Supplementary Information for

The Junction Usage Model (JUM): A method for comprehensive annotation-free analysis of alternative pre-mRNA splicing patterns

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Datasets S1 to S43

Supplementary Information Text

Supplemental Methods

Statistical cutoffs applied for AS analysis software tools

For colon cancer patient tumor versus matched normal tissue RNA-seq data analysis, the following statistical cutoffs are applied:

MISO: at least 10 unique reads mapped to each isoform, $\Delta \Psi \ge 10\%$, Bayes factor ≥ 5 . rMATS: qvalue ≤ 0.05 , $\Delta \Psi \ge 10\%$.

JUM: qvalue $\leq 0.05, \Delta \Psi \geq 10\%$.

IRFinder: pvalue ≤ 0.05 , $\Delta \Psi \geq 10\%$.

For SRSF2 mutation carrying K562 cell line versus wildtype analysis, the following statistical cutoffs are applied: rMATS: qvalue ≤ 0.1 , $\Delta \Psi \geq 10\%$ JUM: qvalue ≤ 0.1 , $\Delta \Psi \geq 10\%$.

For Drosophila male head samples that carry a PSI mutation versus wildtype analysis, the following statistical cutoffs are applied:

MISO: at least 5 unique reads mapped to each isoform, $\Delta \Psi \ge 5\%$, Bayes factor 5. rMATS: qvalue <= 0.1, $\Delta \Psi \ge 5\%$. JUM: qvalue <= 0.1, $\Delta \Psi \ge 5\%$.

RNA extraction and qRT-PCR validation of JUM-predicted AS events

Drosophila heads were isolated from 10-20 manually sorted and snap-frozen males from the PSI mutant and wildtype PSI strains as previously described (1). RNA were extracted using the Trizol reagent. qRT-PCR primers were designed with the software Primer3 (http://bioinfo.ut.ee/primer3-0.4.0/) and qRT-PCR experiments performed by using the SuperScript III Platinum SYBR Green One-Step qRT-PCR Kit (Thermo Fisher Scientific) on a LightCycler 480 instrument (Roche). All AS events were validated as described above except for Fmr1 and lig gene AS events, as no designed primers produced one single product for qRT-PCR experiments. Thus, for these two genes RNA (0.5 μ g) were first reverse-transcribed by SuperScript First-Strand Synthesis System (Invitrogen) and the splicing isoforms were analyzed by RT-PCR followed by gel electrophoresis on 6% TBE gel (Thermo Fisher Scientific), stained with SYBR Gold (Invitrogen) and quantified with ImageJ software (NIH).

Supplemental Figures Figure S1



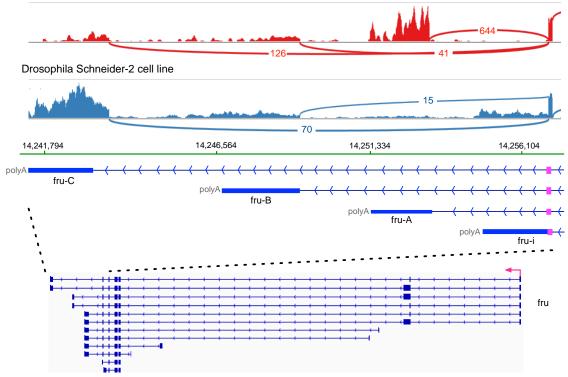


Figure S1. Drosophila Schneider-2 cells and Drosophila male head exhibit distinct, tissue-specific AS patterns. Two distinct AS patterns of the Drosophila *fruitless* gene mRNAs expressed in male Drosophila head tissue and the Drosophila Schineider-2 (S2) cell line (1). The orientation of the transcript is shown at the bottom: the red arrow indicates the direction of the promoter. The dotted lines indicate the region of transcript that is enlarged to highlight the alternatively spliced region. RNA-seq data read density tracks derived from both tissue types are shown, with arcs representing splice junctions that link a common 5' exon to the three alternative last exons, each corresponding to the fruitless isoform fru-A, fru-B and fru-C, respectively. The number of unique-mapped RNA-seq reads mapped to the junction is shown across the arc. The relative levels of the fru-A, fru-B and fru-C isoforms determine normal male fly courtship behavior (46). In Drosophila male heads, all three isoforms are present. However, in the Drosophila S2 tissue culture cell line only fru-B and fru-C mRNA isoforms are expressed, together with an additional isoform (fru-i) that uses an alternative polyadenylation signal downstream of the common 5' exon present in the fru-B and fru-C mRNA isoforms. AS analysis software tools that rely on fixed AS event annotation libraries cannot detect and accurately quantitate the distinct fruitless mRNA isoform distributions present in these two different types of Drosophila RNA samples.

