

Comparative validation of the *D. melanogaster* modENCODE transcriptome annotation

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Accurate gene model annotation of reference genomes is critical for making them useful. The modENCODE project has improved the *D. melanogaster* genome annotation by using deep and diverse high-throughput data. Since transcriptional activity that has been evolutionarily conserved is likely to have an advantageous function, we have performed large-scale interspecific comparisons to increase confidence in predicted annotations. To support comparative genomics, we filled in divergence gaps in the *Drosophila* phylogeny by generating draft genomes for eight new species. For comparative transcriptome analysis, we generated mRNA expression profiles on 81 samples from multiple tissues and developmental stages of 15 *Drosophila* species, and we performed cap analysis of gene expression in *D. melanogaster* and *D. pseudoobscura*. We also describe conservation of four distinct core promoter structures composed of combinations of elements at three positions. Overall, each type of genomic feature shows a characteristic divergence rate relative to neutral models, highlighting the value of multispecies alignment in annotating a target genome that should prove useful in the annotation of other high priority genomes, especially human and other mammalian genomes that are rich in noncoding sequences. We report that the vast majority of elements in the annotation are evolutionarily conserved, indicating that the annotation will be an important springboard for functional genetic testing by the *Drosophila* community.

[Supplemental material is available for this article.]

The value of sequenced and assembled genomes is increased by high-quality annotation of genes and their possible functions (Picardi and Pesole 2010). Approximately 13,000 gene models developed by a combination of ab initio predictions and expert manual curation were included in the first release of the *D. melanogaster* genome (Adams et al. 2000), and more than a decade of input from members of the *Drosophila* research community and the FlyBase curators have resulted in an ever improving annotation

(McQuilton et al. 2012). However, results from early microarray expression profiling studies demonstrated that transcribed elements were unannotated (Andrews et al. 2000; Hild et al. 2003; Stolc et al. 2004). Evolutionary conservation in the genus has been important for improving annotation of *D. melanogaster* (Pollard et al. 2006; *Drosophila* 12 Genomes Consortium 2007; Stark et al. 2007; Zhang et al. 2007). As part of a major effort to improve the annotation, expression profiles provided in the first phase of modENCODE (Cherbas et al. 2011; Graveley et al. 2011) and by complementary studies (Daines et al. 2011) added thousands of new exons to the annotation, especially untranslated 5' and 3'

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regions and noncoding RNAs, as well as confirming the expression of most of the previously annotated transcripts (McQuilton et al. 2012). Importantly, the splice junction spanning reads in those RNA-seq profiles revealed a much richer set of processed transcripts. Additional RNA-seq data sets, along with cap analysis of gene expression (CAGE-seq) and full-insert cDNA sequencing, have been used to generate the modENCODE *D. melanogaster* transcriptome annotation version 2 (MDv2), including MDv3 (Brown et al. 2014). This modENCODE annotation was used to support analysis in the current set of publications from the Consortium. Here we evaluate the biological relevance of this annotation.

Biological tests of annotations are important because not all transcribed regions are functional genes. A classic example is the expressed pseudogene, which can arise by gene duplication followed by degeneration of one redundant copy by random accumulation of mutations (Balakirev and Ayala 2003; Zheng et al. 2007). Functionless transcripts might also arise from transposon promoters (Emera and Wagner 2012; Hancks and Kazazian 2012). It is also reasonable to assume that transcriptional errors occur at a nonzero rate. Core promoter elements use a number of motifs (e.g. TATA, Initiator [INR], and downstream promoter element [DPE]) that are often precisely positioned relative to transcription starts in *Drosophila* (FitzGerald et al. 2006; Ohler 2006; Ohler and Wassarman 2010). These elements direct RNA polymerase to the promoter, but such simple sequence motifs will also appear in random sequence and might be easily generated de novo by mutation. Indeed, the precise nucleotide position of transcript initiation at bona fide promoters is often probabilistic (Libby and Gallant 1991; Kanamori-Katayama et al. 2011), and it has been suggested that 90% of RNA Pol II molecules are initiating nonspecifically rather than from conventional promoters in yeast (Struhl 2007). Such levels of nonspecific initiation arising as a simple consequence of neutral accumulation of sequence changes and high tolerance for spurious transcription within the organism might well result in transcripts having no biological function.

Comparative data from related organisms can provide crucial evidence of function: Genomic elements that are conserved at the level of sequence and expression have withstood mutation for millions of years and are therefore likely to be under purifying selection. Although the *Drosophila* genus is well represented in the pantheon of sequenced and assembled genomes, with 12 species spanning 40–154 million years of evolutionary time (Adams et al. 2000; Richards et al. 2005; *Drosophila* 12 Genomes Consortium 2007; Obbard et al. 2012), our ability to identify regions of the genome that arose by descent from common ancestral sequences declines with increasing sequence divergence. In addition, inherent statistical problems with short elements make them increasingly difficult to align at greater evolutionary distances. Conversely, closely related genomes may not have had sufficient time to lose deleterious or nonfunctional elements due to insufficiently strong purifying selection. Additionally, functional DNA elements can tolerate different amounts of sequence change; for example, one might expect that UTRs will accumulate mutations more readily than CDSs, which means that there is no perfect single evolutionary divergence for comparative validation. Finally, gene losses and gains in particular lineages mean that the probability of finding *D. melanogaster* orthologs will increase with the number of species examined. We report the sequencing and assembly of eight additional *Drosophila* species targeted to increase resolution at intermediate evolutionary distances from *D. melanogaster*. We developed RNA-seq profiles from 81 samples of 15 *Drosophila* species, generating ~6 billion mapped reads to sample

evolutionary distances and tissues with the aim of maximizing the number of transcript element types we could detect.

Our comparative approach revealed strikingly conserved sequence and expression for the vast majority of models in the *D. melanogaster* annotation, suggesting that most of the rich modENCODE transcriptome annotation is biologically relevant. These data also indicate that the *D. melanogaster* transcribed element annotation is nearing completion.

Results

Eight new genomes

Intermediate divergence times from *D. melanogaster* are under-represented among published *Drosophila* genomes. These might better balance the needs for accurate alignment to the *D. melanogaster* genome and accumulation of substitutions in sequences not constrained by selection. We therefore generated draft assemblies of *D. biarmipes*, *D. eugracilis*, *D. ficusphila*, *D. takahashii*, *D. elegans*, *D. rhopaloa*, *D. bipectinata*, and *D. kikkawai* (Supplemental Table S1). To compute evolutionary distances between these and previously sequenced species, we performed a Bayesian phylogenetic analysis of 41 orthologous coding genes to estimate divergence distance in substitutions per site (ss). We found that distances from *D. melanogaster* (Supplemental Table S2) span a broad range from 0.05 ss (*D. simulans*) to 1.10 ss (*D. mojavensis*), with multiple intermediate sampling points (0.30–0.63 ss) from the newly sequenced species (Fig. 1A). Pairwise whole-genome alignments of *D. melanogaster* to each of the new assemblies showed that our ability to align contiguous blocks of genome sequence decreased at a rate proportional to distance based on substitutions among orthologs (Fig. 1B), providing us with ample material for analysis of expression from these aligned genome segments.

D. melanogaster adults show rich transcriptional diversity in RNA-seq data sets (Daines et al. 2011; Graveley et al. 2011). Therefore, as a cost-effective sampling strategy, we performed RNA-seq on poly(A)⁺ RNA (Supplemental Table S3) from adult whole females and males (34–172 million mapped reads for each sex) of all eight of the newly assembled and six of the previously assembled genomes (*D. simulans*, *D. yakuba*, *D. ananassae*, *D. pseudoobscura*, *D. virilis*, and *D. mojavensis*), as well as previously published RNA-seq data for *D. pseudoobscura* and *D. mojavensis* head samples (Graveley et al. 2011). *D. melanogaster* reads reported here are independent from those used for the annotation (Brown et al. 2014). To assay stage- and tissue-biased expression, we also performed poly(A)⁺ RNA-seq on samples from mixed-sex embryos or several dissected tissues from the 14 non-*melanogaster* species (Supplemental Table S4). To estimate the conservation of gene expression across samples and species, we clustered expression values in log₂ reads per kb per million (RPKM) for the first CDS exon of 3223 orthologous genes present in the genomes of all 15 species (Supplemental Table S5). We found striking conservation of expression across species and samples (Fig. 1C). For example, ovary and testis samples from the distantly related *D. simulans* and *D. pseudoobscura* showed top-level branching demonstrating that tissue-specific expression of this subset of highly conserved genes in the gonad is constrained at a distance of at least 0.68 ss. Collectively, we obtained ~6 billion mapped RNA-seq reads with a minimum of 168 million uniquely mapped reads for each species (Fig. 1D) to help ensure detection of low abundance transcripts. We used comparative data to validate the modENCODE elements in the *D. melanogaster* genome (Fig. 1E; Supplemental Tables S6–S10) by testing

