



Sea Cucumber Intestinal Regeneration Reveals Deterministic Assembly of the Gut Microbiome

Brooke L. Weigel^a

^aCommittee on Evolutionary Biology, University of Chicago, Chicago, Illinois, USA

ABSTRACT The gut microbiome has far-reaching effects on host organism health, so understanding the processes that underlie microbial community assembly in the developing gut is a current research priority. Here, a holothurian (also known as sea cucumber; phylum Echinodermata) host is explored as a promising model system for studying the assembly of the gut microbiome. Holothurians have a unique capacity for evisceration (expulsion of the internal organs), followed by rapid regeneration of the gut, decoupling host ontogeny from gut tissue development and permitting experimental manipulation of the gut microbiome in mature host individuals. Here, evisceration was induced in the sea cucumber Sclerodactyla briareus, and regenerating stomach and intestine microbiomes were characterized before and on days 0, 13, 17, and 20 after evisceration using Illumina sequencing of 16S rRNA genes. Regenerating stomach and intestine tissues had microbial communities significantly different from those of mature tissues, with much higher alpha diversity and evenness of taxa in regenerating tissues. Despite immersion in a diverse pool of sediment and seawater microbes in flowthrough seawater aquaria, regenerating gut microbiomes differed at each stage of regeneration and displayed a highly similar community structure among replicates, providing evidence for deterministic host selection of a specific microbial consortium. Moreover, regenerating gut tissues acquired a microbiome that likely conferred energetic and immune advantages to the sea cucumber host, including microbes that can fix carbon and degrade invading pathogens.

IMPORTANCE The gut microbiome is pertinent to many aspects of animal health, and there is a great need for natural but tractable experimental systems to examine the processes shaping gut microbiome assembly. Here, the holothurian (sea cucumber) *Sclerodactyla briareus* was explored as an experimental system to study microbial colonization in the gut, as *S. briareus* individuals have the ability to completely eviscerate and rapidly regenerate their digestive organs. After induced evisceration, microbial community assembly was characterized over 20 days in regenerating animals. This study demonstrated that colonization of the sea cucumber gut was deterministic; despite immersion in a diverse consortium of environmental microbes, a specific subset of microbes proliferated in the gut, including taxa that likely conferred energetic and immune advantages to the host. Sea cucumbers have the potential to revolutionize our understanding of gut microbiome assembly, as rapid and repeatable gut tissue regeneration provides a promising and tractable experimental system.

KEYWORDS holothurian, community assembly, gut microbiome, host-microbe, intestinal colonization, tissue regeneration

n most animals, the gut microbiome is pertinent to almost all aspects of host health (1, 2), including metabolism and digestion, the immune system, and even behavior (3). Perturbations or abnormal development of the gut microbiome are associated with

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Address correspondence to brookeweigel @uchicago.edu.

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various gastrointestinal and metabolic diseases (1, 2); thus, a better understanding of how the gut microbiome develops in animals may be critical to the treatment of some chronic diseases. The assembly of the gut microbiome can be shaped by maternal transmission, host genetic factors, or a combination of host-microbe and microbemicrobe interactions (1, 4). For example, the gut microbiota can be altered by host nutrient secretions (5), host diet (6), or through microbe-microbe interactions such as metabolite secretion (7) or the reduction in oxygen availability by primary colonizing microbes (8). Many studies have used germfree animals to artificially induce gut microbial community assembly (9), and other studies track microbial community development from birth through infancy in humans (10-12). Here, a holothurian (sea cucumber) system was explored to study colonization and community assembly in the gut microbiome of mature hosts under natural conditions, using regeneration to separate the development of the gut from the ontogeny of the host organism. Sea cucumbers are echinoderms, closely related to chordates within the deuterostome phylogeny (13), making them a particularly attractive invertebrate model for gut microbiome research. Furthermore, invertebrate microbiomes may be simpler than vertebrate microbiomes, making them tractable systems, yet there is a dearth of information about the invertebrate gut microbiome (14).

Holothurians are well known for their remarkable ability to eviscerate most of their internal organs, including the digestive tract, using specialized mutable connective tissue (15). The adaptive significance of sea cucumber evisceration is still uncertain; while evisceration occurs in the presence of predators for some holothurians (16), others eviscerate seasonally (17), or evisceration may be a mechanism for the host to expel internal parasites (18). After expulsion of their internal organs, holothurians regenerate the lost viscera at a remarkable rate, in as little as 7 days, beginning with the digestive tract (15). Many holothurians are deposit feeders, consuming bacteria and organic matter in the sediment (19); they have a significant impact on organic matter decomposition and nutrient cycling in soft substrate marine ecosystems (20). Some of the microbes that enter the holothurian gut evade consumption and populate the sea cucumber foregut, where they flourish (19). Sea cucumbers can begin feeding as early as 16 days post-evisceration (21), making them an ideal system to study microbial colonization of the gut.

Immense quantities of sediment pass through the sea cucumber gut; thus, the gut microbiome may play essential roles in preventing pathogenic microbial colonization, metabolizing organic matter in the ingested sediment, or producing essential vitamins (22, 23). However, few studies have characterized the gut microbiome of sea cucumbers (24), and most presently available studies examined the microbiome of the commercially valuable sea cucumber Apostichopus japonicus (22, 25–30). Two studies examined the regenerating gut microbial communities of A. japonicus (23, 29), demonstrating that the composition of the gut microbiome changes rapidly during visceral regeneration, yet further study with increased replication is clearly warranted to understand the processes driving microbial community assembly in this system. The deposit-feeding sea cucumber Sclerodactyla briareus lives in muddy sediments along the continental shelf of the western Atlantic Ocean (31). S. briareus burrows into the sediment and feeds by extending its oral tentacles, which collect particles of sediment, microbes, and organic debris from the seawater or sediment surface (32). Evisceration of S. briareus can be rapidly induced with KCl, leading to anterior expulsion of the viscera (33) and regeneration of intestinal tissues within 20 days (21). Here, S. briareus is explored as a system for studying community assembly in the regenerating gut microbiome.

S. briareus individuals were collected from two different estuarine ponds with distinct sediment microbial communities, stimulated to eviscerate, and allowed to regenerate their lost viscera in a flowthrough seawater tank environment. The aims of this study were to (i) describe the pattern of microbial colonization of the holothurian stomach and intestine during regeneration on days 13, 17, and 20 post-evisceration, (ii) test whether newly formed stomach and intestine microbial communities resemble the initial condition of the mature microbiomes, (iii) examine the influence of the historical



FIG 1 Photographs of eviscerated stomach and intestine tissues from a mature *S. briareus* individual (A) and a longitudinally dissected *S. briareus* individual revealing regenerated stomach and intestine tissues after 20 days in the experimental tank (B). There is evidence of feeding by the specimen in panel B, i.e., brown ingested material is visible in the stomach and intestine.

environment on microbial community assembly by regenerating *S. briareus* individuals collected from two different sediment environments in a common sediment environment, and (iv) determine whether the stomach and intestine microbiomes are randomly or deterministically assembled from the pool of potential colonizing microbes.

