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ORIGINAL ARTICLE

Stony coral tissue loss disease intervention with amoxicillin leads to a reversal of disease-modulated gene expression pathways

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Abstract

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Stony coral tissue loss disease (SCTLD) remains an unprecedented disease outbreak due to its high mortality rate and rapid spread throughout Florida's Coral Reef and wider Caribbean. A collaborative effort is underway to evaluate strategies that mitigate the spread of SCTLD across coral colonies and reefs, including restoration of disease-resistant genotypes, genetic rescue, and disease intervention with therapeutics. We conducted an in-situ experiment in Southeast Florida to assess molecular responses among SCTLD-affected Montastraea cavernosa pre- and post-application of the most widely used intervention method, CoreRx Base 2B with amoxicillin. Through Tag-Seq gene expression profiling of apparently healthy, diseased, and treated corals, we identified modulation of metabolomic and immune gene pathways following antibiotic treatment. In a complementary ex-situ disease challenge experiment, we exposed nursery-cultured M. cavernosa and Orbicella faveolata fragments to SCTLDaffected donor corals to compare transcriptomic profiles among clonal individuals from unexposed controls, those exposed and displaying disease signs, and corals exposed and not displaying disease signs. Suppression of metabolic functional groups and activation of stress gene pathways as a result of SCTLD exposure were apparent in both species. Amoxicillin treatment led to a 'reversal' of the majority of gene pathways implicated in disease response, suggesting potential recovery of corals following antibiotic application. In addition to increasing our understanding of molecular responses to SCTLD, we provide resource managers with transcriptomic evidence that disease intervention with antibiotics appears to be successful and may help to modulate coral immune responses to SCTLD. These results contribute to feasibility assessments of intervention efforts following disease outbreaks and improved predictions of coral reef health across the wider Caribbean.

KEYWORDS

antibiotic treatment, coral disease, disease transmission, Florida's Coral Reef, SCTLD, Tag-Seq, transcriptomics

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1 | INTRODUCTION

Since its first observation near Miami, Florida in 2014, stony coral tissue loss disease (SCTLD) has spread throughout Florida's Coral Reef and to at least 25 jurisdictions across the wider Caribbean (Kramer et al., 2019; NOAA, 2018; Precht et al., 2016). The disease affects at least 24 scleractinian species and is characterized by subacute to acute tissue loss leading to colony mortality, often with formation of rapidly-progressing focal or multifocal lesions (Aeby et al., 2019, 2021) that are histologically distinct from white plague disease (Landsberg et al., 2020; NOAA, 2018). Histopathology has determined that tissue necrosis begins in the coral gastrodermis before progressing to the epithelial layer as a pale or bleached lesion (Aeby et al., 2019; Landsberg et al., 2020). Given that tissue necrosis was seen to originate near the coral's algal symbionts (Symbiodiniaceae) in the gastrodermis, it has been hypothesized that SCTLD may be caused by a pathogen or pathogens affecting the symbionts rather than the coral host directly (Work et al., 2021), while the visible lesion and tissue loss may be the result of secondary or opportunistic infection.

The SCTLD pathogen(s) have not yet been identified, though examination of microbiomes of diseased samples suggests a bacterial (Becker et al., 2021; Huntley et al., 2022; Meiling et al., 2021; Meyer et al., 2019; Rosales et al., 2020, 2022, 2023; Studivan et al., 2022; Ushijima et al., 2020) and/or viral (Veglia et al., 2022; Work et al., 2021) consortium. Antibiotic treatments have shown high rates of success in halting the progression of disease lesions, and in some cases, the quiescence of visible disease signs on treated colonies (Forrester et al., 2022; Neely et al., 2020; Shilling et al., 2021; Walker et al., 2021). Attempts to treat SCTLD-affected corals with chlorinated epoxy, which was hypothesized to affect more pathogenic taxa beyond bacteria relative to targeted antibiotics, have been largely unsuccessful (Shilling et al., 2021; Walker et al., 2021). The mechanisms by which antibiotic application affects disease progression are unknown, particularly the potential impacts on the coral host and its microbiome in processes such as recovery and antibiotic resistance.

The molecular mechanisms underlying coral immune responses to SCTLD are poorly understood relative to other diseases (Traylor-Knowles et al., 2022). A recent study utilizing metabolomics identified several lipid and tocopherol classes of Symbiodiniaceae origin that distinguished healthy and diseased corals, providing further evidence of algal symbiont involvement in SCTLD (Deutsch et al., 2021). Transcriptomics have also been used to examine gene expression of disease lesion tissue in multiple coral species, finding a core set of differentially expressed genes across species that are associated with stress, extracellular matrix rearrangement, immunity and apoptosis responses (Beavers et al., 2023; Traylor-Knowles et al., 2021). Several of these pathways are implicated in coral-algal symbiosis and antiviral processes, such as nuclear factor kappa B (NF- κ B) and Ras-related protein rab 7 (rab7), providing further evidence of a potential viral pathogen affecting algal symbionts (Beavers et al., 2023). It is therefore still unknown, however, how antibiotic

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treatment is effective if SCTLD is indeed caused by a viral pathogen and how coral immune responses to disease are modulated by antibiotic exposure. To date, no transcriptomic studies of SCTLD, or any coral disease, have focused on the effects of intervention methods, identifying a critical need to understand the potential consequences of antibiotic treatment on coral holobiont responses.

To address this knowledge gap, we conducted paired ex-situ transmission and in-situ intervention experiments and examined whole-transcriptome gene expression patterns of corals in response to disease exposure and antibiotic treatment, respectively. These experiments focused on the coral species Montastraea cavernosa and Orbicella faveolata due to their ongoing use in field-based disease intervention and monitoring efforts (Shilling et al., 2021; Walker et al., 2021), ecological importance as primary reef-builders (González-Barrios & Álvarez-Filip, 2018; Walton et al., 2018), and growing use in reef restoration (Koval et al., 2020; Rivas et al., 2021). Through these experiments, we (1) identified transcriptomic responses to SCTLD exposure in a controlled lab setting, (2) compared responses to disease exposure between species, (3) examined transcriptomic modulation following antibiotic treatment in a field-based time series and (4) compared trends between diseased and treated corals in lab and field settings. In doing so, we seek to better understand coral immune responses to SCTLD and to provide transcriptomic resources to the development of disease diagnostics. These experiments also evaluated disease intervention effectiveness at the molecular level and identified potential patterns of recovery following antibiotic treatment of SCTLD-affected wild colonies.

2 | METHODS

2.1 | Transmission experiment

The ex-situ transmission experiment was conducted in the Experimental Reef Laboratory at the University of Miami's Cooperative Institute for Marine and Atmospheric Studies over a period of 2 weeks in March 2020. The disease transmission apparatus consisted of 80 0.5-L coral vessels with independent flow-through seawater sources maintained at local ambient temperature (24°C) and light conditions (PAR of $250 \mu mol m^{-2} s^{-1}$; Studivan et al., 2022). Twenty putative genotype fragments each of disease-naive O. faveolata and M.cavernosa were sourced from the land-based nursery at Mote Marine Laboratory. Each fragment was split into two equal subfragments for healthy/disease exposure genotype pairs (N=80 total) and allowed to recover for 8 days prior to the disease challenge. A disease donor colony of M. cavernosa with visible stony coral tissue loss disease (SCTLD) lesions was collected from Broward County, Florida (26.1476, -80.0961) 2 days prior to the start of the experiment, and was cut into ~1×4cm fragments using a diamond band saw with each fragment containing a portion of active lesion tissue. Coral fragments in the disease-exposed group were maintained in direct contact with diseased tissue fragments, where disease donor fragments were replaced as needed following total loss of tissue.

