# Transcriptional Interplay between Malassezia restricta and Staphylococcus Species Co-Existing in the Skin Environment 

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#### Abstract

Malassezia and Staphylococcus are the most dominant genera in human skin microbiome. To explore the inter-kingdom interactions between the two genera, we examined the transcriptional changes in Malassezia and Staphylococcus species induced upon co-culturing. RNA-seq analyses revealed that genes encoding ribosomal proteins were upregulated, while those encoding aspartyl proteases were downregulated in $M$. restricta after co-culturing with Staphylococcus species. We identified MRET_3770 as a major secretory aspartyl protease coding gene in M. restricta through pepstatin-A affinity chromatography followed by mass spectrometry and found that the expression of MRET_3770 was significantly repressed upon co-culturing with Staphylococcus species or by incubation in media with reduced pH. Moreover, biofilm formation by Staphylococcus aureus was inhibited in the spent medium of $M$. restricta, suggesting that biomolecules secreted by $M$. restricta such as secretory aspartyl proteases may degrade the biofilm structure. We also examined the transcriptional changes in S. aureus co-cultured with M. restricta and found co-cultured S. aureus showed increased expression of genes encoding ribosomal proteins and downregulation of those involved in riboflavin metabolism. These transcriptome data of co-cultured fungal and bacterial species demonstrate a dynamic interplay between the two co-existing genera.


Keywords: Malassezia, Staphylococcus, aspartyl protease, biofilms, skin, pH

## Introduction

Microorganisms interact with each other either directly through physical contact or indirectly via chemical interactions in various ecosystems, such as microbial biofilms [1, 2], respiratory tract [3, 4], soil [5, 6], and plants [7,8]. For example, Malassezia and Candida, when co-cultured, produce stronger biofilms resulting in increased resistance against antifungal reagents [2]. In the soil, physical interaction of actinomycetes with Aspergillus mycelia induces the expression of a gene cluster associated with archetypal polyketides, suggesting that direct physical interactions contribute to the communication among microorganisms and induce gene expression [6]. In plant microbiome, a phenazine produced by the bacterium Pseudomonas piscium inhibits the activity of an acetyltransferase expressed by the fungal species Fusarisu graminearum, resulting in reduced acetylation and repression of gene expression in the fungal pathogen. Thus, the epigenome of a fungal pathogen could be influenced by a chemical produced by co-existing bacteria [8].

The skin is the largest organ acting as the primary physical barrier against the invasion of pathogens and external substances from the environment [9,10]. Skin is inhabited by a large variety of microorganisms, and while some of these microorganisms are harmless or even helpful to the host, pathogenic microorganisms also coexist $[10,11]$. The microbial ecosystem consisting of multiple species coexisting in the same habitat is referred as the microbiome. With the development of metagenome analysis and next-generation sequencing, it has been possible to identify the members of the microbiome present in the skin [12]. Skin microbiota is composed of bacteria, fungi, and viruses. While the distribution of bacterial species differs throughout the body, Cutibacterium, Corynebacterium, and Staphylococcus are generally the dominant genera [13, 14]. Malassezia is the dominant fungal genus in almost all regions of the skin except the feet, which is colonized by diverse types of fungi [13, 15].

Malassezia species are known to exist in oily skin environments since they cannot synthesize fatty acids and should acquire them externally. Thus, Malassezia species secrete multiple lipases involved in lipid metabolism and pathogenicity [16]. Similarly, proteases, important hydrolytic enzymes for Malassezia, are also secreted and used to utilize the nutrients present in the skin environment [17]. Proteases are classified into multiple types, including serine, aspartyl, and metalloprotease; at least one type of protease is expressed by each Malassezia species [17]. In previous works, predominant secreted aspartyl proteases (SAP) were identified in Malassezia globosa and Malassezia furfur $[18,19]$. The SAP in M. globosa inhibited the formation of biofilm in S. aureus and the SAP in

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M. furfur had a wide range of substrates including extracellular matrix [18, 19]. Malassezia restricta expresses a total of 17 secreted proteases, 12 of which are aspartyl proteases [17], but the predominant SAP and the role of SAP have not been identified in $M$. restricta.

