1	Prediction pipeline for discovery of regulatory motifs associated with Brugia
2	<i>malayi</i> molting
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4	Alexandra Grote ^{1*} , Yichao Li ^{2*} , Canhui Liu ³ , Denis Voronin ⁴ , Adam Geber ¹ , Sara
5	Lustigman ⁴ , Thomas R. Unnasch ³ , Lonnie Welch ^{2#} , Elodie Ghedin ^{1,5#}
6 7	¹ Department of Biology, Center for Genomics and Systems Biology, New York University, New York, NY 10003, USA.
8 9 10 11	² School of Computer Science and Electrical Engineering, Ohio University, Athens OH 45701, USA
12 13 14	³ Center for Global Infectious Disease Research, University of South Florida, Tampa, FL 33612, USA
15 16 17	⁴ Laboratory of Molecular Parasitology, Lindsley F. Kimball Research Institute, New York Blood Center, New York, NY 10065, USA
18 19 20 21	⁵ Department of Epidemiology, College of Global Public Health, New York University, New York, NY 10003, USA
22 23 24	* Shared authorship [#] co-corresponding authors: <u>elodie.ghedin@nyu.edu</u> , welch@ohio.edu

25 Abstract

26 Filarial nematodes can cause debilitating diseases in humans. They have complicated 27 life cycles involving an insect vector and mammalian hosts, and they go through a 28 number of developmental molts. While whole genome sequences of parasitic worms are now available, very little is known about transcription factor (TF) binding sites and their 29 30 cognate transcription factors that play a role in regulating development. To address this 31 gap, we developed a novel motif prediction pipeline. Emotif Alpha, that integrates ten different motif discovery algorithms, multiple statistical tests, and a comparative analysis 32 of conserved elements between the filarial worms Brugia malayi and Onchocerca 33 34 volvulus, and the free-living nematode Caenorhabditis elegans. We identified stagespecific TF binding motifs in *B. malayi*, with a particular focus on those potentially 35 involved in the L3-L4 molt, a stage important for the establishment of infection in the 36 mammalian host. Using an in vitro molting system, we tested and validated three of 37 these motifs demonstrating the accuracy of the motif prediction pipeline. 38

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41 Introduction

42 Brugia malavi is a mosquito-borne filarial nematode and one of the causative agents of lymphatic filariasis, commonly known as elephantiasis. Currently, 856 million people in 43 44 52 countries require preventative chemotherapy to stop the spread of the disease 45 (Gordon et al. 2018). Transmission occurs when the mosquito vector introduces 46 infective third-stage larvae (L3) during their blood meal. The larvae then migrate to the 47 lymphatic vessels where they molt twice and develop into adults. Over their lifespan adult females produce millions of microfilariae (immature larvae) that circulate in the 48 49 blood, allowing for continued transmission. Chronic lymphatic filariasis can cause 50 permanent and disfiguring damage, characterized by lymphoedema (tissue swelling) and elephantiasis (tissue thickening) of the lower limbs, and hydrocele (scrotal swelling). 51

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Over the past decade, a few parasitic nematode genomes have been sequenced, 53 54 including *B. malayi* (Ghedin et al., 2007), *Loa loa* (Desjardins et al. 2013), and Onchocerca volvulus (Cotton et al. 2016). Transcriptomic experiments have helped 55 56 quantify differentially expressed genes and their biological implications (Bennuru et al., 57 2016; Choi et al., 2011; Grote et al, 2017; Kariuki, Hearne, & Beerntsen, 2010; Li, Wang, 58 Rush, Mitreva, & Weil, 2012). However, little is known about how these genes are regulated through cis-regulatory motifs. Motifs that have been characterized in *B. malayi* 59 60 and that are available in the CIS-BP database (Weirauch et al. 2014) are purely 61 bioinformatic predictions based on transcription factor binding site (TFBS) homology. De 62 novo DNA motif discovery is an effective bioinformatic method for studying 63 transcriptional gene regulation (Dieterich & Sommer, 2008), and a number of motif

64 discovery methods and tools currently exist. These include expectation-maximization methods, such as MEME (Bailey et al. 2006) and Improbizer (Ao et al. 2004); Gibbs 65 sampling methods, such as BioProspector (Liu et al. 2001) and MotifSampler (Thijs et al. 66 67 2002); k-mer enumeration methods such as Weeder (Pavesi, et al. 2004), DME (Smith et al. 2005), and DECOD (Huggins et al. 2011); ensemble methods such as W-68 ChIPMotifs (Jin et al. 2009), and GimmeMotifs (Heeringen & Veenstra, 2011); and deep 69 70 learning methods such as DanQ (Quang & Xie, 2016) and DeepFinder (Lee et al. 2018). 71 Based on the input types, motif discovery approaches can also be classified as either 72 generative or discriminative. Generative motif discovery models use pre-defined 73 background models (e.g., the Hidden Markov Model), while discriminative motif 74 discovery models need to explicitly specify a set of background sequences. In this study, 75 we developed Emotif Alpha that integrates a number of the current methods based on the aforementioned models and filters the motifs using a Z-test, random forest feature 76 77 importance, and sequence homology.