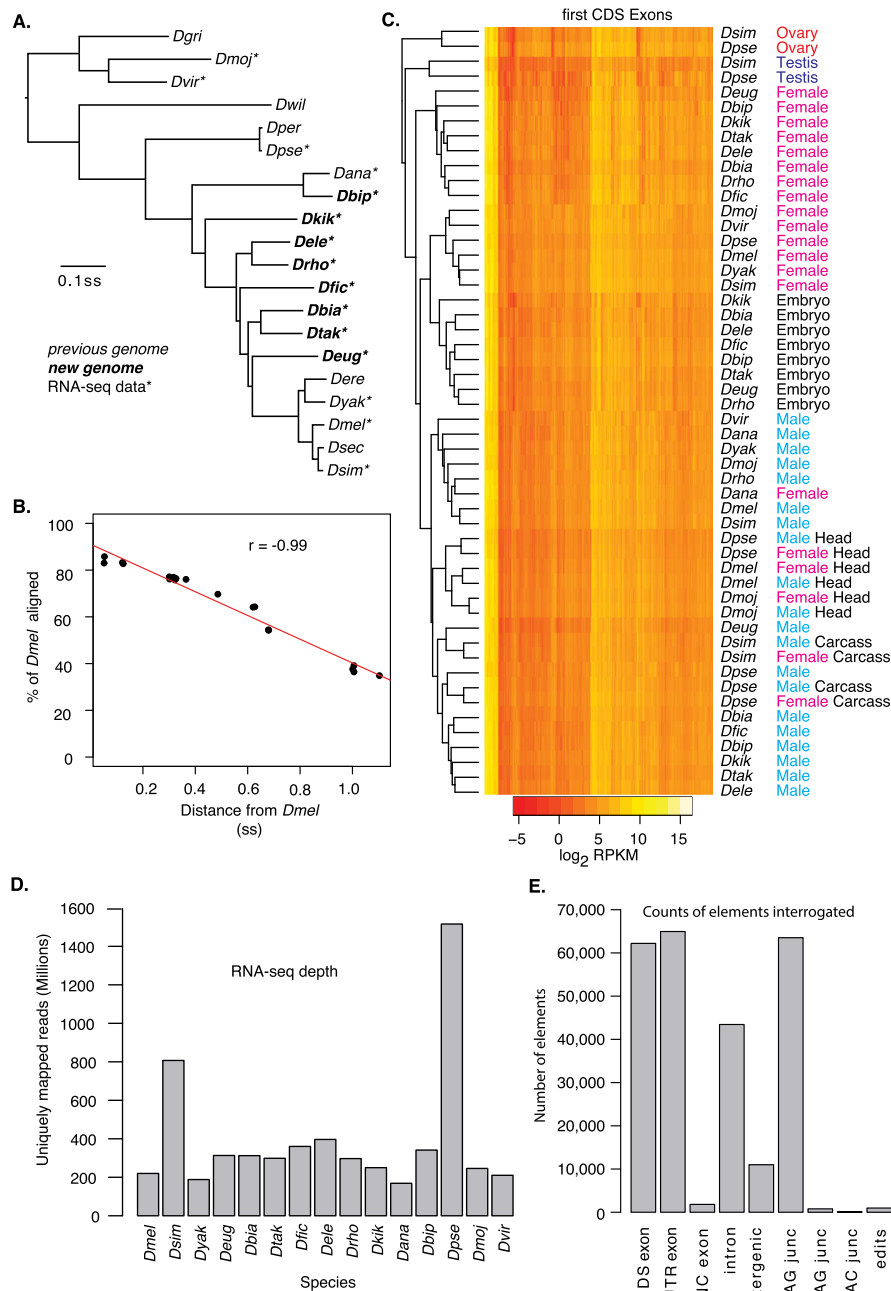


Figure 1. Genome assemblies and RNA-seq. (A) Bayesian phylogenetic tree of 20 sequenced *Drosophila* species (four letter abbreviations). All nodes are supported by 100% posterior probabilities. Scale bar indicates phylogenetic distance in substitutions per site (ss). Previously (italics) and newly assembled (bold italics) genomes, and those with supporting RNA-seq data (asterisk) are indicated. (B) Scatterplot showing alignment versus phylogenetic distance from *D. melanogaster* (linear trendline in red). (C) Heatmap and hierarchical clustering of expression values for 3223 first coding exons from the indicated samples. Adult ovary (dark red) and testis (dark blue) included developing germ cells and somatic gonadal cells and internal reproductive tracts derived from the genital disc. Females (pink) and males (light blue) were whole adults, embryos were unsexed, heads were from adults, and carcasses were all adult tissues remaining after removal of the gonads and internal reproductive tract. RPKM scale is shown for 15 species. The distance scale for hierarchical leaves was arbitrary. (D) Sequencing depth by species. A limited number of RNA-seq reads from heads (20.5 million reads for *D. melanogaster*, 28.4 million reads for *D. pseudoobscura*, and 51.6 million reads for *D. mojavensis*) were previously published (Graveley et al. 2011). The remaining reads are reported here for the first time. (E) The number of each element type from the modENCODE version 2 (MDv2) annotation. We examined the conserved sequence and expression characteristics of all such elements. For purposes of analysis, exons with both UTR and CDS sequences were split.

whether the sequence of these elements was conserved in other species and whether elements conserved at the sequence level also showed expression. We use the term “validation” to indicate that we observed expression in at least one other species (>95% of the aligned element covered by at least one RNA-seq read). Validation is evidence that an element was not annotated due to experimental artifacts such as species-specific alignment error. We also developed models to estimate neutral divergence rates for elements. We use the term “conservation” to indicate that an element shows significantly better alignment and expression level than the neutral model would predict ($P < 0.05$).

Validation of transcribed elements

The degree of *D. melanogaster* genomic element alignment to the genomes of other species depended both on evolutionary distance and element type (Fig. 2A). For example, the percentage of aligned CDS exons was high in all species and correlated well with evolutionary distance from *D. melanogaster* ($r = -0.93$). Alignment of other *D. melanogaster* transcript element types was significantly lower (CDS > NC > UTR > intron > intergenic) but followed the same basic pattern of decreasing alignment with increasing distance. The percentage of alignable elements that were expressed in other species also depended on element type (Fig. 2B), with CDS exons showing the highest expression conservation (CDS > UTR > NC \approx intron > intergenic). As a result of the correlation between evolutionary distance and alignment, our ability to identify *D. melanogaster* annotated elements in other species tracked phylogenetic distance very closely (Fig. 2C). Overall, we found sequence and expression evidence validating 98% of *D. melanogaster* CDS exons, 86% of UTR exons, 62% of NC exons, 52% of introns, and 15% of intergenic regions (Supplemental Table S11).

Coding exons were usually aligned and expressed in all species examined. Indeed, 50% of all CDS exons were expressed in at least 60 different samples (Fig. 2D). These data suggest that validating annotation of the coding portion of the genome can be saturated relatively easily, and is essentially complete, due to high conservation of sequence and abundant transcription. The major differences between CDS exons in FlyBase (McQuilton

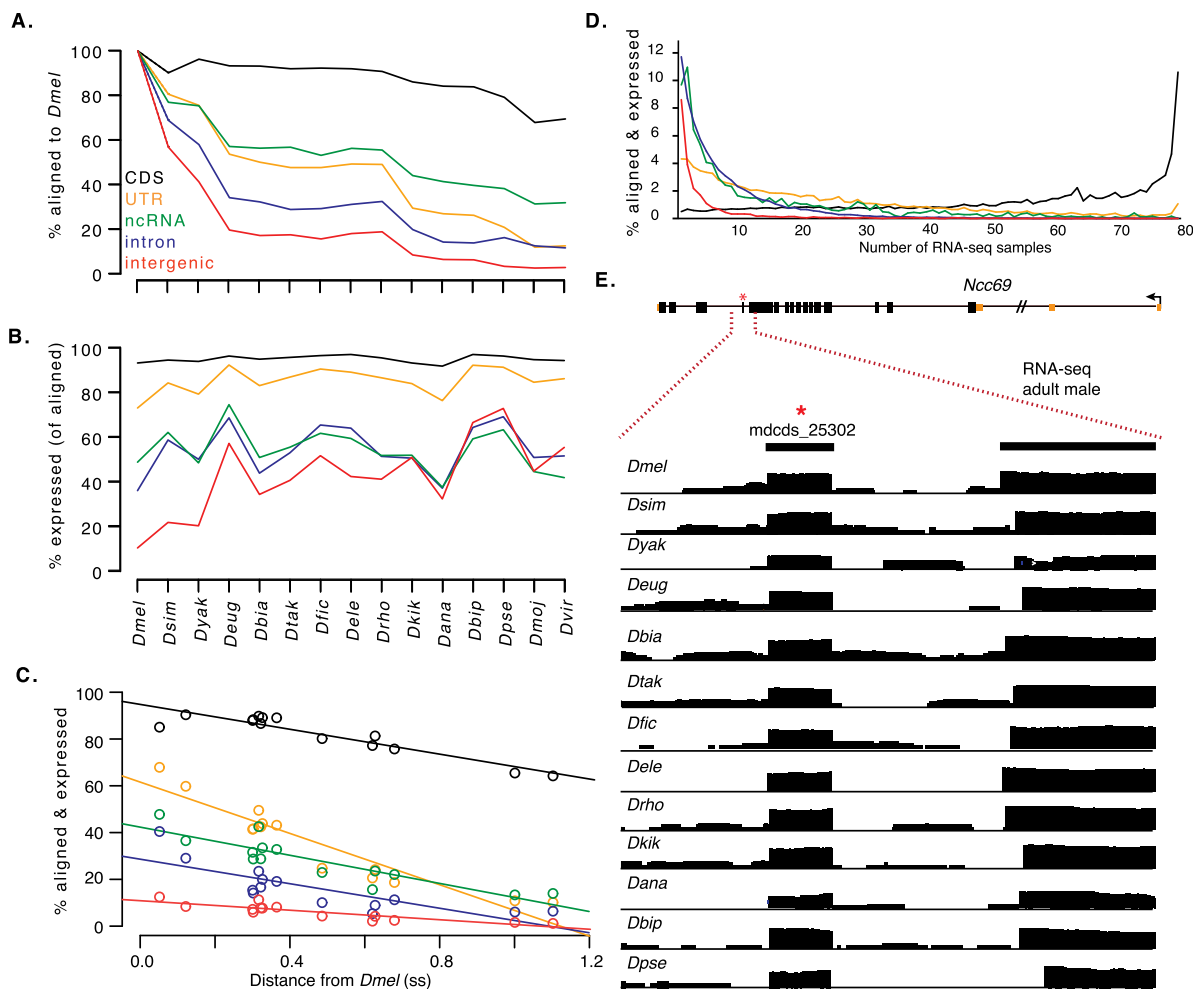


Figure 2. Exon validation. (A) Percentage of MDv2-annotated CDS exons (black), UTR exons (orange), ncRNA exons (green), introns (blue), and intergenic regions (red) that align in the indicated genome. (B) Percentage of aligned regions expressed (95% element coverage). (C) Percentage of aligned and expressed for each element type in each non-*melanogaster* species, plotted against phylogenetic distance from *D. melanogaster* (Fig. 1E; Supplemental Tables S6–S10). (D) The distribution of aligned and expressed features in RNA-seq samples. (E) Gene model for *Ncc69* showing transcription start (arrow), UTR regions (orange fill), CDS (black fill), and introns (black line). Expression of MDv2 exon *mdcds_25302* (red asterisk) and flanking region (upstream 300 bp and downstream 150 bp) in 13 species. Log₂ scale RNA-seq coverage (arbitrary scale for illustration) in whole adult males of the indicated species.