RESULTS

Sea cucumber visceral regeneration in 20 days. The first *S. briareus* individual was dissected after 7 days, and it contained only white mesentery tissue and no visible stomach or intestine. By day 13, dissection revealed that all *S. briareus* individuals had yellow developing intestine tissue, surrounded by white mesentery tissue. On day 13, only one individual out of 13 had begun feeding, indicated by the presence of sediment in the intestine. By day 17, all dissected *S. briareus* individuals had regenerated a calcareous ring, stomach, and intestine, and 2 out of 6 individuals had begun feeding. By day 20, all *S. briareus* individuals had regenerated a stomach and intestine, and all 13 individuals had been feeding. While the stomach and intestine were regenerated by day 20, the regenerated intestine lacked the red color present in the mature intestine (Fig. 1A) that is indicative of blood vessels surrounding the intestine. The regenerated intestines were smaller in length and thinner in diameter than the mature intestine (Fig. 1B).

Microbial communities in stomach, intestine, and environmental samples. After sequence quality control and processing, the final data set contained 185 samples and 1,258,000 amplicon sequences, collected from 38 environmental samples and 51 S. briareus individuals. In this study, 16S rRNA gene sequences were grouped into amplicon sequence variants (ASVs), which are analogous to operational taxonomic units (OTUs) but do not impose arbitrary sequence similarity thresholds. As reflected by the divergent clusters among sample types in the nonmetric multidimensional scaling (NMDS) plot (Fig. 2), microbial communities from stomach, intestine, sediment, algae and seagrass, and seawater sources were significantly different (permutational multivariate analysis of variance [PERMANOVA], df = 6, total df = 184, pseudo-F = 11.86, P = 0.001) (Table 1). Overall, S. briareus stomach and intestine microbial communities were distinct from all environmental sources (Table 1), including both seawater and sediment microbial communities (Fig. 2). Sea cucumber microbiomes were also distinct from algae- and seagrass-associated microbial communities (Fig. 2), despite intimate association with these primary producers in the environment at each site. Overall, stomach and intestine microbial communities were more similar to sediment than to seawater or algae and seagrass microbial communities (Fig. 2); stomach samples shared a higher percentage of ASVs with sediment samples (12.9 to 42.7%) than with seawater (3.4 to 17.7%), and intestine microbial communities displayed the same trend (see Table S1 in the supplemental material). Stomach and intestine samples shared the lowest proportion of ASVs with the alga Gracilaria sp. and the seagrass Zostera marina (Table S1).



FIG 2 Nonmetric multidimensional scaling (NMDS) plot of microbial communities from mature (initial and tank control) and regenerating stomach (circles) and intestine (triangles) tissues, seawater and sediment from the environment and the experimental tank (squares), and algae (*Gracilaria* sp.) and seagrass (*Zostera marina*) from the pond collection sites (squares). Note that regenerating stomach and intestine tissues include days 13, 17, and 20 of regeneration.

Mature stomach and intestine microbial communities displayed significantly different community structures, although the dispersion of variance was unequal between the two groups (Table 1), cautioning against the validity of the comparison. Nevertheless, the compositions of the mature stomach and intestine microbiomes were quite distinct at both the phylum and order levels (Fig. 3 and 4). The stomach microbiome of mature *S. briareus* individuals (initial condition and tank control individuals) was comprised mostly of the phylum *Bacteroidetes* (mean relative abundance, 47% in the stomach versus 8% in the intestine), while the mature intestinal microbiome contained mostly *Proteobacteria* (56% in the intestine versus 25% in the stomach) (Fig. 3). Both

TABLE 1 Pairwise comparisons of beta diversity among stomach, intestine, and environmental microbial communities^{*a*}

		PERMA	ANOVA	PERMI	DISP
Multivariate pairwise test comparison	df	t	Р	t	Р
Mature stomach vs mature intestine	95	5.79	0.001*	5.58	0.001*
Regenerating stomach vs regenerating intestine	44	1.24	0.068	2.57	0.04*
Mature stomach vs regenerating stomach	65	4.02	0.001*	1.64	0.18
Mature intestine vs regenerating intestine	74	3.36	0.001*	0.34	0.79
Mature stomach vs regenerating intestine	75	4.10	0.001*	5.16	0.001*
Mature intestine vs regenerating stomach	64	3.36	0.001*	2.41	0.03*
Seawater vs mature stomach	62	4.57	0.001*	3.79	0.004*
Seawater vs regenerating stomach	31	2.83	0.002*	1.98	0.08
Seawater vs mature intestine	61	3.28	0.001*	0.15	0.92
Seawater vs regenerating intestine	41	2.62	0.001*	0.49	0.68
Sediment vs mature stomach	68	4.16	0.001*	3.47	0.003*
Sediment vs regenerating stomach	37	1.76	0.004*	1.40	0.32
Sediment vs mature intestine	67	3.35	0.001*	0.57	0.62
Sediment vs regenerating intestine	47	1.72	0.007*	0.80	0.53
Sediment vs seawater	34	2.23	0.001*	0.36	0.78
Algae, seagrass vs mature stomach	53	3.82	0.001*	1.69	0.16
Algae, seagrass vs regenerating stomach	22	2.77	0.001*	0.57	0.66
Algae, seagrass vs mature intestine	52	2.58	0.001*	1.02	0.36
Algae, seagrass vs regenerating intestine	32	2.34	0.001*	1.42	0.31
Algae, seagrass vs seawater	19	2.34	0.001*	1.91	0.29
Algae, seagrass vs sediment	25	2.43	0.001*	0.51	0.68

^aDenominator degrees of freedom are listed for all pairwise comparisons, and significant *P* values (<0.05) are indicated with asterisks. PERMDISP tests were conducted to ensure that significant PERMANOVA results were not due to unequal dispersion of variability among groups. Algae and seagrass include the red algae *Gracilaria* sp. and the seagrass *Zostera marina*. *t*, *t* statistic of the pairwise PERMANOVA test.



FIG 3 Relative abundance barplots of sea cucumber microbial communities from replicate intestine (A) and stomach (B) samples over regeneration time. Colors represent microbial phylum-level taxonomy.

stomach and intestine microbial communities contained similar abundances of the phylum *Epsilonbacteraeota* (11 to 12%) (Fig. 3; Table 2). Mature stomach microbial communities were dominated by the bacterial orders *Cytophagales* (38%) and *Campylobacterales* (12%) from the phyla *Bacteroidetes* and *Epsilonbacteraeota*, respectively (Fig. 4B; Table 2). In contrast, mature intestinal microbial communities were dominated by the order *Campylobacterales* (11%) and by an unknown *Alphaproteobacteria* (36%) (Fig. 4A; Table 2). Interestingly, members of the order *Rickettsiales* reached a high abundance in the mature intestinal microbiome of select individuals, mostly tank controls, yet they were noticeably absent from the stomach and the regenerating intestinal microbiomes (Fig. 4; Table 2). The three most abundant ASVs from the mature stomach and intestine microbiomes included one uncultured *Bacteroidetes* from the family *Cyclobacteriaceae*, an unknown *Alphaproteobacteria*, and a *Sulfurovum* sp. from the phylum *Epsilonbacteraeota*.

