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# Insight from an ultraconserved element bait set designed for hemipteran phylogenetics integrated with genomic resources



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#### ABSTRACT

Target enrichment of conserved genomic regions facilitates collecting sequences of many orthologous loci from non-model organisms to address phylogenetic, phylogeographic, population genetic, and molecular evolution questions. Bait sets for sequence capture can simultaneously target thousands of loci, which opens new avenues of research on speciose groups. Current phylogenetic hypotheses on the > 103,000 species of Hemiptera have failed to unambiguously resolve major nodes, suggesting that alternative datasets and more thorough taxon sampling may be required to resolve relationships. We use a recently designed ultraconserved element (UCE) bait set for Hemiptera, with a focus on the suborder Heteroptera, or the true bugs, to test previously proposed relationships. We present newly generated UCE data for 36 samples representing three suborders, all seven heteropteran infraorders, 23 families, and 34 genera of Hemiptera and one thysanopteran outgroup. To improve taxon sampling, we also mined additional UCE loci in silico from published hemipteran genomic and transcriptomic data. We obtained 2271 UCE loci for newly sequenced hemipteran taxa, ranging from 265 to 1696 (average 904) per sample. These were similar in number to the data mined from transcriptomes and genomes, but with fewer loci overall. The amount of missing data correlates with greater phylogenetic divergence from taxa used to design the baits. This bait set hybridizes to a wide range of hemipteran taxa and specimens of varying quality, including dried specimens as old as 1973. Our estimated phylogeny yielded topologies consistent with other studies for most nodes and was strongly-supported. We also demonstrate that UCE loci are almost exclusively from the transcribed portion of the genome, thus data can be successfully integrated with existing genomic and transcriptomic resources for more comprehensive phylogenetic sampling, an important feature in the era of phylogenomics. UCE approaches can be used by other researchers for additional studies on hemipteran evolution and other research that requires well resolved phylogenies.

#### 1. Introduction

Hemiptera is the largest order of non-holometabolous insects with > 103,000 described species. They are characterized by distinctive piercing-sucking mouthparts, which allow exploitation of plant vascular tissue in many species, including some economically important agricultural pests. While some hemipteran species can be beneficial predators, one group includes vectors of human diseases, and others are nuisance pests. Hemiptera are thought to have diverged from their

sister taxon Thysanoptera, the thrips, more than 300 mya (Misof et al., 2014). Although ancestral herbivorous feeding habits have been retained in several hemipteran lineages including aphids, whiteflies and relatives (Sternorrhyncha), cicadas and relatives (Auchenorrhyncha), and moss bugs (Coleorrhyncha), life history strategies diversified in a fourth lineage, the suborder Heteroptera, to include predacious, hematophagous, mycetophagous and mixed-feeding habits (Weirauch et al., 2018). Despite the diversity and economic importance of Hemiptera, phylogenetic relationships among and within major lineages, i.e.,

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the suborders Sternorrhyncha, Auchenorrhyncha, Coleorrhyncha, and Heteroptera, have remained contentious (Cryan and Urban, 2012; Li et al., 2015; Song et al., 2016).

Based on increasingly extensive datasets with respect to taxon sampling and/or characters (few loci to complete mitochondrial genomes and transcriptomes), these analyses have converged on congruent topologies in certain parts of the tree (i.e., establishment of Auchenorrhyncha as more closely related to Heteroptera than to Sternorrhyncha). However, other major questions have remained unsolved, such as relationships among the early diverging lineages within Heteroptera (Li et al., 2012; Wang et al., 2016; Wang et al., 2017; Weirauch et al., 2018; Wheeler et al., 1993), Generating and analyzing comprehensive datasets with respect to both taxonomic and character sampling by using a large number of universal markers from throughout the genome has the potential to greatly advance our understanding of phylogenetic relationships across Hemiptera. Approaches using anchored hybrid enrichment (Lemmon et al., 2012) or ultraconserved elements (UCEs) (Faircloth et al., 2012) generate such data for relatively low costs, making them feasible for taxon-rich phylogenetic analyses.

