# THE EVOLUTION AND ECOLOGY OF CAPITELLA (ANNELIDA, CAPITELLIDAE)

# IN THE GULF OF MEXICO

# A Dissertation

by

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### DOCTOR OF PHILOSOPHY

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### ABSTRACT

Members of genus *Capitella* (Annelida: Capitellidae) are often found in high abundance in areas of anthropogenic disturbance, such as fish farms and waste-water outflow sites and are frequently cited as ecological indicators of organic pollution. Understanding evolutionary relations and habitat preferences between *Capitella* species that can tolerate these, and other, harsh environments and those that cannot is important for their continued and improved use as indicators of pollution.

Five previously undocumented species of *Capitella* and *Capitella nonatoi*, a species described from Brazil, were detected in the Gulf of Mexico (GoM) by DNA barcoding. Most of the new species were found in a single location, with one being distributed throughout the GoM. Two of the proposed species are supported by distinctive life history characteristics. These findings underscore the potential to uncover large amounts of biodiversity in the GoM, a region subject to many anthropogenic and natural disturbances. Additionally, support was found for a single evolutionary origin of acicular spines in *Capitella*, which seems to be a morphology unique to Western Atlantic estuarine waters.

Comparing six species abundance modeling techniques using internal validation metrics with six capitellids in Tampa Bay, Florida indicated that none of the assessed models works best for all species. However, Hurdle and GAM-Tweedie models had good performance overall. This was attributed to how these models handle zero-inflation, which every species had. Species rarity was influential and required consideration. For example, *Capitella aciculata* was found to be a very rare species and this restricted model

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specification, resulting in the removal of one of the covariates. Assessment of environmental term importance indicated that depth and bay segment/region are important across all species, with higher abundance in shallow, near-shore regions of the bay.

Investigation of the evolution of hypoxia inducible factor (HIF), a key transcription factor in the cellular oxygen-sensing pathway consisting of an alpha and beta subunit, revealed high diversity across Annelida. Some recognized groups of annelids were supported by both gene phylogenies. However, neither of the two genes mirrored current hypotheses of annelid phylogenetics but HIF $\beta$  reflected current annelid phylogeny hypotheses more closely, indicating stronger conservation of this gene. Additionally, the protein domains of the two genes were recovered with varying degrees of success. This was attributed to loss of low-quality data during transcriptome assembly and high divergence of the domains.

These findings contribute to our understanding of *Capitella* species diversity, patterns of occurrence, and potential for low-oxygen tolerance. A key component to understanding how *Capitella* have come to occupy so many different marine habitats (e.g. sulfide vents, deep-sea wood falls, squid egg masses) lies in understanding their functional response to the low oxygen levels they encounter in some of these habitats. This will provide insights into the evolution of the HIF transcription factor across Annelida and its potential role in speciation across the phylum.

# DEDICATION

In memory of my mother. Her immense love and support continue to drive me to new accomplishments. This is for you, Mom.

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## CONTRIBUTORS AND FUNDING SOURCES

# Contributors

This work was supervised by a dissertation committee consisting of Anja Schulze [advisor] and Jaime Alvarado-Bremer of the Department of Marine Biology, Wesley Highfield of the Department of Marine and Coastal Environmental Science, and Michelle Lawing of the Department of Ecosystem Science and Management.

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### 1. INTRODUCTION

Capitellid polychaetes (Annelida, Capitellidae) are commonly found in marine benthos. Compared to most polychaetes they have a reduced morphology (no appendages and rarely any branchiae), are generally red in color, and are deposit feeders. Morphological synapomorphies that define this family include a thoracic region that bears mostly capillary chaetae (Figure 1.1A&E) and an abdominal region bearing hooded hooks (Figure 1.1C&E). Genera and species of Capitellidae are differentiated by traits such as thoracic and abdominal region chaetal formulae, hooded hook morphology, and the presence/absence of other structures, e.g. genital hooks, anal cirri, and branchiae (Blake 2008). *Capitella* have nine thoracic chaetigers (Figure 1.1A-B) with genital hooks on the dorsum of chaetigers eight and nine (Figure 1.1D).



Figure 1.1: Modified from Hilliard et al. (2016). Scanning electron micrographs of *Capitella* cf. *capitata* from Galveston Bay, Texas. A. Fragmented specimen with presegmental structures labeled. B. Fragmented specimen with nine thoracic segments numbered and attention drawn to the ventral groove. C. Hooded hooks on right side of segment 11 of specimen shown in image A. D. Genital spines on segments 8 and 9 of specimen shown in image A. E. Mixed neurochaetae (capillary chaetae and hooded hooks) on left side of segment 7. CC, capillary chaeta; F, main fang; GS, genital spine; HH, hooded hook; NuO, nuchal organ; Per, peristomium; Pro, prostomium; VGr, ventral groove. Scale bars: A=500  $\mu$ m; B=200  $\mu$ m; C & E=15  $\mu$ m; D=50  $\mu$ m.

The family Capitellidae comprises 44 accepted genera (WoRMS 2020). Capitellids are of interest because they are often regarded as indicators of polluted and/or disturbed marine sediments where they often occur in high abundance. (Dean 2008). This is especially true for *Capitella*, the second largest genus with 31 accepted species (WoRMS 2020). Unfortunately, the extent to their use as such is questionable because their taxonomy and evolutionary history remain largely unresolved (Blake 2008). *Capitella capitata* was originally considered a cosmopolitan species but early work indicated at least six sibling species along the Massachusetts coast alone with few morphological differences but with distinct life histories, reproductive strategies, and allozyme signatures (Grassle and Grassle 1976). Since then, at least 50 sibling species have been documented worldwide (Méndez et al. 2000) based on physiological, reproductive, and developmental characteristics, among other traits (Eckelbarger & Grassle, 1983 & 1987; Gamenick et al. 1998; Grassle et al. 1987). With this is mind, *Capitella* is likely much larger and more diverse than officially indicated on WoRMS (2020). Interestingly, a recent phylogeny only supports monophyly for *Capitella* (Tomioka et al. 2018) and none of the other capitellid genera. These findings in combination with other species presumed cosmopolitan with large distributions highlight the need for a large revision of the family and continued work on species delimitation.

*Capitella* are found in many diverse habitats. They occur regularly in estuarine sediments, as evidenced by this dissertation. They have been found inhabiting wood and whale-bone falls in the deep-sea (Judge and Barry 2016, Silva et al. 2016). Some species have different sulfide tolerances, with some inhabiting sediment near shallow-water hydrothermal vents (Gamenick et al. 1998). A unique habitat expansion for *Capitella* is squid egg masses. *Capitella ovincola* is one such species that inhabits *Doryteuthis opalescens* egg masses (Zeidberg et al. 2011).

One of the originally detected cryptic species, *Capitella* sp. I (Grassle and Grassle 1976), has been formally described as *Capitella teleta* (Blake et al. 2009) and it is an important model of spiralian/lophotrochozoan development. Its genome has been sequenced (Simakov et al. 2012) and it has become a well-established model organism (Seaver 2016). Notable evo-devo studies include a comprehensive cell fate map (Meyer et

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al. 2010), annotation and mapping of Hox genes (Fröbius et al. 2008, de Jong and Seaver 2016) and ParaHox genes (Fröbius and Seaver 2006), and several studies on posterior regeneration (Özpolat and Bely 2016, de Jong and Seaver 2017).

*Capitella* karyotypes have a lot of variability with diploid numbers ranging 12-26 and differences in chromosome morphology between populations of a species (Grassle et al. 1987). This indicates that genome rearrangement and/or duplication events may have been involved in *Capitella* evolution. With such diversity in species and habitat, development of other *Capitella* species as comparative models would be insightful to understand the implications of genome rearrangement for speciation, habitat expansion, and the evolution of segmentation.

This dissertation contributes to the understanding of three aspects of capitellid biology: evolutionary history, ecology, and physiology. Specifically, I have focused on *Capitella* in the Gulf of Mexico (GoM). The first article addresses species delimitation and supports at least five new species from the GoM based on DNA sequence analysis. We also detected a species previously only known from Brazil in the GoM. Thoracic acicular spines were found in a well-supported monophyletic clade, indicating a single origin for this unique morphology.

The second article is focused on the ecology of six capitellids in Tampa Bay, Florida. All taxa have a zero-inflated abundance distribution and there is spatial autocorrelation by bay regions. Lorenz Curves were found to be an effective tool to assess spatial patterns of species abundance across large areas. Bay Segment, Depth, and Dissolved Oxygen were the most important environmental drivers. Modeling was accomplished by comparing six different approaches: GAMs (Poisson, Negative Binomial, Tweedie, and Zero-Inflated Poisson distributions), Hurdle models, and Boosted Regression Trees. There was no model evaluated with top performance for every species. However, GAM-Tweedie and Hurdle models performed well overall and may be useful for studies of other benthic marine invertebrates.

The final article addresses the evolution of the hypoxia inducible factor (HIF) transcription factor and its two subunits, HIF $\alpha$  and aryl receptor nuclear transferase (ARNT), or HIF $\beta$ , across Annelida. HIF is a key component of the cellular oxygen sensing pathway. While the recovered gene phylogenies do not directly approximate the known annelid phylogeny, some known groups are supported. Annotation of protein domains with Hidden Markov Model (HMM) profiles resulted in recovery of the known domains of each gene across Annelida but incompletely for each species. Updating HMMs to better reflect diversity within Annelida improved the results.

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# 2. CAPITELLA (ANNELIDA: CAPITELLIDAE) SPECIES IN THE GULF OF MEXICO: DELIMITATION, PHYLOGEOGRAPHIC PATTERNS, AND PHYLOGENY OF THE GENUS

#### **2.1. Introduction**

Capitellid polychaetes (Annelida: Capitellidae) are common members of the world's marine benthos, from shallow estuaries to the deep sea. *Capitella capitata* (Fabricius et al., 1780), the most commonly reported species, is frequently cited as a bioindicator (Dean, 2008). However, its utility as a sentinel species is questionable, since it is part of a large complex of morphologically similar but genetically, reproductively and developmentally distinct species (Grassle & Grassle, 1976). Méndez et al. (2000) characterized 50+ putative *Capitella* species on the basis of life history characteristics alone. Other differences among sibling species include physiology, karyotypes, chromosomal count, egg envelope ultrastructure, and mature sperm morphology (Eckelbarger & Grassle, 1983 & 1987; Gamenick et al., 1998; Grassle et al., 1987).

Recent attempts have been made to understand the relationships within this species complex globally with molecular sequence data, mostly using the mitochondrial cytochrome *c* oxidase subunit I (COI) gene (Hilliard et al., 2016; Livi et al., 2017; Man-Ki et al., 2018; Silva et al., 2017; Tomioka et al., 2016). According to the COI data, *Capitella teleta* (formerly known as *Capitella* sp. I, according to Grassle & Grassle 1976) is one of the most widespread species, occurring in Japan (Tomioka et al., 2016), South Korea (Man-Ki et al., 2018) as well as in the Mediterranean Sea around Italy (Livi et al., 2017). New species have been described from the coast of Brazil (Silva et al., 2017) and speculated around Japan (Tomioka et al., 2016) and Italy (Livi et al., 2017).

Hilliard et al. (2016) found two morphotypes of *Capitella* in the northern Gulf of Mexico (GoM). Based on the presence of acicular spines, one of these matches the description of *C. aciculata* (Hartman 1959), while the second one, without acicular spines, fits the general description of *C. capitata*. However, COI sequence data could not confirm the separation of the two morphotypes as separate clades (Hilliard et al. 2016); instead they appear to constitute a single, morphologically plastic species. In addition, the sequence data suggest a genetic break between the eastern and western populations in the northern GoM.

To document developmental differences between the western and eastern GoM, we recently described differences in the early development and adult morphology between *Capitella* sp. from Tampa Bay, FL and Tamiahua Lagoon, Veracruz, Mexico (Méndez et al., 2019). Populations with acicular spines also occur along the Brazilian coast but were sufficiently genetically distinct from the GoM populations that Silva et al. (2017) described them as a new species, *Capitella neoaciculata*.

For the present study, we examined additional samples from the US and Mexican coasts of the GoM. Our objectives are 1) to determine molecular support for the Tampa Bay and Tamiahua Lagoon populations (Méndez et al. 2019) and identify possible geographic patterns, 2) to delimit species boundaries and re-evaluate the significance of acicular spines as diagnostic characters, and 3) to re-analyze the phylogeny of the genus *Capitella* using the newly generated data in conjunction with publicly available data.

#### 2.2. Materials and Methods

### 2.2.1. Specimen Collection/Storage

*Capitella* specimens were collected from shallow mud/sand flats, canals, and the edge of red mangrove swamps along the GOM coast and in Miami, Florida (Figure 2.1 and Table 2.1). Sediment was collected with a shovel at a depth not exceeding 15 cm and sieved through a 0.5- or 1-mm sieve. Some specimens were hand picked off of the mesh and stored in a centrifuge tube with ambient water while others were later picked from retained material (stored in a plastic storage container with ambient water). Most adult *Capitella* spp. (identified by the presence of nine thoracic chaetigers and/or genital spines in the 8<sup>th</sup> and/or 9<sup>th</sup> chaetigers) were processed within several hours of collection by relaxing them in a sea water:7% magnesium chloride (or sulfate) (1:1) solution and then fixed and stored in 95% ethanol. Some specimens from Apollo Beach Preserve in Tampa Bay and from Tamiahua Lagoon in Veracruz were maintained in culture to document their early development (Méndez et al. 2019). Some of the cultured specimens were sequenced for this study as well.



Figure 2.1: Sampling locations throughout the Gulf of Mexico. The shapefiles used to make this map are from version 2.3.7 of the Global Self-consistent, Hierarchical, High-resolution Geography (GSHHG) Database, accessible at <a href="http://www.ngdc.noaa.gov/mgg/shorelines/gshhs.html">http://www.ngdc.noaa.gov/mgg/shorelines/gshhs.html</a>.

|         | Location                 |                         | Geographic<br>coordinates | GenBank Accession                           |  |  |
|---------|--------------------------|-------------------------|---------------------------|---|--|--|
|         |                          |                         |                           | COI   | НЗ   |  |
|         | Galveston Bay            |                         | 29° 13′ 43.20″ N          | KX961408 – KX961417;                        | MT221461; MT221470;<br>MT221471; MT221474; |  |
|         |                          |                         | 94° 54' 57.04" W          | MT246752 – MT246770                         | MT221481; MT221490;<br>MT221515 – MT221518 |  |
|         | Christmas Bay            |                         | 29° 2′ 56.21″ N           | 10/064 404                                  | _  |  |
|         |                          |                         | 94° 9′ 54.71″ W           | KX961404                                    |  |  |
|         | East Matagorda Bay       |                         | 28° 45′ 37.87″ N          |   | MT221535                                   |  |
| τεχας   |                          |                         | 95° 39′ 19.24″ W          | KX301403                                    |  |  |
| 12/010  | Goose Island             |                         | 28° 7′ 42.30″ N           | KX061406                                    | MT221541                                   |  |
|         |                          |                         | 96° 59′ 23.41″ W          | KA901400                                    |  |  |
|         | Corpus<br>Christi<br>Bay | Oso Bay                 | 27° 43′ 5.05″ N           | KY061402- KY061407                          | MT221458; MT221542                         |  |
|         |                          |                         | 97° 19' 52.71" W          | KX901403, KX901407                          |  |  |
|         |                          | Suter Park              | 27° 42' 16.4" N           |   | MT221459; MT221460;                        |  |
|         |                          |                         | 97° 20' 04.1" W           | M1246688 – M1246710                         | MT221462 – MT221469                        |  |
|         |                          | Fish Pass               | 27°41'41.3" N             | _   | MT221472; MT221473                         |  |
|         |                          |                         | 97 11 02.0 W              |   |  |  |
|         | Tampa<br>Bay             | Admiral<br>Farragut     | 27° 46′ 40.90″ N          | KX961418 – KX961426                         | _  |  |
| FLORIDA |                          | Academy                 | 82° 44' 52.53" W          |   |  |  |
|         |                          | Apollo                  | 27° 47′ 34.00″ N          | MT246684 – MT246687;<br>MT246737 – MT246751 | MT221500 – MT221514                        |  |
|         |                          | Preserve                | 82° 25′ 3.89″ W           |   |  |  |
|         |                          | Crystal<br>Beach, Saint | 28° 5′ 30.91″ N           | KX961427                                    | -  |  |
|         |                          | Joseph<br>Sound         | 82° 46′ 52.84″ W          |   |  |  |

