous fungi. This is confirmed by work which shows that the developmental stage of both R. microsporus and Rhizopus oryzae spores impacts pathogenesis in zebrafish and murine models (Itabangi et al., 2019; Andrianaki et al., 2018).

Specifically, infection with pre-swollen spores leads to evasion of macrophage-mediated immunity and increased pathogenesis (Itabangi et al., 2019; Andrianaki et al., 2018). In both models, spore clearance is dependent on phagocyte recruitment, and we show that phagocyte recruitment (in Itabangi et al.) and activation (Figure 7) is influenced by endosymbiont status (Itabangi et al., 2019; Andrianaki et al., 2018). In addition, we extended this analysis by revealing profound differences in the host response to two closely related Rhizopus species. In particular, we observe a M2/damage-associated response during infection with wt $R$. delemar spores that is shifted towards an M1 protective response upon infection with cured $R$. microsporus spores. We reinforce this finding through experimental modulation of macrophage polarization, showing that exposure to strongly M1-polarizing LPS is sufficient to reduce macrophage killing by wt $R$. delemar spores. Therefore, our data provide a framework for beginning to understand differences in the relative virulence of pathogenic Mucorales species and underpin our finding of crosskingdom fungal-bacterial symbiosis influencing mammalian disease.

## Methods

## Fungal Culture

R. delemar and R. microsporus were cultured with Sabouraud dextrose agar (SDA) or broth ( 10 g /liter mycological peptone, 20 g /liter dextrose), sourced from Sigma-Aldrich, at room temperature. Spores were harvested, 10 days after plating, with phosphate-buffered saline (PBS), centrifuged for 3 min at $3,000 \mathrm{rpm}$, and washed. Appropriate concentrations of spores were used for further experiments as indicated. To cure spores of their respective bacterial endosymbionts, spores were cultured with ciprofloxacin, as described in Itabangi et al. 2019. Once cured, spores were subcultured at least twice in ciprofloxacin-free media before use.

## Macrophage Culture

Macrophages from the J774.A1 cell line were cultured in Dulbecco's Modified Eagle Medium, (complemented with 10\% foetal bovine serum, $1 \%$ penicillin, $1 \%$ streptomycin and $1 \%$ L-glutamine). Macrophages were grown at $37^{\circ} \mathrm{C}$, in $5 \% \mathrm{CO}_{2}$.

## Phagocytosis Assay

Macrophages were incubated for one hour in serum-free DMEM prior to infection. Spores were pre-swollen in SAB ( 2 hr for $R$. delemar, 4 hr for $R$. microsporus). Washed spores were incubated at 5:1 MOI with $1 \times 10^{5}$ macrophages as described in Itabangi et al, to ensure that $>95 \%$ of macrophages contained one spore or more. After a 1 hour of incubation, excess spores were washed off the surface and the macrophages were incubated for a further 2 hours, before processing for RNA-Seq experiments. For live cell imaging experiments, images were taken starting immediately after the excess spores were removed.

## Live Cell Imaging

Time course images were taken to determine how LPS pre-treatment (100ng/ml) (Myers et al. 2010) of macrophages, and Nikkomycin Z pre-treatment ( $120 \mathrm{ug} / \mathrm{ml}$ over the course of swelling in SAB) of spores effected phagocytic outcome. Images were taken at $20 x$ on a Zeiss Axio Observer, with images taken every 5 minutes. Bright-field and fluorescent images were
then analysed using ImageJ V1.

## Comparative Genomics and Enrichment Analysis

Fishers exact test was used to detect enrichment of Pfam terms between $R$. delemar and $R$. microsporus, terms with a corrected P value of $<0.01$ were considered significant. Orthologue genes of $R$. delemar and $R$. microsporus were identified using blast+. R (version 3.3.3) was used to carry out hypergeometric testing of KEGG and GO terms to determine enrichment.