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Genotype pairs in the healthy group were not exposed to any other corals. Corals were observed daily over the course of the experiment to quantify the number of days to onset of disease lesions, as well as to observe the gross signs of lesion formation and tissue necrosis. Following progression of lesions across approximately 50% of the fragment area, coral fragments and their corresponding healthy genotype pair were sampled via a small tissue scrape from near the lesion, which was preserved in TRIzol and flash-frozen in liquid nitrogen. Corals remaining at the end of the experiment were processed in the same manner. Herein, coral fragments are characterized as 'healthy' for all samples in the control group, 'diseased' for samples in the disease-exposed group exhibiting lesions, and 'NAI' (no active infection) for samples in the disease-exposed group that showed no visible signs of disease lesions by the end of the experiment.

2.2 | Intervention experiment

The in-situ intervention experiment was conducted at long-term monitoring site BC1 (mean depth 5.8m) in Broward County, Florida (26.1476, -80.0961; Combs et al., 2021; Shilling et al., 2021), over 13 days in April–May 2020. Fifteen colonies of *M. cavernosa* with a single visible SCTLD lesion were tagged, and small tissue scrapes were collected ~5 cm from the disease lesion and preserved as described previously. Nineteen visually healthy colonies of the same species were also tagged and sampled. Following the initial sampling, diseased colonies were treated with amoxicillin in CoreRx Base 2B as described in Shilling et al. (2021), with the exception that trenching of the coral skeleton in advance of the disease lesion was not conducted. Colonies were then revisited 13 days later, and tissue sampling was repeated. No new lesions were reported on any colonies over the duration of the sampling period.

2.3 | Tag-Seq library preparation, sequencing, and bioinformatics

Total RNA was extracted in samples from both experiments using modified versions of protocols for the Zymo Direct-zol RNA Miniprep and Zymo RNA Clean & Concentrator-5 kits (Studivan, 2022c). RNA was guantified on an Agilent Bioanalyzer 2100 and analyzed for purity on a Nanodrop 1000, where samples with RIN scores <4 or poor purity ratios were re-extracted. All successfully extracted samples were normalized to $60 \text{ ng/}\mu\text{L}$ and sent to the University of Texas at Austin Genome Sequencing and Analysis Facility for library preparation and sequencing. Tag-Seq library preparation was performed in duplicate using 600 ng of initial RNA for M. cavernosa samples and 100 ng for O. faveolata samples due to initial issues with PCR inhibitors in the latter. Following successful amplification of all samples, libraries were pooled and sequenced on a NovaSeq 6000 S2-XP flow cell generating 1×100bp reads with 20% PhiX spike-in for a target read depth of ~10 million reads per library (~20 million reads per sample).

Raw sequences were processed according to custom Perl scripts in a GitHub repository release (Studivan, 2022c) to deduplicate, trim (FASTX-Toolkit; Gordon & Hannon, 2010), align (Bowtie 2; Langmead & Salzberg, 2012) and quantify gene counts (SAMtools; Danecek et al., 2021) for each sample. Dominant symbiont genera were determined by aligning sample reads to a reference containing Symbiodiniaceae 28S sequences across the four main genera (Symbiodinium spp., Breviolum spp., Cladocopium spp. and Durusdinium spp.). Montastraea cavernosa samples were dominated by Cladocopium spp. (99.7%), and O.faveolata samples contained a majority of Durusdinium spp. alignments (93.4%). Cleaned reads were mapped to separate host (M. cavernosa, Kitchen et al., 2015; O. faveolata, Pinzón et al., 2015) and algal symbiont (Cladocopium spp., Davies et al., 2018; Durusdinium spp., Shoguchi et al., 2021, respectively) reference transcriptomes sequentially to remove cross-contaminated sequences in both host and symbiont transcriptomes. Transcriptome annotations for host and symbiont references were created according to GitHub repositories for O. faveolata (Studivan, 2022b) and M. cavernosa (Studivan, 2022a) using eggNOG-Mapper (Huerta-Cepas et al., 2016, 2018).

Following deduplication, the mean number of reads across all samples was 24.6 ± 0.9 million, with 5.8 ± 0.2 million reads remaining following trimming and cleaning. For *M. cavernosa* samples, alignment was $61.2 \pm 0.7\%$ for host and $6.5 \pm 0.3\%$ for symbionts with 82,594 and 32,862 isogroups, respectively. The original version of the *M. cavernosa* transcriptome was chosen over the updated, genome-derived version (https://matzlab.weebly.com/data--code. html) due to low alignment in the latter ($28.0 \pm 0.3\%$ for host and $7.1 \pm 0.4\%$ for symbiont) and poorer representation of isogroups (24,850 and 32,932 isogroups, respectively) for downstream differential expression analysis. Alignment rates for *O. faveolata* samples were $60.3 \pm 1.6\%$ for host and $15.6 \pm 0.8\%$ for symbionts, resulting in 81,960 and 39,854 isogroups, respectively.

2.4 | Statistical analysis

All statistical analyses were conducted in the R statistical environment (R Core Team, 2021). Analysis scripts and outputs can be found in a GitHub repository release associated with this manuscript (Studivan, 2023). Transmission metrics from the transmission experiment (time to onset of disease lesions) were analysed for an effect of species using an ANOVA of Box-Cox transformed data and with a fit proportional hazards regression model in the packages *survival* (Therneau, 2021) and *survminer* (Kassambara et al., 2021) to determine the relative risk of developing disease lesions between species.

For transcriptomic data, aligned gene counts were first separated by experiment, species, and host/symbiont datasets and then prefiltered to remove isogroups with a cumulative count <10 across all samples. Data were subsequently transformed using a variance stabilizing transformation in the *DESeq2* package (Love et al., 2014) and examined for outlier samples using the package *arrayQuality-Metrics* (Kauffmann et al., 2009). Samples violating the distance between sample arrays criterion (S_a) were removed from the respective experiment and host/symbiont datasets (Tables 1 and 2). Significance testing for the transmission experiment datasets was performed with PERMANOVA using $1e^{6}$ permutations, and sample dispersion was visualized using PCoA of Manhattan distance in the package vegan (Oksanen et al., 2015). Discriminant analysis of principal components (DAPC) in the adegenet package (Jombart, 2008) was used for the intervention experiment datasets to test the magnitude of transcriptomic plasticity in amoxicillin-treated corals relative to diseased and healthy controls, with significance testing in the package MCMCglmm (Hadfield, 2010). Differential expression analyses were conducted using DESeq2 models for the respective experiments. For M.cavernosa in the transmission experiment, the model genotype+disease status ('healthy', 'diseased', and 'nai') was used since not all fragments exhibited disease signs, whereas for O. faveolata, the model genotype+exposure group ('control' and 'sctld') was used. For the intervention experiment, a single-factor concatenated treatment and time ('control.0', 'sctld.0', 'control.1' and 'sctld.1') model was used. Contrast statements were used to conduct pairwise comparisons for each of the experiment datasets as described in the GitHub repository release (Studivan, 2023). Visualization of differentially expressed genes (DEGs) was done using the pheatmap package (Kolde, 2019).

Functional enrichment analyses with Mann-Whitney U tests were conducted for each experiment's pairwise comparisons using the packages KOGMWU (Dixon et al., 2015) of log fold change data (Ifc) and GO-MWU (Wright et al., 2015) of log p value data (Ipv) with an alpha cut-off of .05 for eukaryotic orthologous group (KOG) and gene ontology (GO) annotations, respectively. To identify correlational relationships between gene modules (genes with similar expression patterns) and experimental variables, weighted gene co-expression network analyses (WGCNA: Langfelder & Horvath, 2008) were conducted as described in the associated GitHub repository release (Studivan, 2023). Module-associated genes were then exported for GO enrichment analysis to examine any relationships between gene expression patterns and additional sample traits beyond diseased versus healthy status. Module hub genes (i.e., genes with the maximum adjacency to other genes in the module, which may infer biological function) were run through the InterPro database to classify protein families and/or domains (Paysan-Lafosse et al., 2023).