78

79 Gene promoter regions play a crucial role in gene regulation yet remain largely 80 uncharacterized in *B. malayi*. Among the very few promoters that have been previously 81 described and validated in *B. malayi* is that of Heat Shock Protein 70 (HSP70) (Shu et 82 al. 2003). A previous study showed that while the regulatory domains of the HSP70 83 promoter were similar to other eukaryotes, the core promoter domains appeared to be 84 distinct (Higazi et al., 2005). And nothing is known about motifs regulating developmentally expressed genes in *B. malayi*. There is thus a need for systematic 85 86 identification, annotation, and experimental validation of *B. malayi* promoter motifs

87 associated with gene regulation to better characterize filaria gene expression patterns. To better understand how promoter elements regulate stage-specific gene expression, 88 we performed differential gene expression analysis of the L3 to L4 molt, the first 89 90 developmental step important for the establishment of infection in the mammalian host, 91 and motif discovery using the Emotif Alpha pipeline. Several promoter motifs appeared 92 to be associated with the regulation of the L3 to L4 molt. Our results provide an initial overview of the putative regulatory mechanisms in the filariae that could be targeted 93 using novel intervention strategies for control. 94

95

96 **Results**

Stage-specific expression of serpins, peptidases, cysteine protease inhibitors, and structural constituents of the cuticle during the L3 to L4 molt

99 Since the L3 to L4 molt is of particular interest because it corresponds to the life cycle 100 stage when infective larvae establish infection, we focused in this study on identifying 101 genes that are differentially expressed during this unique process. We used RNA-seq to 102 profile transcription at different time points during the molt, collecting samples from the 103 infective L3 (from mosquitoes), L3 Day 6, and L3 Day 9 worms recovered from infected 104 gerbils (NCBI PRJNA557263). We combined this transcriptome data with previously 105 published L4 data (Grote et al. 2017) that corresponds to Day 14 post infection of 106 gerbils (**Table 1**). In total, 2.36 billion reads were generated, with 1.38 billion reads 107 mapping to the *B. malayi* genome. Each biological replicate received an average of 272 108 million reads, with an average of 173 million reads that were successfully mapped

- 109 (Table 1). Of the 11,841 *B. malayi* gene models, 87.6% were expressed in at least one
- stage of the L3 to L4 molt (Fig. 1). The molting expression data shows unique stage-
- specific profiles for each stage of the molt with significant differential expression
- 112 between days.

113

Library	Total reads (millions)	Stage Total (millions)	Total Mapped Reads (millions)	Stage Total Mapped Reads (millions)	% B. <i>malayi</i> Genes Expressed	
L3a	294		266			
L3b	223	763	204	639	84	
L3c	246		169			
L3D6a	508		131		82.3	
L3D6b	243	971	152	477		
L3D6c	220		194			
L3D9a	300	440	170	266	81.2	
L3D9b	140	440	96	200		
L4a	104	105	47	96	72.4	
L4b	90	195	49	90	72.4	

Table 1: RNA-Seq summary. The table shows the total reads sequenced and mapped

in each biological replicate at each developmental stage, L3 to L4; lower case a, b, andc refer to separate biological replicates.