et al. 2012) and MDv2 ($N = 16,661$) are restricted to boundaries (3' and 5' ends and splice junctions, which are explored later). Only 17 short CDS exons (range 30–306 nt, median = 60 nt) found in MDv2 were completely missing from the current FlyBase annotation. Short exons are inherently difficult to predict using gene finders but are detected empirically. As an example, the short 60-nt CDS exon in the *sodium chloride cotransporter 69* (*Ncc69*) locus was not annotated in FlyBase release 5.45. We located this exon in 16 of 20 *Drosophila* genomes, including 13 species for which we also had supporting RNA-seq data (Fig. 2E).

Neutral models for conservation of transcribed elements

Sequence and expression validation indicates that a particular element is a biochemical entity in *D. melanogaster*, but evidence of function requires a model. As a first step in the construction of a neutral model, we developed a conservation index (CI). For each species, we took the Boolean present/absent call for an element and multiplied by the distance from *D. melanogaster* (ss) and then

summed the scores by element, for a maximum possible score of ~ 7 . We then generated a frequency profile for each transcript element (Fig. 3A). Based on the simple determination of presence and expression, CDS exons showed the highest CIs, with the maximum number of elements at or near maximum. The UTR and NC exons showed a peak distribution at a conservation index < 0.5 ; however, there was an extended right tail in these distributions. Conservation of introns was slightly worse, but there was steady decay of the distribution of conservation indexes, such that very few introns had an index > 4 . Expressed intergenic regions showed the lowest conservation indexes, with $\sim 90\%$ of regions showing a conservation index < 0.5 and very few regions showing a conservation index > 1.5 . Although it is quite possible that expression of some intergenic regions is functionally important (see Discussion), a conservative approach is to assume that these regions represent the neutral or nearly neutral evolution of expression. Therefore we used the percentile of intergenic CI as a metric to assign a probability that a validated element was conserved due to selection (Fig. 3B). In the context of modENCODE, these values represent the

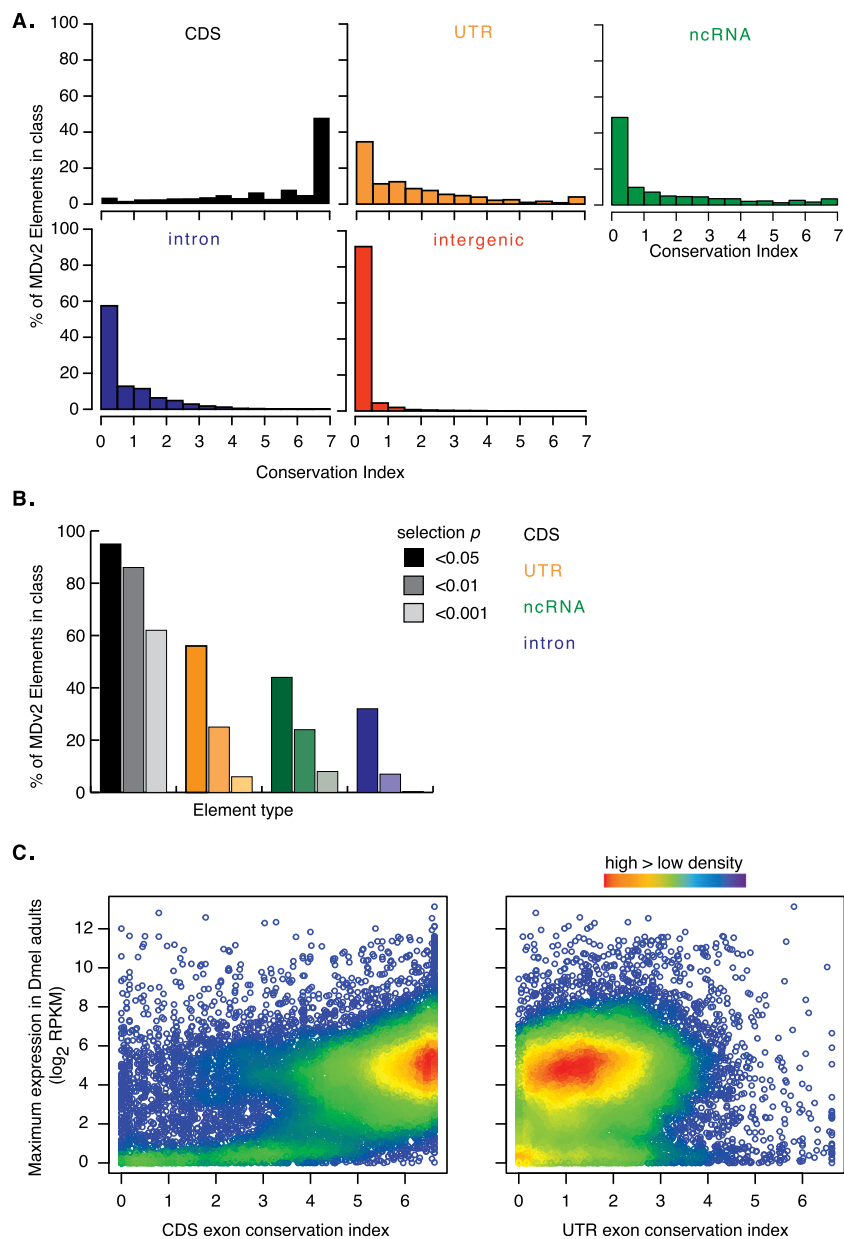


Figure 3. Exon conservation. (A) Frequency of conservation index (CI) scores for MDv2-annotated CDS exons (black), UTR exons (orange), ncRNA exons (green), introns (blue), and intergenic regions (red). (B) Frequency of probabilities that CI scores for CDS exons (shades of black), UTR exons (shades of orange), NC exons (shades of green), and introns (shades of blue) were similar to those of intergenic regions. The P -value is shown in the key (0.05, 0.01, 0.001 from left to right for each element) (Fig. 1E; Supplemental Tables S6–S10). (C) Density plots illustrating the relationship between CDS and UTR exons' CI and maximum element gene-level expression values (FPKM) in *D. melanogaster* adults.

probability that a biochemically validated element is functional based on conservation of sequence and expression. At $P < 0.05$, we observed conservation for 95% of CDS exons, 56% of UTR exons, 44% of NC exons, and 32% of introns.

It is difficult to comment on the function of *D. melanogaster* elements that were not conserved, and we certainly do not rule out species-specific elements. However, we did evaluate some sources of negative results. Elements with low detection due to sample selection in our experiments, sampling depth, low general expression, or expression limited to a few rare cell types, should be

more difficult to evaluate by comparative transcriptomics. To explore the idea that we were underestimating the number of functional elements, we calculated expression in annotated gene models in adult *D. melanogaster*, in fragments per kb per million reads (FPKM) (Trapnell et al. 2012) and plotted maximum expression levels against CI. For CDS exons (Fig. 3C), we observed the highest density at intermediate expression and high conservation. There was a second area of intermediate density with low expression (<1 FPKM) across much of the conservation index range (scores 0–5). These data suggest that low gene expression levels in our samples did not impinge on the comparative analysis of these exon features. Even if we exclude all genes with low expression, the vast majority of CDS exons were validated and conserved. For UTR exons, we observed a similar density distribution, although these were shifted toward lower CI scores (Fig. 3C). As exons within a gene are often derived from the same promoter and as many exons are common to all transcripts from a locus, there was a strong positive correlation between exon expression levels within a gene model (not shown). Thus, at least for the poly(A)⁺ transcripts we analyzed, poor representation is unlikely to lower the overall high rate of element conservation observed across the genus.

Promoter structure and position

An important aspect of gene model annotation is the accurate identification of transcription start sites (TSSs). In order to map TSSs, modENCODE has performed extensive sequencing of *D. melanogaster* 5' transcript ends using CAGE-seq (Hoskins et al. 2011). We performed CAGE-seq analysis on *D. pseudoobscura*, the most extensively annotated member of the genus outside of *D. melanogaster* and with the most RNA-seq reads in this study (>1.5 billion). We used the same RNAs from gonads and reproductive tracts and the remaining adult carcass as samples for both RNA-seq and CAGE-seq experiments

(Supplemental Files S1–S8). These samples are important for several reasons. For example, the male germline uses a set of specific transcription initiation complex members (Hiller et al. 2004), which might recognize different core promoters. Additionally, at least some genes expressed in the germline (e.g., *ovo* and *ovarian tumor*) are known to require specific core promoter subtypes for function (Lü and Oliver 2001; Bielinska et al. 2005).