Finally, DEGs unique to and shared between species and experiments were determined using the *VennDiagram* package (Chen & – MOLECULAR ECOLOGY – 🗸

Boutros, 2011). For the transmission experiment, common DEGs (orthogroups) and associated KOG/GO annotations for diseased/ healthy comparisons in *M. cavernosa* and *O. faveolata* were identified by blast annotations using OrthoFinder (Emms & Kelly, 2015, 2019) and visualized by heatmaps and KOG classes. For comparison of DEGs in *M. cavernosa* samples from the transmission and intervention experiments (e.g., to compare DEGs in disease-exposed transmission samples to antibiotic-treated samples in the intervention experiment), matching gene and KOG annotations were examined in the same fashion as the cross-species comparisons. DEGs with known immune function related to SCTLD exposure (Beavers et al., 2023; Traylor-Knowles et al., 2021) were identified in the datasets and tested for significant differences among treatment groups with one-way ANOVAs and Tukey's post hoc tests then visualized using boxplots.

3 | RESULTS

3.1 | Transmission experiment

3.1.1 | Transmission metrics

There was a significant difference in the number of days to the onset of visible disease lesions between species (ANOVA: $F_{1,29}$ =6.22, p<.019), with *O. faveolata* significantly more likely to develop stony coral tissue loss disease (SCTLD) lesions compared to *M. cavernosa* (log-rank: $z_{1,29}$ =3.569, p<.001; Figure S1). Transmission rates in the disease-exposed treatment at the conclusion of the experiment

TABLE 2 Sample sizes for the intervention experiment, where n_{treat} denotes treatment sample sizes and n_{host} and n_{sym} denote the number of samples used for host and symbiont differential gene expression analyses, respectively.

Time point	Treatment	n _{treat}	n _{host}	n _{sym}
2020-04-21	Healthy	19	15	15
(t ₀)	Diseased	15	15	15
2020-05-04	Healthy	19	15	14
(t ₁)	Treated	15	15	13

TABLE 1Sample sizes and transmission metrics for the transmission experiment including proportion of individuals exhibiting diseaselesions (transmission rate) and the time to onset of lesions (mean days to transmission).

Species	Treatment	n _{treat}	n _{host}	n _{sym}	n _{lesion}	Transmission rate	Days to transmission (mean <u>±</u> SEM)
Montastraea	Control	20	20	18	0	0%	N/A
cavernosa	SCTLD	20	19	18	11	55%	5.4 ± 1.0
Orbicella faveolata	Control	20	19	20	0	0%	N/A
	SCTLD	20	18	14	19	95%	3.1 ± 0.5

Note: Treatment sample size denoted by n_{treat} and the number of samples exhibiting lesions as n_{lesion} , with samples used for host and symbiont differential gene expression analyses as n_{host} and n_{sym} , respectively.

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were 95% for *O. faveolata* with lesions occurring at a mean of 3.1 ± 0.5 days, while 55% of *M. cavernosa* fragments exhibited lesions at a mean of 5.4 ± 1.0 days (Table 1). No controls in either species developed lesions. Visible signs of SCTLD were similar between species, with tissue necrosis and lesion formation/progression being the most common (Dataset S1).

3.1.2 | Differential expression

Analysis of Tag-Seq data with two-way PERMANOVAs identified significant effects of coral genotype and disease status on gene expression of *M. cavernosa* and *Cladocopium* symbionts. Ordination with PCoAs for *M. cavernosa* demonstrated that diseased samples

were distinct from all other samples, while no active infection (NAI) and healthy samples were more similar (Figure 1). This relationship was reversed for *Cladocopium* data, where diseased and NAI samples were more closely related to each other than to healthy samples. Pairwise differential expression tests with *DESeq2* indicated the majority of differentially expressed genes (DEGs) to be attributed to diseased versus healthy samples for *M. cavernosa* (3890 upregulated and 3878 downregulated), with 1820 DEGs between diseased and samples not exhibiting visible disease signs following exposure (NAI; 960 upregulated and 860 downregulated), and 115 DEGs between NAI and healthy samples (43 upregulated, 72 downregulated). Few DEGs were identified for any pairwise comparisons in *Cladocopium* symbionts, with five in diseased versus healthy samples and two in NAI versus healthy samples.



Montastraea cavernosa

Orbicella faveolata

FIGURE 1 PCoAs of coral species and associated symbionts from the transmission experiment, visualizing sample variation among treatments (control and SCTLD-exposed; shapes) and disease status (healthy, no active infection [NAI] and diseased; colours). Test statistics from PERMANOVA models and axis percentages indicate the amount of variation explained by the respective coordinate.

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PERMANOVA effects of genotype and exposure group were marginally insignificant for *O. faveolata* (p = .057 and p = .056, respectively) and non-significant for associated *Durusdinium* symbionts (Table 3). Both *O. faveolata* and *Durusdinium* samples showed similarities between healthy and diseased samples, with high overlap between exposure groups in the ordination space (Figure 1). Orbicella faveolata showed moderate numbers of DEGs between diseased and healthy samples (385 upregulated and 188 downregulated) with no DEGs for *Durusdinium* (Table 4).

3.1.3 | Functional enrichment

Functional enrichment analysis of eukaryotic orthologous groups (KOGs) demonstrated similar patterns between diseased versus healthy and diseased versus NAI samples for M. cavernosa (Figure S2), where metabolic and transport mechanisms were generally downregulated in diseased samples, and nuclear structure and translation-related pathways were upregulated. Some nuclear structure and membrane pathways were positively enriched in NAI versus healthy M. cavernosa, with downregulation of translation, cytoskeleton and extracellular pathways. Cladocopium diseased and NAI samples showed enrichment of most pathways relative to healthy controls, with nuclear structure as the most positively enriched and cell motility as the most downregulated. Similar trends were observed for diseased versus healthy O. faveolata as compared to M. cavernosa, including downregulation of metabolic and transport pathways and upregulation of nuclear and translation mechanisms. Durusdinium showed an inverse pattern of KOG enrichment in diseased samples relative to Cladocopium through weak upregulation of repair mechanisms, strong suppression of nuclear and extracellular structures, and strong upregulation of cell motility (Figure S2).

Functional enrichment using gene ontology (GO) identified 434 GO terms across three categories (molecular function [MF]: 38; biological process [BP]: 287; cellular component [CC]: 109) for diseased versus healthy M. cavernosa samples (Table S1). Of these, the most significantly enriched GO terms with upregulated genes in diseased samples were RNA binding (MF, GO:0003723), intracellular protein transport (BP, GO:0006886), response to endoplasmic reticulum stress (BP, GO:0034976), cilium movement (BP, GO:0003341) and plasma membrane bounded cell projection cytoplasm (CC, GO:0032838, GO:0005930, GO:0097014), while the most significant downregulated terms in diseased samples were catalytic activity acting on DNA (MF, GO:0140097), DNA replication and DNA-dependent DNA replication (BP, GO:0006261 and GO:0006260) and lysosomal lumen (CC, GO:0043202). For diseased versus NAI M. cavernosa, 371 GO terms were significantly enriched (MF: 50; BP: 244; CC: 77), where the most significantly enriched GO terms in diseased versus healthy individuals described above were represented here. Only eight terms were significantly enriched for NAI versus healthy samples (BP: 2; CC: 6; Table S2), with the only significant upregulated term being cilium movement (BP, GO:0003341), and the most significant downregulated terms in NAI versus healthy being cytokinesis (BP, GO:0061640, GO:0000910), endoplasmic reticulum lumen (CC, GO:0005788) and extracellular region part (CC, GO:0005615, GO:0044421). The majority of enriched GO terms were downregulated in diseased versus healthy and diseased versus NAI M. cavernosa, indicating a general suppression of transcriptomic activity following disease lesion formation.