Table 2.1: All sampling localities, figure abbreviations, and GenBank accession numbers for samples collected by the authors in this study (italicized) and Hilliard et al. (2016).

| Location |                                 | Geographic                           | GenBank Accession   |   |
|----------|---------------------------------|--------------------------------------|---------------------|---|
|          |                                 | coordinates                          | COI                 | H3  |
| FLORIDA  | Rookery Bay                     | 26° 0′ 51.24″ N<br>81° 45′ 14.28″ W  | KX961428 – KX961433 | MT221529 – MT221534                         |
|          | Matheson Hammock<br>Park, Miami | 25° 40' 21.5"N<br>80° 15' 37.6"W     | MT246678 – MT246683 | MT221536 – MT221540                         |
|          | Tamiahua, Veracruz              | 21° 16′ 11.05″ N<br>97° 26′ 37.72″ W | MT246711 – MT246721 | MT221475 – MT221480;<br>MT221482 – MT221485 |
| ΜΕΧΙϹΟ   | El Estero, Veracruz             | 19° 05' 31.3"N<br>96° 06' 11.8"W     | MT246722 – MT246729 | MT221486 – MT221489;<br>MT221491 – MT221493 |
|          | Ciudad del Carmen,<br>Campeche  | 18° 38' 54.7"N<br>91° 50' 24.8"W     | MT246730 – MT246736 | MT221495 – MT221499                         |
|          | Mangrove/Marsh,<br>Campeche     | 18°44'28.1"N<br>91°32'38.8"W         | -                   | MT221494                                    |

# **Table 2.1 Continued**

# 2.2.2. DNA Purification and Sequencing

Tissue samples were isolated from each specimen by removing two or three segments from either the posterior end of a fragment or from the middle of the abdominal region in entire specimens. DNA was extracted and purified using the Qiagen DNeasy Blood and Tissue Kit following the manufacturer's protocols but using half the specified amount of several reagents (Buffer AL, proteinase K, 100% EtOH, and Buffers AW1 and AW2) with final elutions of 100  $\mu$ l. COI was amplified by polymerase chain reaction (PCR) using the thermocycler protocol of Carr et al. (2011) and two primer sets: polyLCO (5'-GAYTATWTTCAACAAATCATAAAGATATTGG-3') and polyHCO (5'-TAMACTTCWGGGTGACCAAARAATCA-3') (Carr et al., 2011); Mega-COIF (5'- TAYTCWACWAAYCAYAAAGAYATTGG-3') and Mega-COIR (5'-

TAKACTTCTGGRTGMCCAAARAATC-3') (Schult et al., 2016). Histone H3 (hereafter H3) was amplified using H3aF and H3aR (Colgan et al., 1998). The thermocycler protocol included one cycle at 95°C for 180 s; 35 cycles of denaturing at 95°C for 30 s, annealing at 54°C for 30 s, and extension at 72°C for 60 s; a final extension at 72°C for 300 s; and an indefinite hold at 12°C. All PCR amplifications were carried out with 25  $\mu$ l reaction volumes consisting of 16.8  $\mu$ l autoclaved Milli-Q® (EMD Millipore) water, 1.25  $\mu$ l of each primer (10  $\mu$ M), 0.2  $\mu$ l Taq DNA Polymerase (Qiagen), 2  $\mu$ l dNTP mix (10 mM) (Qiagen), 2.5  $\mu$ l 10X Coral Load Buffer (Qiagen), and 1  $\mu$ l of template DNA. Amplified products were diluted 1:9 in Milli-Q water.

Cycle sequencing was conducted with the BigDye® Direct Cycle Sequencing Kit (Life Technologies, now Thermo Fisher Scientific) using 1 µl Big Dye® Terminator v3.1 Cycle Sequencing RR-100, 2 µl Big Dye® Terminator v1.1/3.1 Sequencing Buffer (5X), 1 µl primer (10 µM), 1 µl template DNA, and 5 µl autoclaved Milli-Q® water. The thermocycler protocol of Hilliard et al. (2016) was followed. Reaction products were cleaned with a ZR DNA Sequencing Clean-Up Kit<sup>TM</sup> (Zymo Research) following the manufacturer's protocols using half the designated volume of all reagents with final elution in 15 µl of Hi-di formamide (Thermo Fisher Scientific). Products were analyzed with an ABI 3130 Genetic Analyzer (Applied Biosystems, now Thermo Fisher Scientific). Resulting electropherograms and base calls were edited in Sequencher<sup>TM</sup> 4.8 (Gene Codes Corporation) by assembling the forward and reverse reads of each specimen. Final sequences were exported as FASTA files.

### 2.2.3. Sequence Analysis

*Capitella* spp. COI sequences were downloaded from GenBank (Table 2.2). Notomastus profondus (Eisig, 1887) and Heteromastus filiformis (Claparède, 1864) were used as outgroups in the COI analysis and a *Heteromastus* sp. was used as an outgroup in the H3 analysis (Table 2.2). Initial multiple sequence alignment by nucleotides was completed using the MUSCLE algorithm (Edgar, 2004) with default settings via MEGAX (Kumar et al., 2018). The alignments were further refined and finalized with MAFFT v7.428 (Katoh et al., 2002 & 2005; Katoh & Standley, 2013) using the global alignment algorithm with a maximum of 16 iterative refinement cycles. MEGAX was used for alignment visualization and adjustment. Primer regions were deleted. Model selection was completed using jModeltest 2.1.10 v20160303 (Darriba et al., 2012) with 88 candidate models (11 substitution schemes, equal/unequal base frequencies, with/without invariable sites, with/without rate variation among sites with four categories) and a BIONJ base tree for likelihood calculations. Phylogenetic analyses were performed using RaxML HPC (8.2.11) (Stamatakis, 2014) for maximum likelihood (ML) and MrBayes (3.2.6) (Ronquist et al., 2012) for Bayesian Inference (BI). Average genetic distances between and within populations were calculated using the K2P model for comparability to other studies (Kimura, 1980).

For COI, the ML analysis was completed with the GTR+CAT+I substitution model (Stamatakis 2006), rapid bootstrapping (Stamatakis et al., 2008) with a random seed of 333 and automatic bootstopping (Pattengale et al., 2009), a final search for the best-scoring tree, and *N. profondus* and *H. filiformis* as outgroups. The BI analysis was completed with the GTR+I+G substitution model (Tavaré, 1986), 7000000 total generations, a 1000-

generation sampling frequency, a 5000-generation diagnostic frequency, a 25% burn-in fraction, and a Metropolis coupling heating coefficient ( $\lambda$ ) of 0.05. Median joining haplotype networks (Bandelt et al., 1999) were generated using PopART (Leigh & Bryant, 2015).

ML analysis of H3 was completed with the Jukes Cantor substitution model (Jukes & Cantor 1969), rapid bootstrapping (Stamatakis et al., 2008) with a random seed of 333 and automatic bootstopping (Pattengale et al., 2009), a final search for the best-scoring tree, and *Heteromastus* sp. as the outgroup. The BI analysis was completed with the Jukes Cantor substitution model (Jukes & Cantor, 1969), 9000000 total generations, a 1000-generation sampling frequency, a 5000-generation diagnostic frequency, and a 25% burn-in fraction.

Bayesian Poisson Tree Process (Zhang et al., 2013) was used to delimit species using the COI ML tree. A seed of 333 was set and Markov Chain Monte Carlo was run for 6000000 generations. The input tree was rerooted on the longest branch and the *Heteromastus filiformis* and *Notomastus profondus* were specified as outgroups.

| Gene | Clade                    | Location                | GenBank Accession   |  |
|------|--------------------------|-------------------------|---------------------|--|
|      |                          | Indo-Pacific            | KF737175; KF815717; |  |
|      |                          |                         | JX676137; JX676150; |  |
|      | INDU-                    |                         | JX676169; JX676171; |  |
|      | PACIFIC                  |                         | JX676173; JX676174; |  |
|      |                          |                         | JX676178; JX676179  |  |
|      |                          | Hudson Bay (Canada      | GU672406; GU672407; |  |
|      |                          | Lineage 1)              | HQ023469; HQ023470  |  |
|      | CANADA                   | Hudson Bay (Canada      | HO022471 HO022474   |  |
|      |                          | Lineage 2)              | ΠQU25471 - ΠQU25474 |  |
|      | Capitella<br>aracaensis, |                         |                     |  |
| COI  | C. biota, C.             |                         | PopSet: 1043110615  |  |
|      | neoaciculata,            | Prazil and Groonland    |                     |  |
|      | C. nonatoi,              | Brazil and Greeniand    |                     |  |
|      | and C.                   |                         |                     |  |
|      | capitata                 |                         |                     |  |
|      | (Greenland)              |                         |                     |  |
|      | ITALY                    | Italy                   | PopSet: 1021313792  |  |
|      | Capitella                |                         | LC120630-LC120653;  |  |
|      | teleta                   | Japan, South Korea, and | KX286328; KX286329; |  |
|      | complex                  | italy (see above)       | KX298243 – KX298247 |  |
|      | OUTGROUPS                | Portugal                | KR916855; KR916899  |  |
| H3   | OUTGROUP                 | Japan                   | LC208097            |  |
|      |                          |                         |                     |  |

 Table 2.2: All clade names, geographic locations, and GenBank accession numbers for samples downloaded from GenBank.

# 2.2.4. Morphological Observations

All specimens used for sequence analyses were morphologically identified with light microscopy. Presence/absence of acicular spines was diagnostic for assigning specimens to *C*. cf. *capitata* or *C*. cf. *aciculata*, respectively. Specimens from laboratory-

maintained cultures of the Galveston (n=3), Corpus Christi (Suter Park) (n=4), and Tampa (Apollo Beach Preserve) (n=7) populations were used for scanning electron microscopy (SEM). This was done for comparison between populations and to *C. capitata* from Greenland, the type locality, and *C. teleta* (Blake, 2009; Blake et al., 2009). All cultures were started with individuals identified as *C.* cf. *capitata*. Individuals with *C.* cf. *aciculata* morphology were not included to prevent any confounding effects.

For scanning electron microscopy (SEM), all worms were relaxed in a 1:1 solution of sea water:7% magnesium sulfate for at least 30 minutes and stored at 4°C in 2.5% glutaraldehyde in Millonig's Phosphate Buffer (1 part 25% glutaraldehyde, 4 parts 0.34M NaCl, and 5 parts Millonig's Phosphate Buffer (0.46M sodium phosphate monobasic, pH 7.4)) until processing for SEM analysis. Each worm was rinsed (1 part Millonig's Phosphate Buffer and 1 part 0.6M NaCl) three times for five minutes. Samples were then rinsed briefly with distilled water followed by dehydration in an ethanol series (30% for 10 min, 50% for 10 min, 2 x 70% for 10 min, 2 x 80% for 10 min, 2 x 95% for 10 min, and 2 x 100% for 10 min). Samples were transferred to a dish, excess ethanol removed, and covered with hexamethyldisilazane and left for several minutes until dry. Worms were mounted on SEM stubs using carbon tabs, and sputter-coated with gold/palladium. SEM was conducted at Texas A&M University at Galveston, TX with a Hitachi TM3000 scanning electron microscope.

### 2.3. Results

### 2.3.1. COI Analysis

A total of 112 specimens were successfully sequenced for COI. Analysis of COI sequences revealed a total of 17 *Capitella* clades (Figure 2.2). Seven of the clades (2, 3, 8, 9, 11, 12, 16) are limited to a single location and three (3, 8, 16) only contain a single specimen. The remaining six encompass specimens from at least two locations. As clades 1, 3, 4, 5, 6, 7, 13, 14, 16, and 17 do not contain any sequences from the Gulf of Mexico, the geographic origins for these clades are listed in Figure 2.2 as countries, but the sequences originated from multiple locations in those countries.

The GoM specimens fall into seven different clades in the phylogenetic tree (clades 2, 8, 9, 10, 11, 12 and 15). Only one of them, clade 15, can be assigned to a named species, *Capitella nonatoi* (Silva et al. 2017), originally described from Araçá Bay, São Paulo, Brazil and here reported from Ciudad del Carmen, Campeche and Texas (Galveston and Suter Park). Specimens from Tamiahua, Veracruz form a clade with specimens from Ciudad del Carmen, Campeche; and Texas (Galveston and Capitella sp. TV following Méndez et al. (2019). Some of the specimens from Apollo Beach Preserve, Tampa Bay culture form a distinct clade (Clade 2) and are referred to as *Capitella* sp. TF after Méndez et al. (2019). *Capitella* sp. TF has morphological differences from *Capitella* sp. TV (see below for more details). The remaining four clades with samples from the GoM cannot be linked to any previously reported species.

Acicular spines were found in three clades, 10, 12, and 13 (Figure 2.2, green boxes). Clades 10 and 13 contain specimens that identified as both *Capitella* cf. *capitata* 

and *Capitella* cf. *aciculata*. Clade 13 is a species recently described from Brazil (Silva et al. 2017) with all specimens having acicular spines.



Figure 2.2: Maximum likelihood phylogenetic tree based on COI sequences. Branch labels are bootstrap support values posterior probabilities. Details of each clade's geographic origin and species name if known are listed. The clades with species where acicular spines have been documented are indicated by green boxes.

Figure 2.3 shows that the *Capitella* sp. TV clade is split into Western and Eastern regions, with all Texas and Mexico samples in one group and all Florida samples in the other, respectively. The two groups are separated by three mutations. Specimens with acicular spines were found throughout (Figure 2.3). Within the Eastern Region are all of the samples from Miami and nine of the samples from Apollo Beach Preserve, including

field collected and culture specimens. The remaining eight field-collected specimens from Apollo Beach Preserve form a distinct clade sister to *Capitella* sp. TV (Clade 9, Figure 2.2).

The *Capitella nonatoi* clade (Clade 15, Figure 2.2) includes specimens from Corpus Christi, Galveston and Ciudad del Carmen, in addition to the sequences from Brazil. Reconstruction of haplotype networks reveals geographic separation between the Gulf of Mexico and Brazil, with some haplotypes shared between Ciudad del Carmen and Corpus Christi (Figure 2.4). K2P genetic distances for COI between all populations are reported in Figure 2.5. Multiple samples were collected from Suter Park, Corpus Christi Bay (Jan 11, 2017 and May 29, 2017) and Galveston Bay (July 10, 2015 and May 23, 2018) Texas over five years, but *C. nonatoi* specimens were only found during May sampling. *Capitella* sp. TV was present during the other samplings as well as the other locations throughout both bays.


Figure 2.3: Median joining haplotype network of COI for *Capitella* sp. TV (Clade 10, Figure 2.2). Locations marked by a triangle in the legends had some specimens with acicular spines. One hash represents a single mutation. Small black circles within the network represent a predicted haplotype that is not present in the data set.



Figure 2.4: Median joining haplotype network of COI *Capitella nonatoi* clade. One hash represents a single mutation. Small black circles within the network represent a predicted haplotype that is not present in the data set.