Similar to the mature stomach and intestine microbiomes, the regenerating stomach and intestine microbiomes were comprised mainly of the phyla Proteobacteria, Bacteroidetes, and Epsilonbacteraeota (Fig. 3). However, at lower taxonomic levels such as order, the regenerating stomach and intestine microbial communities were much more diverse than the mature microbiomes (Fig. 4). Rather than being dominated by a few taxonomic orders, the regenerating stomach and intestine communities were comprised of >10 orders, with relatively even representation across replicate samples (Fig. 4). These trends were also quite evident at the ASV level. Within mature stomach and intestine microbiomes, only five and three ASVs, respectively, made up 50% of the total microbial community, while in the regenerating stomach and intestine microbiomes, 54 and 67 ASVs, respectively, made up 50% of the community. The regenerating stomach microbiome was dominated by the orders Campylobacterales (13.7%), Desulfobacterales (7.3%), Flavobacteriales (6.2%), and Bacteroidales (4.3%), while regenerating intestine tissues were dominated by the orders Campylobacterales (10%), Flavobacteriales (5.3%), Desulfobacterales (4.8%), Coxiellales (3.5%), Rhodobacterales (3.4%), and Bacteroidales (3.0%) (Fig. 4).



FIG 4 Relative abundance barplots of sea cucumber microbial communities from replicate intestine (A) and stomach (B) samples over regeneration time. Colors represent microbial order-level taxonomy. Note that the first taxon is a single ASV that was unclassified at the order level but is classified as a member of the *Alphaproteobacteria*.

Seawater and sediment microbial communities were also dominated by *Proteobacteria* and *Bacteroidetes* at the phylum level, but they were quite distinct from *S. briareus* microbial communities at lower taxonomic levels (Table 2; Fig. S1). Sediment microbial communities were dominated by the orders *Campylobacterales* (13%), *Desulfobacterales* (10%), *Flavobacteriales* (6%), and *Bacteroidales* (6%) (Fig. S1). Seawater samples were composed primarily of the orders *Flavobacteriales* (21%), *Rhodobacterales* (10%), the SAR11 clade (9%), *Verrucomicrobiales* (9%), and *Synechococcales* (7%) (Fig. S1). The dominant bacterial order found in the stomach, *Cytophagales*, was present at only 2% and <1% abundance in sediment and seawater microbial communities, respectively (Table 2). Likewise, the most abundant microbe in the intestine, an unknown alphaproteobacterium, comprised only 5% or less of sediment and seawater microbial communities (Table 2).

Tank residence, but not field collection site, affected gut microbial communities. Despite collection from distinct ponds, the initial stomach and intestine microbial communities were not affected by collection site (PERMANOVA pairwise comparisons, P = 0.10 for stomach, P = 0.45 for intestine) (Table 3). Seawater samples collected from the two ponds also did not differ (Table 3), likely reflecting the connectivity of the two estuarine ponds. In contrast, sediment samples collected from Jehu and Hamblin Ponds were significantly different (Table 3). The tank environment contained a different pool of sediment and seawater microbes than the pond collection sites. The seawater collected from each of the two ponds differed significantly from the flowthrough tank seawater (Table 3). Surprisingly, although the tank sediment was sourced from Hamblin Pond, tank sediment sampled on days 13, 17, and 20 differed significantly from field-collected Hamblin and Jehu Pond sediment (Table 3).

Living in the flowthrough seawater tank for 20 days significantly altered the stomach and intestine composition of actively feeding *S. briareus* individuals (tank controls) compared to the initial condition of the field-collected mature microbiomes (Table 4, see tank control versus initial). However, the stomach microbiome of tank controls **TABLE 2** Relative abundances of the top 10 phyla, classes, and orders of microbes found in all stomach and intestine samples^a

	Relative abundance (±SD) in:				
Taxonomic grouping	Stomach	Intestine	Sediment	Seawater	
Phylum					
, Bacteroidetes	0.47 (±0.32)	0.08 (±0.06)	0.16 (±0.04)	0.39 (±0.03)	
Proteobacteria	0.25 (±0.17)	0.56 (±0.28)	0.45 (±0.02)	0.24 (±0.04)	
Epsilonbacteraeota	0.12 (±0.10)	0.11 (±0.14)	0.10 (±0.04)	0.02 (±0.01)	
Tenericutes	0.05 (±0.13)	0.04 (±0.13)	<0.01 (±0.01)	<0.01 (±0.01)	
Chloroflexi	0.02 (±0.02)	0.01 (±0.02)	0.07 (±0.03)	<0.01 (±0.01)	
Planctomycetes	0.02 (±0.02)	0.03 (±0.03)	0.02 (±0.01)	0.01 (±0.01)	
Acidobacteria	0.01 (±0.01)	0.02 (±0.02)	0.04 (±0.01)	<0.01 (±0.01)	
Firmicutes	0.01 (±0.04)	0.02 (±0.04)	<0.01 (±0.01)	<0.01 (±0.01)	
Verrucomicrobia	0.01 (±0.01)	0.01 (±0.03)	<0.01 (±0.01)	0.16 (±0.05)	
Actinobacteria	0.01 (±0.01)	0.02 (±0.02)	<0.01 (±0.01)	0.05 (±0.02)	
Class					
Bacteroidia	0.47 (±0.32)	0.08 (±0.06)	0.14 (±0.04)	0.39 (±0.03)	
Gammaproteobacteria	0.14 (±0.10)	0.15 (±0.13)	0.26 (±0.03)	0.05 (±0.01)	
Campylobacteria	0.12 (±0.10)	0.11 (±0.14)	0.10 (±0.04)	0.02 (±0.01)	
Deltaproteobacteria	0.07 (±0.05)	0.05 (±0.05)	0.18 (±0.01)	0.02 (±0.01)	
Mollicutes	0.05 (±0.13)	0.04 (±0.13)	<0.01 (±0.01)	<0.01 (±0.01)	
Alphaproteobacteria	0.04 (±0.05)	0.36 (±0.37)	<0.01 (±0.01)	0.17 (±0.04)	
Anaerolineae	0.02 (±0.02)	0.01 (±0.02)	0.06 (±0.03)	<0.01 (±0.01)	
Planctomycetacia	0.01 (±0.01)	0.02 (±0.03)	<0.01 (±0.01)	0.01 (±0.01)	
Verrucomicrobiae	0.01 (±0.01)	0.01 (±0.03)	<0.01 (±0.01)	0.16 (±0.05)	
Clostridia	0.01 (±0.03)	0.02 (±0.03)	<0.01 (±0.01)	<0.01 (±0.01)	
Order					
Cytophagales	0.38 (±0.37)	0.02 (±0.02)	0.02 (±0.01)	<0.01 (±0.01)	
Campylobacterales	0.12 (±0.10)	0.11 (±0.14)	0.10 (±0.04)	0.02 (±0.01)	
Entomoplasmatales	0.05 (±0.13)	0.04 (±0.13)	<0.01 (±0.01)	<0.01 (±0.01)	
Flavobacteriales	0.05 (±0.04)	0.03 (±0.03)	0.04 (±0.02)	0.28 (±0.09)	
Desulfobacterales	0.05 (±0.04)	0.04 (±0.04)	0.11 (±0.01)	<0.01 (±0.01)	
Cellvibrionales	0.02 (±0.02)	0.02 (±0.02)	0.02 (±0.01)	0.02 (±0.01)	
Bacteroidales	0.02 (±0.02)	0.02 (±0.02)	0.06 (±0.01)	<0.01 (±0.01)	
Pirellulales	0.01 (±0.01)	0.02 (±0.02)	<0.01 (±0.01)	<0.01 (±0.01)	
Clostridiales	0.01 (±0.03)	0.02 (±0.03)	<0.01 (±0.01)	<0.01 (±0.01)	
Rickettsiales	<0.01 (±0.01)	0.08 (±0.20)	<0.01 (±0.01)	<0.01 (±0.01)	