TABLE 3 Test statistics for differential gene expression analyses by experiment, test type, host species, and associated symbionts across treatment factors.

Experiment	Test	Species	Factor	df	Test statistic	R ²	р
Transmission	PERMANOVA	Montastraea cavernosa	Genotype	19	1.955	.6282	<.001
			Status	2	2.489	.0842	<.001
		Cladocopium spp.	Genotype	19	1.1746	.5607	.024
			Status	2	1.7443	.0876	.002
		Orbicella faveolata	Genotype	19	1.2049	.5641	.057
			Treatment	1	1.6927	.0417	.056
		Durusdinium spp.	Genotype	19	1.1	.5945	ns
			Treatment	1	1.2558	.0357	ns
Intervention	DAPC	Montastraea cavernosa	treated1_diseased0				<.001
			healthy0_diseased0				<.001
			healthy1_diseased0				<.001
	MCMC		treated1_healthy1				ns
	DAPC	Cladocopium spp.	treated1_diseased0				<.001
			healthy0_diseased0				.024
			healthy1_diseased0				<.001
	MCMC		treated1_healthy1				<.001

Note: Non-significant p values denoted as ns.

TABLE 4 Differentially expressed genes (DEGs) by experiment, host species, and associated symbionts across treatment pairwise comparisons.

			Host DEG	5		Sym D	EGs	
Experiment	Species	Comparison	Up	Down	Total	Up	Down	Total
Transmission	Montastraea	diseased_healthy	3890	3878	7768	4	1	5
	cavernosa	nai_healthy	43	72	115	2	0	2
		diseased_nai	960	860	1820	0	0	0
	Orbicella faveolata	diseased_healthy	385	188	573	0	0	0
Intervention	Montastraea	diseased0_healthy0	284	126	410	0	0	0
	cavernosa	treated1_diseased0	48	193	241	0	0	0
		treated1_healthy1	4	1	5	0	0	0
		healthy1_healthy0	183	65	248	8	4	12
		treated1_healthy0	269	246	515	5	7	12
		diseased0_healthy1	128	137	265	1	1	2

Note: Up denotes DEGs with higher relative expression in treatment x/treatment y, and down denotes lower relative expression.

In O.faveolata, 45 GO terms were enriched in diseased versus healthy samples (MF: 9; BP: 20; CC: 16; Table S1), and the majority of enriched terms were upregulated in diseased versus healthy samples for this species. The most significantly enriched GO terms upregulated in diseased individuals relative to healthy controls were structural constituent of ribosome (MF, GO:0003735), cytoplasmic translation (BP, GO:0002181), cytosolic ribosome and cytosolic large ribosomal subunit (CC, GO:0022626 and GO:0022625); the most significantly downregulated GO terms were active transmembrane transporter activity (MF, GO:0022804), cofactor transport (BP, GO:0051181) and intrinsic component of plasma membrane (CC, GO:0005887, GO:0031226). No GO terms were significantly enriched for *Cladocopium* or *Durusdinium* symbionts.

3.1.4 | Weighted gene coexpression network analysis

Weighted gene coexpression network analysis (WGCNA) identified 10 modules with significant correlations to experimental factors (disease status and the time to onset of lesions) in M. cavernosa. In general, modules that were negatively correlated with healthy samples were positively correlated with diseased samples (Figure S3). Several modules were also correlated with NAI samples that demonstrated similar expression to diseased samples (module 'darkorange2') and the time to transmission ('thistle1' and 'darkorange2'), or inverse relationships with healthy samples ('navajowhite1'). Five module hub genes (i.e., genes with the highest number connections to other genes in the module) had protein domain annotations for M. cavernosa, all of which modules had significant correlations to experimental traits. Their function included known immunity protein domains/families such as growth factor receptor ('blue2') and proteasome B-type subunit ('darkorange2'). The hub gene for module 'darkseagreen4', tropomyosin, was downregulated in response to SCTLD exposure in our study and in a recent experiment by Beavers

et al. (2023; Table S3). The hub gene for module 'royalblue', insulinlike growth factor-binding protein, was associated with a significant positive correlation with NAI samples. Of the modules correlated with NAI samples, only 'darkorange2' showed significant GO enrichment to the mRNA metabolic process (BP) and peptidase, cytosolic, and ribosomal complexes (CC; Table S4). Four modules were found to have significant trait correlations for *Cladocopium*, with similar expression patterns between NAI and diseased samples relative to healthy controls in the 'pink' module, but no significant GO enrichment. Four modules had protein domain-annotated hub genes, only one of which had a significant negative correlation with the transmission time (translation initiation factor IF-2, module 'red'; Table S3).

The *O. faveolata* dataset had six modules with significant correlations to disease status and the time to onset of lesions; most of these were inversely related between diseased and healthy samples, apart from the 'tan' module that was inversely related between NAI and healthy samples (Figure S3). There were no significantly enriched GO terms for the 'pink' or 'tan' modules correlated with NAI samples. Six module hub genes had protein domain annotations for *O. faveolata*, two of which had significant correlations with experimental traits: ATP synthase (module 'black') that was negatively correlated with transmission time, and calcium ion binding ('greenyellow') that was negatively correlated with disease (Figure S3). An immune-related hub gene was identified for module 'purple', mannose-6-phosphate receptor, but the module did not have any significant correlations. WGCNA was not successful in assigning modules to the *Durusdinium* dataset.

3.1.5 | Orthologous genes

Orthofinder identified 681 orthologous DEGs in diseased versus healthy samples between species; of these, 438 showed similar expression patterns (272 upregulated and 166 downregulated), and 243 showed inverse expression (Figure 2). Only two orthologous



FIGURE 2 (a) Common genes (orthogroups) in diseased versus healthy corals compared between *Montastraea cavernosa* (Mcav) and *Orbicella faveolata* (Ofav) samples from the transmission experiment, denoting higher relative expression in diseased/healthy as red (up) and lower expression as blue (down). (b) Heatmap of most significant genes (cut-off $1e^{-6}$) across disease state and species. (c) Representation of eukaryotic orthologous groups (KOGs) across common genes for relative expression levels (up, down) and species.

DEGs identified as part of the immune response to SCTLD were identified in both species (spondin2b and animal haem peroxidase); spondin2b was shown to have decreased expression in diseased versus healthy samples (though not significant for M. cavernosa), and animal haem peroxidase showed a significant difference in diseased and healthy samples with an inverse relationship between species (Figure S4). There were 19 additional genes known to be associated with previously reported immune processes with significant variation in expression levels across fates in *M. cavernosa* (Figure S5), and 12 significant genes in O. faveolata (Figure S6). These included two apoptosis regulation pathways that were differentially expressed in diseased M.cavernosa relative to healthy controls. Extracellular matrix genes (four for M. cavernosa and two for O. faveolata, both including spondin2b mentioned above) were downregulated in SCTLD-affected corals for both species, except for one gene in M. cavernosa that was also associated with the transforming growth factor-beta (TGF- β) immune pathway. Three TGF- β genes were downregulated in diseased versus healthy M. cavernosa. One NF-κB activation gene was upregulated in diseased versus healthy M.cavernosa, while two were found to be higher expressed in diseased O. faveolata relative to healthy controls. Three peroxidases were upregulated in diseased M. cavernosa, but of the seven differentially expressed peroxidase genes in O. faveolata, four were downregulated in diseased versus healthy controls. Protein tyrosine kinase genes (PTK; seven in M. cavernosa and one in O. faveolata) were mostly upregulated in diseased versus healthy individuals, although two genes showed downregulation in diseased M. cavernosa (Figure S5). Finally, one WD repeat gene was downregulated in diseased O.faveolata relative to healthy controls (Figure S6).