In the present work, we studied the interplay between the fungus $M$. restricta and two bacterial species of the genus Staphylococcus, which are predominant in skin microbiome. We comprehensively examined transcriptional changes in M. restricta and S. aureus upon co-culturing. We found that the expression levels of ribosomal proteinencoding genes (RPGs) were upregulated, while SAP-encoding genes were downregulated in M. restricta cocultured with Staphylococcus species. We identified the predominant SAP, MRET_3770, in M. restricta and noticed that MRET_3770 was transcriptionally repressed by co-culturing with Staphylococcus species and by lower pH levels. In bacterial RNA-seq, we observed upregulation of Staphylococcus RPGs and downregulation of genes involved in riboflavin metabolism in co-cultured S. aureus.

## Materials and Methods

## Strains and Growth Conditions

M. restricta KCTC 27527, Staphylococcus epidermidis KCTC 13172, and Staphylococcus aureus NCTC 8325 were obtained from the Korean Collection for Type Cultures (KCTC, Korea). M. restricta KCTC 27527 was maintained in modified Dixon (mDixon) medium ( $3.6 \%$ malt extract [w/v], 2\% bile salt [w/v], $1 \%$ tween 40, $0.6 \%$ peptone $[\mathrm{w} / \mathrm{v}], 0.2 \%$ glycerol, and $0.2 \%$ oleic acid) $[34,35]$. Lower pH mDixon medium was adjusted to pH 5.0 or 5.5 with 5 N HCl . The Staphylococcus cells were maintained in tryptic soy broth (TSB; 1.7\% casein peptone, $0.5 \%$ sodium chloride, $0.3 \%$ soybean peptone, $0.25 \%$ glucose, and $0.25 \%$ dipotassium phosphate) [36]. For the coculture, M. restricta (OD600: 1) and S. epidermidis or S. aureus (OD600: 0.1) were inoculated in mDixon medium and co-cultured at $34^{\circ} \mathrm{C}$ for 12 h with shaking. To prepare bacterial spent medium, S. epidermidis or S. aureus (OD600: 0.1 ) cells were inoculated in mDixon medium and cultured at $34^{\circ} \mathrm{C}$ for 12 h . Then, the bacterial spent medium was separated from bacterial cells by centrifugation. Similarly, M. restricta (OD600: 1) cells were cultured for 12 h , and the $M$. restricta spent medium was separated by centrifugation.

## Enrichment of Secretory Aspartyl Protease Using Pepstatin A-Agarose Resin

Aspartyl proteases were enriched from the extracellular culture media using pepstatin A-agarose resin (Goldbio, USA). Briefly, prewashed pepstatin A-agarose resins were incubated with the concentrated extracellular media with shaking at $4^{\circ} \mathrm{C}$ for 1 h . The resins were collected into column with binding buffer ( 0.1 M citrate and 0.5 M sodium chloride at pH 3.0 ) and subsequently washed with 0.5 M sodium chloride at pH 3.0 and eluted with elution buffer ( 0.1 M sodium bicarbonate and 0.5 M sodium chloride at pH 8.7 ).

## Crystal Violet Assay

Diluted cells were seeded and incubated on 96-well cell culture plates (SPL, Korea) for 12 h . The culture supernatant was removed, and the cells were washed with distilled water (DW) to remove planktonic microbial cells. After the plate was dried, $0.1 \%$ crystal violet was added to stain the bacterial biofilm firmly attached to the plate. After 10 min , the plate was washed with DW, and non-specific dye was decolorized using $30 \%$ acetic acid. The crystal violet staining was measured using spectrophotometry at OD600.

## mRNA Sequencing and Analysis

Total RNA from two biological replicates for each condition was processed to deplete the ribosomal RNA using a NEBNext rRNA Depletion Kit (Bacteria; \#E7850S, NEB). Sequencing libraries for RNA-Seq were constructed using TruSeq Stranded mRNA Library Prep (48 Samples; \#20020594, Illumina) following the manufacturer's instructions. Sequencing was performed using a NovaSeq 6000 instrument (Illumina), following the manufacturer's protocol, which generated 101-bp-long paired-end reads. The sequencing adapter removal and quality-based trimming of the raw data were performed using Trimmomatic v. 0.36 [37]. Cleaned reads were mapped to the reference genome (NCBI assembly; GCF_003290485.1 for M. restricta KCTC 27525 and GCA_026314335.1 for S. epidermidis KCTC 13172) using hisat 2 v .2 .2 .1 [38]. We used the parameter ' -k 1 ' in mapping and added the option '--no-spliced-alignment'. For counting the reads mapped to each coding sequence (CDS), featureCounts was used [39]. Finally, the counts from each CDS were normalized using the DeSeq2 package [40].