^aThe sediment and seawater columns of data display the abundances of these host-associated microbes in environmental samples.

differed from the initial stomach microbiome only at Jehu Pond, not at Hamblin Pond (Table 3). The intestinal microbiome displayed the opposite trend; tank controls differed from initial intestinal microbiomes at Hamblin Pond but not at Jehu Pond (Table 3). Despite differences, the taxonomic composition of the tank control stomach and intestine microbial communities resembled that of the initial, field-collected microbiomes at the phylum and order levels (Fig. 3 and 4). Mature microbiomes from tank control and field-collected individuals also occupy overlapping regions in the NMDS plot (Fig. 2), indicating similarities in community structure. Despite the finding that tank residence altered mature stomach and intestine microbiomes, tank control microbiomes were significantly different from regenerating microbiomes on each day of regeneration (Table 4); thus, changes in the regenerating microbiomes were not simply the result of a tank effect.

Patterns in microbial colonization of the regenerating stomach and intestine. Regenerating stomach and intestine microbial communities were significantly different from those of the mature stomach and intestine at each stage of regeneration (Table 4; Fig. 5). Regenerating *S. briareus* individuals garnered a unique microbial composition compared to those with a fully developed digestive tract (initial condition) (Table 4), including individuals with a fully developed digestive tract placed in the same environment as the regenerating animals (tank controls) (Table 4), suggesting that the regeneration process fosters a novel microbial community. Further, the regenerating

TABLE 3 Pairwise compar	isons of beta	diversity of	samples k	y site ^a
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		PERMANOVA		PERMDISP	
Multivariate pairwise test comparison	df	t	Р	t	Р
Stomach					
Jehu vs Hamblin	35	1.52	0.10	4.98	0.97
Tank control vs Jehu	28	2.29	0.01*	1.12	0.35
Tank control vs Hamblin	29	1.11	0.25	0.98	0.46
Intestine					
Jehu vs Hamblin	34	0.95	0.45	1.04	0.44
Tank control vs Jehu	28	1.37	0.09	1.25	0.29
Tank control vs Hamblin	28	1.52	0.04*	5.98	0.96
Sediment					
Jehu vs Hamblin	7	2.45	0.01*	2.34	0.04*
Tank vs Jehu	10	1.54	0.01*	4.13	0.01*
Tank vs Hamblin	9	3.17	0.01*	2.02	0.23
Seawater					
Jehu vs Hamblin	4	5.64	0.12	1.04	0.60
Tank vs Jehu	10	2.30	0.02*	9.32	0.008*
Tank vs Hamblin	10	2.24	0.02*	9.72	0.004*

^aPairwise comparisons were of Jehu and Hamblin Ponds with the experimental tank for mature (initial and tank control) stomach and intestine microbial communities and for sediment and seawater microbial communities. Denominator degrees of freedom are listed for all pairwise comparisons, and significant *P* values (<0.05) are indicated with asterisks. PERMDISP tests were conducted to ensure that significant PERMANOVA results were not due to unequal dispersion of variability among groups. *t*, *t* statistic of the pairwise PERMANOVA test.

stomach and gut microbiomes were significantly different from those of both sediment and seawater sources (Table 1), suggesting host selection during tissue regeneration. While the mature stomach and intestine microbiomes of *S. briareus* individuals differed significantly from one another, tissue regeneration resulted in a convergence of microbial communities from the regenerating stomach and intestine tissues (Table 1).

TABLE 4 Pairwise comparisons of beta diversity among regenerating stomach and intestinal microbial communities over time^a

		PERMANO	/A	
Multivariate pairwise test comparison	df	t	Р	
Stomach				
Initial (day 0) vs day 17	40	2.42	0.001*	
Initial (day 0) vs day 20	45	3.59	0.001*	
Day 17 vs day 20	15	1.49	0.018*	
Tank control vs initial (day 0)	45	1.85	0.023*	
Tank control vs day 17	15	3.06	0.001*	
Tank control vs day 20	20	4.39	0.001*	
Intestine				
Initial (day 0) vs day 13	43	2.50	0.001*	
Initial (day 0) vs day 17	39	1.87	0.004*	
Initial (day 0) vs day 20	43	2.78	0.001*	
Day 13 vs day 17	14	1.14	0.15	
Day 13 vs day 20	18	1.85	0.002*	
Day 17 vs day 20	14	1.07	0.215	
Tank control vs initial (day 0)	44	1.55	0.035*	
Tank control vs day 13	19	2.30	0.001*	
Tank control vs day 17	15	1.69	0.005*	
Tank control vs day 20	19	2.78	0.001*	

^{*a*}Denominator degrees of freedom are listed for all pairwise comparisons, and significant *P* values (<0.05) are indicated with asterisks. The overall PERMDISP tests for stomach and intestine were not significant; thus, pairwise tests for unequal dispersion of variability among groups were not conducted. *t*, *t* statistic of the pairwise PERMANOVA test.



FIG 5 Nonmetric multidimensional scaling (NMDS) plot of microbial communities from stomach (A) and intestine (B) tissues over regeneration time.

The regenerating stomach microbiome of *S. briareus* did not differ by site (two-way PERMANOVA, df = 1, total df = 66, pseudo-F = 2.20, P = 0.073), while regeneration stage significantly influenced stomach microbial community composition (df = 3, total df = 66, pseudo-F = 8.33, P = 0.001) (Fig. 5A). The regenerating intestinal microbiome displayed the same trend: site did not affect microbial community composition (two-way PERMANOVA, df = 1, total df = 75, pseudo-F = 1.18, P = 0.284), but intestine communities differed significantly over regeneration time (df = 4, total df = 75, pseudo-F = 4.61, P = 0.001) (Fig. 5B). Further, the differences in stomach and intestine microbial communities over regeneration time were not due to unequal dispersion of variance (permutation tests for homogeneity of multivariate dispersions [PERMDISP], P = 0.064 for stomach, P = 0.145 for intestine).