While the expression of individual genes was in some cases inversely related between species (Figure 2), the corresponding KOG annotations demonstrated that the number of DEGs within each KOG class that was up- or downregulated was relatively similar, suggestive of an overall similar functional response to disease exposure between *M.cavernosa* and *O.faveolata*. Likewise, the examination of GO categories in diseased versus healthy samples indicated 21 GO terms (MF: 2; BP: 11; CC: 8) that were commonly enriched in the same direction between species (Table 5; Figure 3). GO terms encompassing protein translation, transport, and metabolism were upregulated in diseased samples between species, while meiosis and DNA metabolic processes were suppressed in diseased individuals.

3.2 | Intervention experiment

3.2.1 | Differential expression

Discriminant analysis of principal components (DAPCs) indicated that expression in the diseased corals and their associated symbionts was significantly different from all other treatment groups including the post-treatment samples (Table 3). MCMC significance testing revealed that treated corals were indistinguishable from healthy controls at t_1 for host gene expression (p=.98), but not for algal expression (p<.001). In both datasets, however, gene expression of treated colonies more resembled that of the healthy controls compared to the original diseased state (Figure 4); indeed, DAPC assigned 80% of treated corals to the healthy t_1 group in the coral dataset and 23% in the algal dataset (the remaining 77% were assigned to the healthy t_0 group; Table S5). Differential expression analyses identified DEGs associated with pairwise treatment/time comparisons, with the most number of DEGs between diseased and healthy corals at t_0 (410 DEGs: 284 upregulated and

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cellular compor	nent (CC).								• •
		Montastraea cavernosa				Orbicella faveolata			
GO category	GO name	GO terms	p Value	Direction	Genes	GO terms	<i>p</i> Value	Direction	Genes
MF	RNA-binding	GO:0003723	9.25E-05	Up	139	GO:0003723	.033	Up	64
ЯF	Structural constituent of ribosome	GO:0003735	.001	Up	45	GO:0003735	1.47E-14	Up	20
ВР	Cytoplasmic translation	GO:0002181	3.51E-09	Up	44	GO:0002181	1.05E-15	Up	19
ВР	DNA metabolic process	GO:0006259	1.41E-09	Down	130	GO:0006259	.035	Down	51
BP	Establishment of protein localization to membrane	GO:0090150	1.82E-07	Up	52	GO:0090150	.002	Up	18
ВР	Intracellular protein transport	GO:0006886	1.01E-15	Up	170	GO:0006886	.001	Up	70
ВР	Meiosis I cell cycle process	GO:0061982; GO:0007127	4.24E-05	Down	30	GO:0061982	.031	Down	17
ВР	Nuclear-transcribed mRNA catabolic process, nonsense- mediated decay	GO:0000184	4.01E-05	Up	28	GO:0000184	.001	Up	11
BP	Peptide biosynthetic process	GO:0006412; GO:0043043	5.60E-07	Up	95	GO:0006412; GO:0043043	3.11E-06	Up	37
BP	Peptide metabolic process	GO:0043604; GO:0006518	.001	Up	145	GO:0043604; GO:0006518	.001	Up	60
ВР	Protein targeting	GO:0006605	3.94E-07	Up	75	GO:0006605	.019	Up	23
BP	Protein targeting to membrane	GO:0006612; GO:0045047; GO:0072599; GO:0070972	1.59E-08	Up	48	GO:0006612	7.02E-05	Up	11
ВР	Translational initiation	GO:0006413	1.60E-08	Up	42	GO:0006413	.001	Up	16
CC	Cytosolic large ribosomal subunit	GO:0022625	3.65E-06	Up	30	GO:0022625	8.00E-13	Up	13
CC	Cytosolic part	GO:0044445	6.45E-06	Up	63	GO:0044445	9.78E-07	Up	30
CC	Cytosolic ribosome	GO:0022626	1.60E-07	Up	46	GO:0022626	2.71E-15	Up	20
CC	Cytosolic small ribosomal subunit	GO:0022627	.010	Up	15	GO:0022627	8.96E-06	Up	9
S	Large ribosomal subunit	GO:0015934	.001	Up	32	GO:0015934	1.25E-08	Up	15
CC	Polysome	GO:0005844	.001	Up	21	GO:0005844	.035	Up	13
CC	Ribonucleoprotein complex	GO:1990904	2.75E-06	Up	145	GO:1990904	.009	Up	69
S	Ribosome	GO:0005840; GO:0044391	.0002	Up	54	GO:0005840; GO:0044391	1.91E-10	Up	26

TABLE 5 Matching enriched gene ontology (GO) terms across species for the transmission experiment, separated by GO categories: molecular function (MF), biological process (BP), and cellu

Note: FDR-corrected p values correspond to results of Mann-Whitney U tests on pairwise contrasts of diseased/healthy samples for each species.

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126 downregulated), the second being between amoxicillin-treated corals at t_1 and their original diseased state at t_0 (241 DEGs: 48 upregulated and 193 downregulated; Table 4; Figure 4). There were few differences between treated and healthy corals at t_1 (5 DEGs: 4 upregulated and 1 downregulated), and temporal shifts in gene expression were evident (e.g., 248 DEGs in t_1 vs. t_0 healthy corals). Few DEGs were identified across pairwise comparisons for Cladocopium (Table 4; Figure 4).

Identification of immune-related pathways with significant variation across treatments revealed five genes: two PTK genes, one of which was elevated in diseased colonies but not in their posttreatment state or in healthy controls, and another that showed significant upregulation in treated versus diseased and healthy corals (Figure S7). Three WD repeat genes were also found, one of which showed upregulation in treated corals relative to diseased and healthy controls, while the remaining two had significantly higher expression in diseased individuals versus both other treatments (Figure S7).

3.2.2 **Functional enrichment**

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KOG enrichment in diseased versus healthy corals at t_0 was similar to the trends observed for the transmission experiment, where several metabolic and transport pathways were negatively enriched (Figure 5). Notably, the nuclear structure KOG class was highly downregulated in diseased corals, when it was shown to be upregulated for both diseased M. cavernosa and O. faveolata samples from the transmission experiment. Comparison of treated versus diseased corals demonstrated an opposite response in the same pathways as compared to diseased versus healthy corals, showing an increase in metabolic, transport and nuclear structure classes. No KOG classes were strongly enriched when comparing treated and healthy corals at t₁. Cladocopium KOG enrichment was similar in diseased versus healthy corals to the transmission experiment samples, with strong upregulation of nuclear structure and suppression of cell motility. Following treatment with amoxicillin, those patterns were reversed, even when comparing treated to healthy corals at t_1 (Figure 5).

GO enrichment analysis identified 46 significantly enriched GO terms in diseased versus healthy corals at t_0 (MF: 9; BP: 10; CC: 27; Table S6; Figure S8). Similar to diseased M. cavernosa samples from the transmission experiment, the majority of enriched GO terms were negatively enriched in diseased versus healthy corals in the intervention experiment, broadly including downregulated protein synthesis and transport, endoplasmic reticulum processes, and oxidoreductase activity. Conversely, relatively few GO terms were upregulated: microtubule processes and ubiquitin, the latter of which is part of NF-κB pathway activation (Beavers et al., 2023). There were 39 significant GO terms in treated versus diseased corals (MF: 6; BP: 14; CC: 19), with the majority upregulated in treated corals including those described above that were suppressed in diseased corals:

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protein translation, metabolism, and transport, as well as endoplasmic reticulum processes and oxidoreductase activity. Microtubule processes and ciliary structures were downregulated following treatment (Figure S8). Seven GO terms were significantly enriched in treated versus healthy corals at t_1 (MF: 1; CC: 6): endoplasmic reticulum terms were upregulated in treated versus healthy samples at t_1 , and ciliary structures and plasma membrane components were downregulated (Table S6; Figure S8).