We examined the relationship between 125,727 CAGE sites identified in *D. melanogaster*, and 111,845 CAGE sites identified in *D. pseudoobscura*. Although 40% of *D. melanogaster* CAGE site

sequences aligned to *D. pseudoobscura*, only 13% overlapped in both species at exactly 1 bp, suggesting that the similar sequences in these aligned promoters have different functions in the two species. However, we found that 81% of *D. melanogaster* CAGE sites that aligned to the *D. pseudoobscura* genome were within 20 nt of a *D. pseudoobscura* CAGE site, suggesting that promoter position is roughly the same in these species. A priori, promoter position could be nearly neutral in evolutionary terms as long as the ORF and any translational regulatory information in the UTR is downstream from the promoter and therefore subject to positional drift. Alternatively, the shifts in CAGE site position we observed could be due to changes in the core promoter motifs between these species. To determine the likelihood of these alternatives, we performed sequence motif analysis on regions flanking CAGE sites.

Three different methods of sequence analysis (motif finding, clustering, and random forests; see Methods) revealed diagnostic short motifs (FitzGerald et al. 2006; Ohler 2006) at the predicted TSS in both species. Like previously annotated TSSs in *D. melanogaster*, we observed enrichment for a CA dinucleotide, where the A is +1 in the transcript (Fig. 4A). The core TSS motif position weight matrix was nearly identical between tissues and species. A large subset of TSSs also showed clear patterns in flanking regions. We observed AT-rich sequences diagnostic of the nucleosome-poor

regions upstream of well-annotated *D. melanogaster* promoters (not shown), as well as known core promoter motifs, flanking the CAGE defined TSSs (Fig. 4B). Interestingly, we found four types of co-associated motifs among these promoters: (1) with a combination of TATA (TATAAA), INR (TCAGTY), and DPE (CGGTT); (2) with an INR and DPE as well as a slightly higher CG content; (3) with Dmv4 (GGYCACAC) in the place of INR; and (4) with a Dmv5 (TGGTATTT) in place of TATA and a Dmv4 motif in place of an INR (Fig. 4B; Supplemental Table S12). We observed only subtle differences in promoter type from tissue to tissue or species to species. At the tissue level, there was a stronger TATA signature in the type-3 promoters in carcass samples relative to gonads. At the species level, the TATA signature of type-1 promoters was more diffuse in *D. pseudoobscura* testis. This finding suggests that there are interdependencies among core promoter motifs, and at least four basic core promoter structures are conserved in the genus.

Since TSSs are short, degenerate, and abundant in the genome, novel sites may easily arise by mutation (Stone and Wray 2001). If the four types of core promoters are functionally equivalent, then the type of core promoter at a given locus should be random because substitutions are extensive between *D. melanogaster* and *D. pseudoobscura* (0.68 ss). However, we found that core promoter types were maintained between species because the

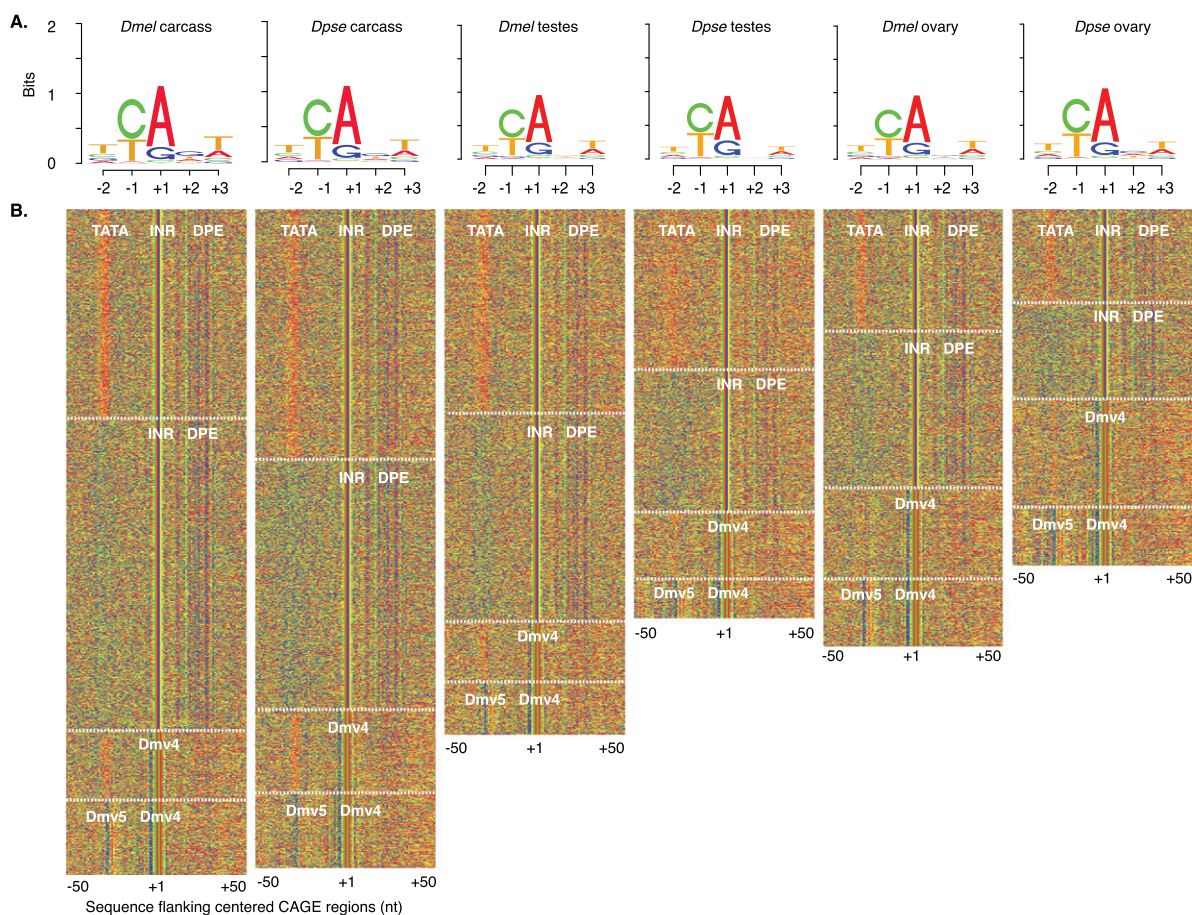


Figure 4. Transcription start site motifs. (A) Sequence logos centered on the “CA” motif (where A = +1 of CAGE sites) derived from the peak distribution of CAGE reads from each *D. melanogaster* and *D. pseudoobscura* sample. CAGE-seq used the same mRNA samples as RNA-seq (Fig. 1C). (B) K-means clustering of sequences flanking the CAGE site sequences (A, red; C, green; G, blue; T, orange). Promoter regions lacking obvious structure are not shown. Regulatory motifs (white text) in each cluster are indicated (delineated by white dashed lines).

corresponding genes were found in the same cluster class more often than expected ($P < 10^{-10}$, Fisher's exact test). Additionally, differences in core promoter structure between species involved "conservative" shifts. For example, the most common differences involve switches between type-1 TATA/INR/DPE and type-2 INR/DPE promoters. As a more definitive test of chance co-occurrence of TSS sites between *D. melanogaster* and *D. pseudoobscura*, we generated a neutral model by asking how often the most common tetramers at TSS were conserved in intergenic space. For example, the most common TSS tetramer CAGT occurs in 23% of TSSs. We were able to align 37% of *D. melanogaster* intergenic space CAGT sequences to *D. pseudoobscura* intergenic CAGT regions. In contrast, 57%–61% of CAGT motifs at gonad TSSs and 71% of CAGT motifs at carcass TSSs were alignable between the species, indicating that they are selectively constrained at TSS ($P < 10^{-10}$, Fisher's exact test). Interestingly, there was also a significant two- to three-fold enrichment for CAGT to CATT substitutions in *D. pseudoobscura* TSS sites relative to intergenic substitutions. CATT is the tetramer in the initiator variant, INR1 (TCATTCG) (FitzGerald et al. 2006), the second most common motif at TSS. These data indicate that there is selection to maintain the particular configuration of TSS motifs at a given gene.

We asked if indels between TSS and the CDS could account for the observed shifts in TSS location between the species and how extensive these shifts might be in a compact *Drosophila* genome (Fig. 5). We found a strong positive correlation between CAGE sites and CDS initiation position, between tissues within a species and between species (Fig. 5A,B), with the majority of CAGE sites within 500 bp of the CDS in both species. We observed two patterns in orthologs when the CAGE sites were further away. In some orthologs, the extended distances were conserved, and in others a distant CAGE site in one species was proximal in the other (moderate density along the diagonal and along each axis). Global rates of indel formation in *Drosophila* result in a 20.4% difference in the size of an element between *D. melanogaster* and *D. pseudoobscura* (Leushkin et al. 2013). Similarly, we observed a 20.9% median difference in the size of aligned intergenic regions between these species. Although the change in the TSS to AUG distance measured from carcass (19.6%) and ovary (20.0%) RNAs between these two species is close to the size change of intergenic regions, the distance