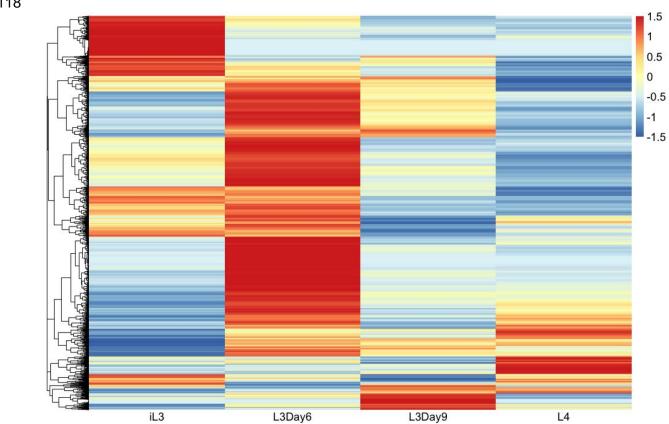


Figure 1: Expression of Brugia malayi genes during the L3 to L4 molt. Expression is in FPKMs and is Z-scale normalized by row prior to clustering. High expression is indicated by red and low expression by blue. Time-points included infective L3 larvae (iL3), L3 larvae at Day 6 of molting (L3D6), L3 larvae at Day 9 of molting (L3D9), and L4 larvae. Biological replicates have been combined.

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We determined differentially expressed genes during the L3 to L4 molt using both DESeq (Anders & Huber, 2010) and EdgeR (Robinson et al. 2010) to perform pairwise comparisons between the four samples. To get a high-confidence list of differentially expressed genes, we used the consensus of the two algorithms. For the purposes of this study, we focused on the genes that were up-regulated at each stage of molting, as

130 compared to the other stages, and did a gene-annotation enrichment analysis for each 131 stage. We found that up-regulated genes in iL3 larvae, as compared to L3D6, L3D9, 132 and L4, were enriched for annotations involving cysteine-type peptidase activity as well 133 as serpin domains and serpin family proteins. Cysteine-type peptidases are essential for 134 molting in *B. malayi* (Guiliano D.B. et al. 2004, Lustigman S. et al. 2004) and serpins are 135 serine protease inhibitors that have previously been shown to be involved in 136 immunomodulation and host immune evasion during infection (Zang X, et al. 2001). We 137 identified five different cysteine-type peptidases and two cysteine-type endopeptidase 138 inhibitors that were upregulated in iL3 larvae. By day 6 of molting, structural constituents 139 of the cuticle, including collagen (the main component of the cuticle) were enriched in 140 the up-regulated gene sets. We also see the up-regulation of several metalloproteases. 141 At day 9, genes involved in signaling were enriched among the up-regulated genes, as 142 were several different metalloproteases. At day 14 (L4 larvae), we again see an 143 enrichment of structural constituents of the cuticle. Similarly to those enriched in L3 day 144 6 larvae, they are all mostly orthologs of *C. elegans* col (COLlagen) genes, which are 145 themselves orthologs of human MARCO genes (macrophage receptor with collagenous structure). The set of structural constituents enriched at day 14 is, however, a 146 147 completely unique set of collagen genes as compared to the genes observed at day 6. 148 These stage-specific enrichments reflect the order of peptidases and structural 149 constituents necessary for the building of a new L4 cuticle, the separation of the old L3 150 cuticle from the developing L4 cuticle, and the shedding of the old L3 cuticle.

152 Identification of 12 motifs associated with transcription factor binding that are 153 enriched in the L3 to L4 molt

154 To better understand the regulatory program of *B. malayi* during the L3 to L4 molt, we analyzed statistically over-represented DNA motifs in regions upstream of genes that 155 156 were upregulated during molting. To do so, we developed a motification pipeline 157 called Emotif Alpha (Fig. 2). First, we used the transcriptome data from the different 158 stages of the L3 to L4 molt to generate lists of genes up-regulated at each stage of the 159 molt using pair-wise comparisons. We then did a motif discovery analysis on each gene 160 set using a combination of three motif discovery tools: GimmeMotifs, DME, and DECOD. 161 GimmeMotifs is an ensemble of generative motif discovery tools—including Homer 162 (Heinz et al. 2010), AMD (Shi et al. 2011), BioProspecter, MDmodule (Conlon et al. 2003), MEME, Weeder, GADEM (Li et al. 2009), and Improbizer-while DME and 163 164 DECOD are discriminative motif discovery tools. We did a discriminative motif discovery 165 analysis by randomly selecting background promoter region sets from all B. malayi 166 genes, excluding the differentially expressed genes. These background sets are three 167 times larger than the foreground sets. We selected motif lengths between 6- and 15-mer. In total, we identified 20,025 motifs. 168