3.2.3 | Weighted gene coexpression network analysis

WGCNA returned eight modules significantly correlated with treatments/time points, with the strongest patterns of inverse correlations between healthy corals at t_0 to t_1 (modules 'darkred' and 'salmon;' Figure 6). Modules 'greenyellow' and 'purple' showed inverse correlations between diseased and healthy corals at t_0 , and only the 'pink' module showed an inverse relationship between treated and diseased corals. Only the 'darkred' module contained significantly enriched GO terms, all of which were downregulated endoplasmic reticulum complexes (CC; Table S4). Visualization of expression patterns for the 30 most significant DEGs in modules 'greenyellow' and 'grey60' demonstrated a shift in expression patterns from the original disease state being distinct to healthy controls, to overall similarities between treated and healthy corals (Figure 6). Nine module hub genes had corresponding protein domain annotations, four of which were associated with significant experiment trait correlations: the heat shock protein 70 family (module 'darkred') was downregulated over time in the healthy controls, fibrillar collagen ('grey60') was downregulated



FIGURE 4 (a) Discriminant analysis of principal components (DAPCs) of *Montastraea cavernosa* samples and associated symbionts from the intervention experiment, visualizing sample assignments among a single-factor combination of treatments and sampling time points. Test statistics from MCMC generalized linear models denote similarities of the treated treatment to the original disease state and the healthy controls at t_1 , where a significant result indicates that treated corals were more similar to one treatment group over another. (b) Venn diagrams of common DEGs across pairwise comparisons of treatments/time (H1/H0: Healthy t_1 /Healthy t_0 ; D0/H0: Diseased t_0 /Healthy t_0 ; T1/D0: Treated t_1 /Diseased t_0 ; T1/H1: Treated t_1 /Healthy t_1).

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FIGURE 5 Heatmaps of eukaryotic orthologous group (KOG; rows) enrichment between pairwise comparisons of treatments (columns) for the intervention experiment, separated by coral host and associated symbionts. Color values represent Mann–Whitney *U* test ranks for each dataset, and hierarchical networks denote similarities among KOG classes and treatment pairwise comparisons, respectively. KOG enrichment calculated using DEGs (log₂ fold change).



FIGURE 6 Correlational heatmaps of weighted gene coexpression network analysis (WGCNA) modules across treatments for the intervention experiment, separated by coral host and associated algal symbionts. Cell colors correspond to the direction of the correlation (red: positive; blue: negative), numbers correspond to significant correlation coefficients, and barplots denote the number of genes within each module. Heatmaps represent expression patterns of the top 30 most significantly differentially expressed genes within the 'greenyellow' and 'grey60' modules.

in diseased corals, heat shock transcription factor ('pink') was upregulated in diseased corals and downregulated in treated corals, and NAD-dependent epimerase/dehydratase ('salmon') was strongly upregulated in healthy controls over time (Figure 6). One module had a significant correlation to experimental traits in *Cladocopium*, but it was driven by one sample and therefore disregarded. Of note was the hub gene of module 'turquoise', photosystem II PsbL, though it was not significantly correlated with any experiment traits.

3.3 | Cross-experiment comparisons

Comparison of diseased versus healthy M. cavernosa samples from the transmission and intervention experiments revealed 1458 genes that were significantly differentially expressed in both experiments. The majority of common genes in diseased samples showed the same directionality between experiments (452 upregulated and 489 downregulated), while 517 genes showed inverse relationships between experiments (Figure S9). When comparing diseased versus healthy samples in the transmission experiment to treated versus diseased corals in the intervention experiment, however, the majority of genes were found in inverse relationships between experiments (1041 genes), whereas only 285 genes were found to share the same direction of expression (121 upregulated and 164 downregulated). Three immune-related genes were identified across both experiments as having significant variation in expression among the respective treatments. Diseased individuals were found to have the highest upregulation of a peroxidase gene relative to healthy controls and treated individuals, with no significant differences between healthy controls and treated corals in the intervention experiment, nor differences between healthy controls and NAI corals in the transmission experiment (Figure S10). Two TGF- β genes showed relative suppression in diseased versus treated and NAI corals, respectively. Gene representation within KOG classes was largely similar across experiments, with the exception of unannotated genes that contributed to variability between experiments and among disease status/treatment comparisons (Figure S9).

4 | DISCUSSION

4.1 | Strong transcriptional responses to SCTLD challenge between coral species

Exposure to stony coral tissue loss disease (SCTLD) in these experiments caused evident transcriptional responses in both coral species. In general, we observed a depression of host metabolic pathways and a corresponding increase in expression of stress response genes and nuclear processes (Figure S2). This is unsurprising given consistency in transcriptomic responses to myriad stressors, a phenomenon characterized as a conserved stress response among diverse coral taxa (Dixon et al., 2020; Wang et al., 2009). While there was evidence of a strong transcriptional response to disease exposure in host corals, there was little variation in the transcriptional response of symbionts in both experiments. This may be due to lower alignment rates to the symbiont transcriptomes relative to the coral hosts ($6.5 \pm 0.3\%$ for Cladocopium and $15.6 \pm 0.8\%$ for Durusdinium vs. $61.2 \pm 0.7\%$ for M. cavernosa and $60.3 \pm 1.6\%$ for O. faveolata, respectively) or comparatively poor annotations in symbiont references. Additional biological mechanisms may also explain the relatively weak symbiont gene expression signal, such as in hospite transcriptional stability (Barshis et al., 2014; Davies et al., 2018), host

suppression of symbiont transcription (Mohamed et al., 2020), or reliance on post-transcriptional regulation (Roy et al., 2018). Therefore, we have focused primarily on interpretation of the coral host datasets to minimize speculation with the symbiont datasets.

Through comparative analyses between coral species in the transmission experiment, we found consistent overlap in the majority of transcriptional responses following exposure to SCTLD. Notably, metabolic pathways were the most suppressed eukaryotic orthologous group (KOG) terms in diseased versus healthy samples for both species, while membrane structure, cell motility and defense mechanisms were often upregulated with exposure to disease (Figure S2). Of 681 differentially expressed genes (DEGs) and 21 gene ontology (GO) terms shared between M. cavernosa and O. faveolata (Figures 2 and 3), the majority of DEGs (~64%) and all GO terms were expressed or enriched in the same direction in response to SCTLD exposure, suggesting that there are many conserved pathways among coral species functioning in the same roles. This relationship has been corroborated in two recent studies by MacKnight et al. (2022) and Beavers et al. (2023), which examined transcriptional responses of several coral species (including our study species) to white plague disease and SCTLD, respectively. Both studies reported upregulation of immunity and cytoskeletal arrangement gene pathways following disease exposure across all species, with variation in intracellular protein trafficking pathways related to differences between disease susceptibility among and within species. Similarly, we observed higher enrichment of protein trafficking KOG and GO terms in diseased versus healthy M. cavernosa, which is less susceptible to SCTLD than O. faveolata (Figure 3; Figure S2; Meiling et al., 2021; NOAA, 2018).