UCEs are highly conserved across divergent taxa (Bejerano et al., 2004) which make them useful as anchors for target enrichment. They have been shown to be useful markers for comparison across diverse taxa in vertebrates (Alexander et al., 2017; Crawford et al., 2012; Crawford et al., 2015; Faircloth et al., 2012; Gilbert et al., 2015; McCormack et al., 2013; Moyle et al., 2016; Smith et al., 2014) and more recently in arthropods (Baca et al., 2017; Faircloth et al., 2015; Starrett et al., 2017; Van Dam et al., 2017). Sequence variability increases with distance from the conserved UCE (Faircloth et al., 2012), which allows for analyses at different phylogenetic scales, from deep divergence (Faircloth et al., 2013) to population level (Harvey et al., 2016; Manthey et al., 2016). While most UCE studies in arthropods have focused on the Hymenoptera (Blaimer et al., 2015; Blaimer et al., 2016; Bossert et al., 2017; Branstetter et al., 2017a; Branstetter et al., 2017b; Faircloth et al., 2015), bait sets designed for other groups have recently been used in empirical studies (Baca et al., 2017; Starrett et al., 2017; Van Dam et al., 2017), which show the promising utility and effectiveness of UCEs in non-vertebrates. Having a universal set of genetic markers for a diverse group like Hemiptera can help standardize the phylogenetic data available and make comparative studies across multiple projects, questions, and scales easier for researchers. Faircloth (2017) recently designed and in silico tested UCE bait sets for several arthropod orders including Hemiptera. Only two of the designed bait sets have been used to generate UCE loci from samples and evaluated [Arachnida; (Starrett et al., 2017) and Coleoptera; (Baca et al., 2017; Van Dam et al., 2017)]. Here, we expand such testing to the Hemiptera UCE bait set.

#### 2. Methods

#### 2.1. Bait and taxon sampling

Hemiptera UCE capture baits (Faircloth, 2017) consisting of 40,207 baits for 2731 loci were tested on 36 hemipteran samples representing three suborders and the seven heteropteran infraorders (Table 1, Supplementary Table S1). Taxa were chosen to include a mix of species closely related to the taxa used for bait design and more distantly related taxa to assess UCE efficacy across Hemiptera. We also included multiple individuals within two families, Coreidae (n = 9) and Reduviidae: Triatominae (n = 6), to assess the utility of the bait set for recovering shallower phylogenetic relationships.

#### 2.2. DNA extraction and library preparation

For most specimens, genomic DNA was extracted from ethanol preserved and recently pinned specimens using a Qiagen DNeasy kit,

and older pinned specimens using a Qiagen QIAquick PCR Clean Up kit. Specimens of Coreidae were extracted using a Puregene Solid Tissue kit (Supplementary Table S1). DNA concentration and quality were assessed on a Qubit, fragment analyzer, and a 1.5% agarose gel. Samples with higher molecular weight were fragmented on a Bioruptor UCD-300 sonication device (Diagenode) based on quality for 2–9 cycles of 30 s on/30 s off. Resulting fragments were in the range of 200–1000 bp.

Libraries were prepared with a KAPA Hyper Prep Kit (Kapa Biosystems) following manufacturer's protocol with a few modifications. Half volume reactions were performed on all samples. Universal TruSeq compatible adaptor stubs were ligated onto A-tailed DNA fragments. Adapter-ligated product was amplified using Illumina TruSeq compatible dual-indexed primers with modified 8 bp indexes (Glenn et al., 2016). PCR reactions were 25  $\mu L$  consisting of 10  $\mu L$  of adapter-ligated DNA, 12.5  $\mu L$  2X KAPA HiFi HotStart ReadyMix, and 2.5  $\mu L$  each of the 5  $\mu M$  dual-indexed primers. Thermocycler conditions were 98 °C for 45 s, followed by 14 cycles of 98 °C for 30 s, 60 °C for 30 s, and 72 °C for 30 s, and then a final extension of 72 °C for 1 min. All clean-up steps used Sera-Mag magnetic beads (Thermo-Scientific, Waltham, MA, USA). Post-PCR cleaned product was quantified on Qubit and equimolar amounts of 9–12 samples were combined into 500 ng pools.