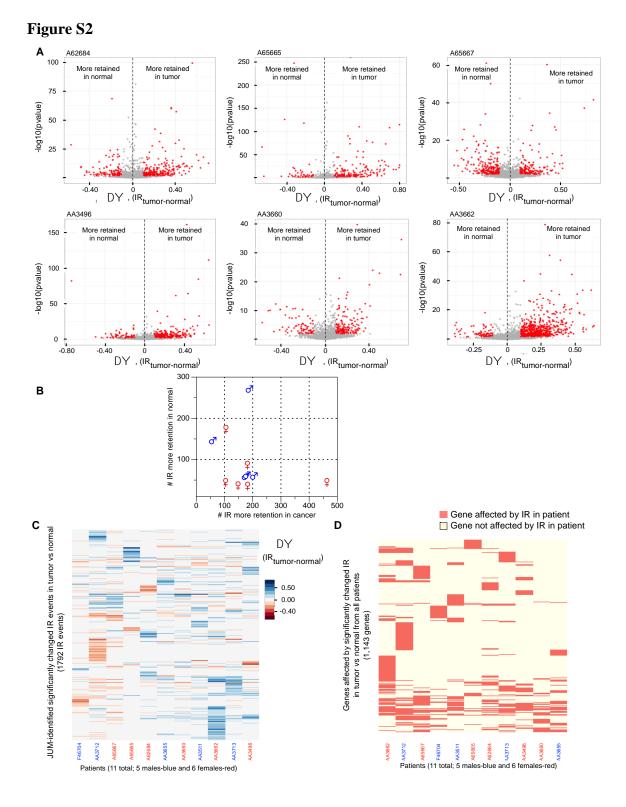


Figure S2. Striking IR heterogeneity revealed by JUM in colon cancer patients' tumor versus matched normal tissues. (A) Volcano plots showing the magnitude and direction of retained intron isoform level changes ($\Delta\Psi$, IR_{tumor-normal}) between tumor and

matched normal tissues on the X-axis and the statistical significance of change (log10(pvalue)) on the Y-axis for every JUM-profiled IR event in each of the six female patients A62684, A65665, A65667, AA3496, AA3660 and AA3662, respectively. Format is as explained in Figure 5A. (B) A summary of the number of JUM-identified, significantly changed IR events that have more retained intron in tumor (# of IR shown on the X axis) versus the ones that have more retained intron in normal tissues (# of IR shown on the Y axis) for each patient. Male patients are marked by the male symbol (3) and female patients by the female symbol (\bigcirc) . (C) Heatmap plot showing the magnitude and direction of retained intron isoform level changes ($\Delta\Psi$, IR_{tumor-normal}) between tumor and matched normal tissues for the 1,792 IR events that are significantly changed in at least one patient's tumor versus matched normal tissues identified by JUM across all 11 patients. Format as explained in Figure 5B. (D) Heatmap showing whether genes affected by changed IR in one patient's tumor versus matched normal tissues are also affected by IR in other patients. Every row shows a gene from the set of total 1,143 genes that are affected by changed IR in at least one patient's tumor versus matched normal tissues and every column shows a patient's samples. If the gene is affected by changed IR in tumor versus normal tissues in the corresponding patient, the grid is marked in red; otherwise the grid is marked in light yellow.

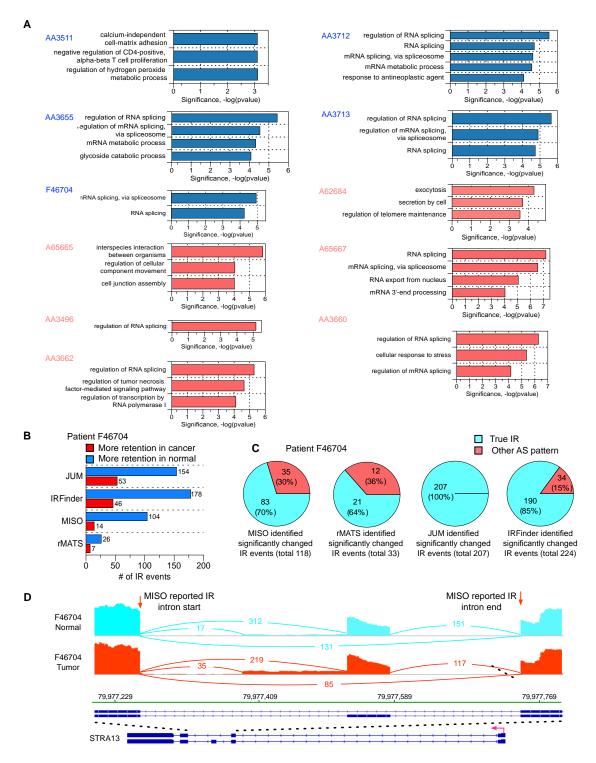


Figure S3. IR changes in colon tumor versus match normal tissues affect genes with distinct functions in different patients and comparison of JUM, rMATS, MISO and IRFinder in analyzing IR in colon cancer patients' tumor versus match normal