Pairwise tests revealed that the stomach microbiome had a significantly different microbial community composition on each day that it was sampled during regeneration (initial versus day 17 versus day 20) (Table 4; Fig. 5A). Intestinal microbial communities on days 13, 17, and 20 were significantly different from those of the initial condition (Fig. 5B); however, intestinal microbial community composition did not differ significantly between days 13 and 17 and between days 17 and 20 (Table 4). In contrast, tank sediment and seawater microbial communities did not change over time (Fig. S1) (PERMANOVA, df = 2, total df = 8; pseudo-F = 1.25, P = 0.017 for sediment; pseudo-F = 6.35, P = 0.004 for seawater; but P > 0.10 for all pairwise comparisons between days), demonstrating that the regenerating sea cucumber gut displayed temporal changes despite static environmental source microbial pools.

Differentially abundant ASVs during stomach and intestine regeneration. Analysis of composition of microbiomes (ANCOM) tests identified differentially abundant ASVs over time in regenerating stomach and intestine microbial communities. Interestingly, *Cytophagales* was the dominant bacterial order in initial and tank control stomach microbial communities but was present only at very low abundances (<3%) in regenerating stomachs (Fig. 4B). In the stomach microbiome, two sequence variants from the family *Cyclobacteriaceae* (order *Cytophagales*) were differentially abundant over time (Fig. 6A). One *Cyclobacteriaceae* ASV was extremely abundant (>50% of the community) in tank control and initial condition stomachs but was nearly absent in regenerating stomachs (Fig. 6A), despite its presence in the tank sediment. The other *Cyclobacteriaceae* ASV, although far less abundant, increased over time in regenerating stomach microbial communities (Fig. 6A).

In the intestine of regenerating *S. briareus* individuals, 7 ASVs displayed significantly different abundances over time. Notably, two ASVs from the order *Rickettsiales* (families *Rickettsiaceae* and *Midichloriaceae*) displayed high abundances in mature intestinal



FIG 6 Mean relative abundances of ASVs from stomach (n = 2 ASVs) (A) and intestine (n = 7 ASVs) (B) microbial communities that displayed significantly different abundances over regeneration time with ANCOM tests. The lowest taxonomic classification for each ASV is indicated above the plot.

microbial communities but were nearly absent (<1% abundant) from regenerating intestinal communities (Fig. 6B). Likewise, one unknown *Alphaproteobacteria* ASV was very abundant in initial and tank control intestines (>25% of the community) but was absent from regenerating *S. briareus* intestines (Fig. 6B). In contrast, one ASV from the order *Cytophagales* was nearly absent in initial intestine microbial communities but increased in abundance during regeneration (Fig. 6B). Two ASVs, *"Candidatus* Spiroplasma holothuricola" (phylum *Tenericutes*) and a member of the phylum *Spirochaetes*, displayed high abundances on day 13 of intestine regeneration. Finally, one ASV in the genus *Thiovulum* was significantly more abundant in the intestines of tank control *S. briareus* individuals (Fig. 6B).

Balls of sediment were observed within the coelomic cavity of some regenerating *S*. *briareus* individuals on days 17 and 20 (Fig. S2). While the ASV classified as "*Candidatus* Spiroplasma holothuricola" was not detected at all in the tank sediment and was detected only at extremely low abundances (<0.00002%) in the sediment collected at the ponds, it was the predominant ASV detected in the samples of sediment found within the coelomic cavity of *S. briareus* individuals (Fig. S2). Other taxa found within



FIG 7 Alpha diversity indices, including mean ASV richness for intestine (purple) (A) and stomach (orange) (B) microbial communities and mean Pielou's evenness for intestine (purple) (C) and stomach (orange) (D) microbial communities over regeneration time. Different letters indicate significant differences in diversity indices with regeneration time (ANOVA pairwise comparisons, P < 0.05).

the sediment inside *S. briareus* included *Sulfurovum* sp., *Actinomarina* sp., and a cyanobacterium in the family *Phormidesmiaceae*.

Regenerating stomach and intestine microbiomes display increased diversity and evenness. During gut regeneration, microbial alpha diversity increased over time in both stomach and intestine tissues relative to the mature microbiomes (Fig. 7). Mean ASV richness was significantly affected by both sample type (stomach versus intestine) and regeneration day (two-way ANOVA, error df = 137; df = 1, F = 6.48, P = 0.012 for type; df = 4, F = 17.4, P < 0.001 for day). On average, stomach tissues from *S. briareus* individuals hosted a greater number of ASVs per sample (232 ± 19) than intestine tissues (179 ± 18). In the regenerating stomach and intestine, ASV richness increased over time relative to the initial condition, reaching a peak on day 20 (Fig. 7A and B). Microbial community evenness also increased during regeneration. Pielou's evenness index did not differ in stomach versus intestine samples but was significantly affected by regeneration day (two-way ANOVA, error df = 137; df = 1, F = 0.21, P = 0.65 for type; df = 4, F = 18.9, P < 0.001 for day). Pielou's evenness index was significantly higher on days 13, 17, and 20 than it was in initial condition and tank control microbial communities (Fig. 7C and D).

Similarity to the mature microbiome increased over time during gut regeneration. Comparing the mean pairwise dissimilarity between *S. briareus* individuals from each day of regeneration to their initial conditions demonstrated that the regenerating intestinal microbiome became more similar to the initial condition over time. Tank control microbiomes were more similar to the initial condition than to regenerating microbiomes (Fig. 8). The intestinal microbiome reached maximum dissimilarity from the initial condition on day 17 and became more similar to the initial condition by day



FIG 8 Mean pairwise Bray-Curtis dissimilarities between each day of regeneration and the initial condition (day 0) for intestine (purple) (A) and stomach (orange) (B) microbial communities. A lower dissimilarity index indicates greater similarity to the initial condition. Different letters indicate significant differences in dissimilarity indices with regeneration time (ANOVA pairwise comparisons, P < 0.05).

20 (Fig. 8A). However, the regenerating stomach microbiome remained dissimilar from the initial condition (Fig. 8B).

DISCUSSION

Complete intestinal regeneration and colonization by common gut symbionts. The sea cucumber *S. briareus* followed a similar time course of regeneration in this study to that reported by Kille in 1935 (21), who found that ingested stomach and intestine contents were seen as early as 16 days after evisceration and "the first specimen was seen feeding by means of its small, unpigmented, regenerated tentacles 20 days after autotomy" (21). In this study, *S. briareus* regenerated intestine tissues by day 13 and stomach tissues by day 17, and all individuals began feeding on tank sediment by day 20. The regeneration process in *A. japonicus* is also rapid, with intestine tissues generated in as little as 10 days (29). With such rapid regeneration capabilities, sea cucumbers provide ample opportunity to study microbial colonization of stomach or intestine tissues during regeneration.