#### 2.3. UCE enrichment and sequencing

Enrichments of library pools were performed using the MYbaits kit (MYcroarray, now Arbor Biosciences) following the manufacturer's protocol v3.01. Hybridizations were performed at 65 °C for 24 h. After hybridization, library pools were bound to Dynabeads M-280 Streptavidin magnetic beads (Life Technologies) for enrichment. Posthybridization enrichments were amplified in a 25  $\mu$ L volume reaction consisting of 10  $\mu$ L enriched DNA, 12.5  $\mu$ L 2X KAPA HiFi HotStart ReadyMix, and 2.5  $\mu$ L each of 5  $\mu$ M of Illumina P5/P7 primers. Amplification conditions were 98 °C for 45 s, followed by 16 cycles of 98 °C for 20 s, 60 °C for 30 s, and 72 °C for 60 s, and then a final extension of 72 °C for five minutes. Enriched and amplified library pools were quantified on Qubit and pooled in equimolar ratios. Libraries were sequenced using paired-end 150 bp reads on an Illumina HiSeq 3000 (Oklahoma Medical Research Foundation).

#### 2.4. Data processing and analysis

For clarification, we make use of the following terms to distinguish between the different data sets analyzed as part of this study: (1) empirical – newly generated UCE data for this study, (2) *in silico* – UCE data retrieved from Faircloth (2017), (3) transcriptome – UCE data retrieved from publicly available transcriptomes and protein-encoding portions of genomes.

Raw sequencing data were processed using PHYLUCE v1.5.0 (Faircloth, 2016) with associated software as incorporated in the pipeline. We used default values unless otherwise noted. Adaptors and low-quality bases were removed using Illumiprocessor (https://github. com/faircloth-lab/illumiprocessor). Reads were assembled using Trinity v2.0.6 (Grabherr et al., 2011). We aligned UCE loci with MAFFT (Katoh and Standley, 2013), changing the max divergence from 20% (for empirical + in silico dataset) to 40% (empirical dataset), and trimmed with GBLOCKS (Castresana, 2000; Talavera and Castresana, 2007). Data matrices that were 50% and 60% complete (i.e., single locus alignments contain at least this percentage of total taxa), were used for further maximum likelihood (ML) phylogenetic analysis using RAxML v8.1.20 (Stamatakis, 2014). To complement our taxon sampling and assess the capacity to integrate our data with existing genomic data, we reassembled transcriptomic data from nine paraneopteran taxa from Misof et al. (2014) (https://doi.org/10.5061/dryad.3c0f1) using Trinity v2.0.6 (Grabherr et al., 2011). We also downloaded the proteincoding sequences of the genome of Bemisia tabaci from GenBank (Xie

Table 1
Summary results of each sample in the empirical data set. Suborder names are abbreviated to the first three letters. Infraorder names are abbreviated by removing -morpha.