## Results

Transcriptional Changes in Malassezia Gene Expression upon Co-Culturing with S. epidermidis or S. aureus To investigate the functional interactions between M. restricta and Staphylococcus species, M. restricta (OD600: 1.0) and Staphylococcus species (OD600:0.1) were inoculated in mDixon media and co-cultured for 12 h (Fig. 1A). As the growth rates of Staphylococcus species are higher than that of M. restricta, M. restricta with a higher OD600 (ten-fold higher than that of Staphylococcus species) were inoculated at the initial step of co-culturing. We tried to measure the growth rate of $M$. restricta in the co-culturing medium using a hemocytometer, but the number of colonies could not be detected due to the preferential aggregation of M. restricta cells. Instead, the growth rate of M. restricta in the co-culture was indirectly measured by using bacterial spent medium through the personal bioreactor (RTS-1). To prepare bacterial spent medium, Staphylococcus cells (OD600: 0.1) were inoculated in mDixon medium and cultured for 12 h . Then, the bacterial spent medium was separated from the bacteria by centrifugation. Incubation of bacterial species in bacterial spent medium mimics co-culturing conditions. The growth rate of $M$. restricta was slightly lower in S. aureus spent medium and further decreased in S. epidermidis


Fig. 1. Transcriptional changes in M. restricta co-cultured with Staphylococcus spp. A. Co-culture of M. restricta (M.R) and Staphylococcus species. M. restricta (OD600, 1.0) and Staphylococcus species (OD600, 0.1 ) were inoculated in mDixon media and co-cultured for 12 h . B. Growth curves of $M$. restricta in bacteria spent media. Blue line indicates $M$. restricta in fresh media, yellow line indicates $M$. restricta (M.R) in S. epidermidis (S.E) spent media, and orange line indicates $M$. restricta in S. aureus (S.A) spent media. C, D. The volcano plots of fungal transcriptional changes after co-culturing with $S$. epidermidis (S.E) (C) and S. aureus (S.A) (D). The orange dots indicate genes encoding ribosomal proteins.
spent medium (Fig. 1B).
Next, the expressional changes in Malassezia genes upon co-culturing with S. aureus or S. epidermidis were examined by RNA-seq analysis. We found that, co-culturing with S. epidermidis resulted in an increase (at least two-fold) in the expression levels of 378 genes and downregulation of 310 genes in M. restricta (Fig. 1C). Similarly, co-culturing with S. aureus induced the upregulation of 357 and downregulation of 222 genes in M. restricta (Fig. 1D). Based on gene ontology (GO) analysis, GO groups related to transcription and translation were significantly upregulated in both co-culturing conditions (Figs. S1A and S1C). On the contrary, GO groups related to lipase and aspartyl protease were significantly downregulated (Figs. S1B and S1D).