In this and other studies, the gut microbiome of sea cucumbers is comprised primarily of Alphaproteobacteria, Gammaproteobacteria, and Deltaproteobacteria, as well as the phylum Bacteroidetes (23, 25, 26, 28, 29, 34). Here, the stomach microbiome of S. briareus was comprised of nearly 50% Bacteroidetes, while the intestinal microbiome consisted of 50% Proteobacteria. While this study only compared the stomach and small intestine microbiota, different parts of the intestinal tract likely harbor distinct microbiota. The small intestine of the sea cucumber Holothuria glaberrima was also dominated by Proteobacteria and Bacteroidetes, while the large intestine was dominated by Firmicutes (24). In this study, the stomach microbiome was dominated by Bacteroidetes from the family Cyclobacteriaceae (order Cytophagales). These microbes exploit diverse ecological niches and are not known to be gut symbionts, but they may contribute to carbohydrate metabolism (35). The intestinal microbiome was dominated by a single Alphaproteobacteria ASV of unknown classification, with only 87% sequence similarity to an uncultured bacterium isolated from intertidal rocks (36), indicating that the diversity of invertebrate gut symbionts is far from being well characterized. In addition to Bacteroidetes and Alphaproteobacteria, members of the phylum Epsilonbacteraeota, formerly the class Epsilonproteobacteria (37), comprised 11% to 12% of the gut microbiome in S. briareus and were also detected in the intestinal microbiome of A. japonicus (30). The Epsilonbacteraeota associated with S. briareus belonged primarily to the order Campylobacterales, which associate with the healthy human gut (38) and dominate the gut microbiome of the sea urchin Lytechinus variegatus (39, 40).

Gut symbionts with potential energetic and immune system benefits were detected in the regenerating microbiome of S. briareus. In the gut microbiome of A. japonicus, functional genes responsible for carbohydrate metabolism, cell proliferation, and the immune system were upregulated during regeneration, suggesting selection of a beneficial microbiome by the host sea cucumber (23, 29). In this study, the most prevalent Campylobacterales ASV associated with S. briareus was a Sulfurovum sp., a strictly chemoautotrophic microbe that fixes carbon through sulfur oxidation (41, 42). Sulfurovum has been isolated from deep-sea hydrothermal vents (41, 43, 44), where it may provide supplemental nutrition to invertebrate hosts, including deep-sea crabs (45), hydrothermal vent shrimp (46), and the enigmatic gutless tube worm Riftia pachyptila (44). It is possible that chemoautotrophy may serve as a source of energy to S. briareus during the energetically expensive process of visceral regeneration, but further research is necessary to determine whether Sulfurovum provides the sea cucumber host with supplemental nutrition. Further, "Candidatus Spiroplasma holothuricola" was significantly enriched on day 13 of intestinal regeneration in S. briareus. The genome of "Ca. Spiroplasma holothuricola," isolated from the hindgut of a deep-sea sea cucumber, contained CRISPR and restriction-methylation systems for destroying virus particles and had a streamlined genome, suggesting that it may be endosymbiotic to host cells (34). While it is possible that "Ca. Spiroplasma holothuricola" confers a protective immune system within the regenerating intestine, further research is required to determine the functional interactions between this microbe and its sea cucumber host.

The sea cucumber gut microbiome may also contain deleterious members. *Rickett-siales* are known as intracellular endosymbionts that parasitize a diversity of invertebrates, most notably arthropods; however, they have also been detected in the coelomic fluid of sea cucumbers (47). *Alphaproteobacteria* from the order *Rickettsiales* were abundant in the intestinal microbiomes of certain *S. briareus* individuals, and they were notably absent from the mature stomach and the regenerating stomach and intestine microbiomes. Given the high abundance of *Rickettsiales* in the intestinal microbiome of certain individuals, and absence in other individuals, it is possible that *Rickettsiales* are opportunistic parasites in the sea cucumber gut.

Deterministic host filtering of microbial taxa in the sea cucumber intestinal microbiome. Sea cucumber stomach and intestine microbiomes were distinct from environmental sources, including sediment, seawater, and algal microbial communities. Selective consumption of some microbial taxa, and retention of others as symbionts, occurs in diverse marine invertebrates and likely in sea cucumbers as well (25). Stomach and intestine microbial communities of *S. briareus* were more similar to those of sediment than to seawater or algal and seagrass microbial communities, reflecting their role as a deposit feeder. Surprisingly, initial stomach and intestine microbial communities of *S. briareus* did not differ by collection site, even though Jehu and Hamblin Ponds contained distinct sediment microbial communities. *S. briareus* selected the same consortium of stomach and intestine microbes, despite distinct sediment microbiomes, providing evidence for host filtering of microbial symbionts. Similarly, one experiment that reciprocally transplanted the gut microbiomes of zebrafish and mice demonstrated that microbial community (9).

In addition to the deterministic process of selective host filtering from a diverse pool of environmental microbes (48), the evisceration experiment revealed evidence for deterministic assembly during the process of visceral regeneration. In contrast to stochastic colonization of host-associated microbial communities, which leads to high variability in community structure and taxonomic composition among replicate samples (49), regenerating sea cucumber stomach and intestine microbiomes displayed strikingly similar relative abundances of many bacterial orders across replicate samples on each day of regeneration (Fig. 4). While tank residence did alter the microbiomes of tank control individuals in this experiment relative to those of field-collected individuals, regenerating stomach and intestine microbiomes were always distinct from those of tank controls, indicating that changes in the regenerating microbiomes were not simply the result of tank effects. In future experiments, allowing sea cucumbers to regenerate gut microbiomes in their natural environment, or in a variety of distinct but replicated tank sediment environments, would provide additional evidence that the conversion of developing microbiomes is the result of deterministic processes. The microbiome of the sea cucumber Holothuria glaberrima also displayed significant differences between field-collected and aquarium-acclimated individuals, which were posited as differences due to food availability or composition (24). In this study, the sediment and seawater microbiomes of the tank environment differed significantly from those of field-collected sediment and seawater, which likely contributed to the differences in the microbiomes of actively feeding tank controls. Yet, the strikingly diverse and reproducible community composition among replicate regenerating sea cucumbers indicates that it is likely that the gut microbiome of S. briareus is shaped at least in part by deterministic factors. Further, the intestinal microbiome became more similar to the initial condition by day 20, portending a possible return to the initial consortium of microbial taxa associated with mature intestine tissues. During A. japonicus intestine regeneration, microbial community composition also became more similar to the mature microbiome after 21 days (29). In the human gut, microbial community assembly over the first 1 to 2 years is also nonrandom (10, 50), with a successional sequence of microbes displaying enrichment in different functional traits, such as oxygen tolerance, motility, and sporulation over time (8). It is possible that a combination of host-microbe and microbe-microbe interactions shapes the developing gut microbiome over time, especially as increasing microbial diversity may promote syntrophy or metabolic cross-feeding, which could generate new opportunities for microbial coexistence (51).