Suborder	Infraorder	Family	Genus	Species	Reads Passed	l QC	Contigs	UCE Loci	On-Target	Missing Da
Auc.	Cicado.	Cicadellidae	Stephanolla	rufoapicata	930,754	91.23%	4209	1059	25.16%	41.22%
Het.	Cimico.	Anthocoridae	Xylastocoris	sp.	800,230	90.14%	2594	697	26.87%	30.46%
Het.	Cimico.	Cimicidae	Cimex	adjunctus	6,127,852	96.72%	5587	1216	21.76%	31.42%
Het.	Cimico.	Miridae	nr. Sophianus	sp.	3,164,378	92.44%	2643	305	11.54%	61.73%
Het.	Cimico.	Nabidae	Alloeorhynchus	sp.	2,590,442	89.28%	2278	570	25.02%	34.36%
Het.	Cimico.	Reduviidae	Dipetalogaster	maximus	2,040,344	96.88%	4317	913	21.15%	47.59%
Het.	Cimico.	Reduviidae	Panstrongylus	geniculatus	1,177,566	89.61%	3026	1177	38.90%	24.6%
let.	Cimico.	Reduviidae	Psammolestes	arthuri	8,484,296	97.83%	4164	1588	38.14%	21.5%
Het.	Cimico.	Reduviidae	Rhodnius	robustus	3,195,092	89.93%	3793	1508	39.76%	13.69%
let.	Cimico.	Reduviidae	Triatoma	dimidiata	2,971,874	92.37%	4768	1401	29.38%	22.83%
Het.	Dipsocoro.	Ceratocombidae	Trichotonannus	sp.	920,424	91.64%	1389	265	19.08%	58.74%
Het.	Dipsocoro.	Schizopteridae	Hoplonannus	sp.	657,912	90.31%	1085	271	24.98%	62.46%
Het.	Enicocephalo.	Enicocephalidae	Oncylocotis	sp.	1,099,202	90.89%	1235	347	28.10%	50.32%
Het.	Gerro.	Gerridae	Gerris	sp.	1,721,476	91.89%	4080	1290	31.62%	34.35%
Het.	Gerro.	Hebridae	Hebrus	ifellus	2,034,830	87.07%	2453	481	19.61%	45.38%
let.	Leptopodo.	Leptopodidae	Valleriola	sp.	1,956,488	90.98%	2326	601	25.84%	40.85%
Het.	Nepo.	Belostomatidae	Abedus	indentatus	1,742,898	88.58%	1908	577	30.24%	38.01%
let.	Nepo.	Corixidae	Micronectus	sp.	2,470,014	91.99%	2270	502	22.11%	45.21%
Het.	Pentatomo.	Aradidae	Mezira	sp.	1,199,180	93.37%	1334	381	28.56%	57.49%
Het.	Pentatomo.	Coreidae	Anisoscelis	flavolineatus	1,344,146	89.15%	5381	698	12.97%	34.55%
Het.	Pentatomo.	Coreidae	Anoplocnemis	sp.	1,433,772	92.32%	6701	1035	15.45%	15.16%
Het.	Pentatomo.	Coreidae	Mozena	nr. lineolata	1,528,344	88.13%	6001	967	16.11%	22.92%
Het.	Pentatomo.	Coreidae	Acanthocephala	thomasi	2,764,968	92.07%	8911	1215	13.63%	16.93%
Het.	Pentatomo.	Coreidae	Acanthocephala	femorata	839,558	91.11%	4037	814	20.16%	25.95%
Het.	Pentatomo.	Coreidae	Lycambes	sargi	1,081,110	91.00%	4890	887	18.14%	19.28%
Het.	Pentatomo.	Coreidae	Mygdonia	tuberculosa	1,301,796	92.40%	5855	1046	17.87%	10.03%
Het.	Pentatomo.	Coreidae	Stenoeurilla	nr. prolixa	722,064	91.30%	3152	944	29.95%	18.1%
Het.	Pentatomo.	Coreidae	Thasus	neocalifornicus	1,779,776	90.48%	5862	1163	19.84%	14.71%
Het.	Pentatomo.	Cydnidae		,	1,769,802	90.76%	2135	946	44.31%	26.49%
Het.	Pentatomo.	Lygaeidae	Oncopeltus	sp.	1,267,356	91.94%	4301	1696	39.43%	21.45%
Het.	Pentatomo.	Pentatomidae	Brochymena	sp.	1,764,158	92.78%	4784	1460	30.52%	26.68%
Het.	Pentatomo.	Pentatomidae	Euschistus	latimarginatus	1,511,668	94.13%	4665	1437	30.80%	24.88%
Het.	Pentatomo.	Pachygronthidae	Oedancala	sp.	2,149,304	91.70%	2223	605	27.22%	33.88%
Ste.	[S.F.] Psylloidea	Aphalaridae	Glycaspis	brimblecombei	989,064	89.77%	3436	776	22.58%	35.76%
Ste.	[S.F.] Aphidoidea	Aphididae	Aphis	fabae	3,858,732	92.57%	3053	1,240	40.63%	27.98%
Ste.	[S.F.] Psylloidea	Psyllidae	Heteropsylla	texana	775,336	91.82%	2967	479	16.14%	55.69%
Γhy.		Phlaeothripidae	Klambothrips	myopori	171,672	88.50%	887	117	13.19%	81.45%
				Averages	1,955,078	91.49%	3641	883	25.32%	34.44%