## Bulk RNA-Seq

RNA was extracted from spores which had either been incubated with the macrophages, or incubated in DMEM for the equivalent time period. To remove the macrophages, triton at $1 \%$ was used to lyse the macrophages, the resulting solution was then centrifuged for 3 min at $3,000 \mathrm{rpm}$, and washed, leaving only spores. The DMEM control also received the same treatment. To extract total RNA, the washed samples were immediately immersed in TRIzol and lysed via bead beating at $6,500 \mathrm{rpm}$ for 60 s . Samples were then either immediately frozen at $-20^{\circ} \mathrm{C}$ and stored for RNA extraction or placed on ice for RNA extraction. After lysis, 0.2 ml of chloroform was added for every 1 ml of TRIzol used in the sample preparation. Samples were incubated for 3 min and then spun at $12,000 \mathrm{~g}$ at $4^{\circ} \mathrm{C}$ for 15 min . To the aqueous phase, an equal volume of $100 \%$ ethanol ( EtOH ) was added, before the samples were loaded onto RNeasy RNA extraction columns (Qiagen). The manufacturer's instructions were followed from this point onwards. RNA quality was checked by Agilent, with all RNA integrity number (RIN) scores above 7 (Schroeder et al. 2006). One microgram of total RNA was used for cDNA library preparation. Library preparation was done in accordance with the NEBNext pipeline, with library quality checked by Agilent. Samples were sequenced using the Illumina HiSeq platform; 100-bp paired-end sequencing was employed ( $2 \times 100 \mathrm{bp}$ ) ( $>10$ million reads per sample).

## Single Cell RNA-Seq

For single cell sequencing experiments, macrophages were infected with fungal spores, as outlined above. Uninfected macrophages, used as a negative control, were treated in the same manner and underwent mock washes and media changes at identical time points to infected macrophages. Macrophages were isolated and released from the bottom of their wells with accutase, as per manufacturer's instructions (Technologies n.d.). Once in solution, the macrophages were loaded onto the 10X genomics single cell RNA sequencing pipeline for single cell isolation and library preparation. In total, 1082 single cells were sequenced. The libraries were sequenced on the Illumina Sequencing Platform.

## Data Analysis

For the bulk RNA-Seq data, FastQC (version 0.11.5) was employed to ensure the quality of all samples. Hisat2 (version 2.0.5) was used to align reads to the indexed genome of Rhizopus delemar RA 88-880 (PRJNA13066, Ma et al. 2009) and the indexed genome of Rhizopus microsporus (Mondo et al. 2017). HTSeq (version 0.8.0) was used to quantify the output (Anders et al. 2015). Trinity and edgeR (Robinson et al. 2009)(version 3.16.5) were then used to analyse differential expression (Grabherr et al. 2013). For the single cell RNASeq data, the 10X genomics analysis pipeline (Loupe Cell Browser V 2.0.0, Cell Ranger Version V 2.0.0) was used to align reads to the mus musculus genome (version MM10), and
quantify the output. For single cell analysis, the samples were then aggregated using this pipeline, to allow comparisons between samples.

## Data Availability

Data will be available upon request.

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## Author contributions

PSC conceived and designed the experiments, collected the data, performed the analysis and interpretation, and wrote the manuscript. JFM, KV and CAC contributed to interpretation of the data, and contributed to the manuscript. ERB conceived and designed the experiments, contributed to interpretation of the data, and wrote the manuscript.

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Figure legends
Figure 1 Phenotypic and genomic comparisons. A) Experimental setup: Pre-swollen (Sab) WT or cured fungal spores from Rhizopus delemar (2hr) and Rhizopus microsporus (4hr) in mid-isotropic phase were co-cultured with J774.1 murine macrophages (sfDMEM) at 5:1 MOI for 1 hr , washed to remove unengulfed spores, then co-incubated for a further 2 hr and RNA for fungi and host cells harvested. Pre-swollen spores (Sab) incubated in sfDMEM for 3 hr served as the negative control. B) Germination percentage over time for $R$. delemar and R. microsporus grown in Sab. C) Spore sizes for $R$. delemar and $R$. microsporus grown in SAB. D) Pfam terms enriched (corrected $\mathrm{P}<0.01$ ) in $R$. delemar vs $R$. microsporus genomes, with
colour indicating the extent of enrichment ( $\log _{10}$ Count).
Figure 2 Principal component analysis of fungal genes differentially expressed across all samples. A) $R$. delemar wt and cured, macrophage engulfed or sfDMEM control B) $R$. microsporus wt and cured, macrophage engulfed or sfDMEM control. Replicates ( $n=3$ ) are shown for each sample.