tissue samples. (A) Gene ontology analyses of those gene transcripts that undergo differential IR changes between tumor and matched normal tissues in each patient, respectively. (B) The number of significantly differentially spliced IR events reported by four methods, both number of IR events that are more retained in cancer and in normal tissues are shown for male patient F46704, respectively. Patient F46704 is randomly chosen here to show as an example. MISO reported a total of 118 differentially spliced IR events, among which only 14 introns were more retained in tumor samples and 104 introns were more retained in the normal tissue; rMATS identified a total of 33 differentially spliced IR events (qvalue 0.05 without restriction on $\Delta \Psi$ values due to the small number), among which 7 are more retained in the tumor sample; JUM identified a total of 207 differentially spliced IR events, among which 53 are more retained in the tumor sample; IRFinder identified a total of 224 differentially spliced IR events, among which 46 are more retained in the tumor sample. (C) Considering that IR is an intricate AS pattern that can be easily misclassified, every predicted differentially spliced IR event by MISO, rMATS, IRFinder and JUM for patient F46704 were visually examined using the genome browser viewer tool igv (45), respectively. 30% (35 out of 118) of MISOreported differentially spliced IR events are not IR events, with an example shown in (D); The ratio for rMATS is also high, with 36% (12 out of 33) rMATS-reported IR events not real IR events, with an example shown in Figue S4A; IRFinder has much lower false positive rate than MISO and rMATS, with 15% (34 out of 224) of the reported IR events are not real IR events, with an example shown in Figure S4B. All of the JUM reported IR events are true IR events. (D) An example of an incorrectly classified IR event reported by MISO in the gene STRA13 in male patient F46704. The start and end coordinates of MISO-reported retained introns are specified by red arrows. Arcs represent splice junctions identified from the RNA-seq datasets in normal tissue (blue) and paired tumor samples (red) and the number of uniquely mapped RNA-seq reads mapped to the junctions are shown across the arc. Exon coverage from RNA-seq data is also shown. This MISO-reported "IR" event is in fact a combination of an SE and A5SS event.

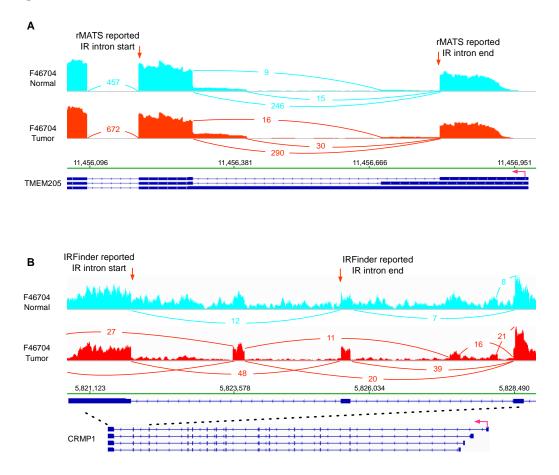


Figure S4. Examples of incorrectly classified IR events reported by other

computational software. Examples of incorrectly classified IR events reported by rMATS (A) and IRFinder (B) in genes TMEM205 and CRMP1 in male patient F46704, respectively. The start and end coordinates of reported retained introns are specified by red arrows. Arcs represent splice junctions identified from the RNA-seq datasets in normal tissue (blue) and paired tumor samples (red) and the number of uniquely mapped RNA-seq reads mapped to the junctions are shown across the arc. Exon coverage from RNA-seq data is also shown. In (A), rMATS reported a retained intron that in fact covers an exon and is in combination with an A5SS event. In (B), IRFinder reported a retained intron that covers an exon that can be alternatively included or excluded in multiple ways with upstream and downstream exons.

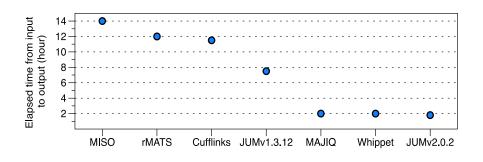


Figure S5. Computation time of the six software tools in analyzing the simulated

RNA-seq datasets. For analyzing two sets of triplicates of ~80 million 100bp reads on a standard computing cluster, Whippet, MAJIQ and JUMv2.0.2 are the fastest, taking about 2 hours (for Whippet the specified time includes read alignment time while for other software tools read alignment time is excluded), followed by JUMv1.3.12 that takes about 7.5 hours, Cufflinks 11 hours, rMATS 12 hours and MISO is the slowest that takes about 14 hours (Figure 4D). JUMv2.0.2 is the most updated JUM version that optimized running time compared to JUMv1.3.12, the previous version.