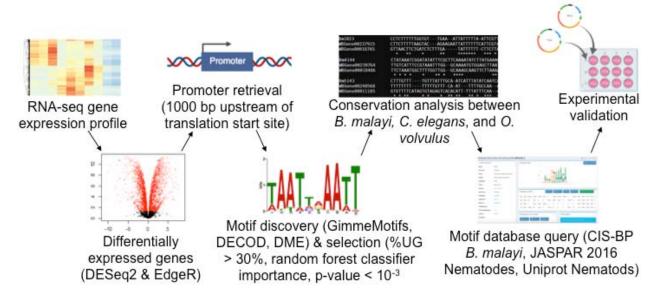


Figure 2: Workflow of promoter motif identification. The six main steps for motif discovery were: 1) generation of an RNA-seq profile, 2) determination of up-regulated genes for every pairwise comparison using DESeq2 (FDR<0.01) and EdgeR (P-value<0.01), 3) promoter retrieval: 1000 bp upstream of the translation start site, 4) ensemble motif discovery using GimmeMotifs (Homer, AMD, BioProspector, MDmodule, MEME, Weeder, GADEM, and Improbizer), DECOD, DME, and selection of enriched motifs: %UG > 30% and random forest classifier feature importance and over-representation p-value < 10⁻³, 5) TFBS conservation analysis between *B. malayi, C. elegans*, and *O. volvulus*. 6) motif database query: CIS-BP *B. malayi*, JASPAR 2016 Nematodes, Uniprot Nematodes. Finally, a subset of those identified motifs were experimentally validated.

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To select statistically significant motifs, we first assessed the motifs by a random forest classifier using scikit-learn (Varoquaux et al. 2015). The random forest algorithm uses bootstrap sampling and constructs a decision tree for each sub-sample. To evaluate the motifs, we used both Gini impurity (Gordon et al.1984) and information gain (Quinlan et al. 1993) criteria and retained the union of the resulting top 40 motifs. We further filtered the motifs by foreground coverage (i.e. UG%), removing motifs occurring in less than 30% of the genes up-regulated at that stage of molting. We then used a Z-test to 177 compare the frequency of a motif in the up-regulated genes with the expected frequency
178 in the background promoters. Using a significance level (p-value) cutoff of 10⁻³, we
179 selected 395 motifs.

180

181 We retrieved a collection of 163 known nematode transcription factor binding sites 182 (TFBSs) from the MEME suite (http://meme-suite.org/), searching the motif databases JASPAR CORE 2016 nematodes (Mathelier et al. 2016), CIS-BP Brugia malavi 183 184 (Weirauch et al. 2014), and Uniprobe worm (Newburger et al. 2009). We matched the 185 remaining motifs to known TFBSs with TOMTOM (Gupta et al. 2007). If two motifs were 186 matched to the same binding site and they were discovered from the same gene list, we 187 considered them to be redundant and kept the one with the lowest over-representation p-value. This step narrowed our list down to 27 motifs that had matches to known 188 189 binding sites.

190

191 We next performed a conservation analysis amongst nematodes using an adaptation of 192 a published method (Roy et al. 2013). We retrieved orthologous gene information 193 among B. malayi, C. elegans, and O. volvulus from Wormbase ParaSite Biomart (Howe 194 et al. 2017). We extracted up to 1Kb upstream from the translation start sites for B. malayi genes, assuming these regions would contain the promoter. We performed 195 196 multiple sequence alignments using CLUSTALW2 (Larkin et al. 2007), and defined a 197 motif as conserved if it occurred at the same position in the orthologous promoter region alignment of either C. elegans or O. volvulus. This step resulted in 12 remaining motifs 198 (**Table 2**) that were (1) enriched (p-value $< 10^{-3}$) and (2) conserved in either *C. elegans* 199

or *O. volvulus*. The frequency of motif occurrence in the putative promoter regions of
up-regulated genes ranges from 33% to 94%. The fold enrichment, representing the
ratio between motif frequencies in the up-regulated gene promoters and background
promoters, ranges from 1.28 to 2.19.