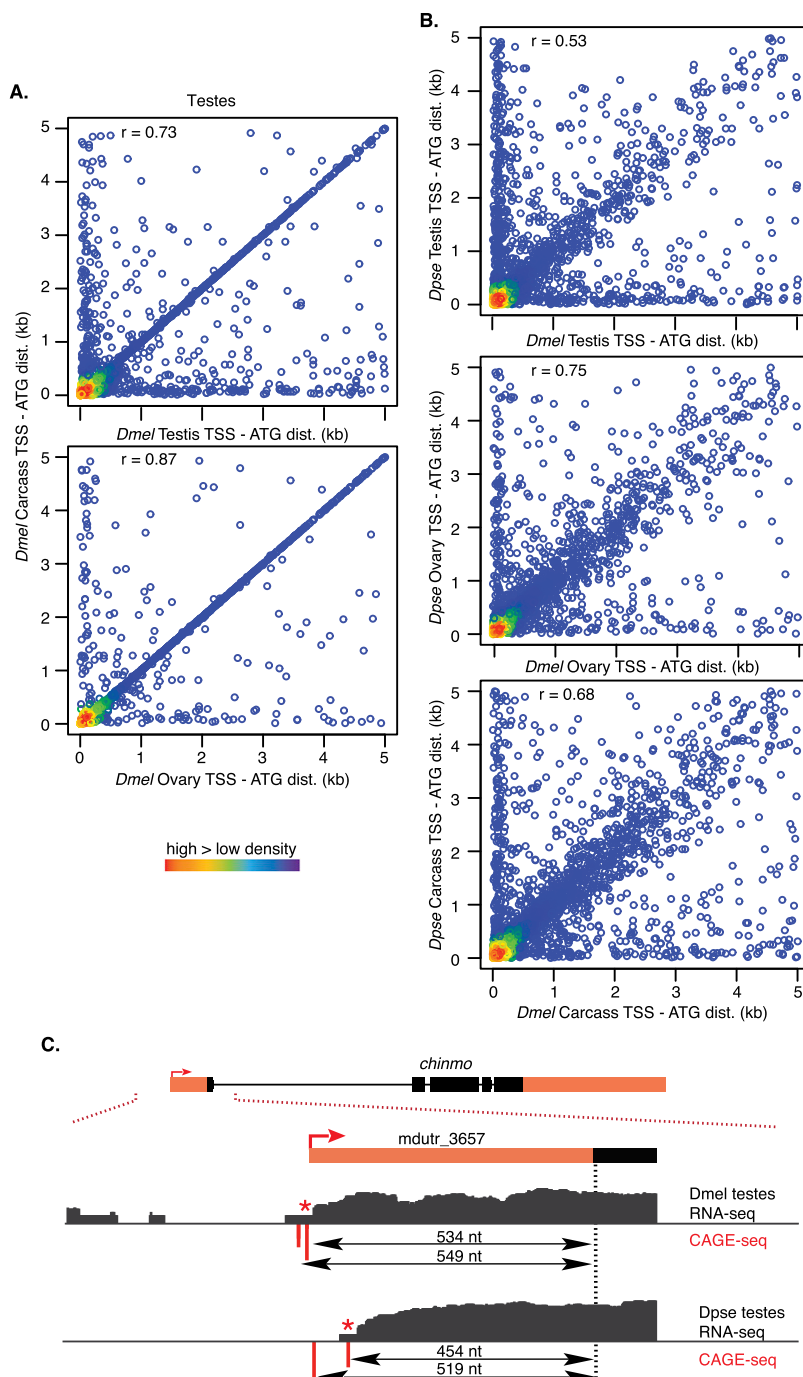


Figure 5. Transcription start site position. (A,B) Density plot (color scale) of distance between translation start (encoding the first AUG of the open reading frame) and CAGE site between *D. melanogaster* tissues or species (see Supplemental Files S1–S8 for browser-ready CAGE data files). (C) CAGE site examples for the *chinmo* locus expression in testes. UTR (orange fill) and CDS exons (black), annotated TSS (red arrow), CAGE sites (red), and RNA-seq read density (black) do not align, but there is clear evidence of these structures from RNA-seq (black). Aligned and presumably orthologous CAGE sites (red asterisk) are shown. Double-ended arrows indicate distance from CDS to the CAGE sites.

change in testes was much larger (30.3%), suggesting that random indels or perhaps even preferential indel accumulation in the case of testis promoters contributes to TSS positional shifts. However, indels do not explain the cases in which we observed the same TSS

tetramer in both species with evidence of a functional TSS in only one species.

We explored the many situations (>30 k per species) in which new promoters may have evolved in one or both species relative to the last common ancestor. A good example of multiple conserved and novel TSSs was at the *chronologically inappropriate morphogenesis (chinmo)* locus (Fig. 5C). There were two CAGE sites each in the testis samples from *D. melanogaster* and *D. pseudoobscura*. The proximal *D. melanogaster* site aligned with the proximal *D. pseudoobscura* CAGE site even though the CAGE site to ATG distance was different due to an indel. The distal *D. melanogaster* CAGE site aligns to *D. pseudoobscura*, but was not used. The distal *D. pseudoobscura* CAGE site was novel. Thus, there are clear examples of both shifts in TSS use independent of sequence evolution, in addition to indels changing the spacing between the TSS and CDS.

Splice junctions

The most extensive contribution of MDv2 to the *D. melanogaster* annotation is at the level of RNA processing, where 8120 newly annotated splice junctions bring the total for *D. melanogaster* to 64,644. The majority of *D. melanogaster* introns (99.9%) are spliced by U2-type spliceosomes (recognizing GT-AG and GC-AG donor-acceptor motifs). However, minor forms processed by U12-type spliceosomes (recognizing AT-AC motifs) are also present (Sheth et al. 2006). We aligned regions flanking splice junctions of each type in *D. melanogaster* with the genomes of the other *Drosophila* species, again with sensitivity that tracked phylogenetic distance (Fig. 6A; Supplemental Table S13). Overall, we aligned 97.7% of splice junctions to at least one non-*Drosophila* species. However, the U12-type spliceosome junctions were poorly aligned.

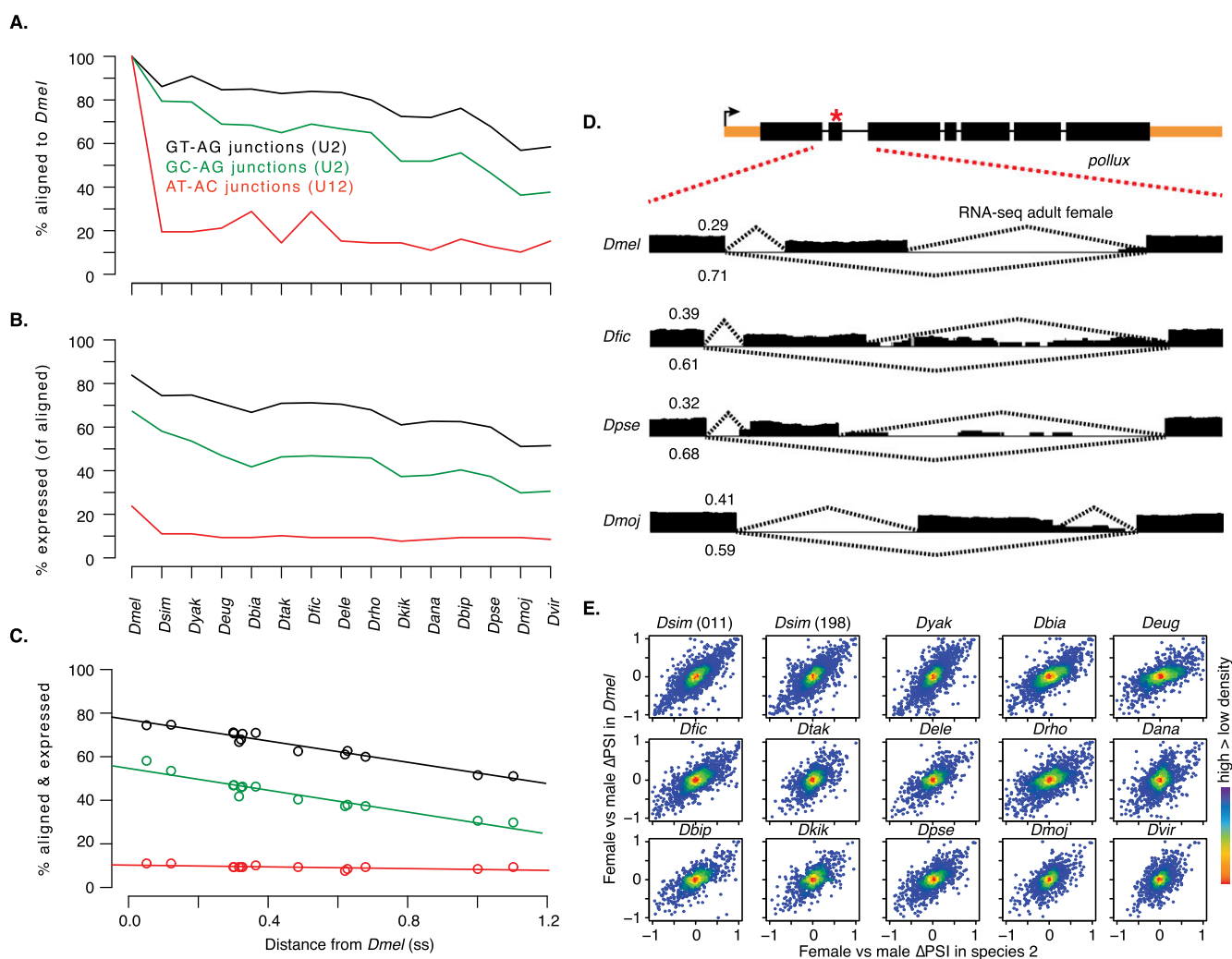


Figure 6. RNA splicing validation. (A) *D. melanogaster* MDv2 GT-AG (black) and GC-AG (green) splice junctions (recognized by U2 spliceosomes) and AT-AC splice junctions (red) (recognized by U12 spliceosomes) that align to the indicated genomes. (B) Aligned elements expressed (≥ 1 junction spanning read). (C) Combined sequence and expression conservation for each element type plotted against distance from *D. melanogaster*. (D) An example of a validated splicing event in a transcript model of the *pollux* gene. (Upper panel) An exon previously annotated as constitutive is annotated as an alternatively spliced cassette in MDv2 (red asterisk). (Lower panels) RNA-seq read coverage (black), and junction coverage with percent spliced in (PSI) values for the cassette exon inclusion (upper dotted lines) and exclusion (lower dotted lines) isoforms in adult females of the indicated species. Additional species also showed this splicing pattern (not shown). (E) Density plots of female/male Δ PSI values for species (and two strains in the case of *D. simulans*) plotted against *D. melanogaster* female/male Δ PSI values.