et al., 2017). Next, we used a custom pipeline (https://github.com/ AlexKnyshov/main\_repo) that uses tblastx to search for homologous loci in transcriptomes. We extracted the best matching amino-acid coding portion of sequences from transcriptomes that matched UCE loci with an e-value of 1e-10 or less, which allowed for inclusion of even short matching sequences in amino acid space. After excluding Xenophysella greensladeae, the taxon with the fewest UCE loci recovered and the worst assembly, we realigned the data using the MAFFT E-INS-i algorithm and trimmed the alignments from the end to include at least 80% taxon representation. We used the best of 20 ML trees, followed by 100 bootstrap replicates, using the GTRGAMMA model with genes partitioned by locus. Furthermore, for the four genomes with annotated coding sequences on GenBank that were used in bait design, we used blastn to assess whether the UCE loci corresponded with coding regions. We used an e-value cutoff of 1e-30 (equivalent to an exact match of a string of  $\sim 75$  base pairs). We also conducted a cross-species check for the pair of the most closely related genome and transcriptome included in our analysis, using tblastx and an e-value cutoff of 1e-10 (as used in our analysis to find corresponding loci in transcriptomes). Analyses were conducted on the University of Georgia and the University of Connecticut high-performance computer clusters.

### 3. Results

#### 3.1. UCE recovery

Summary results for newly generated UCE data are presented in Table 1. We produced 2,114,434 raw paired-end reads per sample on

average, with an average of 1,955,078 (91.49%) passing filter. Assemblies resulted in an average of 3641 contigs per sample. We recovered a total of 2721 UCE loci across all taxa. Loci per sample ranged between 265 and 1696 (average = 904) for hemipteran taxa, with 117 loci from the thysanopteran outgroup for which new data was gathered. From the 50% and 60% complete data matrices, we recovered 532 and 220 UCE loci from the empirical data set, respectively, while the inclusion of in silico data increased recovery to 744 and 325 UCE loci, respectively. We found an average of 34.44% (33.13% for Hemiptera) missing data between UCE alignments, with a range of 10.03% to 62.46% within Hemiptera and 81.45% for the outgroup. We recovered more UCE loci than average for two dried specimens used in this study (Table 1, Supplementary Table S1). Summary results of empirically generated UCE data processed with in silico data are presented in Supplementary Table S2. Summary numbers for parsimony and invariant sites for each data matrix are reported in Supplementary Table

Within Heteroptera, UCE loci numbers varied between the infraorders, e.g., from a low of 268 loci (Dipsocoromorpha) to a high of 1042 loci (Cimicomorpha), corresponding to the amount of missing data within each group (Supplementary Table S4). Overall, the number of loci recovered was less than expected when compared to the Faircloth (2017) in silico study. We found the average number of loci, compared to the *in silico* study, to be 73.33% within the same genus, 68.02% within the same family, 52.74% within the same suborder, 51.28% within the order Hemiptera, and 13.54% within the Thysanoptera (Supplementary Table S5).

Table 2
Summary results of UCE loci found in annotated protein-coding sequences of genomes (top), and UCE loci designed for *Gerris buenoi* that matched to the *Velia caprai* transcriptome (bottom).

UCE loci vs. CDS of self										
Species	# of target UCE loci	# of transcripts	# of blastn hits with $1e-30$ cutoff	% match						
Acyrthosiphon pisum	2059	30,790	2050	99.56						
Cimex lectularius	2283	26,626	2273	99.56						
Diaphorina citri	1545	21,652	1364	88.28						
Halyomorpha halys	2257	27,675	2233	98.94						
UCE loci vs. Velia transcriptome										
Species	cies # of target UCE loci		# of tblastx hits with $1e-10$ cutoff	% match						
Gerris buenoi	erris buenoi 2266		1599	70.56						

#### 3.2. UCEs from transcriptome data

The results of extracting UCE loci from 10 transcriptomes are shown in Supplementary Table S6. We recovered the most UCE loci from the coding sequences of the Bemisia tabaci genome, most likely due to its completeness compared to transcriptomes based only on cDNA sequencing (88%, or 287 of the 325 loci, used in recovering the tree). We excluded Xenophysella greensladeae due to the low N50 of the assembly and the few UCE loci we were able to recover. On average, we recovered 71.5% of the 325 loci used in reconstructing the phylogeny across the remaining eight transcriptomes. For the four annotated genomes, we found that an average of 96.5% UCE loci of the  $\sim 1500-2300$  per taxon contained a match to an annotated protein-coding sequence (Table 2). With a cross-species check of a closely related genome and transcriptome pair, we found that 70.5% of the 2266 UCE loci designed for Gerris buenoi could be found in the transcriptome of Velia caprai (Table 2).