Induction of Ribosomal Protein-Coding Genes in Malassezia upon Co-Culturing with Staphylococcus Species
The expression levels of ribosomal protein-encoding genes (RPGs) in M. restricta were noticeably elevated after co-culturing with Staphylococcus species, especially with S. aureus (Figs. 1C and 1D). Among the total 137 annotated Malassezia RPGs, 12 RPGs were commonly induced by co-culturing with either Staphylococcus species, and 72 RPGs were only induced by co-culturing with $S$. aureus (Fig. 2A). When $M$. restricta was co-cultured with S. aureus, 84 RPGs (out of $137 ; 61.3 \%$ ) were upregulated more than two-fold compared to M. restricta axenic culture (Fig. 2A). We noticed that mitochondrial RPGs (Mito RPGs) tended to be upregulated in both co-culture conditions, but cytosolic and nuclear RPGs (Cyto/Nuc RPGs) were greatly upregulated in M. restricta co-cultured with S. aureus but not in M. restricta co-cultured with S. epidermidis (Fig. 2B). Thus, expression levels of mitochondrial and cytosolic/nuclear RPGs are differentially regulated, and the two Staphylococcus species have distinct effects on the regulation of Malassezia ribosomal proteins.
To investigate the molecular mechanisms underlying the differential regulation of Cyto/Nuc RPGs and Mito RPGs in M. restricta, the motif sequences on the promoter regions of the RPGs were examined. We found that approximately $60 \%$ of the RPGs possessed the core motif sequence 'ATCACGTGA' and that the motif sequences did not clearly differ between Cyto/Nuc RPGs and Mito RPGs. However, the promoter regions of Cyto/Nuc RPGs had the extended consensus sequence 'ATCACGTGATTTATT', which may alter the binding affinities of regulatory proteins (Fig. 2C). Next, we examined the expression levels of the RPGs according to the presence of the


Fig. 2. Upregulation of ribosomal proteins in M. restricta upon co-culturing with Staphylococcus spp. A. Venn diagram showing the numbers of genes exhibiting more than 2 -fold increase in M. restricta (M.R) upon co-culturing compared to axenic culture. Black arrows point to mitochondrial ribosomal protein-encoding genes (mito RPGs) and cytoplasmic/ nuclear ribosomal protein-encoding genes (cyt/nuc RPGs). B. Box plots showing the expressional changes in mito RPGs and in cyto/nuc RPGs in M. restricta co-cultured with S. epidermidis compared to M. restricta axenic culture (M.R+S.E/ M.R) and in M. restricta co-cultured with S. aureus compared to M. restricta axenic culture (M.R+S.A/ M.R). C. Motif sequences of identified mito and cyto/nuc RPGs analyzed by MEME Suite 5.5.0. D. Box plots showing the expressional changes in mito RPGs and cyto/nuc RPGs according to the presence of the motif sequence.
identified motif and found that the expression of RPGs with the motif were significantly upregulated in M. restricta co-cultured with S. aureus, but not in that co-cultured with S. epidermidis (Fig. 2D).

Taken together, we found that Cyto/Nuc RPGs were upregulated in M. restricta co-cultured with either of the two Staphylococcus species, especially with S. aureus. Moreover, our observations suggest that the extended motif sequences on the promoter regions of Cyto/Nuc RPGs in $M$. restricta might have a role in the upregulation of the genes.

Downregulation of Major Aspartyl Proteases in M. restricta upon Co-Culturing with Staphylococcus Species
We observed that the genes encoding aspartyl proteases and lipases, which are important for M. restricta to utilize the nutrients available in host skin, were significantly downregulated in $M$. restricta after co-culturing with Staphylococcus species (Figs. 1C and 1D, S1C). First, we summarized the changes in the expression levels of lipase annotated genes in $M$. restricta (Figs. S2A and S2B). MrLIP3 and MrLIP2 were significantly downregulated in $M$. restricta after co-culturing with S. epidermidis and S. aureus, respectively (Figs. 1C and 1D, S2A). However, the transcriptional expression of MrLIP1, which is the lipase with the highest expression levels in M. restricta, was not downregulated by co-culturing with Staphylococcus species; instead, it was slightly upregulated upon co-culturing with S. epidermidis.
Of the 79 genes downregulated in both co-culturing conditions, three genes encoding aspartyl proteases, MRET_3770, MRET_2827, and MRET_4390, were markedly downregulated (Figs. 2A and 2B). We summarized the changes in the expression levels of genes annotated as aspartyl proteases in M. restricta (Fig. 2B). Interestingly, MRET_3770 showed the highest levels of expression in M. restricta cultured alone; however, it exhibited the strongest downregulation in both co-culturing conditions. MRET_2827 and MRET_4390 also showed relatively higher expression levels and were significantly downregulated in both co-culturing conditions (Figs. 2B and 2C). RT-qPCR analysis confirmed that the expression levels of MRET_3770, MRET_2827, and MRET_4390 were significantly decreased in co-cultures with Staphylococcus species, except in the case of MRET_4390 in the coculture with S. aureus. However, the expression levels of other aspartyl proteases, such as MRET_2886 and