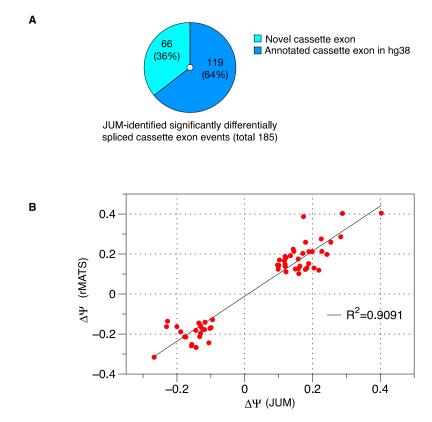


Figure S6. JUM is capable of identifying previously known AS events and novel events and quantification values of splicing changes reported by JUM and rMATS are highly correlated. (A) The distribution of previously annotated and novel SE exons from the 185 JUM-reported significantly changed SE AS events in human K562 cell lines bearing a cancer-associated SRSF2 point mutation versus wildtype. A further comparison of the 185 JUM-reported significantly differentially spliced SE events to current human transcriptome annotation revealed that 119 (64%) of these SE were previously known and annotated and 66 (36%) correspond to novel cassette exons that are supported by strong evidence from both RNA-seq exon coverage track signals and adjacent splice junctions, through visual examinations of the RNA-seq datasets using igv (2) (Figure 6B). This observation shows that JUM, although annotation-independent, is capable of accurately profiling AS events that are either previously known or novel to the specific tissue under study. In fact, a significant percentage of the JUM output results cover previously annotated AS events. (B) Scatter plots showing the splicing changes $(\Delta \Psi)$ in the exon exclusion isoform levels reported by JUM (X axis) and rMATS (y axis) for the 58 cassette exons that are identified by both JUM and rMATS as significantly changed in the human K562 cells bearing a cancer-associated SRSF2 point mutation versus wildtype. Each dot is a cassette exon and a fitting line for these dots correlating the JUM $\Delta \Psi$ and rMATS $\Delta \Psi$ is plotted, with the square of the Pearson correlation coefficient (R^2) calculated and shown as 0.9091.



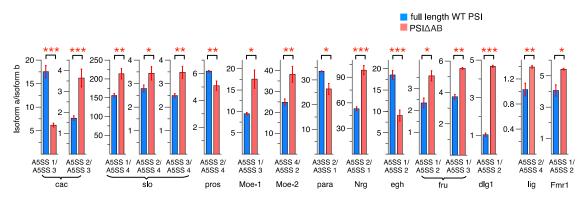
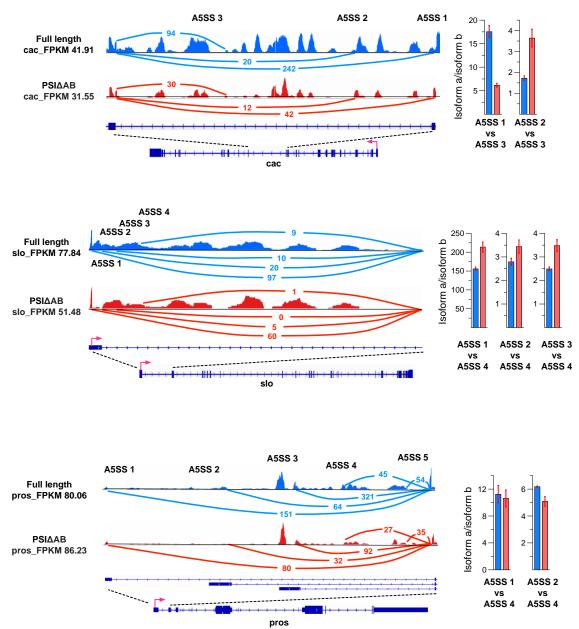


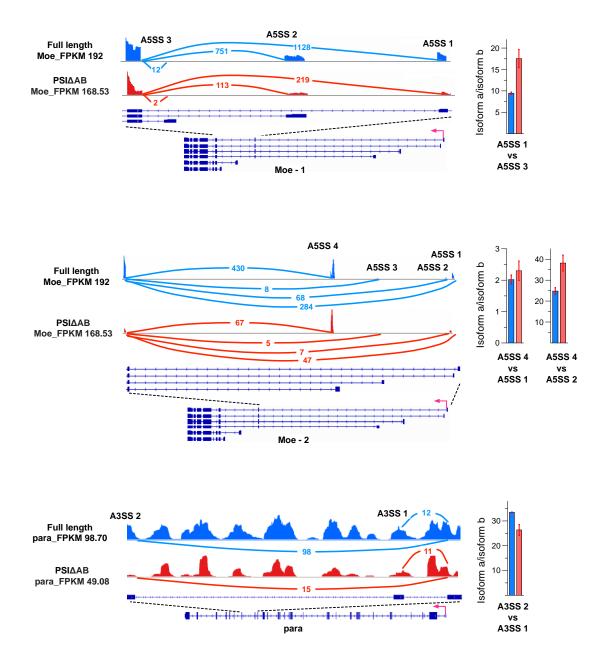
Figure S7. qRT–PCR validation of 12 significantly alternatively spliced AS events in genes associated with male courtship regulation that are only identified by JUM in the mutant male fly head. The Y-axis depicts the ratio between AS isoform a and isoform b, as indicated in the label below each bar graph. The detailed AS event structure and genome browser views of each AS event are provided in SI Appendix, Fig. S8-S11. The means of three independent measurements +/- standard deviation are shown. The differences between full-length WT PSI (blue) and PSI truncation mutation (PSI Δ AB, red) male fly head samples were analyzed by one-way ANOVA test. (*) Statistically significant with P-value < 0.05; (**) statistically significant with P-value < 0.01; (***) Statistically significant with P-value < 0.001.