We mapped junction-spanning reads from each species back to the source genome to determine whether splice junctions were used (Fig. 6B; Supplemental Table S13). Aligned GT-AG donor-acceptor motifs were utilized as bona fide splice junctions at a higher frequency than conserved GC-AG motifs. This is unsurprising because GC-AG introns have intrinsically weak donor sites that must rigidly adhere to other consensus sequences to be recognized by the U2 spliceosome (Thanaraj and Clark 2001), so these may be vulnerable to mutation and rapid evolution. As we observed with exons, the relationship between element validation and divergence was linear (Fig. 6C), allowing us to calculate element half-life for U2-mediated splicing events. Overall, GT-AG junctions showed a half-life of 1.67 ss and GC-AG junctions a half-life of 1.03 ss (Supplemental Table S14). However, the validation of AT-AC junctions was unrelated to phylogenetic distance. Of the AT-AC junctions that were annotated exclusively by modENCODE, we detected use of only 16% in *D. melanogaster* and only 4% were aligned and expressed in non-*melanogaster* species. However, the subset of AT-AC junctions that were detected in *D. melanogaster* and validated by comparative annotation were used throughout the genus. For example, of the 13 AT-AC junctions that were used in both *D. melanogaster* and *D. simulans*, 10 were also used in the most distantly related species (>1.0 ss). Thus, there are clear examples of validated U12 spliceosome AT-AC junctions.

New splicing patterns identified in MDv2 provide a fuller accounting of proteomic complexity in *D. melanogaster*. Although many newly annotated junctions are in untranslated regions, 2115 have overlap with annotated coding regions. For example, the *pollux* (*plx*) gene has a newly annotated junction that defines an

alternatively spliced cassette exon rather than the previously annotated constitutive exon (Fig. 6D). This alternative splicing event is broadly conserved in the *Drosophila* genus, as we observed both the inclusion and exclusion junctions in 14 species with RNA-seq data, including those most distantly diverged from *D. melanogaster* (additional species not shown). Additionally, the percent spliced in (PSI) for the alternative paths is also conserved, indicating that the isoform ratios are subject to constraint. The conservation of alternative splicing ratios is a general feature (Fig. 6E; Supplemental Table S15). We obtained RNA-seq data for the adult sexes in all the species, and a pairwise comparison of female/male Δ PSI values of those species against *D. melanogaster* showed a strong linear relationship.

We again used the CI score for every *D. melanogaster* junction to estimate the contribution of selection (Fig. 7A). All three junction types showed a strongly bimodal distribution with peaks in the distributions of CI at <0.5 and >6.5. Those that were used throughout the genus are likely to represent strongly conserved splicing events that are subject to strong selection (Fig. 7B). At $P < 0.05$, we observed conservation of 77% of GT-AG junctions, 52% of GC-AG junctions, and 9% of AT-AC junctions. The distribution of AT-AC junction conservation P -values was strikingly skewed, such that essentially all junction P -values <0.95 were also <0.001. This suggests that many of the AT-AC junctions are either invalid or neutral in evolutionary terms. However, the few conserved AT-AC junctions we observed are essentially fixed in the phylogeny. This is consistent with the very rare gains or losses of U12 splice sites, as well as U12 to U2 switches, in metazoans (Lin et al. 2010).

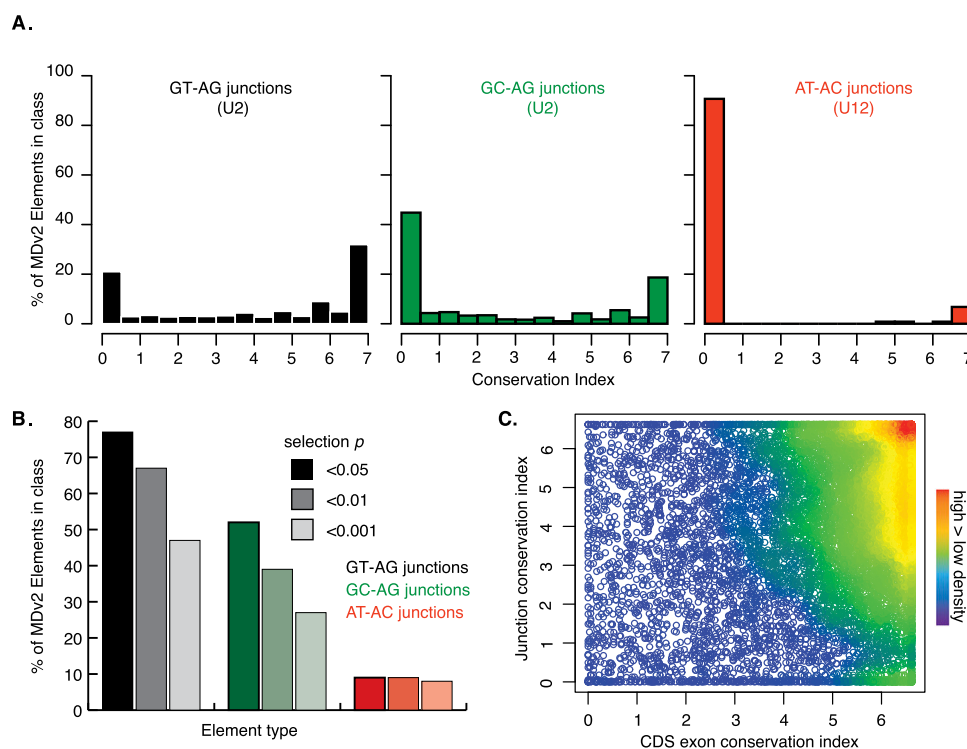
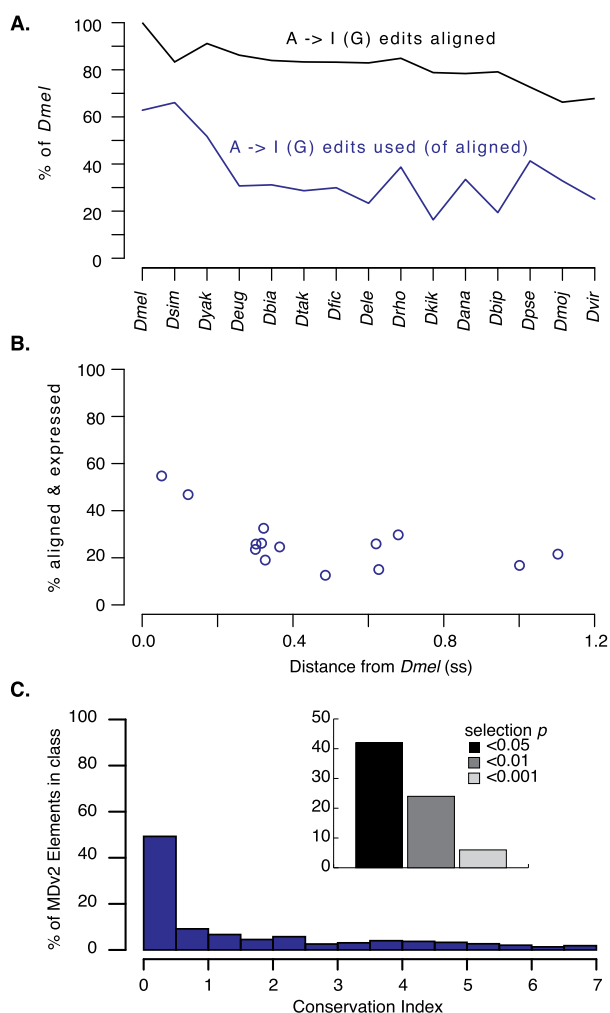


Figure 7. RNA splicing conservation. (A) Frequency of CI scores for MDv2 annotated GT-AG (black) and GC-AG (green) splice junctions (recognized by U2 spliceosomes) and AT-AC splice junctions (red) (recognized by U12 spliceosomes). (B) Frequency of probabilities that the exon conservation indexes for GT-AG junctions (shades of black), GC-AG junctions (shades of green), and AT-AC junctions (shades of red) were similar to intergenic regions (Supplemental Table S13). The P -value column order for each element is shown in the key (0.05, 0.01, and 0.001 from left to right for each element). (C) Density plot illustrating the relationship between the mean CDS exon and junction conservation index scores within a gene.

The evolution of splicing patterns has not been examined as extensively as DNA sequences, or gene-level expression, but recent reports indicate that alternative splicing may evolve more rapidly than expression (Merkin et al. 2012). Thus, lower validation might be expected for evolutionary reasons. However, it is also true that junction detection is much more complicated technically and is more subject to detection errors (see Discussion). Given that we have the highest confidence in the CDS exons, where strong selection to maintain open reading frames should result in conserved splicing patterns, we compared the mean junction CI scores with the mean CI scores averaged by gene (Fig. 7C). We observed the highest density of points at high CI in both data sets. However, there were genes with maximum exon CI values with a wide range of junction CI values, suggesting that technical issues contributed to some failed junction detections.