Conversely, a minority of DEGs showed inverse relationships between species following exposure to SCTLD (Figure 2). For example, cytoskeletal structure and intracellular trafficking genes were strongly upregulated in M. cavernosa but suppressed in O. faveolata, and likely relate to differences in disease susceptibility as described above. The galactose binding lectin domain was upregulated in O.faveolata but strongly suppressed in M.cavernosa (Figure 2b). This pathway is especially important in recognition of glycan ligands on algal symbiont cell surfaces during initiation of symbiosis (Yoshioka et al., 2022), implying that losses of Durusdinium symbionts in O.faveolata were greater than Cladocopium in M.cavernosa, and indicate potential attempts at recovery of in hospite symbiont assemblages. Despite this variation in gene-level expression patterns spanning metabolic, transport and immune processes, functional enrichment of KOG and GO terms were largely similar between species (Figure 3; Figure S2), potentially indicating plasticity of conserved gene pathways between M. cavernosa and O. faveolata (i.e., distantly related species using the same gene pathways in different ways). This modulation may be indicative of plasticity related to disease susceptibility (e.g., Beavers et al., 2023; MacKnight et al., 2022), and warrants additional investigation with other species affected by SCTLD.

Both prior studies that examined transcriptomic responses to SCTLD (Beavers et al., 2023; Traylor-Knowles et al., 2021) identified

differentially expressed gene processes implicated in coral immunity following exposure to SCTLD. Here, we report significant variation of the same pathways in diseased individuals of both species (Figures S4–S6). Apoptosis, a well-known process implicated in cell death and necrosis (D'Arcy, 2019; Fuess et al., 2017), was naturally upregulated in diseased samples relative to healthy controls. Extracellular matrix genes were often downregulated following disease exposure in both species and are hypothesized to be related to wound healing and the prevention of lesion progression (Traylor-Knowles et al., 2021; Young et al., 2020). Transforming growth factor-beta (TGF- β) pathways are linked with increased microtubule and ciliary activity (Fuess et al., 2020; Traylor-Knowles et al., 2021), which we observed to be upregulated in diseased individuals across both experiments (Table S1; Figure S8). Ciliary action has been documented to help corals maintain their surface microbial layer which aids in pathogen removal (Gavish et al., 2021), and may be upregulated during immune challenge as a means of initial defense (Changsut et al., 2022). Nuclear factor kappa B (NF- κ B) genes were also upregulated in diseased versus healthy samples (Figures S5 and S6), where this transcription factor is well-known for its role in immune activation and potentially in regulation of the coral-algal symbiosis (Voolstra et al., 2009; Williams et al., 2018).

Similarly, Beavers et al. (2023) identified significant upregulation of Ras-related protein rab 7 (rab7) across five coral species exposed to SCTLD, which is a gene implicated in autophagy of zooxanthellae (Chen et al., 2003). The authors concluded that rab7 expression is an indicator of the breakdown of the coral-algal symbiosis in response to disease exposure, and therefore could be a useful bioindicator of SCTLD exposure. Rab7 was not found to be differentially expressed in any of our datasets, so we could not corroborate the pattern observed in the aforementioned study. Instead, we found the key members of WGCNA modules (i.e., module hub genes; Table S3) to be associated with known symbiosis and immune-related processes including mannose-6-phosphate receptor (Kvennefors et al., 2008; Rodriguez-Lanetty et al., 2009), scavenger receptor (Neubauer et al., 2016), and spondin2 (Kenkel et al., 2014). Taken together, expression of these pathways may be related to the hypothesis that SCTLD is caused by a virus targeting Symbiodiniaceae (Veglia et al., 2022; Work et al., 2021), but this observation requires further study.

Additional immune-related gene pathways were shown to be indicators of disease exposure and of the strong coral response to SCTLD exposure in this study. Peroxidases have been shown to be a component of the innate immune response to disease and thermal stress through their production of antibiotic compounds (Mydlarz & Harvell, 2007; Palmer, 2018); we identified 10 peroxidase genes with variable expression levels both within and between species, indicative of species-specific regulation of conserved pathways (Figures S5 and S6). Eight protein tyrosine kinase genes (PTKs) were mostly upregulated in diseased corals, which promote inflammatory responses to pathogens in corals (Fuess et al., 2016), corroborating that cytokine production plays a role in the response to MOLECULAR ECOLOGY – WILEY

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SCTLD exposure (Traylor-Knowles et al., 2021). One WD repeat gene was downregulated in diseased *O. faveolata* in the transmission experiment (Figures S5 and S6); this class of immune genes provides negative regulation of apoptotic and immune responses (Aranda et al., 2011), though their function in coral immunity is not well understood. The corroboration of conserved immune functions among species in this study and the only other transcriptomic resources related to SCTLD exposure at present (Beavers et al., 2023; Traylor-Knowles et al., 2021) provides evidence of their importance in the immune response to this disease, and further may be useful in the identification of biomarkers of disease exposure in wild corals (Traylor-Knowles et al., 2022).

Finally, similarities between no active infection (NAI) and healthy corals in GO enrichment analyses corroborated variance explained by PCoA ordination (Figure 1), suggesting that disease exposure does not necessarily result in a disease response at the transcriptomic level, and posits that innate resistance may be present in some individuals. This may be through immune front-loading (e.g., MacKnight et al., 2022), such as seen in the upregulation of cilium movement GO terms in NAI samples relative to healthy controls, which was also upregulated in diseased individuals. Downregulation of the endoplasmic reticulum lumen GO term in NAI samples, similar terms to which were conversely upregulated in diseased versus healthy and diseased versus NAI individuals (Tables S1 and S2), is likely an initial response to acute stress and may promote resistance to endoplasmic reticulum stress (such as protein misfolding or a breakdown of homeostasis; Aguilar et al., 2019; Aranda et al., 2011). There may also be inherent genetic resistance to disease in some genotypes (Vollmer & Kline, 2008), perhaps due to somatic age (Kelley et al., 2021; Ward, 2007), microbiome associations (MacKnight et al., 2021), or epigenetic processes (Thurber et al., 2020), and these potential relationships have only begun to be explored with SCTLD.

4.2 | Antibiotic treatment reverses transcriptional signatures of SCTLD

Treatment of corals with amoxicillin appears to result in a 'normalization' of host transcriptional pathways associated with the response to SCTLD, and to a lesser extent, of algal symbiont pathways. Treated corals were statistically indistinguishable from healthy controls and significantly different from their original diseased state (Figure 4), indicating a return to 'pre-disease' gene expression patterns. Comparisons of diseased versus healthy *M. cavernosa* across transmission and intervention experiments revealed mostly consistent patterns, with downregulation of metabolic pathways and upregulation of stress response, immune, and nuclear processes (Figure 5; Figure S10). The majority of shared DEGs between diseased individuals in both experiments were expressed in the same direction (~64%); however, following antibiotic treatment, the majority of shared DEGs (~76%, Figure S9) were inversely expressed relative to the pre-treatment WILEY-MOLECULAR ECOLOGY

diseased state. Perhaps the most exciting conclusions are that this study provides compelling evidence of a reversal of the same transcriptomic mechanisms involved in the immune response to SCTLD following treatment with amoxicillin, and further, it proposes that targeted disease intervention may be beneficial to the coral beyond removal of potential pathogens and co-occurring opportunistic microbes. As studies evaluating the effectiveness of antibiotic treatments on diseased corals often focus on visible observations (i.e., lesion progression and/or quiescence; Forrester et al., 2022; Neely et al., 2020; Shilling et al., 2021; Walker et al., 2021) or shifts in microbial communities (Sweet et al., 2011, 2014) as a means of assessing treatment success, this hypothesis requires further testing to elucidate the long-term impacts of antibiotic treatment on other members of the holobiont including the coral host. For example, antibiotics have additional immune-modulating and anti-inflammatory impacts on humans beyond alteration of associated microbial communities (Pradhan et al., 2016), which may prove beneficial to corals affected by SCTLD. Likewise, the implications of antibiotic treatment on associated Symbiodiniaceae assemblages in corals (Connelly et al., 2022), including a depression of nuclear processes reported here (Figure 5), are mostly unknown but may also impact holobiont health

Examination of SCTLD-associated immune responses (Beavers et al., 2023; Traylor-Knowles et al., 2021) in the intervention experiment reinforced the reversal of transcriptional patterns following amoxicillin treatment. PTK and WD repeat genes had significant variation in expression between diseased corals and healthy controls, and in some cases, between diseased and treated corals (Figure S7). In two of those cases (non-membrane spanning PTK activity and WD repeat-containing protein 37), expression in treated individuals was also significantly higher than that in healthy controls, perhaps as a form of overcompensation during an attempt at recovery from prior disease exposure. A heat shock protein family gene was also identified as a hub gene in weighted gene coexpression network analysis (WGCNA) in M. cavernosa, demonstrating a negative correlation with treated corals relative to diseased corals (Figure 6). Heat shock proteins are considered a key component of the general coral stress response (Dixon et al., 2020), and its downregulation following antibiotic treatment implies a reduction in the stress response by the coral host.