Enhanced microbial diversity and evenness of taxa in regenerating stomach and intestine. Regenerating stomach and intestine microbial communities were distinct from mature microbial communities, with significantly different community structure, higher alpha diversity, and taxonomic divergence at the order level. Remarkably, only 3 to 5 ASVs made up 50% of all sequence reads in the mature stomach and intestine communities, while the combined abundances of the top 54 and 67 ASVs made up 50% of the regenerating stomach and intestine microbiomes, respectively, demonstrating the magnitude of this increased diversity and evenness in the regenerating gut microbiome. Similarly, the diversity of the intestinal microbiome in A. japonicus was elevated in regenerating intestines compared to the initial condition (23, 29). Regenerating stomach and intestine microbial communities in S. briareus individuals were distinct on each day, with the exception of intestinal microbial communities between days 13 and 17 and days 17 and 20. In contrast, tank seawater and sediment microbial communities did not display temporal differences. The intestinal microbiome of A. japonicus also displayed significant temporal differences over 21 days of regeneration (29). In S. briareus gut microbiomes, the number of ASVs increased gradually throughout regeneration time, while the evenness of taxa was much higher in all regenerating stomach and intestine microbial communities than in mature microbiomes. In a report by Wang et al. (23), alpha diversity also increased over time, reaching a maximum between days 15 and 25, and then declined. It is likely that given more time, the diversity of the stomach and intestine microbiomes would have decreased, as dominant, late-successional intestine symbionts become more numerous. Interestingly, one Bacteroidetes ASV from the order Cytophagales dominated initial stomach microbial communities but was nearly absent from regenerating stomachs, despite its presence in the tank sediment. Likewise, one unknown Alphaproteobacteria ASV was very abundant in initial intestines but absent from regenerating S. briareus intestines, indicating that regenerating microbiomes were not immediately colonized by the dominant symbionts of mature communities. This study likely captured the initial stages of intestinal microbiome assembly, consisting of a diverse community with high evenness among taxonomic groups, yet it was not carried out long enough for

stabilization and proliferation of the dominant taxa that comprise the mature intestinal microbiome.

While the mature stomach and intestinal microbial communities of S. briareus displayed distinct community structure and composition, the regeneration processes resulted in a convergence of community structure and composition in regenerating stomach and intestinal microbiomes. Despite this convergence, regenerating gut microbial communities still displayed high diversity and evenness of taxa. In the human intestinal microbiome, alpha diversity is lowest at birth and increases as a function of time into adulthood (50, 52), opposite to the trend observed here. Sediment tends to have the highest microbial diversity of all free-living communities (53); thus, it is possible that the benthic lifestyle of S. briareus at the sediment-seawater interface permits colonization of the regenerating stomach and intestine by an exceptionally diverse microbial consortium, which is winnowed down over time until the mature stomach and intestinal microbial compositions are reached. Moreover, it is possible that during early regeneration and tissue colonization, the stomach and intestinal microbial communities resemble one another because the host environment has not yet differentiated enough to select for stomach- and intestine-specific microbiomes. Most microbiome studies have focused on the intestinal tract, ignoring the potential downstream influence of the stomach microbiome, and thus further research on the selection processes unique to each host environment is warranted.

Conclusion. After induced evisceration, the sea cucumber *S. briareus* regenerated a functional stomach and intestine within 20 days. Mature stomach and intestine microbial communities were significantly different from regenerating microbiomes, which displayed a taxonomic and structural convergence yet differed significantly over regeneration time. The regenerating microbiome was colonized by a significantly more diverse microbial community with high evenness of taxa. Moreover, stomach and intestine microbiomes displayed highly repeatable community structure among replicates over time, suggesting deterministic host filtering of microbial symbionts from the regional species pool. Abundant and significantly enriched ASVs in the regenerating intestine may confer energetic and immune advantages to the sea cucumber host, and thus further investigation of the adaptive significance of these key microbes, including *"Ca.* Spiroplasma holothuricola" and *Sulfurovum* sp., is warranted. Rapidly regenerating holothurians are a promising and tractable model system to study microbial community assembly in the gut, with the capacity to advance our understanding of the fundamental processes shaping the gut microbiome.

MATERIALS AND METHODS

Experimental design. Sea cucumbers (*Sclerodactyla briareus*) were collected on 1 September 2017 from two different sites adjacent to Waquoit Bay, a large estuary in Cape Cod, MA, USA. The two sites were Hamblin Pond (41.575°N, 70.505°W) and Jehu Pond (41.568°N, 70.498°W), which are connected across a distance of approximately 4,000 m by estuarine waterways. At Hamblin Pond, *S. briareus* individuals were entangled in abundant red algae (*Gracilaria* sp.), while at Jehu Pond, *S. briareus* individuals were collected from within a seagrass bed (*Zostera marina*). To characterize algal and seagrass microbial communities, three *Gracilaria* thallus fragments were collected from Hamblin Pond and three *Zostera marina* blades were collected at Jehu Pond. At each site, sediment samples (n = 4) were collected in 1.5-ml tubes, and 0.48 liters of seawater (n = 3) was filtered onto 0.7- μ m filters (Whatman GF/F). Environmental samples were transported to the lab in a cooler with ice packs and frozen at -80° C until DNA extraction.

Sea cucumbers were transported live from the field to flowthrough seawater aquaria at the Marine Biological Laboratory in Woods Hole, MA. Sea cucumbers were acclimated to lab conditions for 2 days in two different aquaria containing sediment from the site where they were collected. The water temperature did not differ appreciably between the tank seawater and the collection location; the mean water temperature for incoming tank seawater, with data sourced from the Woods Hole, MA, NOAA buoy station (station BZBM3, 41°31′25″ N 70°40′16″ W) was 20.11°C (\pm 0.40), while the mean water temperature nearby the collection sites in Waquoit Bay, sampled in September 2017, was 21.37°C (\pm 0.76). After acclimation, *S. briareus* individuals were removed one at a time from the aquaria (Hamblin Pond, *n* = 20; Jehu Pond, *n* = 14) (see Fig. S3 in the supplemental material) and evisceration was induced by injecting approximately 2 ml 0.5 M KCl into the coelomic cavity through the oral (anterior) opening (33). After expulsion of the viscera, the stomach was aseptically dissected by cutting below the ring canal/pharynx and above the top of the intestine (Fig. 1A). The stomach was thicker walled and rounder than the intestinal tract below. For intestine samples, the thickest portion of the medial small intestine was

removed; this region was usually yellow to orange in color, located approximately halfway down the gut (Fig. 1A). Although sampling multiple sections of the intestine would have been interesting, only one intestinal section was sampled to achieve high biological replication for the regeneration experiment. Five individuals from Jehu Pond did not eviscerate; they were dissected to examine initial stomach and intestine microbial communities. Twelve randomly chosen *S. briareus* individuals served as tank controls (Hamblin Pond, n = 7; Jehu Pond, n = 5). Tank control individuals entered the experimental tank without evisceration, continued feeding throughout the study, and were eviscerated on day 18 of the experiment using KCl, as described above, to acquire stomach and intestine microbial communities. Here, both initial condition (day 0) and tank control samples will together be referred to as "mature" stomach and intestine microbial communities to distinguish them from the regenerating tissues.