Name	Logo	%UGª	Ratio	P-value	Matched known motif	transcripti on factor (TF)	Function	Gene pair of conserved sites				
M1.1 <l4,l3></l4,l3>	CATAATTAAT	64	1.63	1.4*10 ⁻⁴				[Bm4560, OVOC6906], [Bm856, OVOC3639]				
M1.2 <l3d9,l3></l3d9,l3>	HAATTAATTAA <u>tta</u>	84.1	1.31	7.1*10 ⁻⁵	MA0928.1		Involved in hermaphrodite genitalia development, locomotion,	[Bm856, OVOC3639], [Bm17348, OVOC8896], [Bm17988, OVOC3292]				
M1.3 <l3d6,l3></l3d6,l3>	- MANTANTIANT	94.4	1.28	7.6*10 ⁻⁶	(C. elegans)	zfh-2	nematode larval development and receptor- mediated endocytosis	[Bm2559, C34C6.3], [Bm2821, OVOC10446], [Bm17348, OVOC8896], [Bm3341, OVOC10396], [Bm4257, OVOC2553]				
M1.4 <l3d9,l3d 6></l3d9,l3d 	-ATTANTIANTIANT	84.7	1.55	9.6*10 ⁻⁸				[Bm7179, OVOC394], [Bm2270, OVOC2391]				
M2 <l3d6,l4></l3d6,l4>	- <mark>Matcaatmat<u>am</u></mark>	93.3	1.31	2.9*10 ⁻⁵	MA0927.1 (C. elegans)	vab-7	Required for DB motorneuron identity and posterior DB axonal polarity	[Bm4904, OVOC2123]				
M3.1 <l3d9,l3d 6></l3d9,l3d 		80.6	1.33	3.0*10 ⁻⁴	MA0542.1 (C.		MA0542.1 (<i>C</i> .			elt-3	Controlling hypodermal cell	[Bm2802, OVOC9504]
M3.2 <l3d9,l3></l3d9,l3>		81.8	1.32	8.3*10 ⁻⁵	elegans)		differentiation	[Bm10655, C28A5.3, OVOC9600]				

M4.1 <l4,l3d6></l4,l3d6>	-CTCCTCAAACAGAAAA	34.8	2.19	4.9*10 ⁻⁴			Loss of blmp-1 activity via deletion	[Bm2802, OVOC9504], [Bm6190, OVOC827]
M4.2 <l4,l3></l4,l3>	MGSGAAA	56	1.71	1.6*10 ⁻⁴	MA0537.1 (C. elegans)	blimp-1	mutation has been reported to result in small, dumpy animals with	[Bm7019, OVOC7405], [Bm6190, OVOC827]
M4.3 <l3d9,l3d 6></l3d9,l3d 	-CTCCTCANGAGAAAAA	38.9	2.01	1.0*10 ⁻⁵			abnormal fat content	[Bm2802, OVOC9504], [Bm7179, OVOC394]
M5 [*] <l3,l3d6></l3,l3d6>		93.3	1.23	2.9*10 ⁻⁴	M5348_1. 02 (CIS-BP <i>Brugia</i> inferred)	Bm8528	Retinal homeobox protein Rx3	[Bm1938, OVOC2080], [Bm8228, C27D6.4], [Bm1559, OVOC7210], [Bm4184, OVOC3386]
M6 [*] <l3,l3d6></l3,l3d6>		33.3	2.03	3.0*10 ⁻⁵	M5221_1. 02 (CIS-BP <i>Brugia</i> inferred)	Bm4429	Involved in regulation of transcription, DNA- templated and steroid hormone mediated signaling pathway	[Bm1938, OVOC2080], [Bm6642, Y48B6A.12]
M7* <l3,l3d9></l3,l3d9>	TATAMCA	54.5	1.19	6.1*10 ⁻²	M0739_1. 02 (CIS- BP inferred)	Bm3608	Involved in cell growth, proliferation, differentiation, and longevity.	[Bm4184, OVOC3386]

204 Table 2: Table of enriched promoter motifs over the L3-L4 molt. Motifs were found to be enriched (p-value $< 10^{-3}$) in the upstream elements of up-regulated genes between different 205 206 stages of molting and to be conserved (in either C. elegans or O. volvulus). ^aFrequency of a motif in up-regulated gene promoters. ^bRelative frequency of a motif in up-regulated gene 207 208 promoters vs. background promoters. *These two motifs have been validated experimentally. 209 Note that M7 was included in the experimental validation because it passed 4 out of 5 filters, 210 including foreground coverage filter, random forest filter, known motif filter and conservation 211 filter. However, it was not included in the 12 reported motifs due to its non-significant p-value.

212

213	The 12 selected motifs matched known binding sites for 6 transcription factors in C.
214	elegans (Table 2), all of which are involved in development, aging, and/ or movement.
215	Motifs M1.1, M1.2, M1.3 and M1.4 matched a zinc-finger protein, zfh-2, which is
216	involved in hermaphrodite genitalia development, locomotion, nematode larval
217	development and receptor-mediated endocytosis. Motif M2 matched vab-7, which is
218	associated with DB motor neuron identity and posterior DB axonal polarity. Motifs M3.1
219	and M3.2 matched elt-3, which is related to aging (Budovskaya et al. 2008). Motifs
220	M4.1, M4.2, and M4.3 matched blmp-1. M5 matched a homeobox protein, Bm8528, and
221	M6 matched a nuclear receptor Bm4429. The 12 motifs are conserved in either C.
222	elegans or O. volvulus (Table 2, last column). Moreover, the occurrence of M3.2 in the
223	Bm10655 promoter region is conserved in orthologs in both C. elegans (promoter of
224	C28A5.3) and O. volvulus (promoter of OVOC9600).