#### 3.3. Phylogenetic trees and taxa relationships

The phylogenetic tree for the full set of empirical, *in silico*, and transcriptome data is shown in Fig. 1. Bootstrap values were 100% for all but two (*Glycaspis + Pachypsylla* and *Brochymena + Halyomorpha*) of the shallow evolutionary relationships (Fig. 1) with a trend of decreasing support values with increased evolutionary depth. Trees for each data set showed mostly consistent topologies with similar support, trending toward more support at deeper phylogenetic nodes when additional taxa are added (i.e., addition of *in silico* and transcriptome data). The inclusion of this additional data did help to recover the well-supported and uncontentious relationship of Sternorrhyncha as sister to Auchenorrhyncha + Heteroptera which was not recovered otherwise in analyzing the newly acquired data in combination with *in silico* data or by itself (Supplementary Figs. S1 and S2).

Our analysis recovered a monophyletic Hemiptera, with Sternorrhyncha highly supported as the sister group to Auchenorrhyncha + Heteroptera. Support for Auchenorrhyncha + Heteroptera was weak (68%). Inter-infraorder support within Heteroptera ranged from 77 to 100%. We recovered with high support a monophyletic Geoheteroptera (Leptopodomorpha + (Cimicomorpha + Pentatomomorpha)), the land bugs, which are sister to a clade comprising the four remaining heteropteran infraorders. A strongly supported clade comprising Enicocephalomorpha, Dipsocoromorpha, and Gerromorpha) (GED clade; 100%) was recovered and moderately supported (77%) as the sister group of Nepomorpha. No topological differences were observed between phylogenetic trees produced using 50% versus 60% data matrices.

The results of intra-familiar level sampling of Reduviidae that focused on the subfamily Triatominae strongly supported (both 100%) a Rhodnius + Psammolestes clade as sister to Panstrongylus + (Dipetalogaster + Triatoma). For Coreidae, our analysis, which includes

two subfamilies and six tribes, recovered all relationships with 100% support. Both species of *Acanthocephala* (Acanthocephalini) were recovered as sister to one another. The genera *Mygdonia* and *Anoplocnemis* were also recovered as sister taxa, supporting a monophyletic Mictini, which is sister to *Anisoscelis* + (*Stenoeurilla* + *Acanthocephala*). The only sampled representative of the subfamily Meropachyinae, *Lycambes sargi*, was nested within the coreine tribe Nematopodini, which together formed a clade sister to all other sampled coreids.

#### 4. Discussion

#### 4.1. Study rationale

Ultraconserved elements have been widely used for phylogenetic research among vertebrate groups during the past several years, with arthropod UCEs being developed comparatively more recently. Research in the area of arthropod UCEs is still largely open and untested for the vast majority of taxonomic groups. While several UCE bait sets have been empirically evaluated (Baca et al., 2017; Faircloth et al., 2015; Starrett et al., 2017; Van Dam et al., 2017), the designs for Diptera, Hemiptera, and Lepidoptera (Faircloth, 2017) have yet to be similarly evaluated. We demonstrate the utility of the Hemiptera UCE bait set (Faircloth, 2017) across divergent hemipteran taxa.

# 4.2. Recovery of UCE loci

We obtained UCE loci from all taxa sequenced and the number of loci recovered for each sample was correlated with sequencing read depth, consistent with previous UCE studies. We were also able to recover a large number of loci from 25 + year old museum specimens, which will facilitate studies of heteropteran taxa in the future. The taxa for which we recovered the most UCE loci were frequently those with the closest relationship to the species used for bait design, e.g., Oncopeltus sp. and Rhodnius robustus are congeneric with Oncopeltus fasciatus and Rhodnius prolixus, respectively, and were the two taxa with the most UCE loci recovered. The amount of missing UCE data for taxa sampled is correlated (Pearson r = 0.477, p = 0.003) with greater phylogenetic divergence from taxa used to design baits (Supplementary Table S5), which along with some nodes at deeper evolutionary depths having lower support, highlights the importance of including phylogenetically diverse taxa when developing baits for lineages as old as Hemiptera (300 mya; (Misof et al., 2014). Despite the missing data, however, most nodes had 100% support, and all but four exceeded 70%