RNA editing

Adenosine deaminase acting on RNA (ADAR) catalyzes the deamination of adenosine to inosine (A-to-I) in dsRNA regions that can alter secondary structure, siRNA targeting, polypeptide diversity or expression (Jin et al. 2009). The modENCODE Project identified 972 edited positions in 597 genes (Graveley et al. 2011). Our comparative approach is critically important for validating editing, a feature that cannot be inferred from genome sequence alone, and because RNA-seq error results in mismatches relative to the genome. As a result, the extent of editing has been controversial (Li et al. 2011; Bass et al. 2012). Species comparison provides higher confidence in the validation of these elements (Danecek et al. 2012).

We aligned 99% of edited positions in genomic sequence in at least one non-*melanogaster* species, and >66% align even in the most distantly related species (Fig. 8A). This level of conservation

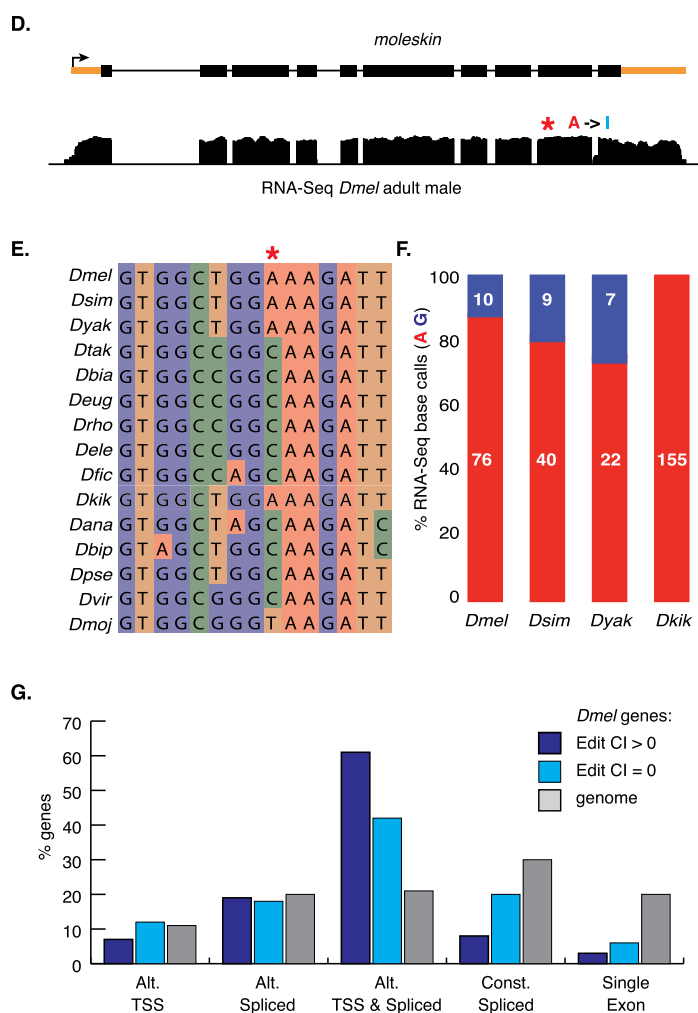


Figure 8. RNA editing. (A) *D. melanogaster* editing events that align to the indicated genomes (black) and are used if aligned (blue). (B) Combined sequence and expression conservation for editing events. (C) Frequency of conservation index scores for MDv2-annotated edits. (Inset) Probability that CI is random (shades of black). (D) An example of a validated editing site in *moleskin* with a low CI. Gene model and log₂ scale RNA-seq coverage in adult males with editing site are indicated (red asterisk). (E) Genome alignment of *moleskin* editing site and flanking region. (D,E) Nucleotides are color coded (I, light blue; A, red; C, green; G, blue; T, orange). (F) Stacked bar plot of editing site base calling in *D. melanogaster*, *D. simulans*, *D. yakuba*, and *D. kikkawai*. (G) Frequencies of editing occurrence among transcripts from genes with annotated alternative transcription start sites (Alt. TSS), alternative splicing (Alt. Spliced), both alternative transcription start sites and splicing (Alt. TSS & Alt. Spliced), multiexon genes with a single annotated isoform, and single exon genes. All *D. melanogaster* genes (gray), those with edits in at least one other species (dark blue), and those with edits only in *D. melanogaster* (light blue) are shown.

was comparable to what we observed for CDS exons (Fig. 3A), which is unsurprising as many of the editing events were embedded within CDS exons. To validate the RNA editing events, we asked if there were “G” bases (“T” is read as “G”) in RNA-seq reads at “A” locations in the corresponding assemblies. Considering that the base calling error rate is >1%, we required $\geq 5\%$ of reads showing an editing-type mismatch. We found that 70% of the *D. melanogaster* annotated editing sites were confirmed in our non-*melanogaster* data. Most conserved editing events were observed in *D. simulans* and *D. yakuba*, two very close relatives of *D. melanogaster* (Fig. 8A,B; Supplemental Table S16). However, evidence for conserved editing was quite sparse in the remaining species and relatively flat across the rest of the phylogeny (we did not estimate editing site half-life due to that lack of a phylogeny-wide linear relationship between conservation and distance). The CI distributions showed a maximum in the lowest bin (<0.5), with a long extended tail to the maximum CI score, supporting the idea that there are many rapidly evolving editing events as well as a few highly conserved events. Overall, 42% of *D. melanogaster* editing events are likely to be functional ($P < 0.05$) based on comparison to the intergenic region neutral model (Fig. 8C). Our RNA-seq data showed that genes subject to editing in *D. melanogaster* were expressed at significantly higher levels than genes without edits throughout the phylogeny (not shown), therefore failure to detect such events was not due to low expression.

Among the 682 sites used in non-*melanogaster* species, 478 CDS edits alter amino acid coding and 112 are synonymous, and 92 were in UTRs. An example of a conserved editing event is a site in the *moleskin* (*msk*) coding sequence (Fig. 8D–F). This site is synonymous (in the wobble position of a glycine codon) in *D. melanogaster* and is a potentially editable “A” in seven non-*melanogaster* species, including four species where we obtained RNA-seq data. We found evidence for editing in *D. simulans* and *D. yakuba* (<0.30 ss) but not in the more distantly related *D. kikkawai* (0.48 ss). The potential editing site was lost in many of the species due to an A > C substitution relative to *D. melanogaster*.

Because of the nonlinearity in edit validation relative to divergence, the analysis of more species, especially ones more closely related to *D. melanogaster*, may be required to define the rate of editing evolution and to determine if most *D. melanogaster* editing events are changing due to drift or selection. We did observe a slightly higher validation rate for editing events that change the encoded amino acid (not shown), suggesting that amino acid changing events result in functional changes in the encoded proteins that are under selection, but this will require further analysis with additional species. However, we did look for additional evidence (albeit ad hoc) to inform edit function in *D. melanogaster*. Given that editing contributes to regulatory complexity, we asked if editing events were significantly enriched in genes showing complexity at the level of alternative TSS use and alternative splicing (Fig. 8G). Although $\sim 20\%$ of all *D. melanogaster* genes show both alternative TSS use and alternative splicing, $\sim 60\%$ of genes with edits in at least one non-*melanogaster* species were in this category. Even the genes where we found edits only in *D. melanogaster* were overrepresented among genes with higher regulatory complexity. In contrast, we found that editing events were significantly underrepresented in genes with single isoforms. These data indicate that editing increases isoform diversity at genes, which already show complex regulation. These data raise the possibility that edits with low CI scores are functional, but species-specific or lineage-specific.

Discussion

Biochemical validation and evolutionary conservation of modENCODE transcripts

The modENCODE and ENCODE mission (Celniker et al. 2009; The ENCODE Project Consortium 2012) is to identify all the functional elements in the *D. melanogaster*, *C. elegans*, and human genomes. This is essentially a project to take empirical biochemical evidence and map it back onto the genome. Simple conservation of sequence and expression provides strong validation of the physical presence of transcripts, but it does not imply function unless it is measured relative to the probability of occurrence by chance. Analysis of defective *D. melanogaster* transposons (Petrov et al. 1996) suggests that neutral DNA has a half-life of ~ 0.19 ss (see Methods). We calculated a 0.16 ss half-life for nonexpressed intergenic DNA. Using these estimates, a functionally neutral element would be overwritten in most of the lineages outside of the *melanogaster* subgroup. Our extensive data from multiple species spanning a wide range of phylogenetic distances allowed us to calculate the rates of divergence and the evolutionary half-life for different types of conserved transcribed elements: CDS exons (2.06 ss), NC exons (0.58 ss), introns (0.39 ss), UTR exons (0.36 ss), and total intergenic space (0.24 ss). All of these values are greater than the estimated half-life of neutral DNA, indicating that all classes of transcribed elements, including introns and expressed intergenic DNA, are functionally constrained. In terms of *D. melanogaster* annotations, this means our use of total intergenic space as a model for neutral sequence and position change is conservative.

Caveats

The absence of comparative evidence does not imply that there is no function for a species-specific element. Therefore, some of the elements that have low conservation scores in our report may ultimately be shown to be functional. Conversely, we might overestimate the selection for expression, as expression and sequence need not always be causally linked. For example, excised introns generally do not contribute to gene function, but *D. melanogaster* introns were aligned to and showed expression in non-*melanogaster* species. Here the conservation of intron sequence is consistent with functional constraint on intron evolution, possibly due to the regular presence of intronic splicing enhancers (Hare and Palumbi 2003; Xing and Lee 2006) and transcriptional enhancers (Banerji et al. 1983; Rowntree et al. 2001) rather than expression per se. If introns have little direct function as RNA-elements, then we might expect that the expression of most introns would be low, because most reads mapping to introns would be derived from incompletely processed transcripts. Indeed, most were detected at very low coverage in the RNA-seq data sets (0.3%–3.3% of mapped reads). Additionally, only 19% of *D. melanogaster* introns were mapped and expressed in species with distances >0.6 ss. Although some retained introns might be functional RNA elements (e.g., misannotated alternative isoforms), it is reasonable to assume that the vast majority of expressed introns are detected processing intermediates.