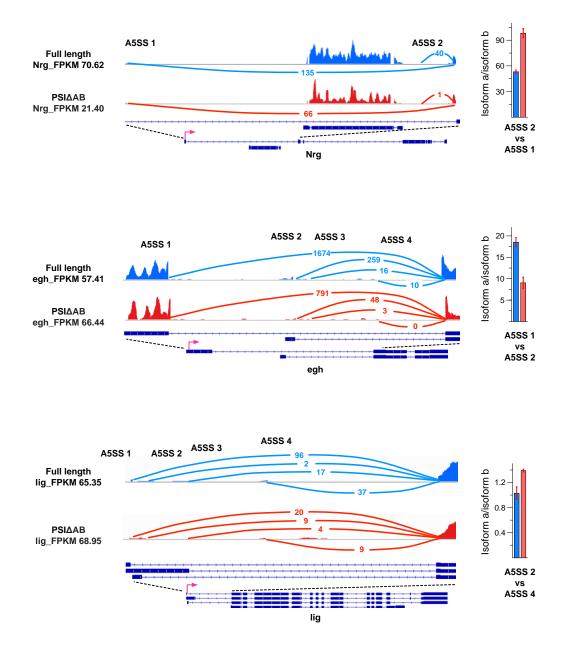
Figure S8-S11. Genome browser charts of the experimentally verified significantly alternatively spliced AS events associated with male courtship behavior regulation that are only identified by JUM in the PSI truncation mutant male fly heads versus wildtype. RNA-seq data tracks derived from the full-length wildtype PSI (blue) and PSI truncation mutation (PSI Δ AB, red) male fly head samples are shown, with arcs representing splice junctions and the number of uniquely mapped RNA-seq reads mapped to the junctions shown across the arc. Distinct A5SS or A3SS sites corresponding to alternatively spliced junctions/isoforms are shown. The orientation of the transcript is shown at the bottom: the red arrow indicates the direction of the promoter. The dotted lines indicate the region of transcript that is enlarged to highlight the alternatively spliced region. The qRT-PCR results reflecting the ratio of the two indicated alternatively spliced isoforms are shown on the right of each chart. The Y-axis depicts the ratio between AS isoform a and isoform b, as indicated in the label below each bar graph. The means of three independent measurements +/- standard deviation are shown. See also SI Appendix, Fig. S7.

It is also worth noting that although JUM relies exclusively on splice junction reads from the specific sample and profiles tissue-specific AS patterns that are novel, these JUM-identified AS events are not necessarily in poorly annotated or lowly expressed genes in the tissue sample. For example, the male courtship behavior-associated differentially spliced AS events that are only identified by JUM in PSI mutant male fly heads are in genes are that abundantly expressed, with FPKM ranges from 20 to 200 (Fig. 7A; SI Appendix, Fig. S8-S11).

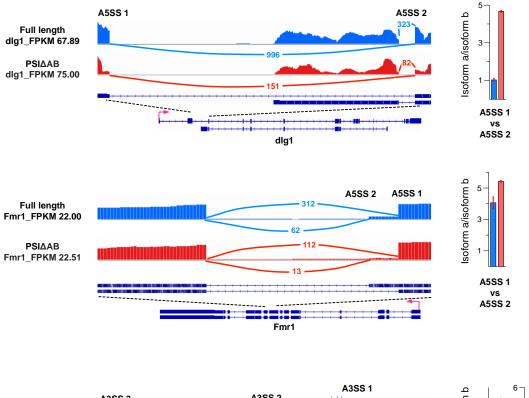


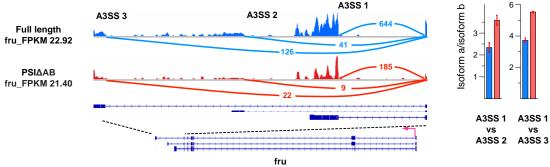






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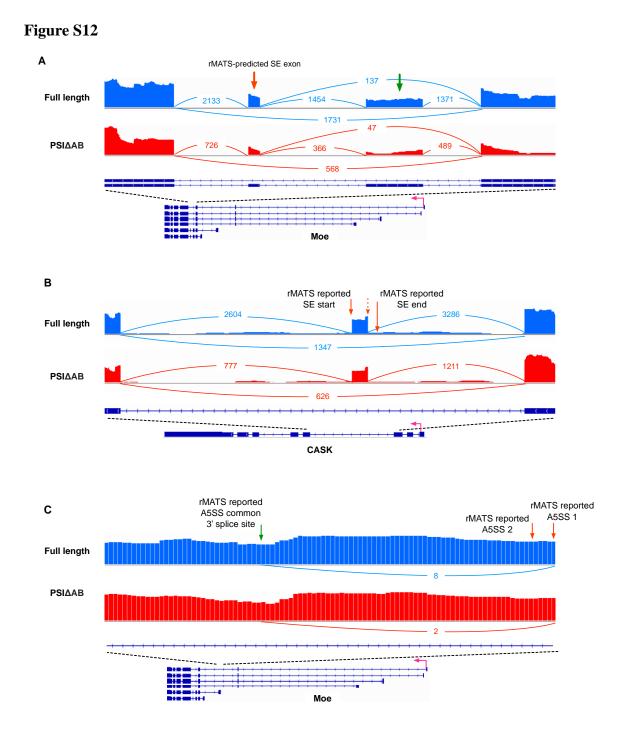