Our species delimitation analysis using bPTP clearly separated the 17 *Capitella* clades (Figure 2.2). While 13 of the clades were confirmed as species under both maximum likelihood and Bayesian posterior probability, four clades (Clades 11, 13, 14 and 17) were additionally split up into several species, depending on the criterion used. For Clade 11, both solutions delimited two species (each represented by a single specimen). Clade 13 contains a single species under the maximum likelihood criterion but eight species under Bayesian posterior probability. Clade 14 includes two species under maximum likelihood and forms a single species under posterior probability. Clade 17 (*Capitella biota*) was delimited as six species under maximum likelihood and as eight under posterior probability.

| Capitella aracaensis   |       | _     |       |       |       |       |       |       |       |       |       |       |       |       |       |       |       |
|------------------------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|
| Capitella sp. TF       | 0.189 |       |       |       |       |       |       |       |       |       |       |       |       |       |       |       |       |
| Clade 3                | 0.180 | 0.216 |       |       |       |       |       |       |       |       |       |       |       |       |       |       |       |
| Capitella capitata     | 0.223 | 0.246 | 0.190 |       |       |       |       |       |       |       |       |       |       |       |       |       |       |
| Clade 5                | 0.190 | 0.209 | 0.174 | 0.201 |       |       |       |       |       |       |       |       |       |       |       |       |       |
| Clade 6                | 0.169 | 0.206 | 0.183 | 0.222 | 0.126 |       |       |       |       |       |       |       |       |       |       |       |       |
| Capitella teleta       | 0.193 | 0.244 | 0.191 | 0.206 | 0.201 | 0.172 |       |       |       |       |       |       |       |       |       |       |       |
| Clade 8                | 0.189 | 0.237 | 0.169 | 0.215 | 0.185 | 0.188 | 0.175 |       |       |       |       |       |       |       |       |       |       |
| Clade 9                | 0.163 | 0.225 | 0.192 | 0.228 | 0.206 | 0.208 | 0.193 | 0.132 |       |       |       |       |       |       |       |       |       |
| Capitella sp. TV       | 0.499 | 0.253 | 0 206 | 253   | 0 231 | 0.239 | 0.193 | 0 141 | 0.095 |       |       |       |       |       |       |       |       |
| Clade 11               | 0.191 | 0.252 | 0.215 | 0.226 | 0.237 | 0.229 | 0.210 | 0.154 | 0.125 | 0.143 |       |       |       |       |       |       |       |
| Clade 12               | 0.191 | 0.249 | 0.218 | 0.232 | 0.214 | 0.206 | 0.194 | 0.147 | 0.137 | 0.134 | 0.072 | _     |       |       |       |       |       |
| Capitella neoaciculata | 0.184 | 0.242 | 0.208 | 0.229 | 0.207 | 0.204 | 0.194 | 0.147 | 0.131 | 0.138 | 0.089 | 0.078 |       |       |       |       |       |
| Clade 14               | 0.206 | 0.226 | 0.216 | 0.229 | 0.225 | 0.244 | 0.244 | 0.192 | 0.212 | 0.223 | 0.229 | 0.211 | 0.198 |       |       |       |       |
| Capitella nonatoi      | 0.214 | 0.241 | 0.221 | 0.262 | 0.216 | 0.233 | 0.208 | 0.203 | 0.223 | 0.236 | 0.228 | 0.204 | 0.210 | 0.175 |       |       |       |
| Clade 16               | 0.219 | 0.254 | 0.256 | 0.258 | 0.241 | 0.249 | 0.224 | 0.229 | 0.232 | 0.244 | 0.240 | 0.235 | 0.216 | 0.189 | 0.119 |       | 3     |
| Capitella biota        | 0.213 | 0.239 | 0.231 | 0.244 | 0.236 | 0.225 | 0.215 | 0.230 | 0.224 | 0.254 | 0.255 | 0.251 | 0.237 | 0.214 | 0.212 | 0.224 |       |
| Outgroups              | 0.294 | 0.310 | 0.323 | 0.355 | 0.340 | 0.325 | 0.331 | 0.345 | 0.330 | 0.351 | 0.337 | 0.330 | 0.327 | 0.350 | 0.324 | 0.339 | 0.267 |

Figure 2.5: K2P genetic distances based on COI. Only distances between groups are shown and no within-group values are reported. The color scheme for the distance values can be interpreted as column = upper right and row = lower left. For example, the genetic distance between *Capitella teleta* and *Capitella aracaensis* is 0.193, or 19.3%.

# 2.3.2. H3 Analysis

Analysis of H3 did not reveal much, if any, geographic structure. The two Ciudad del Carmen specimens that clustered within *Capitella nonatoi* by COI analysis formed a well-supported clade with two specimens from Fish Pass, Corpus Christi, Texas (Figure 2.6). We did not successfully sequence COI for the Fish Pass specimens. Several of the samples from Apollo Beach Preserve formed supported clades, but the clade membership does not align with that of COI.



Figure 2.6: Bayesian Inference phylogenetic tree based on H3 sequences. Branch labels are bootstrap support values/posterior probabilities. Branches are only labeled as they are relevant to the Discussion Section.

### 2.3.3. Morphology

Scanning electron micrographs show that *Capitella* sp. TF (Figure 2.7 A-C) is not as long as *Capitella* sp. TV (Figure 2.7 D-F) in terms of total body length and thoracic length. *Capitella* sp. TF has dorsally incomplete intersegmental furrows in chaetigers 1-4 (Figure 2.7 B-C) whereas *Capitella* sp. TV has complete furrows (Figure 2.7 E-F). Thoracic chaetigers 1-4 of *Capitella* sp. TF also appear more inflated than those of *Capitella* sp. TV (Figure 2.7 B & E).



Figure 2.7: Scanning electron micrographs. *Capitella* sp. TF is in all top images (A-C). A. Complete specimen for total length. B. Thoracic region of specimen with chaetigers 1-4 labeled. C. Dorsal view for emphasis of incomplete intersegmental furrows. *Capitella* sp. TV is in all bottom images (D-F). D. Complete specimen from Galveston, TX for total length. E. Thoracic region of specimen from Tampa, FL with chaetigers 1-4 labeled. F. Dorsal view of specimen from Suter Park, Corpus Christi, TX for emphasis of complete intersegmental furrows. Scale bars: A&D=1 mm; B&E=500 μm; C&F=250 μm.

#### 2.4. Discussion

Our results show that *Capitella* has high diversity along the GoM coast. This diversity remains largely undocumented, as the majority of specimens used in this study could not be assigned to any named species. Our phylogenetic analysis and the Bayesian Poisson Tree Process species delimitation supported at least five new *Capitella* spp. (Clades 2, 9, 10, 11, and 12 Figure 2.2). *Capitella* species are generally not localized to a particular location in the GoM and most locations host several species. Furthermore, the proportional contributions of different species at a particular location may be temporally variable, depending on season, environmental conditions, or random factors (Grassle and Grassle, 1976; Gamenick et al., 1998). For example, *Capitella nonatoi* was only collected in May 2017 and 2018 in Suter Park, Corpus Christi and Galveston Bay, respectively. In comparison, *Capitella* sp. TV was the only species found at these locations at other times of the year and it was found in Suter Park in May 2017.

The acicular spine morphology occurs in Clades 10, 12, and 13 (Figure 2.2, green boxes) which, with Clade 11, form a well-supported derived clade in our phylogeny, suggesting a single evolutionary origin of acicular spines. Within this acicular clade, only *Capitella neoaciculata* (Clade 13) is currently known from outside of the GoM (Brazil) and it is monophyletic with species from southern Veracruz and Campeche, Mexico. This would suggest that speciation within this clade may coincide with the opening of the GoM and Caribbean Sea and that this morphology evolved during the Jurassic Period (Ross and Scotese, 1988). Clitellates evolved as early as the Triassic Period (Manum et al., 1991) and the divergence of Capitellidae and Echiura from Clitellata (Weigert and Bleidorn, 2016; Helm et al., 2018) predates this. Further work using the fossil records of clitellates will be necessary to establish a molecular clock for Capitellidae and test this hypothesis. While some of these species' ranges may extend into the Caribbean, there are likely undiscovered *Capitella* species with acicular spines as well.

*Capitella capitata* was described from Greenland and has been redescribed with material from there (Blake, 2009). Blake (2009) hypothesized that *Capitella capitata* is widely distributed in Arctic and Subarctic waters and this is supported by the current analysis (Figure 2.2) and the original report of the *Capitella capitata* COI sequence from Greenland (Silva et al., 2017). Interestingly, there is support for samples from the Indo-Pacific region being true *Capitella capitata* (Figure 2.2). This is likely the result of an introduction by anthropogenic activity. *Capitella teleta* is also widely distributed and has been detected in the Mediterranean Sea and waters of South Korea and Japan (Figure 2.2). It was hypothesized that this, too, is due to anthropogenic activity (Tomioka et al., 2016). Continued sampling around the world will shed light on these patterns.

Our data clearly support *Capitella* sp. TV (Clade 10) and *Capitella* sp. TF (Clade 2) as separate species. Méndez et al. (2019) recently distinguished these two species by their larval development, based on samples collected from Tamiahua, Veracruz (abbreviated as TV) and Tampa Bay, FL (abbreviate as TF). In addition, they can be distinguished by their overall size (Figure 2.7) and pigmentation patterns in *Capitella* sp. TF (Méndez et al., 2019).

Three sympatric species occurred at Apollo Beach Preserve in Tampa Bay, Florida. At the time of collection, we did not detect any obvious morphological differences among the specimens and some of the larger specimens were preserved for morphological and molecular studies. The smaller specimens and the remaining larger specimens were kept in culture under the assumption that they all belonged to a single species. Our COI sequence analysis revealed that *Capitella* sp. TV was present both in the culture and the fieldpreserved samples. *Capitella* sp. TF, a smaller species, was only detected in the culture. A third species, comprising larger specimens (Clade 9, Figure 2.2), was only sequenced from the field-preserved material (although it is possible that some specimens are present in the culture but have not been sequenced). The three species may have different ecological characteristics and/or occupy different depths (Gamenick et al., 1998) or they may maintain sympatry through differing seasonal dynamics (Grassle and Grassle, 1976). However, our sampling design did not address this.

*Capitella* sp. TV from Miami were collected at Matheson Hammock Park, the type locality for *Capitella caribaeorum* (Warren & George, 1986). They are approximately the same size (*C. caribaeorum* < 20 mm, *Capitella* sp. TV  $\leq$  24 mm), but our specimens from this location were collected differently. While Warren & George (1986) described *C. caribaerum* from a culture stemming from intertidally collected decaying mangrove leaves, our specimens were retrieved by sieving sediment from sand flats with interspersed algal mats.

We further considered the possibility that our *Capitella* sp. TF (Clade 2), represents *Capitella caribaeorum*, but differences in size (mid-thoracic width: *Capitella caribaeorum*: 0.7 mm; Capitella sp. TF: ~0.25 mm) and life cycle make this unlikely as well. *Capitella caribaeorum* larvae metamorphose in the brood tube and emerge as juvenile worms (George, 1975) whereas *Capitella* sp. TF larvae emerge from brood tubes as swimming metatrochophores, settling to metamorphose after three days (Méndez et al., 2019).

H3 had limited utility for species delimitation in *Capitella*, as the phylogenetic analysis did not support most of the clades revealed in the COI analysis. The only species that was supported as monophyletic in the H3 analysis was *C. nonatoi*. The average K2P distance between *C. nonatoi* H3 and all other *Capitella* is 8.54%. Average K2P distances among Clades 9-12 range 0.517-11.5%, likely reflecting more recent speciation. Although H3 has been successfully used to delimit three cryptic *Heteromastus* species from Korea (Man-Ki et al., 2019), the marker may lack sufficient variation to resolve relationships among closely related *Capitella* species.

In conclusion, at least five undescribed species of *Capitella* were present in our samples as revealed by COI analysis. Two of them, *Capitella* sp. TV and *Capitella* sp. TF, also differ in their larval development. *Capitella* sp. TV is widespread throughout the GoM, ranging to at least the southern Atlantic coast of Florida, while the range of *Capitella* sp. TF still remains to be determined. Our phylogenetic tree supports a single origin of acicular spines. Our analyses included our own sequences in combination with publicly available sequences from multiple locations worldwide. Many parts of the world still remain unstudied with regard to *Capitella* diversity. Increased sampling efforts would lead to a more global picture of *Capitella* phylogeny and biogeography. Finally, multiple lines of evidence are useful when delimiting species. Culturing of *Capitella* is important to link developmental characteristics to the genetic signatures and morphology.

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# 3. COMPARATIVE SPECIES ABUNDANCE MODELING OF CAPITELLIDAE (ANNELIDA) IN TAMPA BAY, FLORIDA

#### **3.1. Introduction**

Species abundance modeling is used in ecology for understanding biogeographic patterns and predicting impacts of climate change. These models are not to be confused with those commonly termed species distribution models (SDM) and ecological niche models (ENM) (Elith and Leathwick 2009, Sillero 2011, Peterson and Soberón 2012). While some of these methods use abundance data, they often use presence-only/-absence data and have prediction of species' distributions, and often maps, as an end-goal. Research using species abundance models for marine organisms has been focused on theoretical ecology, conservation planning, and climate change (Robinson et al. 2017). Taxonomic representation has been varied but biased toward vertebrates, with nearly 50% of studies focused on fish, birds, and mammals (Robinson et al. 2017).

Generalized linear models (GLMs) (Nelder & Wedderburn 1972, McCullagh & Nelder 1983) and generalized additive models (GAMs) (Hastie & Tibshirani 1986, 1990) are regression techniques frequently used for modeling species abundance data (Guisan et al. 2002). GLMs and GAMs are similar in that they both allow for non-Gaussian response distributions and use a monotonic function, often logarithmic, to link the response and predictors. The difference is that GAMs utilize smoothing functions on the predictors to determine their individual relationships with the response (Guisan et al. 2002, Zuur et al. 2009). When there is overdispersion due to zero-inflation, generalized linear modeling can be extended to a two-part, or hurdle, model (Cragg 1971). This approach first fits the

abundance data as presence/absence with a binary response and then truncates the data and fits non-zero abundance with a Poisson or Negative Binomial response (Zuur et al. 2009).

A newer method being applied to abundance modeling is boosted regression trees (BRTs). This approach combines classification and regression trees (Breiman et al. 1984) with boosting algorithms (Freund & Schapire 1996). Some advantages include its ability to accommodate nonparametric data sets and fit complex interactions (De'ath 2007, Elith et al. 2008). For marine species abundance modeling, GLMs and GAMs were used 18% of the time while BRTs were used in only 4.2% of papers reviewed (Robinson et al. 2017). Hegel et al. (2010) provide a general overview of various other modeling strategies. There have been several comparisons of modeling strategies and while some target marine organisms (Connolly et al. 2009, Shelton et al. 2014), they are often focused on terrestrial organisms (e.g. Potts & Elith 2006, Baldridge et al. 2016) and vertebrates (Oppel et al. 2012). Such a comparative study of modeling strategies has not been completed for capitellid polychaetes.

Capitellids occur ubiquitously throughout the world's oceans. They have been reported from river mouths, estuaries, sea grass beds, deep sea sediments, and even wood and bones from whale falls in the deep sea (Judge & Barry 2016, Silva et al. 2016). This is especially the case for the best-known genus of the family, *Capitella*. Cryptic species of *C*. *capitata* were initially reported off the coast of Massachusetts primarily on the basis of life history characteristics and allozyme data (Grassle & Grassle 1976). Since then, there have been 50+ putative species described worldwide on the basis of life history alone (Méndez et al. 2000). Recent efforts have aimed to understand this species complex using the mitochondrial cytochrome c oxidase subunit I gene (COI) from the coasts of Brazil, Japan, Korea, Italy, and the Gulf of Mexico (Hilliard et al. 2016, Tomioka et al. 2016, Livi et al. 2017, Man-Ki et al. 2017, Silva et al. 2017). Some DNA barcoding with COI has been done on other genera (Carr et al. 2011, Lobo et al. 2016) and a phylogeny of the family indicates monophyly only for *Capitella* and a need to revise other genera (Tomioka et al. 2018).

Species in the *Capitella* species complex, as well as other capitellids, such as *Heteromastus filiformis*, *Mediomastus ambiseta*, and *M. californiensis*, have all shown utility as bioindicators (reviewed in Dean 2008). However, resolving species boundaries and understanding ecological drivers of abundance are necessary steps to effectively use them as such. All of these species, as well as *C. aciculata* and *C. jonesi*, occur throughout Tampa Bay, Florida. Tampa Bay is on the west central Florida coast (27°27'-28°3' N; 82°20'-82°44' W), in a biogeographic transition zone between the Northern Gulf of Mexico and Floridian ecoregions, creating a very diverse system (Yates & Greening 2011 and references therein, Spalding et al. 2007). Tampa Bay has an average depth of 4 m and surface area of nearly 1,036 km<sup>2</sup> (Morrison & Yates 2011). The shorelines are characterized by tidal flats and mangroves (Glick & Clough 2006).