Fig. 3. Downregulation of aspartyl protease-encoding genes in M. restricta upon co-culturing with Staphylococcus spp. A. Venn diagram showing the numbers of M. restricta (M.R) genes that were downregulated at least 2fold in both co-culture conditions compared to axenic culture. B. Expressional changes in genes encoding aspartyl proteases upon co-culturing. Aspartyl protease-encoding genes were ordered by expression level from top to bottom. C. Expression levels of genes encoding aspartyl proteases in M. restricta (M.R) axenic culture. D. Relative expression levels of genes encoding aspartyl proteases in M. restricta (M.R) axenic culture, in M. restricta co-cultured with S. epidermidis compared to M. restricta axenic culture (M.R + S.E/ M.R), and in M. restricta co-cultured with S. aureus compared to M. restricta axenic culture (M.R+S.A/ M.R), examined by reverse transcription followed by qPCR. Expression levels were normalized to those of actin (MRET_1518) as an endogenous control and compared to the expression levels observed in M.R axenic culture. ${ }^{*}, p<0.1 ;{ }^{* *}, p$ $<0.01 ;^{* * *}, p<0.001$.

MRET_2661, were not altered (Fig. 2D). Taken together, the mainly expressed aspartyl proteases, but not lipases, in M. restricta are transcriptionally repressed by Staphylococcus species.

## Identification of the Major Secretory Aspartyl Proteases in M. restricta

To identify the major secretory aspartyl proteases (SAP) in M. restricta, we listed the genes annotated as SAP using the MEROPS and SignalP 5.0. We noted that $M$. restricta had a total of 13 genes encoding putative aspartyl proteases, of which, 11 were secretory (Fig. S3A). Genes encoding other types of secretory proteases were also present, including metalloproteases (four genes), serine proteases-(seven genes), and threonine protease (one gene) (Fig. S3A). To determine the major SAP in M. restricta, an alignment tree of the 11 annotated SAPs were created comparing them to the SAPs in M. globosa (MGL_1932) and M. furfur (FUN_000223) that were previously identified as functional SAPs (Fig. 4A). MRET_2661 was identified as the closest to the SAPs of M. globosa (MGL_1932) and of M. furfur (FUN_000223) [18].

Next, the SAPs present in the culture media were captured by affinity chromatography using pepstatin Aagarose resin, and the proteins were visualized on SDS-PAGE (Fig. 4B). Then, the captured proteins were identified through the MALDI-TOF analysis (Fig. 4B). MRET_3770 and MRET_2827, which exhibited the highest expression levels, were identified as highly scored purified proteins, followed by MRET_2825 and MRET_2661 (Figs. 4B, S3B). Collectively, although not closely related to previously identified SAPs in other Malassezia species, MRET_3770 and MRET_2827 were the most abundant putative SAPs in M. restricta.

SAPs of M. globosa are known to inhibit the formation of the biofilm generated by S. aureus [19]. To investigate the inhibition of biofilm formation by M. restricta, we performed a crystal violet assay in both axenic and coculture conditions. S. aureus at OD600 of $0.5,0.1,0.05$, or 0.01 were co-cultured with M. restricta at OD600 of 1 or 0.1 on 96 -well plates. After 12 h , the amounts of biofilm formed under axenic and co-culture conditions were quantitatively measured through the density of crystal violet. Biofilm formation by $S$. aureus was significantly