Figure S12. Examples of rMATS-predicted significantly changed AS events in genes associated with male courtship regulation that are either identified by JUM as composite AS events, or are incorrectly annotated AS events by rMATS in the first place, or for which rMATS-reported annotated AS isoforms poorly expressed in the specific fly head tissue under study. (A) An example of an rMATS-identified SE event that actually represents more complicated AS patterns in the male fly head and was re-

classified correctly by JUM as a composite AS event is shown. Exon coverage from RNA-seq data is shown in blue (full-length PSI male fly head) and red (PSI truncation mutation male fly head, $PSI\Delta AB$; arcs represent splice junctions identified from the RNA-seq data and the number of uniquely mapped RNA-seq reads mapped to the junctions are shown across the arc; Drosophila annotation (dm3) of the transcripts is shown at the bottom. The red arrow indicates the direction of the promoter. The dotted lines indicate the region of transcript that is enlarged to highlight the alternatively spliced region. rMATS-predicted SE exon is specified with a red arrow. This SE exon is in fact alternatively spliced, either as a cassette exon or together with a downstream exon (green arrow). (B) An example of an rMATS-identified SE event that is incorrectly annotated as a SE event. The start and end coordinates of the rMATS-identified SE exon are marked by solid red arrows, which is not supported by either splice junctions nor exon coverage from the RNA-seq data. There is however a real cassette exon in the region specified, but the end coordinate of the real SE exon is 45 bp upstream of the rMATS-identified SE exon end coordinate. The real SE exon is identified by JUM as a mildly changed AS event (pvalue ≤ 0.05 , $\Delta \Psi = 4\%$), but not discovered by rMATS as a significantly changed SE event. (C) An example of an rMATS-identified A5SS event for which the rMATSreported second A5SS isoform is not or poorly expressed in the fly head tissue, resulting in an invalid rMATS-identified A5SS event for the tissue under study. The two rMATSpredicted A5SS sites are shown by red arrows, while the common 3' splice site for both A5SS marked by a green arrow. No splice junctions are identified from the RNA-seq sample to support the existence of the second A5SS site, which is only 4 bp downstream of the first A5SS site. The isoform corresponding to the second A5SS site thus is either not expressed in the corresponding RNA sample or the expression is too low to be detected by the RNA-seq experiments reported here.

Supplemental Tables

Table S1. Commands for the computational simulations of RNA-seq experiments.

python cal_NB_counts.py genes.gff3 -g1 DRQW1A_2nd_passAligned.out.sam DRQW1B_2nd_passAligned.out.sam -g2 DRQW1C_2nd_passAligned.out.sam DRQW1D_2nd_passAligned.out.sam -n 3 -l 2000 -m AS-genes

python generate_rnaseq.py group2.nbcounts AS_genes_list.txt myPara.par testgroup2_0.4 -p 0.4 -c 500

python generate_rnaseq.py group2.nbcounts AS_genes_list.txt myPara.par testgroup2_0.6 -p 0.6 -c 500

python generate_rnaseq.py group2.nbcounts AS_genes_list.txt myPara.par testgroup2_0.8 -p 0.8 -c 500

Table S2. Commands for the five annotation-based AS analysis software in analyzing the simulated RNA-seq datasets.

MISO (version 0.5.4):

miso --run index_for_MISO/indexed_RI testgroup2_out.bam --output-dir testgroup2_output_RI/ --read-len 100 -- paired-end 200 10

miso --run index_for_MISO/indexed_SE_filtered testgroup2_out.bam --output-dir miso --run index_for_MISO/indexed_A3SS_filtered testgroup2_out.bam --output-dir testgroup2_output_A3SS/ -read-len 100 --paired-end 200 10

miso --run index_for_MISO/indexed_MXE testgroup2_out.bam --output-dir testgroup2_output_MXE/ --read-len 100 --paired-end 200 10

miso --run index_for_MISO/indexed_A5SS testgroup2_out.bam --output-dir testgroup2_output_A5SS/ --read-len 100 --paired-end 200 10

miso --run index_for_MISO/indexed_SE_filtered testgroup1_out.bam --output-dir testgroup1_output_SE/ --read-len 100 --paired-end 200 10

miso --run index_for_MISO/indexed_MXE testgroup1_out.bam --output-dir testgroup1_output_MXE/ --read-len 100 --paired-end 200 10