225

The motif analysis reveals how some of the differential expression of different proteases may be orchestrated during the L3 to L4 molt. Motif M1.4 is found in the promoter region of Bm2270 a metalloprotease significantly up-regulated in L3D9 worms. Bm2270 is an ortholog of nas-37 in *C. elegans* and has been shown to be involved in collagen and cuticulin-based cuticle development and ecdysis. Motif M5 is found in the promoter region of Bm1938 and is predicted to encode a serpin. Bm1938 is one of the serpins that was found to be significantly up-regulated in the iL3 larvae.

234 L3 stage-specific transcription factor binding motifs can be validated *in vitro*

235 Three of the motifs (M5, M6, and M7) were chosen for validation based on their 236 enrichment in the promoters of genes up-regulated in the mid to late stages of the L3 to L4 molt. Three separate genes, each containing one chosen motif, were tested. The 1 237 238 kbp upstream region of each gene was amplified from *B. malayi* genomic DNA and 239 cloned upstream of the firefly luciferase reporter gene in the expression vector pGL3 240 Basic (Shu et al. 2003). B. malayi L3 were then transfected with the constructs in a co-241 culture system as previously described (Liu et al. 2018). The parasites were induced to 242 molt in vitro and then assayed for luciferase activity. The number of relative light units 243 (RLUs) observed were normalized to those obtained from parasites transfected in 244 parallel with a construct consisting of the *B. malayi* HSP70 promoter driving the expression of the firefly luciferase reporter (Shu et al. 2018). The experiment was 245 246 performed with both the native promoter and a mutant promoter where the nucleotides 247 of the motif had been randomly shuffled. All of the native promoters produced significant 248 amounts of reporter luciferase activity in the molting parasites (ranging from 40%-70%) 249 of the activity produced by the HSP70 construct transfected positive controls; Fig. 3). 250 However, when the putative motifs were mutated, the activity in all the promoters tested 251 decreased by 80-90% (Fig. 3).

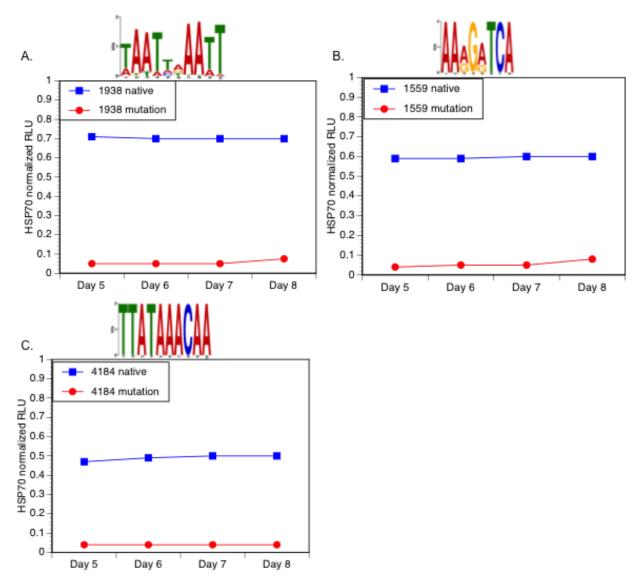


Figure 3: Promoter motif validation. A) Promoter motif validation in L3 worms that were molting in vitro using the native promoter of Bm1559 and a mutated motif M5 version of the same promoter. B) Promoter motif validation using the native promoter of Bm1938 and a mutated motif M6 version of the promoter. C) Promoter motif validation using the native promoter of Bm4184 with a mutated motif M7 version of the promoter. In each panel luciferase activity obtained from the constructs is normalized against parasites transfected with a construct containing the Bm HSP70 promoter driving the expression of the firefly luciferase reporter.