The Environmental Protection Commission of Hillsborough County (EPCHC) has been continuously surveying the benthos of Tampa Bay since 1993. This dataset provides a unique opportunity for spatial modeling of benthic organisms in an estuarine system. We sought to conduct a meta-analysis using EPCHC data on *C. capitata* complex, *C. aciculata*, *C. jonesi*, *H. filiformis*, *M. ambiseta*, and *M. californiensis* (Figure 3.1) in this study. One goal of this study is to explore the data to understand spatial patterns inherent to each species. A second goal is to model environmental drivers of species abundance and ask whether there is one modeling strategy that works well for all species. Modeling is accomplished by comparing six different approaches: GAMs (Poisson, Negative Binomial, Tweedie, and Zero-Inflated Poisson distributions), Hurdle models, and BRTs. The third goal is to use Random Forest models (Breiman 2001), another classification and regression method, for environmental driver evaluation. These results can be used to inform future studies of benthic invertebrate spatial ecology in general as well as population genetics, speciation, phylogeography, and toxicology of capitellids in the Gulf of Mexico.

#### **3.2. Materials and Methods**

## **3.2.1. Data Collection**

The EPCHC has been collecting benthic samples throughout the bay since 1993 following a program designed by the Tampa Bay Estuary Program to monitor large changes throughout the bay using robust randomized sampling (Squires et al. 1994). Tampa Bay is divided into the seven segments of Hillsborough Bay (HB), Boca Ciega Bay (BCB), Terra Ceia Bay (TCB), Manatee River (MR), Lower Tampa Bay (LTB), Middle Tampa Bay (MTB), and Old Tampa Bay (OTB) (Figure 3.2). Hexagon grids are overlaid to further divide regions. Smaller hexagons are used in smaller regions (HB, BCB, TCB and MR) to increase the number of samples. A number of hexagons are randomly selected for sampling each year (July – October) and a random point is generated within each hexagon. The same general strategy has been followed even though some aspects of the design (number of samples, reporting period, etc.) have changed over time.



Figure 3.1: Light micrographs of Capitellidae species highlighting diagnostic characters. All specimens are from the Hillsborough County Environmental Protection Commission's samples and were photographed in-house. Capitellids are characterized by having thoracic and abdominal regions, with the number of thoracic chaetigers being the primary diagnostic for genera. The arrangement and type(s) of chaetae are also important. (a): *Capitella capitata* complex specimen at 4X magnification with capillary chaetae highlighted. (b): *Capitella aciculata* specimen at 40X magnification with acicular spine highlighted. Thoracic chaetigers 1-9 are labeled to differentiate thorax from abdomen. (c): *Mediomastus ambiseta* specimen at 4X magnification with abdominal capillary chaetae highlighted. (d): *Mediomastus californiensis* specimen at 40X with long abdominal hooded hooks highlighted.



Figure 3.2: Map of Tampa Bay. The seven bay segments are indicated by the pie charts of relative species frequency over all 23 years. Note that the only instance of no species occurrence is *Capitella aciculata* in Lower Tampa Bay. Map created using QGIS Desktop 3.0.2 and Inkscape 0.92.3. The Tampa Bay shapefile was sourced from the Florida Geographic Data Library.

Prior to 2007 there was a very large sampling effort with up to 134 samples collected in 1995 (Table 3.1). However, the effort was not consistent with as few as 78 samples collected in 2006 (Table 3.1). Substantially fewer samples have been collected per year since 2007 but the sampling effort has become more consistent by bay segment and overall, with about 44 samples collected per year (Table 3.1). This is also evidenced by the sample decimal ratio, which increases and becomes more consistent from 2007 onward (Table 3.1).

From 2007 onward MR+TCB and LTB+MTB were treated as single reporting units by EPCHC for the random sample selection (Table 3.1). We did not combine these bay regions for modeling and kept them as separate bay segment categories for consistency and to avoid added complexity. Despite the change in reporting units, the number of samples for each bay segment remained relatively constant (Table 3.1).

Infaunal samples are collected with a single benthic grab using a Young Modified Van Veen grab (0.04 m2), sifted through a 500 micron mesh sieve, and bulk preserved. A 10% formalin solution was used for preservation prior to 2012 and NOTOXhisto<sup>TM</sup> (Scientific Device Laboratory) has been used since. After 72+ hours, samples are washed and transferred to 70% isopropanol for storage and identification. Surface and bottom water quality (pH, temperature, dissolved oxygen, and salinity) and depth are recorded at time of collection. A sample is also collected for calculation of the silt/clay fraction. More sampling design details, including a map of the hexagon grids, are available in EPCHC's Benthic Report (Karlen et al. 2015).

Table 3.1: Number of samples collected by Bay Segment and Year. From 2007 onward, LTB+MTB and MR+TCB (samples boxed for both combinations) were treated as two, instead of four, reporting units for random sample selection. Additional samples were collected in 2010 in OTB for a special project (highlighted in grey). Decimal ratios were calculated by continuously dividing every number within a year by the number to its right; for a given year, the quotient of HB and OTB was divided by MTB, whose quotient was divided by LTB, and so on. A decimal ratio of 1 would indicate equal sampling effort across bay segments. Abbreviations follow those outlined in the Methods.

|      | HB | OTB | MTB | LTB | MR | TCB | BCB | Bay-Wide | Decimal<br>Ratio |
|------|----|-----|-----|-----|----|-----|-----|----------|------------------|
| 1993 | 19 | 17  | 20  | 17  | 11 | 7   | 0   | 91       |                  |
| 1994 | 19 | 17  | 20  | 17  | 10 | 7   | 0   | 90       |                  |
| 1995 | 29 | 23  | 21  | 22  | 11 | 7   | 21  | 134      | 9.71E-07         |
| 1996 | 27 | 15  | 24  | 24  | 13 | 8   | 21  | 132      | 1.13E-06         |
| 1997 | 22 | 16  | 22  | 21  | 13 | 8   | 21  | 123      | 1.24E-06         |
| 1998 | 26 | 16  | 20  | 17  | 13 | 7   | 21  | 120      | 1.07E-06         |
| 1999 | 23 | 19  | 21  | 19  | 13 | 8   | 21  | 124      | 9.48E-07         |
| 2000 | 22 | 19  | 23  | 17  | 13 | 8   | 27  | 129      | 6.30E-07         |
| 2001 | 25 | 18  | 26  | 12  | 9  | 5   | 23  | 118      | 9.91E-07         |
| 2002 | 25 | 8   | 21  | 9   | 7  | 4   | 9   | 83       | 8.50E-06         |
| 2003 | 28 | 9   | 22  | 12  | 7  | 3   | 10  | 91       | 1.03E-05         |
| 2004 | 25 | 9   | 22  | 11  | 10 | 1   | 10  | 88       | 2.22E-05         |
| 2005 | 24 | 10  | 22  | 11  | 6  | 5   | 10  | 88       | 6.94E-06         |
| 2006 | 24 | 8   | 19  | 8   | 5  | 5   | 9   | 78       | 9.75E-06         |
| 2007 | 9  | 7   | 7   | 1   | 5  | 4   | 10  | 43       | 1.41E-03         |

|      | HB | OTB | MTB | LTB | MR | TCB | BCB | Bay-Wide | Decimal<br>Ratio |
|------|----|-----|-----|-----|----|-----|-----|----------|------------------|
| 2008 | 9  | 7   | 5   | 3   | 6  | 3   | 11  | 44       | 1.28E-03         |
| 2009 | 9  | 7   | 6   | 2   | 5  | 4   | 11  | 44       | 1.28E-03         |
| 2010 | 9  | 22  | 5   | 3   | 5  | 4   | 11  | 59       | 4.08E-04         |
| 2011 | 9  | 7   | 5   | 3   | 7  | 2   | 11  | 44       | 1.28E-03         |
| 2012 | 9  | 7   | 5   | 3   | 7  | 2   | 11  | 44       | 1.28E-03         |
| 2013 | 9  | 6   | 5   | 3   | 6  | 3   | 11  | 43       | 1.50E-03         |
| 2014 | 9  | 7   | 5   | 3   | 5  | 4   | 11  | 44       | 1.28E-03         |
| 2015 | 9  | 7   | 5   | 3   | 6  | 3   | 11  | 44       | 1.28E-03         |

Table 3.1 Continued

### 3.2.2. Database Acquisition and Filtering

The EPCHC maintains a Microsoft Access database on an FTP site (ftp://ftp.epchc.org/EPC\_ERM\_FTP/Benthic\_Monitoring/). "EPC DataSubmittals\_####.zip" is the relevant file and contains all data from 1993 through present. Data used in this study span 1993 to 2015 and were downloaded in December 2017. Species identifications were performed by different agencies using the most current identification literature at the time. The EPCHC is continually verifying identifications and posting data updates. Therefore, minor changes to our dataset have occurred since we completed the analyses and will continue to occur as specimens are re-examined.

The two relevant tables within the database are "Biology", with records of species abundance data, and "DataSpreadsheet", with all details related to field work and the measured environmental variables. These tables were joined and filtered for bottom measurements, year, hexagon ID, station number ID, latitude, longitude, and absolute abundance (Number/0.04m2) of *Capitella capitata* complex (hereafter *C. capitata*), *C. aciculata*, *C. jonesi*, *Heteromastus filiformis*, *Mediomastus ambiseta*, *M. californiensis*, and all other Capitellidae entries. The final data frame for modeling consisted of 1788 observations of the six listed species' abundance data, latitude, longitude, bay segment, year, temperature (°C), salinity (psu), pH, dissolved oxygen (mg/L), silt clay fraction, and depth (meters).

### **3.2.3. Spatial Statistics**

Unless otherwise stated, all analyses were performed with R, version 3.4.4 (R Core Team 2018) and all graphics were generated with base-R graphics and the package ggplot2 (Wickham 2009). Inkscape was used to further modify figures for final presentation.

Spatial patterns were explored for data description and to inform statistical model construction. Species constancy (presence in samples) and dominance (proportion of total abundance) were calculated (Carmo et al. 2013). Constancy is a percent calculated as: C =(p\*100)/N, where p is the number of samples the species was present in and N is the total number of samples. Categories include  $C \ge 50\%$ , Constant; C = 25 - 50%, Accessory; and  $C \le 25\%$ , Rare. Dominance is also a percent calculated as: D = (i/t)\*100, where i is the species of interest's abundance and t is total abundance. Categories include  $D \ge 10\%$ , Eudominant; D = 5 - 10%, Dominant; D = 2 - 5%, Subdominant; D = 1 - 2%, Recessive; and  $D \le 1\%$ , Rare. Pie charts of species dominance were plotted and overlaid onto a map of Tampa Bay to illustrate the seven regions relative species dominance (Figure 3.2). To assess abundance as a function of space, Lorenz curves (Lorenz 1905, Burt et al. 2009), a graphical way to assess equality, were manually fit and overlaid with violin plots for each species as a function of bay segment. Abundance was averaged by bay segment for Lorenz curves to account for unequal sample sizes. A table was generated to assess variation in sampling spatially and temporally. Local Indicator of Spatial Association (LISA), or the Local Moran's I (Anselin 1995), was calculated and plotted using the software GeoDa (Anselin et al. 2006). The K-Nearest Neighbors method was used to define neighborhoods with five neighbors (six total including the sample being considered). GeoDa was also used to generate bubble plots of species abundance.

Species abundance structures were assessed for overdispersion by comparing their mean and sample variances. When variance equals mean, a Poisson model is appropriate. Overdispersion is present when the variance is larger than the mean and indicates that another distribution may be more appropriate. This was also assessed by a likelihood-ratio test between Poisson and Negative Binomial models using the r-package lmtest, version 0.9-36 (Zeileis & Hothorn 2002). Zero-inflation of species abundance was assessed by visualization with violin plots using the r-package vioplot (Adler 2005).

# 3.2.4. Species Abundance Modeling

GAMs were fit for each species using all terms as covariates with r-package mgcv, version 1.8-23 (Wood 2011, Wood et al. 2016, Wood 2017). To not assume a linear relationship between each predictor and the response, a smoothing function was applied to all continuous covariates to generate a data-driven structure. Instead of using Year as a categorical term, the covariate "Total Samples/Year" was calculated and used to determine if species abundance is a function of sampling effort. The models took the form of: Species  $\sim$  s(Temperature) + s(Salinity) + s(pH) + s(Dissolved Oxygen) + s(Depth) + s(Silt Clay Fraction) + s(Total Samples/Year) + Bay Segment. All GAMs were fit using the "REML" smoothing method and a logarithmic link function. The only exception is that the Zero-Inflated Poisson distribution models had to be fit with an identity link function.

The Hurdle model was fit using r-package pscl, version 1.5.2 (Zeileis et al. 2008, Jackman 2017) with all covariates in the binomial and negative binomial parts of the model. Link functions used were logarithmic for the negative binomial model and logit for the binomial model. BRTs were fit by first using the 'gbm.step' function (available in the supplementary materials of Elith et al. 2008, used for this study, and the dismo r-package) to determine an optimal number of trees. A seed of 37 was set to permit reproducibility, a Poisson distribution was used for the response, tree complexity (or interaction depth) was set to one to not allow any interactions, bag fraction was 0.5, and learning rate (or shrinkage) was started at 0.01 and adjusted until an optimal tree count of at least 1,000 was reached (Elith et al. 2008). An exception was that *C. aciculata* was fit with a bag fraction of 1.0 due to algorithm convergence problems.

All models had static structure; all terms were used in every model with no term selection procedure or term interactions. This is because the goal was to assess model specification "out-of-the-box" and not refine any particular model to optimize its fit. Predictor significance was assessed at alpha of 0.05 for all models except for BRTs, for which the relative influence of each term is estimated (Friedman 2001, Friedman & Meulman 2003). Significance of bay segment in Hurdle models was assessed with a likelihood ratio test (r-package lmtest), resulting in a single significance value for the entire model.

Model evaluation and selection of a "best" model was completed by testing internal predictive performance, comparing the model's predicted values against the observed values. Statistics used were the Pearson correlation coefficient, Spearman rank correlation, root mean square error (RMSE), average (mean absolute) error (AVE), slope, and intercept (Potts & Elith 2006). We also followed the methods of Potts and Elith (2006) to correct the calibration statistics by estimating bias using the 0.632+ bootstrap method (Efron & Tibshirani 1997, Steyerberg et al. 2001) with 200 iterations. R-code was sourced from the online supplementary material of Zuur et al. (2009) and modified to shorten processing time.

A data set with as many zeros as *C. aciculata* (16 records of presence, data not shown), especially an entire bay segment with all zeros (LTB), presented unique problems. Algorithm convergence failures and matrix singularities were routinely encountered and required more exploration of model parameterization to resolve this issue. A consequence

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is that we could not use the 0.632+ bootstrap corrections and had to remove bay segment. Instead of removing bay segment from analyses, removing LTB samples would have also worked. We instead chose to keep LTB samples for their information in other cofactors. Another consequence is that stochasticity could not be included in the BRT and bag fraction had to be fixed at 1.0. These problems are not unrelated as bootstrapping for estimate correction and introducing stochasticity into the BRT both require subsampling the data frame. Limited presence records for *C. aciculata* results in a higher (1.05x10^-7) probability of a data frame with all zeros being built. In comparison, *C. capitata* has a 2.87x10^-141 probability of this happening.

#### **3.2.5. Environmental Factors**

Analyses for this section were performed with R, version 3.6.0 (R Core Team 2019). Random forest models were built to assess environmental drivers of species abundance independent of the model specification comparisons. We have allowed interactions in the random forest as our goal is not to compare this to the other model specifications but use it to understand environmental driver importance, and inclusion of interactions can aid this. As total samples/year is not an environmental term, it was not included in this analysis. We specifically used conditional random forests because they reduce variable-selection bias due to differences in variable types and structures (Strobl et al. 2009). Models were fit with r-package party, version 1.3-3 (Hothorn et al. 2006, Strobl et al. 2007,2008) and r-package caret, version 6.0-85 (Kuhn et al. 2020). Plots of variable importance were created.