miso --run index_for_MISO/indexed_A3SS_filtered testgroup1_out.bam --output-dir testgroup1_output_A3SS/ -read-len 100 --paired-end 200 10 miso --run index_for_MISO/indexed_A5SS testgroup1_out.bam --output-dir testgroup1_output_A5SS/ --read-len 100 --paired-end 200 10

miso --run index_for_MISO/indexed_RI testgroup1_out.bam --output-dir testgroup1_output_RI/ --read-len 100 -paired-end 200 10

summarize_miso --summarize-samples testgroup1_output_ASSS/ testgroup1_output_ASSS/ summarize_miso --summarize-samples testgroup1_output_A3SS/ testgroup1_output_A3SS/ summarize_miso --summarize-samples testgroup1_output_SE/ testgroup1_output_SE/ summarize_miso --summarize-samples testgroup1_output_RI/ testgroup1_output_RI/ summarize_miso --summarize-samples testgroup1_output_MXE/ testgroup1_output_MXE/ summarize_miso --summarize-samples testgroup2_output_ASSS/ testgroup2_output_ASSS/ summarize_miso --summarize-samples testgroup2_output_ASSS/ testgroup2_output_ASSS/ summarize_miso --summarize-samples testgroup2_output_ASSS/ testgroup2_output_ASSS/ summarize_miso --summarize-samples testgroup2_output_ASSS/ testgroup2_output_ASSS/ summarize_miso --summarize-samples testgroup2_output_RI/SE/ testgroup2_output_SE/ summarize_miso --summarize-samples testgroup2_output_RI/ testgroup2_output_SE/ summarize_miso --summarize-samples testgroup2_output_RI/ testgroup2_output_SE/

compare_miso --compare-samples testgroup1_output_Rl/ testgroup2_output_Rl/ RI_comparisons/ compare_miso --compare-samples testgroup1_output_MXE/ testgroup2_output_MXE/ MXE_comparisons/ compare_miso --compare-samples testgroup1_output_A5SS/ testgroup2_output_A5SS/ A5SS_comparisons/ compare_miso --compare-samples testgroup1_output_A3SS/ testgroup2_output_A3SS/ A3SS_comparisons/ compare_miso --compare-samples testgroup1_output_A3SS/ testgroup2_output_A3SS/ A3SS_comparisons/

Cufflinks (version 2.2.1):

cufflinks -p 3 -o test1_1 -L t1_1 testgroup1_1Aligned.out_sorted.bam

cuffmerge -o merged.gtf -g genes.gtf -p 3 -s genome.fa assembly_GTF_list.txt

cuffdiff -o diff_output -L testgroup1,testgroup2 -p 4 -b genome.fa -FDR 1 merged.gtf/merged.gtf testgroup1_1Aligned.out_sorted.bam,testgroup1_2Aligned.out_sorted.bam,testgroup1_3Aligned.out_sorted.bam testgroup2_0.8_1Aligned.out_sorted.bam,testgroup2_0.8_2Aligned.out_sorted.bam,testgroup2_0.8_3Aligned.out_s orted.bam

MAJIQ (version 1.0.6a):

majiq build cleaned_genes.gff3 -conf configuration.txt --nthreads 6 --output output

majiq psi output/testgroup1_1Aligned.out_sorted.majiq.hdf5 output/testgroup1_2Aligned.out_sorted.majiq.hdf5 output/testgroup1_3Aligned.out_sorted.majiq.hdf5 --nthreads 3 --output psi_out_1 --name testgroup1

majiq psi output/testgroup2_0.8_1Aligned.out_sorted.majiq.hdf5 output/testgroup2_0.8_2Aligned.out_sorted.majiq.hdf5 output/testgroup2_0.8_3Aligned.out_sorted.majiq.hdf5 -nthreads 3 --output psi_out_2 --name testgroup2

majiq deltapsi -grp1 output/testgroup1_1Aligned.out_sorted.majiq.hdf5 output/testgroup1_2Aligned.out_sorted.majiq.hdf5 output/testgroup1_3Aligned.out_sorted.majiq.hdf5 -grp2 output/testgroup2_0.8_1Aligned.out_sorted.majiq.hdf5 output/testgroup2_0.8_2Aligned.out_sorted.majiq.hdf5 output/testgroup2_0.8_3Aligned.out_sorted.majiq.hdf5 --nthreads 3 --output deltapsi_output --names testgroup1 testgroup2

voila psi --no-html psi_out_1/testgroup1.psi.voila -o viola_testgroup_1

voila psi --no-html psi_out_2/testgroup2.psi.voila -o viola_testgroup_2

voila deltapsi --no-html deltapsi_output/testgroup1_testgroup2.deltapsi.voila --threshold 0.1 --show-all -o voila_deltapsi_output_threshold_0.1

rMATS (version 3.2.5):