After sampling of the initial stomach and intestine microbial communities, eviscerated and tank control S. briareus individuals were assigned numbers using a random number generator, and each individual was placed into a numbered compartment within a flowthrough seawater table (Fig. S3). Sediment and pieces of Gracilaria sp., both sourced from Hamblin Pond, were placed into each compartment for food and habitat. This common garden experimental design was used so that sea cucumbers from both populations regenerated digestive organs in the presence of a common source pool of potential colonizing microbes. For stomach and intestine sampling on days 13, 17, and 20, individuals from each site were selected using a random number generator. Because newly formed guts could not be eviscerated, regenerated stomach and intestine tissues were sampled by aseptically dissecting S. briareus individuals along the body length (Fig. 1B). S. briareus individuals were anesthetized with magnesium chloride for at least 20 min prior to dissection. The first attempted sampling at 7 days post-evisceration yielded no regenerated tissues; samples were successfully collected on days 13, 17, and 20 postevisceration (Fig. S3). On day 13, only intestine tissues were visible (n = 13), but on days 17 (n = 6) and 20 (n = 13), both regenerated stomach and intestine tissues were visible and sampled. On days 13 and 20, S. briareus individuals sourced from both sites were sampled, but on day 17, only individuals from Hamblin Pond were sampled due to the greater number of eviscerated individuals from Hamblin Pond in the experiment (Fig. S3). Tank seawater (n = 3) and sediment (n = 3) samples were collected on each sampling day. On days 17 and 20, a small ball of sediment was observed within the coelomic cavity of several S. briareus individuals (Fig. S2). Out of curiosity, this sediment was sampled from two individuals on day 17 and two on day 20. All samples were transferred into sterile tubes and frozen at -80°C until DNA extraction. The final 16S amplicon data set contained the following: 76 intestine samples, 67 stomach samples, 17 sediment samples, 15 seawater samples, three Gracilaria sp. samples, three Zostera marina samples, and four samples of sediment found inside regenerating cucumbers.

Molecular methods. For stomach samples that were visibly full of ingested contents, ingested sediment was removed prior to DNA extraction by aseptically separating the stomach tissue from the contents. Intestine samples, however, were left with ingested contents intact due to the fragile nature of the intestine, especially from early regeneration stages. To avoid contamination, sample acquisition was performed using standard aseptic technique, including flame sterilization and new scalpel blades between samples. DNA was extracted from *S. briareus* stomach and intestine tissues, sediment samples, seawater filters, *Gracilaria* sp. thallus fragments, and *Zostera marina* blades by using the MagAttract PowerSoil DNA kit (Qiagen) and the KingFisher flex system (Thermo Scientific) for automated DNA extraction. Amplification of the V4 region of the 16S rRNA gene was performed at Argonne National Laboratory using the Earth Microbiome Project universal primers 515f-806r (54), with the modified forward primer (55) to reduce bias against *Crenarchaeota, Thaumarchaeota,* and the SAR11 clade (56). DNA amplicons were sequenced on an Illumina MiSeq paired-end run (250 bp) at Argonne National Laboratory in accordance with the procedures described by Caporaso et al. (54).

16S rRNA sequence data analyses. Amplicon sequences were processed with QIIME2 (57), where sequence reads were demultiplexed, paired-end reads were merged, and amplicon sequence variants (ASVs) were generated using the divisive amplicon denoising algorithm (DADA2) (58). Quality control within the DADA2 algorithm included chimera detection and removal, sequence error elimination, singleton exclusion, and sequence trimming (13 to 250 bp). Sequences were classified with the Silva 132 database and trimmed to the V4 region, and chloroplast and mitochondrial reads were subsequently removed. One highly abundant but unclassified ASV yielded BLAST results with 97.97% sequence similarity and 100% query coverage to "*Candidatus* Spiroplasma holothuricola" (34), so taxonomy was manually entered for that ASV. After examination of the alpha rarefaction curves (Fig. S4), samples were rarified to 6,800 sequences per sample, which removed only 4 samples from the data set.

Alpha diversity indices (ASV richness and Pielou's evenness) were calculated in QIIME2 with q2diversity, and two-way nonparametric Kruskal-Wallis analyses of variance (ANOVA) were used to statistically compare the diversity indices with the factors sample type (stomach versus intestine) and day of regeneration. Analysis of composition of microbiomes (ANCOM) tests (59) were implemented in QIIME2 to search for differentially abundant microbial taxa across regeneration time in the stomach and intestine. ASVs with significantly different abundances over time, indicated by ANCOM, were selected from the data set and graphed individually. Sequence data were imported into R (version 3.4.4) for subsequent analysis and visualization. Taxonomic barplots and nonmetric multidimensional scaling (NMDS) ordinations, based on Bray-Curtis dissimilarity matrices, were created with the R packages phyloseq (60) (version 1.22.3) and ggplot2 (61) (version 2.2.1).

Statistical differences in microbial community structure (beta diversity) were tested using permutational multivariate analysis of variance (PERMANOVA) based on Bray-Curtis dissimilarity matrices using the program PRIMER (version 6.1.11). One-way PERMANOVA tests compared (i) all samples with the fixed factor of sample type (stomach versus intestine versus environmental samples) and (ii) mature stomach and intestine microbial communities with the fixed factor of site (Jehu Pond versus Hamblin Pond versus tank controls). Two-way PERMANOVAs were used to compare regenerating stomach and intestine microbial communities over regeneration time (initial, day 13, day 17, and day 20), with site of origin and day as fixed factors. To verify that significant PERMANOVA outcomes were not a result of unequal dispersion of variability among groups, permutation tests for homogeneity of multivariate dispersions (PERMDISP) were also conducted in PRIMER (version 6.1.11) using the same factors. Finally, the difference in beta diversity between regenerating stomach and intestine microbial communities and the initial conditions was assessed by comparing mean pairwise Bray-Curtis distances between individuals from each group (days 13, 17, 20, and tank control) to the initial condition (day 0). This allowed a visual comparison of the magnitude of change in microbial communities relative to the initial condition throughout regeneration time.

Data availability. Raw 16S rRNA sequences were deposited as FASTQ files to the Sequence Read Archive of the National Center for Biotechnology Information under accession no. SRP255421.

SUPPLEMENTAL MATERIAL

Supplemental material is available online only. **SUPPLEMENTAL FILE 1**, PDF file, 2.2 MB.

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