On average, we obtained about two-thirds the number of loci we expected when compared to the *in silico* study (Faircloth, 2017) and 7.4 times less sequencing data than the generated *in silico* data. The amount of UCE loci recovered positively trended (Pearson r = 0.328, p = 0.054) with the amount of coverage. With increased sequencing

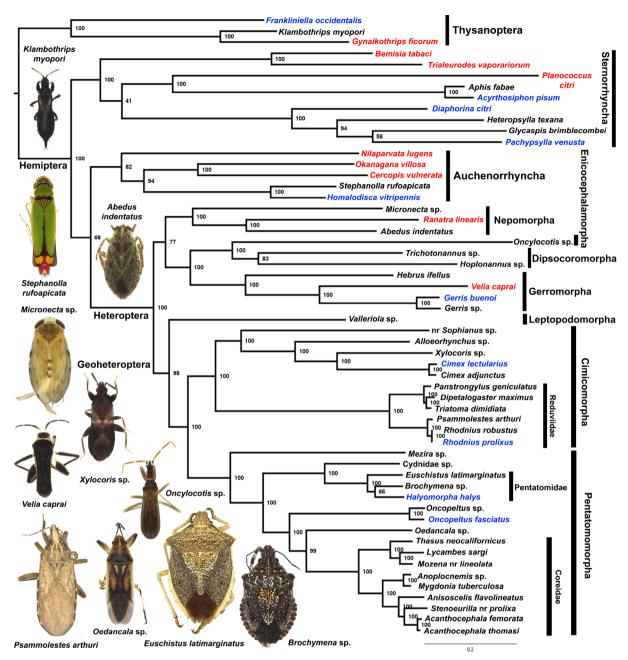


Fig. 1. Best Maximum Likelihood tree from a search of 20 trees with 100 bootstraps of the 80% data matrix of samples using empirical, *in silico* (blue), and transcriptome UCE data (red). (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

depth for certain samples, it is likely we would obtain more unique UCE loci, and the gap between *in silico* expected and empirically obtained would diminish, though even at this level of coverage the data can resolve most relationships. Changes to the assembly methods and enrichment stringency may also increase the number of loci collected across Hemiptera.

We recovered matching sequences for about 90% of the 325 UCE loci from the empirical + *in silico* dataset for which we conducted a search on amino acid coding sequences of the *Bemisia tabaci* genome. We also found an average of 96.5% UCE loci matching annotated protein-coding sequences with the corresponding percentages in two of the four examined taxa as high as 99.6%. We further investigated the only nine loci with no matches in the annotations of the aphid genome, which was the genome with the fewest number of loci without matches to clarify the nature of these UCE loci. We found that seven of these nine loci matched proteins annotated in other aphid species and two

loci corresponded with spliceosomal RNAs (U11 and U12). Thus for the pea aphid at least 2,057 of 2,059 UCE loci (99.9%) contain a protein-encoding core. We suspect that lower percentages found in some transcriptome and genome assemblies can be attributed to incomplete annotations, assemblies, or limited sequencing efforts. This reflects a fundamental difference of UCE loci in vertebrates where UCEs are primarily noncoding yet conserved elements versus invertebrates, where they are primarily protein-coding, as is being increasingly recognized (Bossert and Danforth, 2018).

# 4.3. Systematics of Hemiptera

Recent published studies have proposed several alternative hypotheses for relationships within Hemiptera, and particularly within the Heteroptera (Wang et al., 2017; Weirauch et al., 2018). Using a large molecular dataset of loci not previously employed that samples broadly