Fig. 4. Identification of mainly expressed secretory aspartyl proteases in M. restricta and the inhibitory effect of M. restricta on the formation of S. aureus biofilm. A. Unrooted phylogenetic tree of the putative secretory aspartyl proteases in M. restricta compared with MGL_1932 (MgSAP1) and MGL_3328 in M. globosa and FUN_000223 (MfSAP1) in M. furfur. The numbers at the nodes indicate the bootstrap values. B. Coomassie brilliant blue staining of SDSPAGE of the extracellular media (Flow though), binding buffer (Binding), and the enriched fraction (Elution) from pepstatin A-agarose affinity purification. The contents of the band in the block box (approximately 42 kDa ) were analyzed by orbitrap mass spectrometry and identified as MRET_3770, MRET_2827, MRET_2825, and MRET_2661. C. Biofilm enrichment was measured by the crystal violet assay as described in the Methods section. Serial concentration of S. aureus (S.A) in axenic culture, S.A co-cultured with M. restricta (M.R), or S.A cultured in M.R spent media were examined. Black box, S.A axenic culture; red box, S.A co-cultured with M.R (OD600: 1); blue box, S.A co-cultured with M.R (OD600: 0.1); green box, S.A cultured in M.R spent media; yellow box, M.R axenic culture. D. The ratios of biofilm formation. Biofilm formation was measured by spectrophotometry. ${ }^{*}, p<0.1 ;{ }^{* *}, p<0.01 ;^{* * *}, p<0.001$.
reduced upon co-culturing with $M$. restricta at OD600 of 1 , but not altered after co-culturing with $M$. restricta at OD600 of 0.1 (Figs. 4C and 4D), indicating that sufficient concentrations of M. restricta could inhibit the biofilm formation by S. aureus.

## Differential Expression of Putative SAP Genes at Lower pH

We noticed that the pH of the culture medium decreased from 6.5-6.8 to 5.0-5.5 after co-culturing with Staphylococcus species, while the pH of $M$. restricta axenic culture medium was maintained at around 6.5 (Fig. 5A). Accordingly, we examined the impact of reduced pH on the expression of SAP genes. The result of RTqPCR indicated that the mRNA levels of putative SAPs including MRET_3770, MRET_2827, MRET_4390, MRET_2661 and MRET_2886 were significantly reduced in culture medium at $\mathrm{pH} 5.0-5.5$ compared to culture medium at pH 6.0 (Fig. 5B), indicating that lower pH could result in the inhibition of the expression of SAP genes in M. restricta.
Next, we examined the effect of the pH of the culture media on the regulation of SAP genes in M. globosa, which were characterized in a previous study [19]. The expression of the previously characterized SAP gene MGL_1932 was not altered by co-culturing with either Staphylococcus species or by culturing in media with a lower pH , but the expression of MGL_3328, which is the SAP the highest expression levels in M. globosa, was reduced by coculturing, especially with S. epidermidis, and in response to a decrease in pH (Figs. 5C and 5D).

## Changes in Staphylococcus Gene Expression upon Co-Culturing with M. restricta

To comprehensively explore the interplay between Malassezia and Staphylococcus, we also examined the global changes in gene expression in Staphylococcus species after co-culturing with Malassezia. In the analysis of


Fig. 5. Transcriptional expression of secretory aspartyl proteases in M. restricta and M. globosa at lower pH. A. The pH of the media of $M$. restricta axenic culture (M.R), M. restricta co-cultured with S. epidermidis (M.R + S.E), and M. restricta co-cultured with S. aureus (M.R+S.A) before and after 12 h of incubation. The initial pH of the media was $6.5-6.7$. B. Relative expression levels of genes encoding aspartyl proteases in M. restricta in media at pH 6.5 (M.R at pH 6.5), pH 5.5 (M.R at pH 5.5 ), and pH 5.0 (M.R at pH 5.0 ). Expression levels were normalized to those of actin (MRET_1518) and compared to the expression levels observed in M.R at pH 6.5. C. Relative expression levels of MGL_3328 and MGL_1932 in M. globosa (M.G) axenic culture, M. globosa co-cultured with S. epidermidis (M.G+S.E), and M. globosa co-cultured with S. aureus (M.G+S.A). Gene expression levels were normalized to those of actin (MGL_1986) and compared to the expression levels observed in M.G axenic culture. D. Relative expression of genes encoding aspartyl proteases in $M$. globosa at pH 6.5 (M.G at pH 6.5), pH 5.5 (M.G at pH 5.5 ), and pH 5.0 (M.G at pH 5.0 ). Gene expression levels were normalized to those of actin (MGL_1986) and compared to the expression levels observed in M.G at pH 6.5. ${ }^{*}, p<0.1 ;{ }^{* *}, p<0.01 ;^{* * *}, p<0.001$.
bacterial RNA-seq, 180 and 189 genes were found to be significantly upregulated and downregulated, respectively, in S. aureus co-cultured with M. restricta (Fig. 6A). Notably, RPGs in S. aureus were drastically upregulated, as indicated by GO analysis with KEGG pathway (Figs. 6A and 6B). On the contrary, genes involved in riboflavin metabolism and sulfur metabolism were significantly downregulated upon co-culturing with $M$. restricta (Fig. 6C). To understand the physiological changes in S. aureus induced by M. restricta, we examined the growth rate of S. aureus in M. restricta spent medium. We observed a decrease in the growth rate of S. aureus in the spent medium (OD600: ~4), compared to cultivation in fresh media (OD600: 5.5) (Fig. 6D). We noticed that the decrease in bacterial growth rates upon culturing in M. restricta spent medium was specific to S. aureus since the growth rate of S. epidermidis was not reduced in M. restricta spent medium (Fig. S4). Under these stressful conditions, $S$. aureus may express essential genes for cell viability, such as RPGs. It has been known that riboflavin is a precursor for essential co-enzymes FAD and FMN. Therefore, downregulation of genes involved in riboflavin metabolism might be one of the reasons for the decreased growth rate.