In the interest of space, we chose to only assess the relationship between each species and its most important variable. Accumulated local effects (ALE) plots (Apley and

Zhu 2016) were generated using r-package iml, version 0.9.0 (Molnar et al. 2018). ALE plots average the effects of a factor on model predictions while holding all other factors constant. Changes in model predictions are averaged in windows, measuring local effects. This approach avoids data extrapolation that can lead to bias when predictors are correlated. See Molnar (2019) for further reading.

#### 3.3. Results

# **3.3.1. Spatial Statistics**

Constancy and dominance of the six species are variable throughout all bay segments. *Capitella capitata* was most dominant overall (D = 33.60%) (Table 3.2). *C. aciculata* was the least dominant overall at 2.72% (Table 3.2) and was not found at all in LTB. Its peak dominance was in OTB where it comprised 9.97% of abundance (Figure 3.2 and Table 3.2). *C. jonesi* also occurred in a small portion of the samples (C = 5.22%) but was found throughout the bay with dominance ranging 0.84 - 4.63% (Figure 3.2 and Table 3.2). *C. capitata* and *Mediomastus* spp. were the most constant throughout the bay and had dominance that ranged anywhere from 4.6 to 71.48% of species abundance (Figure 3.2 and Table 3.2). *Heteromastus filiformis* has dominance throughout the bay at 3.88 - 11.87% but is its most dominant in BCB (D = 36%) (Figure 3.2 and Table 3.2).

|                   | TOTAL |       |       | HB   |       |       |
|-------------------|-------|-------|-------|------|-------|-------|
|                   | N     | С     | D     | Ν    | С     | D     |
| <br>C. capitata   | 2760  | 16.56 | 33.34 | 1082 | 20.54 | 38.99 |
| C. aciculata      | 233   | 0.90  | 2.81  | 44   | 0.74  | 1.59  |
| C. jonesi         | 250   | 5.32  | 3.02  | 129  | 6.44  | 4.65  |
| H. filiformis     | 949   | 8.45  | 11.46 | 108  | 7.43  | 3.89  |
| M. ambiseta       | 2706  | 13.21 | 32.69 | 1286 | 12.62 | 46.34 |
| M. californiensis | 1381  | 11.81 | 16.68 | 126  | 3.22  | 4.54  |

Table 3.2: Abundance (N), constancy (C), and dominance (D) overall and by Bay Segment per *Capitella, Heteromastus,* and *Mediomastus*. Abbreviations follow those outlined in the Methods.

| OTB |       |       | MTB |       |       |
|-----|-------|-------|-----|-------|-------|
| N   | С     | D     | N   | С     | D     |
| 618 | 18.08 | 42.13 | 392 | 9.50  | 39.60 |
| 147 | 1.48  | 10.02 | 1   | 0.30  | 0.10  |
| 23  | 5.90  | 1.57  | 35  | 5.34  | 3.54  |
| 175 | 11.07 | 11.93 | 41  | 5.93  | 4.14  |
| 176 | 12.92 | 12.00 | 154 | 6.23  | 15.56 |
| 328 | 9.59  | 22.36 | 367 | 13.35 | 37.07 |

# Table 3.2 Continued

| LTB |       |       | MR  |       |       |
|-----|-------|-------|-----|-------|-------|
| Ν   | С     | D     | N   | С     | D     |
| 66  | 10.05 | 13.23 | 65  | 9.47  | 8.16  |
| 0   | 0.00  | 0.00  | 1   | 0.59  | 0.13  |
| 6   | 2.28  | 1.20  | 6   | 1.18  | 0.75  |
| 41  | 3.20  | 8.22  | 27  | 7.10  | 3.39  |
| 159 | 10.05 | 31.86 | 583 | 23.67 | 73.15 |
| 227 | 23.74 | 45.49 | 115 | 11.24 | 14.43 |

| TCB |       |       | BCB |       |       |
|-----|-------|-------|-----|-------|-------|
| N   | С     | D     | N   | С     | D     |
| 111 | 18.48 | 27.21 | 426 | 26.10 | 31.72 |
| 3   | 1.09  | 0.74  | 37  | 2.03  | 2.76  |
| 7   | 5.43  | 1.72  | 44  | 7.80  | 3.28  |
| 44  | 9.78  | 10.78 | 513 | 14.58 | 38.20 |
| 157 | 20.65 | 38.48 | 191 | 16.27 | 14.22 |
| 86  | 18.48 | 21.08 | 132 | 13.22 | 9.83  |

Species abundance distributions indicate that there is zero-inflation for all species (Figure 3.3). There is also evidence of statistical overdispersion, indicating that distributions other than Poisson are appropriate (Table 3.3). Comparing GAM-Poisson and GAM-Negative Binomial models with a likelihood ratio test indicates that a Negative Binomial distribution describes all species better (Table 3.4). These results led to use of a Negative Binomial distribution for the Hurdle model.



Figure 3.3: Violin plots of species abundance. The white points represent the median of each range. Abbreviations: C.cap=*Capitella capitata*; C.acic=*Capitella aciculata*; C.jon=*Capitella jonesi*; H.fili=*Heteromastus filiformis*; M.amb=*Mediomastus ambiseta*; M.cal=*Mediomastus californiensis*.

|                   | Variance | Mean |
|-------------------|----------|------|
| C. capitata       | 65.13    | 1.54 |
| C. aciculata      | 7.38     | 0.13 |
| C. jonesi         | 2.15     | 0.13 |
| H. filiformis     | 13.01    | 0.53 |
| M. ambiseta       | 126.45   | 1.51 |
| M. californiensis | 21.47    | 0.77 |

Table 3.3: The variance and mean of each species abundance.

Table 3.4: The likelihood ratio test results from comparing the GAM-Poisson and GAM-Negative Binomial models for each species. Significance at  $\alpha$  of 0.05 indicates a better fit of the GAM-Negative Binomial model.

|                   | Chi Squara | Degrees of | n value  |  |
|-------------------|------------|------------|----------|--|
|                   | Cin-Square | Freedom    | P fulle  |  |
| C. capitata       | 5970.7     | 33.564     | <2.2E-16 |  |
| C. aciculata      | 53.749     | 35.572     | 0.02885  |  |
| C. jonesi         | 363.24     | 38.151     | <2.2E-16 |  |
| H. filiformis     | 1337.5     | 34.464     | <2.2E-16 |  |
| M. ambiseta       | 5387.6     | 36.59      | <2.2E-16 |  |
| M. californiensis | 3972.6     | 36.034     | <2.2E-16 |  |

The Lorenz curves illustrate zero inflation and spatial autocorrelation (Figure 3.4). The violin plots for every species have a similar shape to those in Figure 3.3, indicating zero inflation. Spatial autocorrelation is indicated by steep and changing slopes in the Lorenz curves. For example, the violin plot for *H. filiformis* (Figure 3.4d) at BCB shows a very large abundance and the steep slope between LTB and BCB indicates that BCB has a large portion, or unequal share, of all *H. filiformis* abundance in Tampa Bay. A contrasting example is *M. californiensis* (Figure 3.4f) whose violin plots appear more equal and Lorenz curve is closer to the line of equal distribution. However, all species show some degree of spatial autocorrelation.

Looking at bubble plots of abundance and LISA plots, organized by bay segment (Figure 3.5), there is evidence of spatial autocorrelation. For example, LISA plots show that areas of species' presence often result in significantly autocorrelated neighborhoods (Figure 3.5). There is also a pattern of species' presence near-shore with few occurrences in the open-water areas of the bay (Figure 3.5).


Figure 3.4: Violin plots of species abundance by Bay Segment, ordered by increasing average abundance. Lorenz curves of the cumulative proportion of averaged species abundance are overlaid. The different colored lines correspond to each species unique distribution and the black lines are a representation of a species with abundance equally distributed among Bay Segments. Note that "Species Abundance" scale varies between graphs.





MTB

Not Significant (214)
 High-High (2)
 Low-Low (1594)

Low-High (74) High-Low (14)

assessed at alpha = 0.05. Neighborhoods were defined by the five nearest heighbors. Interpretation: a significant high-high correlation indicates that the sample has a high value and is neighbored by other samples with high values. Raw figures generated with GeoDa (Anselin, Syabri, and Kho 2006) and further modified with Inkscape 0.92.3.





**Figure 3.5 Continued** 





**Figure 3.5 Continued** 

# 3.3.2. Species Abundance Modeling

The 0.632+ bootstrap to correct model optimism was applied to every species except C. aciculata. A problem with matrix singularity was encountered during the 0.632+ bootstrap processes and apparent (non-adjusted) statistics of the model fits are presented for this species. Model calibration can be assessed with the slope and intercept (observed count ~ predicted count) (Figure 3.6, Table A.1) (Potts & Elith 2006). It is clear that there is a lot of variation within and between species. All models had a bias (intercept) within ±1.0 except BRT, C. aciculata; GAM-Zero-Inflated Poisson, C. capitata; and Hurdle, M. *ambiseta*. The consistency/spread (slope) was more variable (Figure 3.6, Table A.1). The models considered best calibrated for each species are: Hurdle, C. capitata (m = 0.95, b =0.04); GAM-Poisson, C. aciculata (m = 1.01, b = 0.00); GAM-Tweedie, C. jonesi (m = 0.97, b = 0.01); Hurdle, H. filiformis (m = 1.01, b = -0.01); GAM- Negative Binomial, M. *ambiseta* (m = 0.98, b = 0.26); and GAM-Tweedie, *M. californiensis* (m = 0.94, b = 0.07) (Figure 3.6, Table A.1). This calibration is reflected in both correlation values, with the best calibrated models generally having the highest, or near highest, values (Figure 3.7, Table A.1). It is also corroborated by the RMSE and AVE values, with selected models having the lowest or relatively low values (Figure 3.7, Table A.1).



Figure 3.6: Plots of the slope and intercept for all models using values from Table A1. The axes are unitless as only slope and intercept were used for plot generation. However, the y-axis represents the observed count and x-axis the predicted count (Potts and Elith 2006). \*\*Indicates that the biased, apparent values are used.



Figure 3.7: Plots of measures of correlation and error between observed and predicted values for all models using values from Table A1. Outlying values were not plotted for root mean square error and average error for visualization purposes. Excluded points are highlighted in Table A1. \*\*Indicates that the biased, apparent values are used.

# **3.3.3. Environmental Factors**

Significance was assessed at alpha 0.05 for all models (Figure 3.8) except for BRTs for which the relative influence of each term is estimated (Friedman 2001, Friedman & Meulman 2003) (Figure A.1).GAM-Poisson and -Zero Inflated Poisson models found all terms significant for every species except for salinity|*H. filiformis* (Figure 3.8). Bay segment was found significant for every species/model combination. Depth was found significant for every best-

calibrated model. Total samples had the next overall significance with every species/bestcalibrated model combination returning it as significant except for *C. jonesi* (Figure 3.8). This is generally corroborated by the BRTs for which depth or bay segment are within the top two influential terms for most species. The exceptions are *C. aciculata*, which had pH as the only term that influences abundance, and *H. filiformis*, which had depth third but still of strong influence (Figure A.1).

| <u>Model Key</u>   |       |          |    |                     |                       |       |                  |                |
|--|-------|----------|----|---------------------|-----------------------|-------|------------------|----------------|
| GAM-Zero Inflated Poisson<br>GAM-Tweedie — 1 Count<br>GAM-Poisson Zero Hurdle<br>GAM-Negative Binomial |       |          |    |                     |                       |       |                  |                |
|  | Temp. | Salinity | рН | Dissolved<br>Oxygen | Silt-Clay<br>Fraction | Depth | Total<br>Samples | Bay<br>Segment |
| Capitella capitata   |       |          |    |                     |                       |       |                  |                |
| Capitella aciculata  |       |          |    |                     |                       |       |                  | +++++++        |
| Capitella jonesi   |       |          |    |                     |                       |       |                  |                |
| Heteromastus<br>filiformis   |       |          |    |                     |                       |       |                  |                |
| Mediomastus<br>ambiseta  |       |          |    |                     |                       |       |                  |                |
| Mediomastus<br>californiensis  |       |          |    |                     |                       |       |                  |                |

Figure 3.8: A table graph of term significance for all data-based models. There is a key at the top. If the term was significant (alpha = 0.05) for a given species/model combination, that block was colored. All colors correspond to those used for the models in Figures 7 and 8. Notice that the count and zero (presence/absence) parts of the Hurdle model are separated for all terms except Bay Segment. Significance of Bay Segment was assessed for the Hurdle model as a whole using a likelihood-ratio test. Bay Segment was not investigated for *Capitella aciculata*. The model chosen as best calibrated for each species is highlighted with a bold block.

Random forest models indicated that bay segment and/or depth had 50+% importance for every species (Figure 3.9). Bay segment was most important for *C. aciculata*, *C. jonesi*, and *M. ambiseta* while depth was most important for *C. capitata* and *H. filiformis* (Figure 3.9). Dissolved oxygen was most important for *M. californiensis* (Figure 3.9). ALE plots for *C. capitata* and *H. filiformis* indicate a negative relationship of species abundance and depth; higher species abundances are found at shallower depths (<1.9 m and <1.0 m, respectively) (Figure 3.10). Species with bay segment being most important have ALE plots (Figure 3.10) that reflect patterns of spatial autocorrelation observed in Lorenz curves (Figure 3.4). For example, the Lorenz curve for *C. jonesi* indicates a large portion of species abundance in HB and the ALE plot shows a large positive effect of HB. *M. californiensis* has a somewhat sigmoidal relationship with dissolved oxygen, with a large increase in abundance between ~4.4 – 7.5 mg/L (Figure 3.10).







Figure 3.10: Accumulated Local Effects (ALE) plots of terms with top variable importance for each species. ALE scores are interpreted as the difference between the model prediction (at a given instance of x) and the averaged model prediction. Continuous predictors include a rug plot on the x-axis for visualizing observation density. Abbreviations of bay segments and term units are described in the Methods.

# **3.4.** Discussion

Our results demonstrate presence of spatial autocorrelation structured by bay

segment for capitellids and variation in model specification across species. Using Lorenz

curves in conjunction with violin plots demonstrated an effective way to assess this and

overall species abundance structure across different regions of a large area. Interpretation of Lorenz curves is that the further the curve is from the line of perfect equality, the more unequally distributed the species is. One difference from standard Lorenz curves is that ours do not meet the line of equality at the origin. This is because we are using an x-axis with categories that are all assumed to have some abundance in the case of perfect equality. The curve's slope allows for quick assessment of autocorrelation; given a steep slope between two regions, it can be inferred that the region with greater averaged abundance has, proportionally, more of the total species abundance in the entire bay. Some apparent examples are OTB for *Capitella aciculata*, BCB for *Heteromastus filiformis*, and TCB for *Mediomastus ambiseta* (Figure 3.4). Additionally, the slope of the curve to each bay segment reflects the magnitude of effect that bay segment has in ALE plots (results not shown).

Bubble plots of species abundance and LISA plots confirm autocorrelation indicated by Lorenz curves (Figures 3.5). It is important to keep in mind that the small details do not matter much when interpreting the LISA plots as this dataset was collected with large scale patterns in mind. Therefore, what is important is whether or not bay segments appear significantly autocorrelated overall; the fact that one neighborhood is significant and a neighboring group is not has little interpretation because the sampling strategy is not appropriate for such comparisons. For example, *H. filiformis* abundance in BCB (Figure 3.5) has an apparent clustering clear in the bubble plot. LISA plots show several neighborhoods with High-High (high values surrounded by other high values) and Low-High LISA scores (Figure 3.5).