At the gene functional pathway level, GO terms associated with activation of the NF- κ B pathway (ubiquitin; Beavers et al., 2023) that were upregulated in diseased versus healthy corals in the intervention experiment were notably absent following antibiotic treatment, suggesting that the downstream NF- κ B immune response was no longer active (Figure S8). Suppression of oxidoreductase GO terms, as seen in diseased relative to healthy corals in the intervention experiment, has been shown to be a sign of redox homeostasis dysfunction (Williams et al., 2021), possibly making disease-affected corals more susceptible to oxygen stress and reactive oxygen species (ROS). Following antibiotic treatment, those pathways were upregulated, indicating the potential for re-establishment of homeostasis (Figure S8).

4.3 | Transcriptomics provide support for targeted antibiotic treatment as an effective SCTLD intervention approach

Amoxicillin is effective at slowing or halting SCTLD lesion progression on individual colonies, including in field settings (Forrester et al., 2022; Neely et al., 2020; Shilling et al., 2021; Walker et al., 2021). Here, we provide the first transcriptomic evidence that antibiotic intervention is indeed successful in promoting coral recovery from SCTLD, and may even provide additional direct benefits to coral immune processes beyond removal of pathogens alone. There are, however, multiple limitations of antibiotic treatment effectiveness on broad-scale disease intervention efforts, including that this approach often requires multiple re-treatments, requires continuous monitoring, and is labour-intensive (Neely et al., 2020; Walker et al., 2021). While application of amoxicillin shows a high rate of success (~95%) in halting individual lesions, it does not necessarily prevent the formation of new lesions on a treated colony through time (Neely et al., 2020; Shilling et al., 2021). It also remains to be tested how long the 'normalization' of coral transcription, and particularly immune responses, remains in antibiotic-treated corals, and whether treatment may provide additional benefits or long-term consequences. We show that antibiotic treatment may stimulate immune responses (Figure S7), which is generally energetically costly, and has been shown to cause reduced fecundity in corals affected by a disease broadly characterized as growth anomalies (reviewed in Ricci et al., 2022). Finally, it is currently unknown what impacts antibiotic application may have on diverse coral reef ecosystems beyond the coral host, notably potential antibiotic resistance in microbial communities (Griffin et al., 2020; Liu et al., 2020). Antibiotic treatment may additionally have negative impacts on healthy coral microbiomes, potentially increasing susceptibility of corals to other stressors such as elevated temperatures (Connelly et al., 2022).

Alternative treatment methods are therefore warranted for further investigation with multi-'omic approaches in the mitigation of SCTLD, as well as future coral disease outbreaks. In particular, probiotic treatments are gaining research interest due to their potential benefits to coral survival following disease exposure (Peixoto et al., 2021), thermal stress (Doering et al., 2021; Santoro et al., 2021), and exposure to pollutants (Silva et al., 2021). Probiotic treatments are in development for SCTLD (Deutsch et al., 2022), and field trials are necessary to assess treatment effectiveness in a reef environment (Peixoto et al., 2021). Phage therapy also shows promise for the treatment of bacterial pathogens that affect corals (Jacquemot et al., 2018; Teplitski & Ritchie, 2009; Thurber et al., 2020), but many of these approaches are not yet fully operational. Potential impacts of these alternative treatment approaches on coral immunity are also unknown.

While treatment of individual coral colonies with antibiotics is not intended to be a long-term solution to curbing the spread of SCTLD, it may represent a feasible method of mitigating impacts on high-value conservation and restoration targets, particularly ecologically important, rare, and reproductively viable members of the population. This is of particular importance while disease diagnostics are still being developed for SCTLD and other diseases. Disease diagnostics, when operational and scalable, may instead allow broad mitigation of pathogen transport via disease vectors and sources, potentially eliminating the need for colony-level disease intervention. Continued examination of gene mechanisms and functions will also improve understanding of coral immune responses (Traylor-Knowles et al., 2022), facilitating targeted treatment approaches in future disease outbreaks. Disease response efforts focusing on identification and diagnosis, mitigation of spread, and treatment of affected individuals require a holistic understanding of coral immunity and resilience at the individual level in order to maximize conservation and restoration success at the population level.

5 | CONCLUSIONS

Through complementary studies examining the transcriptomic responses of corals to stony coral tissue loss disease (SCTLD) and subsequent antibiotic treatment, we identified a consistent signature of immune responses in both coral species examined. Furthermore, we observed evidence of a reversal in immune and metabolic responses related to disease exposure when corals were treated with amoxicillin, suggestive of a recovery process occurring at the host level. The strong impacts of antibiotic treatment on coral transcription, both in terms of a return to 'healthy' levels, and in some cases promotion of immune activation beyond levels seen in healthy controls, are suggestive of direct benefits of antibiotic exposure to the coral host. This phenomenon may, in part, explain why antibiotics appear to be effective in slowing or halting SCTLD lesions, particularly if the disease is caused by a viral pathogen or pathogenic consortium containing viruses. If indeed SCTLD is caused by a virus targeting Symbiodiniaceae as has been hypothesized (Veglia et al., 2022; Work et al., 2021), the stabilization of the coral-algal symbiosis through coral immune activation and metabolic support may be of the utmost importance in determining the survival of the holobiont.

AUTHOR CONTRIBUTIONS

Michael S. Studivan: Conceptualization, Funding Acquisition, Methodology, Investigation, Statistical Analysis, Data Curation, Writing-Original Draft, Writing-Review & Editing. Ryan J. Eckert: Methodology, Investigation, Writing-Review & Editing. Erin Shilling: Conceptualization, Methodology, Investigation, Writing-Review & Editing. Nash Soderberg: Methodology, Investigation, Writing-Review & Editing. Ian C. Enochs: Funding Acquisition, Methodology, Writing-Review & Editing. Joshua D. Voss: Conceptualization, Funding Acquisition, Methodology, Investigation, Writing-Review & Editing.

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CONFLICT OF INTEREST STATEMENT

All authors declare that they have no conflicts of interest.

OPEN RESEARCH BADGES

This article has earned an Open Data badge for making publicly available the digitally-shareable data necessary to reproduce the reported results. The data is available at https://www.ncbi.nlm.nih. gov/bioproject/PRJNA897845.

DATA AVAILABILITY STATEMENT

All sequence files associated with this study can be found in the National Center for Biotechnology Information (NCBI) Sequence Read Archive (SRA) under BioProject PRJNA897845, accession numbers SAMN31581862 through SAMN31582010. Datasets and analysis scripts generated from this study are available in a GitHub repository (Studivan, 2023). Pipelines for bioinformatics and transcriptome annotations are described in separate GitHub repositories for Tag-Seq, *M. cavernosa*, and *O. faveolata* (Studivan, 2022a, 2022b, 2022c).

BENEFIT-SHARING STATEMENT

Benefits from this research accrue from the sharing of our data and results on public databases as described above, and through the Florida Department of Environmental Protection's Disturbance Advisory Committee.

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