Similarly, regulatory sequences in intergenic space might be conserved but not in order to produce transcripts, or at least not principally for that reason. For example, there is transcription at enhancers (Natoli and Andrau 2012). We observed very little intergenic transcription in *D. melanogaster* (for example, <18% of intergenic bases were covered by reads in any one sample type). The lack of detected transcription in >82% of *D. melanogaster*

intergenic bases is important because this suggests that there are regions of the genome free from easily detectable transcriptional noise. Furthermore, when we did observe conserved intergenic expression, only a small fraction of reads mapped to that conserved intergenic space in any species (0.01%–1.08% of mapped reads), and most of this expression was not well conserved in the phylogeny. For example, we observed conservation of sequence and expression of only 3% of the MDv2 intergenic regions at >0.6 ss, suggesting that much of the intergenic transcription of conserved sequences is nonfunctional. Additionally, among all the expressed elements, these regions showed expression in the fewest numbers of samples. These data suggest that most intergenic space is likely to accumulate expression divergence due to chance.

What is missing and what might be removed from the annotation?

We have shown that the *Drosophila* genome and annotation built from modENCODE and community data over the last decade is of very high quality, but it is more difficult to determine how many transcripts remain undiscovered. A systematic way of estimating completeness is to carefully examine intergenic expression and determine if targeted analysis in those regions is justified. Some intergenic expression could be due to artifact, but if RNA-seq artifacts resulted in the appearance of expression where no transcripts existed, we would not expect supporting evidence from other modENCODE data sets. Expressed intergenic regions in *D. melanogaster* were enriched for CAGE sites indicative of promoters (Hoskins et al. 2011) and with histone H3K27ac modifications (Supplemental Table S17; Nègre et al. 2011), which are markers of transcriptional activity. These data validate the biochemical activity of the corresponding regions. Interestingly, enrichment for CAGE sites and H3K27ac in *D. melanogaster* was maximal for intergenic regions conserved and expressed in distantly related species (distance >0.3 ss), suggesting that some unannotated and functional transcribed elements remain. These transcripts tended to be both rare and lowly expressed. Although we chose to use a conservative neutral model incorporating both expressed and nonexpressed intergenic space, the rare aligned and transcribed intergenic regions will be of special interest in future rounds of annotation. Indeed many have already been incorporated as UTR exons in the working draft of the modENCODE version 3 annotation (MDv3) (Brown et al. 2014).

We were unable to conclusively determine the cause of poor AT-AC junction validation and suggest that these might require more targeted experimental validation. In the meantime, we suggest that annotation end-users carefully review any AT-AC junctions in a gene of interest.

Conclusions

There has been prolific recent criticism of the ENCODE annotation project, suggesting that much of the effort has been to map functionless regions of the genome (Eddy 2012; Kapranov and St Laurent 2012; Doolittle 2013; Graur et al. 2013; Niu and Jiang 2013). Our analysis indicates that the vast majority of transcribed elements in the *D. melanogaster* modENCODE annotation are evolutionarily conserved. Although it is certainly possible that some transcription is selected based on selfish DNA function that does not benefit the host, the most parsimonious conclusion is that the annotated transcribed elements perform functions that are constrained by natural selection acting on the organism. Given that

ENCODE has used similar methods to annotate transcribed elements in the human genome, it seems likely that those elements are also under selective constraint. However, the euchromatic portion of the *Drosophila* genome is quite compact and may well exhibit less functionless transcriptional noise than the human genome. This makes it even more important to apply comparative methods to improve ENCODE annotations. There are genomes available for this work, as the human-mouse-rat-dog group comprises 0.68 ss of divergence time (Lindblad-Toh et al. 2011). This is comparable to the distances flanking *D. melanogaster* and *D. pseudoobscura*. If our observations on the rates of decay of transcribed elements are general, rather than specific to fruit flies, then sampling taxa within this range should allow the validation of the human transcriptome annotation.

Methods

Genomes

D. biarmipes, *D. eugracilis*, *D. ficusphila*, *D. takahashii*, *D. elegans*, *D. rhopaloa*, *D. bipectinata*, and *D. kikkawai* were inbred by single-pair, full-sib crosses for 10–18 generations (with the exception of *D. rhopaloa*, which did not tolerate inbreeding). All genome strains have been deposited in the San Diego (USA) and Ehime (Japan) *Drosophila* species stock centers. We prepared shotgun genomic paired-end libraries for sequencing on a Genome Sequencer FLX instrument using Titanium chemistry (Roche) using standard methods. Genome assembly was performed using the CABOG assembler. We utilized Illumina technology to correct for any 454 homopolymer errors that may have otherwise been incorporated in the reference genome sequences. Additional detail on the library construction, sequencing, and assembly methods is available in the Supplemental Material.

For analysis, we used GenBank files under these identifiers: *D. biarmipes* (Dbia_1.0), *D. bipectinata* (Dbip_1.0), *D. elegans* (Dele_1.0), *D. eugracilis* (Deug_1.0), *D. ficusphila* (Dfic_1.0), *D. kikkawai* (Dkik_1.0), *D. rhopaloa* (Drho_1.0), *D. takahashii* (Dtak_1.0), *D. pseudoobscura* (Dpse_2.0), *D. ananassae* (GCA_000005115.1), *D. erecta* (GCA_000005135.1), *D. grimshawi* (GCA_000005155.1), *D. melanogaster* (GCA_000001215.1), *D. mojavensis* (GCA_000005175.1), *D. persimilis* (GCA_000005195.1), *D. sechellia* (GCA_000005215.1), *D. simulans* (GCA_000259055.1), *D. virilis* (GCA_000005245.1), *D. willistoni* (GCA_000005925.1), and *D. yakuba* (GCA_000005975.1).

Phylogenetic analysis

We constructed phylogenetic trees using 41 loci that were present in at least 75% of the species using MrBayes 3.2 (Ronquist et al. 2012). We used the combined branch length separating these species on the phylogeny, expressed in substitutions per site (ss). Whole-genome alignments between *D. melanogaster* and other species were performed using LASTZ (Harris 2007) using UCSC Genome Browser liftOver software (Kent et al. 2002) to project *D. melanogaster* annotation coordinates from the modENCODE *D. melanogaster* transcriptome (MDv2) and FlyBase r5.45 to the genomes of each species. Additional methodological detail is in the Supplemental Material.

Expression analysis

We generated RNA reads on the Illumina platform. Reads for exons, introns, and intergenic space were uniquely mapped using TopHat v2.0.3 (Trapnell et al. 2012). For abundance comparisons

between samples and between species, we used Cufflinks (Trapnell et al. 2012). To estimate background expression (<1.47 RPKM), we used read density in intergenic space.

CAGE (Takahashi et al. 2012) reads were aligned to the *D. pseudoobscura* genome using StatMap (<http://www.statmap-bio.org/>) and represented as a 1-bp CAGE site. To compare orthologous TSSs, we used the translation start sites of 1:1 orthologs of *D. melanogaster* and *D. pseudoobscura* from OrthoDB version 6 (Waterhouse et al. 2013). We used Random Forests (Malley et al. 2012), *seqLogo v.1.2* (Bembom 2012), and k-means clustering to examine regions flanking CAGE sites for motifs. Additional methodological detail is in the Supplemental Material.

Post-translational modifications

Splicing analysis was performed with the Splicing Analysis Toolkit (Spanki) v.0.4.0 (<http://www.cbcb.umd.edu/software/spanki>; and <https://github.com/dsturg/Spanki>). Briefly, this program analyzes splicing at the junction level by calculating read coverage over splice junctions and over exon–intron boundaries (Sturgill et al. 2013). Alternative splicing was quantified from junction coverage using the percent spliced in (PSI) metric. For the validation of aligned editing sites, we extracted the base calling at the aligned editing sites with the *mpileup* command in SAMtools (v.0.1.18) (Li et al. 2009) and compared them with the reference bases. Reads where base calling of the site is “G” and reference is “A,” or base calling of the site is “C” and reference is “T,” were taken as evidence of editing; base calling that is the same as reference bases were taken as reference match, and other reads were excluded.

Data access

The RNA-seq data from this study have been submitted to the NCBI Gene Expression Omnibus (GEO; <http://www.ncbi.nlm.nih.gov/geo/>) under accession number GSE44612. Reads for all CAGE experiments have been submitted to the NCBI Sequence Read Archive (SRA; <http://www.ncbi.nlm.nih.gov/sra>) under the following accession numbers: SRR488282, SRR488283, SRR488284, SRR488285, SRR488308, SRR488309, and SRR488325 (*D. melanogaster*); and SRR488317, SRR488318, SRR488319, and SRR488320 (*D. pseudoobscura*). All DNA sequencing data have been submitted to the NCBI SRA under the following accession numbers: SRP007984, SRP007991, SRP008002, SRP008019, SRP008020, SRP008021, SRP008024, and SRP008029. Genome assemblies have been submitted to NCBI GenBank (<http://www.ncbi.nlm.nih.gov/genbank/>) under identifiers: *D. biarmipes* (Dbia_2.0), *D. bipunctinata* (Dbip_2.0), *D. elegans* (Dele_2.0), *D. eugracillis* (Deug_2.0), *D. ficusphila* (Dfic_2.0), *D. kikkawai* (Dkik_2.0), *D. rhopaloa* (Drho_2.0), and *D. takahashii* (Dtak_2.0).

Competing interest statement

Certain commercial equipment, instruments, or materials are identified in this document. Such identification does not imply recommendation or endorsement by NIH, nor does it imply that the products identified are necessarily the best available for the purpose.

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