The zero-inflatedness of every species is not surprising. Benthic infaunal invertebrates, especially estuarine polychaetes, are known for having patchy spatial distributions, often associated with grain size or organic matter/food (Warren 1977, James & Gibson 1980, Ansari et al. 1986, Kalejta & Hockey 1991, Sanchez-Moyano & García-Asencio 2009). Larval settlement patterns are sometimes attributed to the presence of conspecific adults (Osman & Whitlatch 1995, Snelgrove et al. 2001), chemical cues in sediment (Qian 1999), and/or subjection to near-bottom flow dynamics, with active selection during passive flow (Butman 1986, 1989, Butman & Grassle 1992, Snelgrove et al. 1993). The presence of some bacteria and their metabolites has even been attributed to inducing larval settlement (Harder et al. 2002, Lau et al. 2003, Chung et al. 2010). Capitella are among the better studied marine invertebrates (Grassle & Grassle 1976, Blake et al. 2009, Seaver 2016). One of the cryptic species discovered by Grassle and Grassle (1976) has since been formally described as C. teleta (Blake et al. 2009) and has been the subject of several studies on larval settlement (Dubilier 1988, Grassle et al. 1992, Hill & Nelson 1992, Thiyagarajan et al. 2005, Biggers et al. 2012, Burns et al. 2014). There are limited studies on the other genera considered (Hannan 1984, Snelgrove 1994).

Although not considered the best-calibrated model for every species, GAM-Tweedie and/or Hurdle models have intercepts closest to, or near, the origin for all species, indicating low bias in their calibration. One of the two was considered best-calibrated for *C. capitata*, *C. jonesi*, *H. filiformis*, and *M. californiensis* (Table A.1). *C. aciculata* and *M. ambiseta* have GAM-Tweedie slopes within  $\pm 0.3$  (Table A.1). This is an indication that although these two models may not be deemed the best fit in all cases, they are reasonably calibrated and could be considered a good starting point. The overall high performance of GAM-Tweedie and Hurdle models may be attributable to their ability to handle the excess zeros in unique ways. Hurdle models have been specifically used for rare species count data (Cunningham and Lindenmayer 2005). This approach splits the dataset into a binary version (presence/absence) and a zero-truncated abundance version. assuming that processes driving presence/absence are separate from those driving abundance (Cragg 1971, Zuur et al. 2009). All other methods keep the dataset whole and assume the processes driving zero-inflation are also driving abundance. A Tweedie distribution allows more flexibility for the species abundance distribution's shape, as this is determined by a power term (p) in the variance function (e.g. p=1 is the Poisson distribution) (Jørgensen 1987). The mgcv r-package has the option to estimate the power term during model fitting, resulting in an automated distribution choice that may fit the data better than the standard Poisson or Negative Binomial distributions.

BRT models have shown equal (Martínez-Rincón et al. 2012) and better (França and Cabral 2015) performance compared to GAMs. Our results indicate better performance of GAMs. This is likely due to the "stump model" restriction (not allowing any interactions), as a key benefit of a BRT is that it can handle very complex interactions that are not possible in the data-based models (De'ath 2007, Elith et al. 2008). It is likely that a well-built BRT could perform just as well as, if not better than, the GAM-Tweedie and Hurdle models. See Elith et al. (2008) for a guide to assembling BRT models and further references on the topic.

General location within a bay and sampling effort are expected to affect how many worms are collected, so the overall significance of bay segment and total samples is not surprising. What was unexpected was the significance of depth, as Tampa Bay is only 4m deep on average (Morrison & Yates 2011). This is not a result of collinearity as standard measures (augmented pairs plots and variance inflation factor values) did not reveal any collinearity among environmental factors (results not shown). Relationships of species abundance and diversity with depth are complex (Houston & Haedrich 1984, Paterson & Lambshead 1995, Sibaja-Cordero et al. 2012). Studies focused on depth gradients in shallow estuarine systems would be useful to better understand this relationship.

We recognize that these data may be confounded by presence of cryptic species. There is little known about how many species comprise the *C. capitata* complex in Tampa Bay, but recent work indicates at least three distinct genetic lineages (Section 2 of this dissertation). It is also possible that *C. aciculata* may not be a distinct species and is part of a *C. capitata* complex lineage (Hilliard et al. 2016). Preliminary work on *H. filiformis* in the Gulf of Mexico indicates the presence of distinct genetic lineages world-wide and likely the presence of another species complex in Capitellidae (JH, pers. obs.). While there has been no work on genetic lineages of *M. ambiseta* and *M. californiensis*, it can be hypothesized that they are also species complexes due to their large geographic range (Blake 2008) and the emerging patterns in *Capitella*. This is, unfortunately, a factor that we cannot control or account for at this time. However, these results still further our general understanding of capitellid ecology.

We have shown that, despite filling a similar ecological niche (burrowing deposit feeders), there is not one model optimal for every species. Much consideration should be given to a taxon's biology, especially the shape of its distribution in the area of interest, and the structure of the data frame (e.g., sampling design and scale). For example, *C. aciculata* was especially zero-inflated and this required more exploration of model

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parameterization. This highlights the complex biology of capitellids, as the extreme zeroinflation may be due to this species truly being rare. It may also be that *C. aciculata* is not a unique species (Hilliard et al. 2016) and the records should be combined with *C. capitata* complex until there is further resolution of species boundaries. Consideration of the data structure and the sampling scale and design indicated that spatial autocorrelation needed accounted for on a bay-scale and comparisons at smaller scales were not appropriate. Taking an approach similar to the one presented here allows for systematic comparison of several modeling strategies at once. The model(s) considered best can then be refined. In the case of a benthic infaunal marine invertebrate with zero-inflated presence/absence records, Hurdle and GAM-Tweedie models may be a good place to start if resources are limited.

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# 4. ANALYSIS OF ANNELID TRANSCRIPTOMES AND GENOMES REVEALS HIGH DIVERSITY OF THE OXYGEN SENSING TRANSCRIPTION FACTOR HYPOXIA INDUCIBLE FACTOR (HIF)

#### **4.1. Introduction**

Oxygen shapes the composition and functioning of most biological communities. Throughout geological time, hyperoxic conditions have led to bursts of diversification (Graham et al. 1995; Berner et al. 2007) and gigantism (Dudley 1998) whereas hypoxia generally leads to the opposite effects (Levin 2003; Heinrich et al. 2011; Friedrich et al. 2014). In marine and estuarine environments, oxygen levels can vary greatly spatially and temporally. Hypoxia zones are natural phenomena, occurring in oxygen minimum zones, enclosed basins or semi-enclosed fjords, but can be exacerbated by anthropogenic activities, in extreme cases leading to "dead zones" (Rabalais et al. 2002; Díaz and Rosenberg 2008). Hypoxia is generally defined as dissolved oxygen (DO) levels below 2 ml O<sub>2</sub>/l (Díaz and Rosenberg 1995). This degree of oxygen depletion can lead to severely diminished diversity and biomass, especially when combined with other environmental stressors such as warming temperatures and acidification (Pörtner et al. 2005; Rosa and Seibel 2008; Melzner et al. 2013; Rosa et al. 2013). The threshold value of 2 ml  $O_2/l$  is somewhat arbitrary, as different organisms exhibit different sensitivities to diminishing O<sub>2</sub> and the viability and fitness of an organism are often negatively affected at only slightly decreased  $O_2$  levels well above the 2 ml  $O_2/l$  threshold (Vaquer-Sunyer and Duarte 2008).

The phylum Annelida comprises a large diversity of species inhabiting terrestrial, freshwater and marine habitats. Polychaetes are a subset of annelids which form an

important component of marine benthic communities. Many species survive or even thrive under low oxygen or hypoxia and can tolerate significant fluctuations in DO levels by sophisticated mechanisms for maximizing oxygen uptake, transport and delivery (Kristensen 1983, Hourdez and Lallier 2007, Qu et al. 2015). However, it is not well studied how they sense DO levels and how the physiological coping mechanisms are activated.

Due to its relevance for physiology and medicine, oxygen sensing is well studied in humans and other vertebrates, and to some degree in invertebrate models such as *Drosophila* (Nambu et al. 1996), *Caenorhabditis* (Epstein et al. 2001; Jiang et al. 2001), and even the simple *Trichoplax adhaerens* (Leonarz et al. 2011). In all of these vastly divergent species, the physiological response to low oxygen is triggered by molecular cascades in which Hypoxia Inducible Factors (HIFs) play a key role. HIFs are heterodimeric transcription factors with a basic helix-loop-helix (bHLH) motif which trigger cellular responses to low oxygen (Wang et al. 1995). Under normoxic conditions, one of the subunits, HIF $\alpha$ , is hydroxylated at two proline residues by the enzymes HIF proline hydroxylase (PHD) and Factor Inhibiting HIF1 (FIH1). Both PHD and FIH1 are oxygen dependent, but FIH1 remains functional under lower DO concentrations than PHD, and thus may be particularly important under moderate hypoxia (Kaelin Jr and Ratcliffe 2008).

Proline hydroxylation of HIFα promotes interaction with a cellular protein complex containing von Hippel-Lindau factor (vHL), eventually leading to proteasomal degradation (Kaelin Jr 2005). Under hypoxic conditions, the degradation is disrupted because PHD and FIH1 become non-functional. As a consequence, HIFα accumulates in the cytoplasm and

dimerizes with the stable subunit HIF $\beta$  (also known as Aryl Hydrocarbon Nuclear Translator, ARNT). The dimer translocates to the nucleus and acts as a transcription factor by binding to short Hypoxia Response Elements (HREs) in the genome, enhancing transcription of downstream genes. Thus, HIFs are only functional as transcription factors under hypoxic conditions.

Three HIF $\alpha$ s have been characterized in metazoans, but only HIF1 $\alpha$  and HIF2 $\alpha$ have been studied extensively (Kaelin Jr and Ratcliffe 2008). *Drosophila* and *Caenorhabditis* only have a single PHD family member, known as Eg19, whereas three PHDs occur in vertebrates (Kaelin Jr and Ratcliffe 2008). By comparison, very little is known about oxygen sensing in the third branch of bilaterians, the lophotrochozoans or spiralians. The only lophotrochozoan taxa studied to date in this respect are several species of molluscs, including two species of oysters (Piontkivska et al. 2011; Kawabe and Yokoyama 2012), a mussel (Giannetto et al. 2015) and an abalone (Cai et al. 2014). The above studies have characterized HIF $\alpha$ , HIF $\beta$ , and PHD in molluscs, but FIH1 has not been identified in any lophotrochozoan. It has primarily been characterized in vertebrates, as well as recently in a freshwater shrimp (Sun et al. 2016).

HIF $\alpha$  and ARNT are part of the basic helix-loop-helix-per-arnt-sim (bHLH+PAS) family, characterized by a bHLH and two PAS domains (Figure 4.1). Additionally, HIF $\alpha$ has two transactivation domains, a c-terminal (CTAD) and n-terminal (NTAD) (Figure 4.1). CTAD contains an asparagine residue that is hydroxylated under normoxia and binds to the p300 transcription coactivator under hypoxia (Lando et al. 2002). NTAD confers target gene binding specificity (Hu et al. 2007). There have been multiple studies on the evolution of the bHLH super family (Ledent et al. 2002, Simionato et al. 2007) as well as the bHLH+PAS gene family within it (Yan et al. 2014, Graham and Presnell 2017). These studies focused on identifying overarching patterns in metazoans, with hardly any representation of annelids (but see Simionato et al. 2007). This study aims to examine the diversity and evolution of the two subunits of the HIF transcription factor across the phylum Annelida. We expect to find high diversity of these genes as annelids range widely in their activity patterns and feeding modes (e.g. sessile passive filter feeders vs. highly motile predators) and occur in virtually all marine habitats, spanning well oxygenated to hypoxic conditions.



Figure 4.1: Illustration depicting the domain structure of hypoxia inducible factor with the basic helix-loop-helix, per-arnt-sim, n-terminal transactivation, and cterminal transactivation domains labeled. Aryl receptor nuclear transferase has the same arrangement but without the transactivation domains. Illustration created with Illustrator for Biological Sequences.

# 4.2. Materials and Methods

# 4.2.1. Public Data Sourcing and Transcriptome Assembly

Most data were retrieved from the NCBI Sequence Read Archive (SRA) using the

SRA Toolkit (Table 4.1). Raw SRA files were converted to FASTQ and split into paired

end sets. Trinity v2.5.1 (Grabherr et al. 2011; Haas et al. 2013) was used for transcriptome

assembly. Reads were quality-trimmed with the --trimmomatic option and normalized (i.e.

reads with > 50x representation were discarded). Transcriptomes for several other annelids and the outgroup were sourced from Kocot et al. (2017), where assemblies are provided. Predicted gene sets for *Capitella teleta* and *Helobdella robusta* genomes were sourced from EnsemblMetazoa (Yates et al. 2020).

#### 4.2.2. Capitella sp. TV RNA-Sequencing and Transcriptome Assembly

Material was sourced from a lab culture started with specimens from Galveston Bay, Texas. Total RNA was extracted from 50 metatrochophore larvae (Stage 9, Seaver et al. 2005) (two replicates of 25 larvae), two adult males, two adult females, and two adult hermaphrodites using TRIzol for extraction and Qiagen RNeasy for cleanup. TRIzol protocol differences: pestle (~25 twists) and 27 gauge syringe (~10 draws) used for homogenization; precipitation of RNA by adding 0.1volume 3M Na Acetate and 2.5volume 100% EtOH, inverting five times, and incubating at -80°C for 110 minutes; air dried RNA pellet for 20 minutes; and final elution in 107µl nuclease-free water. RNeasy protocol differences: all centrifugations were at 4°C; all 15sec centrifugations were for 30sec; the optional full speed centrifugation for 1min was run for 2min followed by leaving the sample in the centrifuge for 10min to dry the column better; a 57µl elution was performed to use 7µl for sample quantification and qualification and the remaining 50µl for library prep; and samples were stored at -80°C until used.

Sequencing libraries were prepared and sequenced by TAMU AgriLife. Illumina TruSeq RNA stranded libraries were prepared. Sequencing was conducted on an Illumina NovaSeq 6000. Illumina software (NCS v1.0.2 and RFV v1.0.2, default settings) were used for sequence cluster identification, quality prefiltering, base calling, and uncertainty assessment. NovaSeq basecall files were demultiplexed and converted to FASTQ using Illumina bcl2fastq2 v2.19.0. A single transcriptome for the species was assembled using all of the data following the same approach used for the public data.

# 4.2.3. Open Reading Frame (ORF) Prediction and Basic Local Alignment Tool (BLAST) Searches

ORFs were predicted for all transcriptomes and genomes using TransDecoder v3.01 (Haas & Papanicolaou et al. in prep) with default settings. Nucleotide BLAST databases were built with the predicted ORFs. Reference sequences were obtained from multiple sources (Satou et al. 2003, Simionato et al. 2007, Gyoja 2014, Fortunato et al. 2016, Graham and Presnell 2017). These were used as query sequences in tBLASTn searches to identify putative homologs. BLAST hits with E-Value ≤1E-06 were considered significant, filtered for unique headers, and converted to protein sequences for further analysis.

# 4.2.4. Gene Identification by Phylogenetic Analysis

Significant ORFs from both BLAST searches were concatenated with HIFα, SIM, NPAS1-4, ARNT(2), and ARNTL(2) sequences from Graham and Presnell (2017). Redundant sequences were removed with Jalview v2.11.0 (Warehouse et al. 2009) and MAFFT v7.266 (Katoh and Standley 2013) accurate local alignment was performed. The multiple sequence alignment was trimmed and again filtered for redundancy in Jalview. A maximum likelihood (ML) phylogeny was constructed with IQ-TREE v1.6.12 (Nguyen et al. 2015) with automatic model selection restricted to only amino acid nuclear models via ModelFinder (Kalyaanamoorthy et al. 2017). Branch support was determined using the SH-like approximate likelihood ratio test (SH-aLRT) (Guindon et al. 2010) and ultrafast bootstrap (UFBoot) (Minh et al. 2013). These two metrics have different interpretations from standard, nonparametric bootstrapping (Felsenstein 1985). See the above references and IQ-TREE manual for details. *Drosophila melanogaster* Hey gene (Simionato et al. 2007) was used as an outgroup. The tree was viewed using FigTree v1.4.4 (Rambaut 2012) to define HIF $\alpha$ and ARNT clades. Sequences were manually parsed out of the pre-alignment file for subsequent analyses.