throughout the genome, our analyses test these relationships and corroborate some. For example, our phylogenetic hypothesis is congruent with many recently published topologies (Misof et al., 2014; Wang et al., 2017; Weirauch et al., 2018) in supporting a monophyletic Auchenorrhyncha as sister to the Heteroptera (Coleorrhyncha was not included in this analysis, so their position was not evaluated). Consistent with most analyses in recent decades (reviewed in Weirauch et al., 2018), relationships within the more densely sampled Heteroptera strongly support the monophyly of Geoheteroptera, the land bugs, which include the great majority of the extant species diversity in this suborder. Also congruent with some recently published phylogenetic hypotheses is the well-supported clade formed by the Gerromorpha. Enicocephalomorpha, and Dipsocoromorpha [GED clade: (Wang et al., 2017; Weirauch et al., 2018)], although relationships within this clade differ between analyses with either Dipsocoromorpha (this study; Wang et al., 2017) or Gerromorpha (Weirauch et al., 2018) being recovered as sister group to the two remaining infraorders. However, one of the most controversial issues that has significant impact on our understanding of character evolution within the Heteroptera remains unresolved: in contrast to recent phylogenies that either supported the GED clade (Wang et al., 2017) or the aquatic Nepomorpha (Weirauch et al., 2018) as the sister group to all remaining Heteroptera, the current analysis modestly (77%) supported Nepomorpha as sister to the GED clade, putting forward a third alternative hypothesis. Taxon sampling within the Geoheteroptera in our analysis is limited, but relationships conform with currently accepted hypotheses (e.g., Aradidae as sister to Trichophora, Pentatomoidea sister to all other Trichophora, Miroidea and Cimicoidea + Naboidea clade are sister taxa within Cimicomorpha [Weirauch et al., 2018]).

Intra-familial relationships within the reduviid subfamily Triatominae are consistent with previous phylogenetic analyses of the group based on fewer loci (Georgieva et al., 2017; Justi et al., 2014). For the Coreidae, relationships among and within the four subfamilies and 37 tribes have remained unresolved across morphological and single-gene phylogenetic studies (Li, 1997; Pan et al., 2007; Souza et al., 2016). We expected and recovered a sister group relationship between the two sampled species of Acanthocephala (Acanthocephalini). Phylogenetic analyses during the past couple of decades have also supported the monophyly of the Micitini, albeit with different taxon sampling compared to our study that included Anoplocnemis and Mygdonia (Li, 1997; Pan et al., 2007). Our analysis recovered a paraphyletic Coreinae with respect to Lycambes (Meropachyinae), a result that has been supported in some previous analyses (Li, 1996, 1997). However, in these previous studies, Meropachyinae was supported as the sister group to Chariesterini (not included in our analysis), whereas our study finds the subfamily to be nested within the Nematopodini (Thasus and Mozena).

Furthermore, our results show congruent topologies across data sets, indicating the usefulness of UCEs even with a relatively small number of samples. However, increasing the taxonomic representation with the addition of *in silico* and transcriptome data improved support for many deep phylogenetic nodes, which may improve with further additions. More importantly, the ability to sample UCE loci from other genomic resources expands possibilities of taxonomic representation and improves the utility of UCEs for phylogenomic studies.

# 4.4. Conclusion

Our study adds to the accumulating evidence that custom UCE bait sets can resolve most phylogenetic nodes with high bootstrap support, including baits designed for invertebrate groups. We also have shown the capability of integrating our invertebrate UCE loci with proteincoding data from transcriptomes. As phylogenomic datasets become more common and varied in structure, the capability of combining large genetic datasets with others from different sources will become more important to generate a complete tree of life, which represents another strength of this approach. Because the number of loci recovered

empirically is significantly lower than expected, we recommend researchers explore various options to improve loci recovery as needed based on study objectives. For example, comparing different assembly methods, less stringent enrichment conditions, and incorporating additional taxa to improve phylogenetic relationships. Certain taxonomic clades within Hemiptera may also benefit from a designed subset of UCE baits as more genomic resources become available. However, we have shown that established relationships within Hemiptera can be recovered with relatively few loci, which provide broad application of the current bait set to researchers.

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#### Data accessibility

Raw sequencing reads are deposited in Sequence Read Archive (https://www.ncbi.nlm.nih.gov/sra/SRP161492). All configuration files and scripts, milestone data used for analyses, and a workflow are available on Dryad Digital Repository (https://doi.org/10.5061/dryad. 425vg4m). Scripts used for transcriptome analyses are on the github repository of Alexander Knyshov (https://github.com/AlexKnyshov/main repo).

#### Appendix A. Supplementary material

Supplementary data to this article can be found online at https://doi.org/10.1016/j.ympev.2018.10.026.

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