Figure 3 Clustering of fungal transcriptional changes. A) Heatmap displaying differentially expressed genes in R. delemar. Expression levels are plotted in Log2, space and meancentered (FDR < 0.001) B) Heatmap displaying differentially expressed genes in $R$. microsporus. Expression levels are plotted in Log2, space and mean-centered (FDR < 0.001)

Figure 4 Differential expression of fungal genes in compared conditions. A) The number of genes significantly differentially expressed (multiple corrected $P$ value < 0.05) between samples. Blue bars indicate genes with an increase in expression (LogFC > 2), whilst orange bars indicate genes with a decrease in expression (LogFC <-2).

Figure 5 Gene functions of genes differentially expressed in R. delemar. Enriched KEGG categories for the up/down regulated genes over sample comparisons. The enrichment of the category is indicated by the colour bar. White corresponds to no enrichment, and yellow to red corresponds to the given P value of the enrichment.

Figure 6 Principal component analysis of macrophage genes differentially expressed across all samples. Single cell sequencing was performed on uninfected and infected macrophages. Transcriptional data from the experiment was analysed with the 10X genomics analysis pipeline, and aggregated prior to principle component analysis.

Figure 7 Clustering of macrophage transcription. Heatmap displaying immune response genes significantly differentially expressed between macrophage populations. Expression levels are plotted in Log2 (FDR < 0.001)

Figure 8 Macrophage survival following exposure to $R$. delemar and $R$. microsporus spores. Macrophages +/- LPS pre-treatment were infected (MOI 5:1) with fungal spores, pre-swollen in SAB consistent with single cell experiments. Macrophages were infected with fungal spores that were pre-treated with $+/-$ Nikkomycin $Z(24 \mu \mathrm{~g} / \mathrm{ml}$; $\mathrm{n}=3$ for each sample). Macrophage survival was determined 7 hr post infection. Significant differences between samples is indicated by ( ${ }^{*}=\mathrm{p}<0.01$ ).

Supplementary Figure 1 Table of Pfam terms found to be enriched (corrected $\mathrm{P}<5 \times 10^{-8}$ ) in $R$. delemar and R. microsporus upon genome comparison.

Supplementary Figure 2 Clustering of fungal transcription with GO annotation. Heatmap displaying all differentially expressed genes, across all conditions, in $R$. microsporus. Expression levels are plotted in Log2, space and mean-centered (FDR < 0.001).

Supplementary Figure 3 Clustering and heterogeneity in single cell analysis of $\mathbf{J 7 7 4 . 1}$ macrophages. Single cell plot generated by loupe cell browser. Colors indicate experimental conditions as indicated. Spacial distribution indicates relative similarity across all detected transcripts. 1082 single cells represented.

Supplementary Figure 4 Expression of chitin synthase genes. A) Heatmap showing the expression of chitin synthase genes in $R$. delemar B) Heatmap showing the expression of chitin synthase genes in $R$. microsporus

Supplementary Figure 5 Chitin synthase inhibition of R. delemar and R. microsporus germination. R. delemar and R. microsporus treated with Nikkomycin Z in SAB at indicated concentrations for the indicated times. Fluorescence indicates calcofluor white staining, and thus the availability of chitin/chitosan in the cell wall. Labels indicate time and concentration of inhibitor.

Supplemental Table 1 Selected genes differentially regulated in pairwise comparisons, with Pfam annotations provided where available.

Supplementary Table 2 Table displaying the LogFC values for a subset of genes displayed in Figure 7.

A


A $\circ$ Macrophages + R. delemar WT
$\triangle$ R. delemar WT

+ Macrophages $+R$. delemar cured
$\times$ R. delemar cured


PC 1 (72.54\%)

B $\circ$ Macrophages + R. microsporus WT
$\triangle$ R. microsporus WT

- Macrophages + R. microsporus cured
$\times$ R. microsporus cured







Macrophage
control

Macrophage $+R$. delemar WT

Macrophage + R microsporus WT

Macrophage $+R . \quad \begin{gathered}\text { Macrophage }+R . \\ \text { delemar cured }\end{gathered} \quad$ microsporus cured