## 4.2.5. Isoform Selection and Gene-Specific Phylogenetic Analyses

To represent each species with a single sequence in each phylogenetic tree, only one isoform can be used. Isoform selection was performed with IsoSel v1.0 (Philippon et al. 2017) with default settings and a species/gene identifier file (for automatic filtering of sequences). Multiple sequence alignments were built using MAFFT accurate local alignment. ML phylogenetic analyses were performed as above. *Crassostrea gigas* was used as an outgroup for both analyses.

# **4.2.6.** Domain Annotation

hmmsearch from HMMER v3.1b2 (Eddy 2009) was used to search Hidden Markov Model Profiles (HMMs) for different domains against the final HIFα and ARNT prealignment dataframes. HMMs downloaded from the Pfam database include helix-loophelix (HLH) (PF00010), per-arnt-sim (PAS) (PF00989), HIF N-terminal transactivation domain (NTAD) (HIF-1; PF11413), and HIF-1 alpha C terminal transactivation domain (CTAD) (PF08778).

Given the limited annelid representation in the HMMs, searches were conducted iteratively, updating the HMM with significant hits (E-value  $\leq 1e-5$ ) until the domain was found in all sequences or the search stopped returning significant hits. Significant domains

were extracted from sequences using hmmer3\_extract\_domains.pl

(https://github.com/amgraham07/HIF\_eukaryote) (Graham and Presnell 2017).

# 4.3. Results

# 4.3.1. BLAST Searches and Gene Identification by Phylogenetic Analysis

The final database had 72 annelid species and the outgroup *Crassostrea gigas*. A total of 69 HIF $\alpha$  and 51 ARNT sequences (available in a supplementary file) were used to query the annelid database. Before any reduction, the starting dataframe had 1965 sequences from BLAST searches and 180 annotated bHLHs. After trimming and removal of redundant sequences, the final alignment for analysis consisted of 542 sequences. HIF $\alpha$  and ARNT were recovered for 43 (58.9%) and 40 (54.8%) of the species in the database, respectively (Table 4.1). The black branches in Fig. 4.2 are annelid bHLH sequences which did not cluster with any of the known bHLH genes used and remain to be characterized.
| and and and the        |                |                  |                            |               |      |      |
|------------------------|----------------|------------------|----------------------------|---------------|------|------|
| SRA/Accession          | Major<br>Group | Family           | Species                    | Environment   | HIFα | ARNT |
| SRR5353284             | Sedentaria     | Acanthodrilidae  | Maoridrilus_wilkini        | terrestrial   |      |      |
| SRR1221445             | Sedentaria     | Acrocirridae     | Macrochaeta_clavicornis    | marine        |      |      |
| SRR3665377             | Sedentaria     | Alvinellidae     | Paralvinella_grasslei      | marine y      |      | у    |
| SRR5590961             | Sedentaria     | Ampharetidae     | Hypania_invalida           | freshwater    | у    | у    |
| SRR651044              | Basal          | Amphinomidae     | Hermodice_carunculata      | marine y      |      | у    |
| SRR1257732             | Basal          | Amphinomidae     | Paramphinome_jeffreysii    | marine        | у    |      |
| SRR5590965             | Sedentaria     | Apistobranchidae | Apistobranchus_tullbergi   | marine        |      |      |
| SRR2005653             | Sedentaria     | Arenicolidae     | Arenicola_marina           | marine        | у    | у    |
| THIS STUDY             | Sedentaria     | Capitellidae     | Capitella_sp_TV            | marine        | у    | у    |
| EnsemblMetazoa         | Sedentaria     | Capitellidae     | Capitella_teleta           | marine        | у    | у    |
| SRR1646443             | Basal          | Chaetopteridae   | Chaetopterus_sp            | marine        | у    | у    |
| SRR1219647             | Basal          | Chaetopteridae   | Chaetopterus_variopedatus  | marine        |      |      |
| SRR1257898             | Basal          | Chaetopteridae   | Phyllochaetopterus_sp      | marine        | у    | у    |
| SRR1224605             | Basal          | Chaetopteridae   | Spiochaetopterus_sp        | marine        | у    | у    |
| SRR5590966             | Sedentaria     | Cirratulidae     | Cirratulus_cirratus        | marine        | у    | у    |
| SRR2018886             | Sedentaria     | Dinophilidae     | Dinophilus_taeniatus       | marine        |      | у    |
| SRR2014693             | Sedentaria     | Dinophilidae     | Trilobodrilus_axi          | marine        |      | у    |
| SRR2014574             | Sedentaria     | Dinophilidae(?)  | Apharyngtus_punicus        | marine        |      |      |
| SRR2131612             | Sedentaria     | Diurodrilidae    | Diurodrilus_subterraneus   | marine        |      | у    |
| SRR2014681             | Errantia       | Dorvilleidae     | Protodorvillea_kefersteini | marine        |      |      |
| SRR2017645             | Sedentaria     | Echiura          | Bonellia_viridis           | marine        | у    | у    |
| SRR2040479             | Errantia       | Eunicidae        | Eunice_pennata             | marine        | у    | у    |
| SRR1232833             | Errantia       | Eunicidae        | Marphysa_bellii            | marine        | у    |      |
| SRR2017643             | Sedentaria     | Fauveliopsidae   | Fauveliopsis_sp            | marine        | у    | у    |
| SRR3574613             | Sedentaria     | Flabelligeridae  | Flabelligera_mundata       | marine        |      |      |
| EnsemblMetazoa         | Sedentaria     | Glossiphoniidae  | Helobdella_robusta         | freshwater    |      | у    |
| Kocot et al.<br>(2017) | Errantia       | Glyceridae       | Glycera_dibranchiata       | marine        |      |      |
| SRR1237870             | Errantia       | Glyceridae       | Glycera_tridactyla         | marine        |      |      |
| SRR4162952             | Sedentaria     | Haemadipsidae    | Haemadipsa_cavatuses       | terrestrial   | у    | у    |
| SRR4162958             | Sedentaria     | Haemopidae       | Whitmania_pigra            | freshwater y  |      | у    |
| SRR6371134             | Sedentaria     | Hirudinidae      | Hirudo_nipponica           | freshwater    |      | у    |
| SRR4162957             | Sedentaria     | Hirudinidae      | Poecilobdella_javanica     | freshwater y  |      | у    |
| SRR923752              | Sedentaria     | Lumbricidae      | Lumbricus_terrestris       | terrestrial y |      | у    |
| SRR1257639             | Basal          | Magelonidae      | Magelona_berkeleyi         | marine        |      |      |
| SRR1222290             | Basal          | Magelonidae      | Magelona_johnstoni         | marine y      |      | у    |
| Kocot et al.           | Sedentaria     | Maldanidae       | Clymenella_torquata        | marine        |      |      |
| Kocot et al.<br>(2017) |                | MOLLUSCA         | Crassostrea_gigas          |               | У    | У    |

Table 4.1: Species used in this study, NCBI SRA accession information for RNA Seq data, and whether HIF $\alpha$  and ARNT were found for them.

| SRA/Accession          | Major<br>Group | Family            | Species                      | Environment                   | HIFα | ARNT |
|------------------------|----------------|-------------------|------------------------------|-------------------------------|------|------|
| SRR1237872             | •              | Myzostomatidae    | Myzostoma_cirriferum         | marine                        | у    | у    |
| SRR1232795             | Errantia       | Nephtyidae        | Nephtys_caeca                | marine                        |      |      |
| Kocot et al.<br>(2017) | Errantia       | Nereididae        | Alitta_succinea              | Alitta_succinea marine        |      | у    |
| SRR1742987             | Errantia       | Nereididae        | Platynereis_dumerilii        | marine                        | у    | у    |
| SRR2014581             | Sedentaria     | Nerillidae        | Mesonerilla_fagei            | marine                        |      |      |
| SRR2017631             | Sedentaria     | Opheliidae        | Thoracophelia_mucronata      | marine                        | у    | у    |
| SRR1222216             | Sedentaria     | Orbiniidae        | Phylo_foetida                | marine                        |      |      |
| SRR1221444             | Sedentaria     | Orbiniidae        | Scoloplos_armiger            | marine                        |      |      |
| SRR1222288             | Basal          | Oweniidae         | Owenia_fusiformis            | marine                        | у    | у    |
| SRR2027869             | Sedentaria     | Parergodrilidae   | Stygocapitella_subterranea   | marine                        |      |      |
| SRR2057036             | Sedentaria     | Pectinariidae     | Pectinaria_gouldii           | marine                        |      | у    |
| Kocot et al.<br>(2017) | Basal          | Phascolosomatidae | Phascolosoma_agassizii       | marine                        | У    |      |
| SRR1231565             | Basal          | Phascolosomatidae | Phascolosoma_granulatum      | marine                        |      |      |
| SRR2016923             | Errantia       | Phyllodocidae     | Phyllodoce_medipapillata     | marine                        | у    | У    |
| SRR2014676             | Errantia       | Polygordiidae     | Polygordius_lacteus          | marine                        |      | у    |
| SRR1237766             | Errantia       | Polynoidae        | Harmothoe_extenuata          | armothoe_extenuata marine     |      | у    |
| SRR2014684             | Errantia       | Protodrilidae     | Protodrilus_adhaerens        | marine                        | у    |      |
| SRR2016233             | Errantia       | Protodriloidae    | Protodriloides_chaetifer     | marine                        | у    | у    |
| SRR2017810             | Sedentaria     | Sabellariidae     | Neosabellaria_cementarium    | mentarium marine              |      | у    |
| SRR1232634             | Sedentaria     | Sabellariidae     | Sabellaria_alveolata         | ata marine                    |      |      |
| SRR1231830             | Sedentaria     | Sabellidae        | Megalomma_vesiculosum        | n marine                      |      |      |
| SRR2005708             | Sedentaria     | Sabellidae        | Sabella_pavonina             | a_pavonina marine             |      |      |
| SRR2014689             | Errantia       | Saccocirridae     | Saccocirrus_burchelli        | marine                        | у    |      |
| SRR5590970             | Sedentaria     | Scalibregmatidae  | Scalibregma_inflatum         | marine                        | у    | У    |
| SRR516531              | Sedentaria     | Serpulidae        | Pomatoceros_lamarckii        | marine                        |      | У    |
| SRR3556248             | Sedentaria     | Siboglinidae      | Lamellibrachia_luymesi       | Lamellibrachia_luymesi marine |      |      |
| SRR3574382             | Sedentaria     | Siboglinidae      | Osedax_rubiplumus marine     |                               | У    | у    |
| SRR3560108             | Sedentaria     | Siboglinidae      | Sclerolinum_brattstromi      | marine                        |      |      |
| SRR3560206             | Sedentaria     | Siboglinidae      | Siboglinum_fiordicum         | m marine                      |      |      |
| SRR3571603             | Sedentaria     | Siboglinidae      | Spirobrachia_sp marine       |                               | у    |      |
| Kocot et al.<br>(2017) | Sedentaria     | Spionidae         | Boccardia_proboscidea marine |                               | у    |      |
| SRR1222145             | Sedentaria     | Spionidae         | Scolelepis_squamata          | marine                        |      |      |
| SRR2017800             | Sedentaria     | Sternaspidae      | Sternaspsis_affinis          | Sternaspsis_affinis marine y  |      | у    |
| SRR1224604             | Errantia       | Syllidae          | Syllis_sp                    | marine                        |      |      |
| SRR5590962             | Sedentaria     | Terebellidae      | Lanice_conchilega marine y   |                               | у    | У    |
| SRR1237767             | Errantia       | Tomopteridae      | Tomopteris_helgolandica      | marine                        |      |      |

 Table 4.1 Continued



Figure 4.2: Maximum likelihood phylogenetic tree of annotated bHLH genes (Graham and Presnell 2017) and extracted annelid and *Crassostrea gigas* sequences. Only support values for branches relevant to HIF $\alpha$  and ARNT identification are shown and they are in the format of SH-aLRT/UFBoot. The black branches are annelid sequences that did not have clear membership to one of the known clades (NPAS1/3, NPAS4, SIM, ARNTL(2), ARNT2).

### **4.3.2.** Gene-Specific Phylogenies

In the HIFα phylogenetic tree (Fig. 4.3), Clitellata is recovered with moderate support and Hirudinea is well supported (Figure 4.3). Families are well supported in cases of two or more species (Capitellidae, Chaetopteridae, Amphinomidae, Eunicidae, and Sabellidae) (Figure 4.3). A relationship between Capitellidae and Echiura is also well supported (Figure 4.3).

In the ARNT phylogenetic tree (Figure 4.4), families with two or more species (Nereididae, Chaetopteridae, Capitellidae, and Dinophilidae) are well supported (Figure 4.4). Most of Clitellata and Hirudinea form a well-supported clade (Figure 4.4), but two clitellates form a long branch close to the base of the tree (Figure 4.4). The relationship of Echiura with Capitellidae is poorly supported (Figure 4.4). Two notable clades that were mostly recovered are Sedentaria and Errantia/Basal groups. They are poorly supported and polyphyletic, but do reflect patterns in the known annelid phylogeny (Weigert and Bleidorn 2016) (Figure 4.4).

## **4.3.3.** Domain Annotation

All of the known domains of HIF $\alpha$  and ARNT were recovered within Annelida (Graham and Presnell 2017) (Figures 4.3 and 4.4). Ten of the HIF $\alpha$  sequences lacked the HLH domain (Figure 4.3) as did twelve of the ARNT sequences (Figure 4.4). The HLH HMM was updated until HLH was no longer found. PAS domains were recovered in every species but in eight of the HIF $\alpha$  sequences and 16 of the ARNT sequences, only a single PAS domain was present. The PAS HMM was updated until there was no improvement in the resulting hits with no indication of a second PAS domain in the relevant sequences. CTAD was only recovered in three HIF $\alpha$  sequences and NTAD was found in 18 of the sequences (Figure 4.3). Both of the transactivation domain HMMs were updated until they were no longer found in the remaining sequences.



Figure 4.3: Maximum likelihood phylogenetic tree of annelid HIFα genes. Branch support values are in the format of SH-aLRT/UFBoot. Presence of protein domains is indicated following the key in the top right corner.



Figure 4.4: Maximum likelihood phylogenetic tree of annelid ARNT genes. Branch support values are in the format of SH-aLRT/UFBoot. Presence of protein domains is indicated following the key in the top right corner.

## 4.4. Discussion

Our findings suggest that domain structure of HIFα and ARNT varies greatly across Annelida. Identification of these genes in annelids was only possible through phylogenetic analysis, as BLAST searches using reference sequences as queries were not specific enough and detected related other bHLH+PAS genes (ARNT2, ARNTL(2), SIM 1/2, and NPAS 1/3/4) beside the target genes.

It is likely that BLAST searches primarily captured the highly conserved PAS domains. For example, the first *hmmsearch* of the Pfam PAS HMM (with no annelids in the profile) returned 42 significant hits for HIF $\alpha$ . On the other hand, HLH domains have been found to be diverse (Graham and Presnell 2017) and the annelids are not an exception. The first *hmmsearch* of the Pfam HLH HMM (which only has *Helobdella robusta* in the profile) returned three significant hits for HIF $\alpha$ . The lack of the HLH domain in some species is likely an artifact resulting from removal of low-quality data. Examination of the multiple sequence alignment indicates total lack of data in this region for the respective species. The alternative of true loss of the HLH domain is not probable as this domain is responsible for DNA binding activity.

There is no clear relationship between transactivation domain presence and phylogeny (Figure 4.3). NTAD is present throughout Annelida but lost in several lineages (Figure 4.3). CTAD has a very limited occurrence and the three species it was found in are not closely related (Figure 4.3). However, *Hermodice carunculata* and *Owenia fusiformis* both have basal positions in the current annelid phylogeny. *Phyllodoce medipapillata* is in the Errantia grouping. This may indicate loss of the CTAD domain within Sedentaria (GIGA 2014, Weigert and Bleidorn 2016, Helm et al. 2018). While these domains are presumed to be important for HIF activity and specificity (Lando et al. 2002, Hu et al. 2007), they may not be entirely necessary for annelids, and invertebrates in general (Graham and Presnell 2017), or they are just so diverged that we could not detect them.