## Discussion

In the present study, we explored the inter-kingdom interactions between two major microorganisms present in skin microbiome, the fungal species $M$. restricta and the bacterial Staphylococcus species. The interplay between the two organisms under co-culturing conditions are schematically summarized in Fig. 7. In M. restricta, RPGs were upregulated, and putative SAP genes were downregulated upon co-culturing with Staphylococcus species. In cells growing under favorable conditions, a great portion of total cellular energy is dedicated to ribosomal biogenesis [20-22]. Tight control of RPG expression is necessary in response to changes in nutrient and energy supply. Transcriptional regulation of RPGs is controlled via the target of rapamycin (TOR) pathway in response to nutrient starvation and other signals. When cells are exposed to nutrient starvation, TORC1 is inhibited, and downstream transcriptional regulators repress transcription of RPGs [20-22]. Thus, we assume that M. restricta


Fig. 6. Transcriptional changes in S. aureus upon co-culturing with M. restricta. A. Volcano plot showing transcriptional changes in $S$. aureus co-cultured with $M$. restricta compared to $S$. aureus axenic culture (S.A+M.R vs S.A). B. KEGG pathway groups for $S$. aureus genes exhibiting more than 2 -fold increase (S.A+M.R vs S.A). C. KEGG pathway groups for S. aureus genes exhibiting more than 2 -fold decrease (S.A+M.R vs S.A). D. Growth curve of S. aureus in fresh or M. restricta spent media.


Fig. 7. Schematic model of the interplay between $M$. restricta and S. aureus. See the discussion for details.
co-cultured with S. aureus may experience favorable growing conditions or may be responding to other uncharacterized signals. The growth rate of $M$. restricta cultured in $S$. aureus spent media was similar to that observed in fresh media, but the growth rate of $M$. restricta cultured in S. epidermidis spent media was significantly lower than the growth rate observed in fresh media. Furthermore, we observed differential regulation of RPGs in M. restricta according to sub-cellular localization, motif sequences on the promoters of RPGs, and co-cultured Staphylococcus species.
Genes encoding putative SAPs, MRET_3770, MRET_2827, and MRET_4390, were drastically downregulated in M. restricta co-cultured with either Staphylococcus species. However, these three genes were not homologs of the SAP genes previously characterized in M. globosa and M. furfur [18, 19]. In the present work, we first identified the putative SAPs in M. restricta using the concentrated extracellular media by pepstatin A-agarose resin, which is a reversible aspartyl protease inhibitor [19]. We collected proteins specifically bound to pepstatin A-agarose and performed mass spectrometry. Then, we identified MRET_3770 and MRET_2827 as major pepstatin A binding proteins present in the extracellular medium. Further analyses might be required to examine the biochemical activities of aspartyl proteases as in the cases of M. globosa and M. furfur [18, 19].
We asked how these putative SAPs in M. restricta were downregulated in co-cultured conditions. We noticed that the pH of the co-culture medium was reduced from 6.7 to $5-5.5$, presumably due to the organic acids emitted by Staphylococcus as a by-product during growth [23] and found that the reduced pH induces the downregulation of putative SAPs, such as MRET_3770, MRET_2827, and MRET_4390. Therefore, we hypothesized that Staphylococcus species protect the biofilms they form by inhibiting the predominant SAPs by reducing the pH . We further examined the expression of MGL_1932, a previously characterized SAP in M. globosa (MGSAP1) by lower pH or co-culturing with Staphylococcus species [19]. The reduced pH or co-culturing did not affect the