260 Discussion

261 Parasitic nematodes such as *B. malayi* maintain a complicated lifecycle involving both 262 an insect and a mammalian host, and undergo a number of molts. The L3 to L4 molt that occurs immediately upon infection of the mammalian host is of particular interest as 263 264 it marks the establishment of infection and thus represents an attractive point for drug intervention. Little is known, however, about how *B. malayi* regulates the transitions 265 between these stages. Prior to our study, nothing was known about promoter motifs that 266 267 regulate developmentally expressed genes in *B. malayi*. Because stage transitions rely 268 on precise transcriptional control through the interaction of transcription factors and their 269 binding sites, we set out to characterize the potential transcription factor binding motifs 270 of these parasites and to identify motifs that contribute to stage-specific expression of genes involved in early worm development in the mammalian host. 271

272

We found a number of enriched motifs and were able to define both conserved motifs 273 274 across molting as well as stage-specific motifs. While some of the motifs we identified 275 are conserved in other nematodes, such as C. elegans, a number of motifs represent novel binding sites potentially reflecting the differences in development and the parasitic 276 277 lifestyle. It is known that molting is regulated by an ecdysone-like response system 278 (Barker et al. 1991; Mhashilkar at al. 2016; Mhashilkar at al. 2016; Warbrick et al. 1993, 279 Lui et al, 2012). Two of the identified motifs and their cognate TFs appear to be related 280 to the ecdysone response. For example, zfh-2, the transcription factor predicted to bind four of our identified motifs, is a common cofactor implicated in ecdysone signaling in D. 281 282 melanogaster (Davis et al. 2011). Blimp-1, the transcription factor predicted to bind

three of our identified motifs, is an ecdysone-inducible repressor that is essential for the prepupal development in *Drosophila* (Akagi and Ueda 2011). Validation results suggest that our pipeline is able to identify biologically-relevant motifs involved in molting. This analysis provided biological insight into the development of the parasite as well as the identification of novel drug targets.

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Future work needs to be done to expand this analysis across the lifecycle of the nematode at different stages of development, in its different hosts (i.e. human vs. mosquito). While transcriptomic data from these stages exists and can be used to predict motifs, validation at other stages *in vivo* will prove more difficult. However, with recent innovation in filarial transgenics, it is now possible to create stable transgenic parasite lines that will allow functional testing *in vivo* of defined promoter motifs at all life stages of the parasite (Liu et al. 2018).

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297 Materials and Methods

298 Transcriptomic study design

All parasites were obtained from FR3 (Filariasis Research Reagent Resource Center; BEI Resources, Manassas, VA, USA), where they were isolated from infected gerbils (*Meriones unguiculatus*) or mosquitoes (*Aedes aegypti*). Worms were flash-frozen and shipped to the New York Blood Center for processing. For transcriptomic sequencing, infective third-stage larvae (iL3) were recovered from mosquitoes and mammalian stage larvae were recovered from gerbils at 6 and 9 days post infection (dpi). At 6 dpi, larvae are typically undergoing the molt from L3 to L4, while by 9 dpi the molt is complete
(Mutafchiev et al. 2014). Data was combined with previously published stages 14 dpi
(L4) (Grote et al. 2017).

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9 RNA isolation, library preparation and sequencing

310 Total RNA was prepared from *B. malayi* worms as previously described (Grote et al. 311 2017). RNA was prepared from 3 biological replicates of infective L3 (iL3; 2000 larvae 312 each), 3 replicates of 6 dpi larvae (1500 each) and 2 replicates of 9 dpi larvae (1300 each). B. malayi worms were homogenized in Trizol (ThermoFisher) using a hand-held 313 314 pestle in 1.5mL tubes containing the worms. Total RNA was extracted by organic 315 extraction using Trizol and the PureLink RNA mini kit (ThermoFisher) and after being 316 treated with DNasel (New England Biolabs). Ribosomal RNA (rRNA) depletion was 317 performed using Terminator (Epicentre), a 5'-phosphate-dependent exonuclease that 318 degrades transcripts with a 5' monophosphate. Libraries were prepared using the NEBNext Ultra II RNA Library Prep Kit for Illumina (New England Biolabs) according to 319 320 manufacturer instructions. Library quality was assessed using a D1000 ScreenTape 321 Assay (Agilent) prior to sequencing. Library concentrations were assessed using the 322 gPCR library quantification protocol (KAPA biosystems). Libraries were sequenced on the Illumina NextSeq500 platform with 150bp paired-end reads. To minimize the 323 324 confounding effects of lane-to-lane variation, libraries were multiplexed and sequenced 325 with technical replicates on multiple lanes. Each biological replicate received an average of 135 million mapped reads (PRJNA557263). 326

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328 Sequencing alignment and expression analysis