Capitellids and echiurans are frequently cited as the sister group to clitellates (GIGA 2014, Weigert and Bleidorn 2016, Helm et al. 2018). A relationship between capitellids and echiurans is present in both genes, but their status as sister to clitellates is not supported by HIFα (Figure 4.3) and only poorly supported by ARNT (Figure 4.4). Clitellata is derived and moderately supported in both gene trees (Figures 4.3 and 4.4). The long branch for the clade containing *Hirudo nipponica* and *Whitmania pigra* outside of Clitellata in the ARNT phylogeny may be caused by extreme diversification and long-branch attraction (Bergsten 2005), but we did not evaluate this. It is noteworthy that both *H. nipponica* and *W. pigra* are freshwater species, but so are *Helobdella* and *Poecilobdella*. Recent work on clitellates indicates duplication events of Na+/K+ - ATPases with freshwater colonization (Horn et al. 2019). Further work with a better representation of Clitellata would reveal any oxygen-sensing pathway novelties associated with transitions to freshwater and terrestrial environments.

ARNT recovered two large clades, Sedentaria and Errantia/Basal groups (Figure 4.4). While support is low, it is congruent with current annelid phylogenies (GIGA 2014, Weigert and Bleidorn 2016, Helm et al. 2018). This pattern was not recovered in HIF $\alpha$  (Figure 4.3) and likely due to HIF $\alpha$  being under less evolutionarily constraint. ARNT takes part in various other processes from HIF dimerization (Graham and Presnell 2017).

In conclusion, we have demonstrated high diversity in the transcription factor HIF across Annelida. Its heterodimer ARNT is more conserved and reflects the current

hypotheses of annelid phylogeny more closely. Protein domains were recovered in varying degrees and it is not clear if this is due to domain loss, extreme divergence, or loss of lowquality data during transcriptome construction. Through annotation of the domains, HMM profiles were updated to better reflect diversity in Annelida. Use of these updated models for further gene discovery with studies on the activity of this transcription factor will continue to shed light on the evolution of this important cellular pathway.

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#### 5. CONCLUSIONS

While the results of each chapter of this dissertation represent a significant contribution, they also contain interconnecting relevance. Gene evolution and function impacts the ecology of organisms by restricting and/or expanding their ecological niche. The interaction of these aspects of their biology contribute to patterns of speciation and, ultimately, a deeper understanding of evolutionary history.

I have demonstrated that the Gulf of Mexico (GoM) contains many unknown species of *Capitella* with the discovery of at least five new species and the first report of *Capitella nonatoi*, originally described from Brazil. This is significant in multiple ways. First, it simply adds to our understanding of the evolutionary history of *Capitella*. It will take substantial effort to ultimately determine the total number of species contained in this genus and their phylogeny. For example, I found three sympatric species at Apollo Beach Preserve, Tampa Bay, Florida. One of the species was also found throughout the GoM while the range of the other two appears very restricted, since they were recovered only from that field site. This indicates that a very targeted sampling effort, inclusive of different sediment depths, is necessary to recover all *Capitella*. Beyond estuarine/shallowwater habitats, there are still deep-sea and specialized habitats (whale-bone and wood falls and squid egg masses) that likely harbor additional diversity.

Second, an expanded understanding of *Capitella* phylogeny could lead to the eventual establishment of new spiralian evo-devo models. *Capitella teleta* is very well studied and has helped to fill gaps in our understanding of protostome and bilaterian evolution; sequencing annelid genomes revealed a strong likeness to non-protostomes and further uncovered characteristics of the metazoan last common ancestor (Simakov et al.

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2012). While *Capitella* cryptic species are presumed closely related, and thus assigned to the same genus, they can be notably diverse in their chromosome diploid number, ranging 12-26 with only 19 species evaluated (Grassle et al. 1987). This suggest many genome rearrangements during the evolution of *Capitella*. Novel insights that can come from evo-devo studies comparing species of *Capitella* include the role of genome rearrangement events in speciation, regeneration rates of posterior segments, early segmentation patterns during embryonic development, and spiralian development (e.g. cell fate specification, development of eye spots, and nervous system development).

Third, interesting questions about population dynamics are raised with the discovery of sympatric species. For example, discovery of *Capitella nonatoi* in the GoM and its dominance in the May samplings contrasts with *Capitella* sp. TV that was found at other times. This may represent an instance of seasonal dynamics as was suggested in the originally detected cryptic *Capitella* species in Massachusetts (Grassle and Grassle 1976). There may also be resource partitioning for *Capitella* in the GoM as cryptic species have been found inhabiting different sediment depths in the Mediterranean (Gamenick et al. 1998). Differences in larval development, maternal investments (i.e. presence/absence of yolk reserve), and timing of reproductive events (Méndez et al. 2000) between species would allow larvae to functionally inhabit different niches and reduce competition (Levin and Huggett 1990).

Finally, resolved species boundaries will facilitate more focused use of *Capitella* as pollution indicators. It is well established that *Capitella* have a lot of potential use as environmental sentinels. There has even been evidence that they can degrade polycyclic aromatic hydrocarbons (Li et al. 2004). This indicates that they may play a role in

bioremediation of organically-polluted sites, contributing to their known r-selected nature. However, their capacity in this role may vary as cryptic species have shown physiological differences, tolerating different sulphide levels (Gamenick et al. 1998). Species delimitation studies such as this one will make research on these topics more targeted and repeatable.

Regarding contribution to their ecology, I showed that, among the models evaluated, there is not a single strategy that works well for capitellids, despite them filling a similar ecological niche (burrowing, deposit feeders). However, Hurdle and GAM-Tweedie models performed well overall, possibly resulting from their handling of zeros. Bay segment was important overall, indicating that unexplained processes (water circulation patterns, anthropogenic activity, etc.) within these regions of the bay may have a strong influence over capitellid occurrences and distributions. For *C. capitata* complex specifically, depth was most important.

These results are significant because they 1) provide the first comparison of this kind for modeling capitellid species abundance and 2) generate hypotheses for future work on *Capitella* ecology. For example, the importance of depth in such a shallow system was surprising. These model results suggest the hypothesis that *C. capitata* complex is most abundant in shallower, near-shore waters, and this could be tested.

Furthermore, finding five new species in the GoM, three in Tampa Bay, Florida, raises the question as to whether the results for *C. capitata* complex are reliable. It is likely that the referenced three species, among others, are present within these samples. However, the specimens were preserved for morphology and not DNA integrity, making DNA barcoding difficult. Using Ancient DNA extraction methods in the future could turn this

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dataset into a useful resource for species delimitation in the GoM and, ultimately, refine our understanding of their ecology.

I did not directly study *Capitella* physiology but evaluated the phylogeny of two genes that are crucial in cellular oxygen-sensing, hypoxia inducible factor alpha (HIF $\alpha$ ) and aryl receptor nuclear transferase (ARNT). Under hypoxia these two genes dimerize, forming a transcription factor that initiates cellular response. Therefore, understanding their evolution across Annelida might be informative to understand evolutionary pathways in annelids.

I found that these genes do not mirror the known annelid phylogeny and reflect complex evolutionary pathways that remain to be understood. Annotation of domains revealed that annelids are quite diverse, particularly in the helix-loop-helix region. Capitellidae was well supported in both phylogenies and their sister relationship to Echiura, which is commonly recovered in annelid phylogenies, was supported. Additionally, capitellids and echiurans were sister to most of the clitellates in the ARNT phylogeny, which is also recovered in annelid phylogenies.

These findings are significant because they 1) represent the first analysis of HIF $\alpha$ and ARNT evolution across Annelida, 2) resulted in updated Hidden Markov Models (HMMs) of HIF $\alpha$  and ARNT domains to better reflect diversity within Annelida, and 3) contribute omics data of another *Capitella* species. The original HMM profiles had little or no annelid representation. Use of the updated profiles can lead to better discovery of HIF $\alpha$ and ARNT across Annelida and further resolution of their phylogenies.

*Capitella* are found in low-oxygen environments such as hydrothermal vents of the Mediterranean and development of larvae and juveniles has shown resilience to hypoxia

(Gamenick et al. 1998, Pechenik et al. 2016). Having many species from diverse habitats, being easily amenable to culture, and reproducing multiple times a year make *Capitella* a good candidate system for studying functional response to hypoxia across life stages. This and other studies on the functional response to varying oxygen levels across Annelida, will shed light on the complex evolutionary history of the HIF transcription factor.

In conclusion, this dissertation furthers understanding of three areas of *Capitella* biology. Knowledge of oxygen sensing gene evolution can give perspective on species distributions and their environmental drivers. Both gene evolution and ecology play a role in speciation and can shed light on observed patterns of phylogeography. Continued work on these aspects will lead to better utilization of *Capitella* as environmental sentinels, new insights into spiralian evolution, and understanding of annelid evolution as a whole.

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## APPENDIX A

# COMPARATIVE SPECIES ABUNDANCE MODELING OF CAPITELLIDAE

# (ANNELIDA) IN TAMPA BAY, FLORIDA

Table A.1: Model calibration metrics between observed values and model predicted values. Cells highlighted in blue indicate that those values are not present in the graphs of Figures 7 and 8. \*\*Apparent (not corrected for optimism) statistics reported.

|                  | Pearson<br>Correlation | Spearman Rank<br>Correlation | Slope       | Intercept | Root Mean Square<br>Error | Average Error |
|------------------|------------------------|------------------------------|-------------|-----------|---------------------------|---------------|
| Capitella        |                        |                              |             |           |                           |               |
| capitata         |                        |                              |             |           |                           |               |
| Poisson          | -0.06                  | 0.37                         | 1.03        | -0.05     | 7.72E+18                  | 6.25E+17      |
| Negative         | 0.19                   | 0.40                         | 0.40        | 0.79      | 015 50                    | 61 20         |
| BITUTIIA         | 0.10                   | 0.40                         | 0.40        | 0.78      | -015.50                   | -01.50        |
| Iweedie          | 0.11                   | 0.40                         | 0.76        | 0.35      | -133.54                   | 32.04         |
| Zero-Inflated    | 0.11                   | 0.00                         | 7 5 4 5 0 0 | 4 5 4     | 2 645.02                  | 4.045.02      |
| Poisson          | -0.11                  | 0.26                         | -7.54E-08   | 1.54      | -3.64E+83                 | -1.04E+82     |
| Hurdle           | 0.31                   | 0.40                         | 0.95        | 0.04      | -40.01                    | 0.41          |
| Boosted          |                        |                              |             |           |                           |               |
| Regression Tree  | 0.15                   | 0.39                         | 1.44        | -0.57     | 7.76                      | 2.21          |
| Capitella        |                        |                              |             |           |                           |               |
|                  |                        |                              |             |           |                           |               |
| Poisson          | 1.00                   | 0.31                         | 1.01        | 0.00      | 0.05                      | 0.01          |
| Negative         | 0.05                   |                              | 0.00        | 0.40      | 5.00                      | 0.50          |
| Binomiai         | 0.05                   | 0.14                         | 0.03        | 0.12      | 5.09                      | 0.52          |
| Tweedie          | 0.21                   | 0.14                         | 0.79        | 0.05      | 2.66                      | 0.21          |
| Zero-Inflated    |                        |                              |             |           |                           |               |
| Poisson          | 0.00                   | -0.01                        | -5.12E-08   | 0.13      | 7.50E+04                  | 2.21E+03      |
| Hurdle           | 0.00                   | 0.08                         | -5.00E-08   | 0.13      | 1.26E+05                  | 6.08E+03      |
| Boosted          |                        |                              |             |           |                           |               |
| Regression Tree  | 0.09                   | 0.08                         | 238.71      | -30.81    | 2.71                      | 0.26          |
| Capitella jonesi |                        |                              |             |           |                           |               |
| Poisson          | -0.22                  | 0.09                         | 2.04        | -0.15     | 1.96                      | 0.25          |
| Negative         |                        |                              |             |           |                           |               |
| Binomial         | -0.05                  | 0.14                         | 0.47        | 0.07      | 1.55                      | 0.35          |
| Tweedie          | -0.21                  | 0.10                         | 0.97        | 0.01      | 1.55                      | 0.26          |
| Zero-Inflated    |                        |                              |             |           |                           |               |
| Poisson          | -0.02                  | 0.02                         | -1.04E-09   | 0.14      | 3.23E+06**                | 8.82E+282     |
| Hurdle           | 0.06                   | 0.17                         | 0.51        | 0.06      | -2.52E+09                 | 2.49E+07      |
| Boosted          |                        |                              |             |           |                           |               |
| Regression Tree  | 0.00                   | 0.10                         | 4.30        | -0.36     | 1.70                      | 0.24          |

|                            | Pearson<br>Correlation | Spearman Rank<br>Correlation | Slope | Intercept | Root Mean Square<br>Error | Average Error |  |
|----------------------------|------------------------|------------------------------|-------|-----------|---------------------------|---------------|--|
| Heteromastus<br>filiformis |                        |                              |       |           |                           |               |  |
| Poisson                    | 0.02                   | 0.32                         | 1.11  | -0.06     | 2.50**                    | 2.99E+177     |  |
| Negative                   |                        |                              |       |           |                           |               |  |
| Binomial                   | 0.15                   | 0.34                         | 0.21  | 0.36      | 7.62E+05                  | -2.25E+04     |  |
| Tweedie                    | 0.03                   | 0.33                         | 0.81  | 0.10      | -1.20E+06                 | 2.14E+04      |  |
| Zero-Inflated              |                        |                              |       |           |                           |               |  |
| Poisson                    | 0.40                   | 0.30                         | 0.98  | -0.02     | -4.01E+108                | -1.36E+107    |  |
| Hurdle                     | 0.35                   | 0.34                         | 1.01  | -0.01     | -5.15E+05                 | -2.38E+04     |  |
| Boosted                    |                        |                              |       |           |                           |               |  |
| Regression Tree            | 0.30                   | 0.30                         | 1.25  | -0.10     | 3.99                      | 0.81          |  |
| Mediomastus                |                        |                              |       |           |                           |               |  |
| umbisetu                   |                        |                              |       |           | 14                        |               |  |
| Poisson                    | 0.13                   | 0.24                         | 1.20  | -0.31     | 8.06**                    | 1.46E+167     |  |
| Negative                   | 0.20                   | 0.29                         | 0.08  | 0.26      | 10.90                     | 2 27          |  |
| Binomiai                   | 0.30                   | 0.28                         | 0.98  | 0.26      | 10.80                     | 2.27          |  |
| I weedle                   | 0.36                   | 0.27                         | 1.30  | -0.19     | 10.98                     | 2.27          |  |
| Poisson                    | 0.33                   | 0.25                         | 0.65  | 0.45      | 10.64**                   | -7.60E+301    |  |
| Hurdle                     | 0.02                   | 0.11                         | 0.12  | 1 25      | 10.71                     | 2.02          |  |
| Boosted                    | 0.05                   | 0.11                         | 0.12  | 1.25      | 10.71                     | 3.03          |  |
| Regression Tree            | 0.37                   | 0.22                         | 1.28  | -0.32     | 11.49                     | 2.27          |  |
| Mediomastus                |                        |                              |       |           |                           |               |  |
| californiensis             |                        |                              |       |           |                           |               |  |
| Poisson                    | -0.03                  | 0.23                         | 1.32  | -0.24     | 4.96E+27                  | 1.79E+24      |  |
| Negative                   |                        |                              |       |           |                           |               |  |
| Binomial                   | 0.10                   | 0.25                         | 0.54  | 0.35      | 3.65                      | 1.41          |  |
| Tweedie                    | 0.04                   | 0.24                         | 0.94  | 0.07      | 4.80                      | 1.34          |  |
| Zero-Inflated              |                        |                              |       |           |                           |               |  |
| Poisson                    | 0.00                   | 0.19                         | 0.00  | 0.76      | 20.21**                   | 4.37E+241     |  |
| Hurdle                     | 0.07                   | 0.15                         | 0.72  | 0.15      | -15.98                    | 2.11          |  |
| Boosted                    |                        |                              |       |           |                           |               |  |
| Regression Tree            | 0.12                   | 0.20                         | 1.64  | -0.41     | 5.43                      | 1.30          |  |

# **Table A.1 Continued**



Figure A.1: Plots of the relative influence of each term as determined with the Boosted Regression Trees. pH is the only term labeled for *Capitella aciculata* because every other term had zero influence.