[^0]transcriptional regulation of MGL_1932, but instead resulted in the downregulation of MGL_3328, the SAP with the highest expression levels in M. globosa. The protein encoded by MGL_3328 might be another functional SAP candidate in M. globosa. Recent interesting study reported that MGSAP1 was upregulated in atopic and seborrheic dermatitis skin. Furthermore, this SAP play a pivotal role in fungal skin colonization and tissue inflammation in diseased skin tissue [24]. In our present work, pH is another factor which could control the expression of SAP. Thus, it will be interesting to see the environmental factors that affect the expression of SAP in the diseased skin tissues.

To comprehensively understand the transcriptional interplay between M. restricta and Staphylococcus species, we also performed bacterial RNA-seq of S. aureus co-cultured with M. restricta. We observed that RPGs were upregulated in co-cultured S. aureus. Regulation of bacterial RPGs have been not intensively studied but is known to be linked to a stress response mechanism referred to as "the stringent response". The expression of RPGs might be repressed as a part of the stringent response by the function of ppGpp . In addition, ppGpp and the transcription factor DksA bind to the promoter regions of RPGs and inhibit transcriptional initiation in Escherichia coli [25, 26]. In our experiment, the co-culture conditions might be unfavorable for $S$. aureus since the growth rate of $S$. aureus in $M$. restricta spent medium was retarded, but the expression levels of RPGs were significantly elevated. Our data suggest that $S$. aureus may have an unknown mechanism to upregulate the expression of RPGs in response to unfavorable growth conditions. Co-cultured S. aureus exhibited downregulated expression of genes involved in riboflavin biosynthesis. Riboflavin is a precursor of co-enzymes FAD and FMN, which function as the prosthetic groups of various oxidoreductases. Bacterial riboflavin homeostasis is regulated by FMN riboswitches [27-31]. FMN incorporation into its cognate riboswitch inhibit proper transcription of rib genes. Thus, cellular concentration of FMN is critical for controlling the riboswitch, and the FMN riboswitches are among the most sensitive regulators of cellular homeostasis in response to environmental or cellular stressors [27]. Riboflavin is synthesized in bacteria, yeast, and plants, but vertebrates acquire riboflavin from their diet [32]. S. aureus obtains riboflavin from the host environment or generates it through de novo biosynthesis [28, 33]. Therefore, the downregulation of riboflavin biosynthesis genes might be caused by the riboflavin available in the co-culture environment. M. restricta may produce and secret riboflavin or FMN, which would in turn repress bacterial FMN riboswitches, and the bacteria may use FMN acquired from co-culture environment. It is possible that M. restricta and Staphylococcus species may compete for riboflavin uptake in the co-culture environment.

Collectively, we have explored the interplay between $M$. restricta and Staphylococcus species, which co-exist in human skin microbiome. We observed the upregulation of genes encoding ribosomal proteins and the downregulation of genes encoding SAP in co-cultured $M$. restricta. Then, we noticed that the lower pH is critical factor to control the transcriptional expression of SAP coding genes in M. restricta. We also observed the upregulation of genes encoding ribosomal proteins and downregulation of genes involved in riboflavin metabolism in co-cultured S. aureus. Therefore, we found that the dominant fungus M. restricta and the bacteria Staphylococcus species interact with each other to compete or reconcile in a given co-existing environment.

## Author Contributions

Conception and experimental design: H. Y. and K. K.; methodology and data acquisition: H. Y., J. L.; computational analysis: Y. C.; manuscript writing: H. Y., Y. C., and K. K.

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## Conflict of Interest

The authors have no financial conflicts of interest to declare.

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