Read quality was assessed using FastQC (Babraham Bioinformatics). Sequence reads 329 from each sample were analyzed with the Tuxedo suite of tools (Kim et al. 2013; 330 331 Trapnell et al. 2013; Trapnell et al. 2010). Reads were mapped with Tophat2's Bowtie2-332 very-sensitive algorithm to the annotated *B. malayi* genome assembly (WormBase.org). The resulting BAM files were then used with HtSeq to obtain raw read counts. 333 334 Differential gene expression analysis was performed using both DESeg and EdgeR, 335 and the overlapping genes (FDR < 0.01 & P-value < 0.01) were retained. Up-regulated 336 genes were characterized for each pairwise comparison between L3, L3 Day 6 (L3D6), 337 L3 day 9 (L3D9), and L4 worms. For example, <L3,L4> refers to the up-regulated genes in L3 compared to L4. Two pairs of comparisons, <L3D9,L4> and <L4,L3D9>, were 338 339 dropped due to the limited number of up-regulated genes (<=3), possible due to the 340 L3D9 being actually younger L4. The up-regulated gene lists were filtered using log2 341 fold change (logFC) with the following thresholds: |logFC| = 7 for <L3D6,L3>, <L3D6,L3D9>, <L3D6,L4>; |logFC| = 4 for <L3D9,L3>, <L3,L3D6>, <L3,L3D9>, 342 343 <L3,L4>, <L4,L3>; |logFC| = 2.5 for <L3D9,L3D6>, <L4,L3D6>. The reason for varying 344 the threshold was that the number of up-regulated genes in each list varied significantly; 345 for motif discovery tools to search efficiently, the number of sequences were limited to 346 less than one hundred. In total, 10 up-regulated gene lists were used for motif discovery 347 (Table S1).

Potential promoter sequences were retrieved from WormBase ParaSite Biomart (Howe et al. 2016) web interface, capturing the 1000bp upstream of the translation start site for each gene.

352

353 The Emotif Alpha pipeline for regulatory motif identification

The Emotif Alpha pipeline (freely available at: https://github.com/YichaoOU/Emotif_Alpha) 354 355 was developed to automate motif discovery analysis for the 10 up-regulated gene lists. 356 This pipeline was written in python and was applied to perform all aforementioned motif 357 analyses. The motif discovery step used multiple tools and was run in parallel at the 358 Ohio SuperComputer Center. Motif length search was from 6 to 14. Motif scanning was done using FIMO (Grant et al. 2011) with a default p-value threshold of 10⁻⁴. We 359 implemented 5 different motif filters. (1) Foreground coverage (i.e., UG%) was defined 360 361 as the proportion of up-regulated gene promoters containing the given motif. We set a minimal foreground coverage at 30%. (2) Motifs were then filtered by a random forest 362 363 classifier. The union of the top 40 motifs that resulted from either Gini impurity or 364 information gain criterion was retained. (3) Motif enrichment p-value was calculated using Z-test and the cutoff was 10⁻³. (4) Known motif filter was performed using 365 366 TOMTOM and a collection of 163 known nematode TFBSs. The motif similarity p-value 367 threshold was 10⁻⁴. (5) Conservation analysis was performed using a method described in (Roy et al. 2013). Only conserved motifs were kept. 368

369

370 In vitro validation of promoter transcription motifs

371 The putative TF motifs M5, M6, and M7 were chosen for validation based on their 372 enrichment in the promoters of genes upregulated in the mid to late stages of the L3 to 373 L4 molt. Three different genes, each containing one of the chosen motifs, were used for 374 the validation assay. As previously described in Shu et al. (Shu et al. 2003), we amplified the 1 kbp region upstream of each gene from *B. malayi* genomic DNA and 375 cloned upstream of the firefly luciferase reporter gene in the expression vector pGL3 376 377 Basic. We then transfected *B. malayi* L3 larvae with the constructs in a co-culture 378 system as previously described (Liu et al. 2018). The parasites were induced to molt by the addition of ascorbic acid on day 5, and parasites were assayed for luciferase activity 379 380 on days 5-8, as by day 9 the molting was complete. We normalized the number of RLUs 381 observed to those obtained from parasites transfected in parallel with a construct 382 consisting of the *B. malayi* HSP70 promoter driving the expression of the firefly 383 luciferase reporter (Shu et al. 2018) to control for accumulation of the firefly luciferase 384 over time during the duration of the experiment. We did the experiment with both 385 the antive promoter and a mutant promoter where the nucleotides of the motif had been randomly shuffled (Table S2). 386

387

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