RNASeq-MATS.py -b1

testgroup1_1Aligned.out_sorted.bam,testgroup1_2Aligned.out_sorted.bam,testgroup1_3Aligned.out_sorted.bam - b2

testgroup2_0.8_1Aligned.out_sorted.bam,testgroup2_0.8_2Aligned.out_sorted.bam,testgroup2_0.8_3Aligned.out_s orted.bam -gtf genes.gtf -o output -t paired -len 100 -noveISS 1

Whippet (version 0.10.4):

julia ~/.julia/v0.6/Whippet/bin/whippet-quant.jl testgroup2_0.8_1_1.fq testgroup2_0.8_1_2.fq -o testgroup2_0.8_1

julia ~/.julia/v0.6/Whippet/bin/whippet-quant.jl testgroup2_0.8_2_1.fq testgroup2_0.8_2_2.fq -o testgroup2_0.8_2

julia ~/.julia/v0.6/Whippet/bin/whippet-quant.jl testgroup2_0.8_3_1.fq testgroup2_0.8_3_2.fq -o testgroup2_0.8_3

julia ~/.julia/v0.6/Whippet/bin/whippet-quant.jl testgroup1_1_1.fq testgroup1_1_2.fq -o testgroup1_1

julia ~/.julia/v0.6/Whippet/bin/whippet-quant.jl testgroup1_2_1.fq testgroup1_2_2.fq -o testgroup1_2

julia ~/.julia/v0.6/Whippet/bin/whippet-quant.jl testgroup1_3_1.fq testgroup1_3_2.fq -o testgroup1_3

julia ~/.julia/v0.6/Whippet/bin/whippet-delta.jl -a testgroup1_1.psi.gz,testgroup1_2.psi.gz,testgroup1_3.psi.gz -b testgroup2_0.8_1.psi.gz,testgroup2_0.8_2.psi.gz,testgroup2_0.8_3.psi.gz

JUM (version 1.3.12)

bash ~/JUM_1.3.12/JUM_2-1.sh bash ~/JUM_1.3.12/JUM_2-2.sh ~/JUM_1.3.12 5 3 testgroup1 bash ~/JUM_1.3.12/JUM_2-2.sh ~/JUM_1.3.12 5 3 testgroup2 bash ~/JUM_1.3.12/JUM_2-3.sh ~/JUM_1.3.12 5 3 5 100 Rscript ~/JUM_1.3.12/R_script_JUM.R ~/JUM_1.3.12 experiment_design.txt > outputFile.Rout 2> errorFile.Rout bash ~/JUM_1.3.12/JUM_3.sh ~/JUM_1.3.12 pvalue 1 6 3 bash ~/JUM_1.3.12/JUM_4.sh ~/JUM_1.3.12 pvalue 1 3 3 refFlat.txt

 Table S3. Commands for running IRFinder (version 1.2.4) to analyze the male

 patient F46704 colon cancer and matched normal tissue datasets

IRFinder -m BuildRef -r REF/Human-hg38-release91 ftp://ftp.ensembl.org/pub/ release-91/gtf/homo_sapiens/Homo_sapiens.GRCh38.91.gtf.gz

IRFinder -r ~/software/IRFinder-1.2.4/REF/Human-hg38-release91 -d F46704_TMirfinder F46704TM_1.fastq F46704TM_2.fastq

IRFinder -r ~/software/IRFinder-1.2.4/REF/Human-hg38-release91 -d F46704_NTirfinder F46704NT_1.fastq F46704NT_2.fastq

analysisWithNoReplicates.pl -A F46704_TMirfinder/IRFinder-IR-nondir.txt -B F46704_NTirfinder/IRFinder-IRnondir.txt > TM-vs-NT.txt

Patient ID	Vital status	Tumor type	Sex	Age	Primary tumor RNA- seq sample uuid	Paired-end sequencing length	Paired normal tissue RNA-seq sample uuid	Paired-end sequencing length
TCGA-	Alive	Primary	Male	64	24dc3d9d-	48	c77b629b-	48
AA-		tumor			9011-4752-		ae40-450e-	
3511					bf86-		8154-	
					7308f89fd27d		f4fc0b6bb6e3	
TCGA-	Alive	Primary	Male	68	ef7c0e3b-	48	6e1add3f-	48
AA-		tumor			66ac-43c8-		e334-413f-	
3655					a220-		a32c-	
					abdffbdd2f24		3302f80db15f	
TCGA-	Alive	Primary	Male	65	a4299481-	48	56ec9cb6-	48
AA-		tumor			edf7-4286-		c34f-413f-	
3712					892c-		b04a-	
					d6d4a35e061d		ea2e5e429cd3	
TCGA-	Alive	Primary	Male	68	29c6bd2a-	48	34df9d7b-	48
AA-		tumor			d4db-40db-		935c-4298-	
3713					9249-		bee1-	
					bb2b7f24c7bf		cd2d03cd7950	
TCGA-	Alive	Primary	Male	60	f815284b-	48	f2e8d1e1-	48
F4-		tumor			74a2-4ad8-		001b-4a31-	
6704					9f1b-		a4ee-	
					aa1ec54fe579		23936f5f3022	
TCGA-	Alive	Primary	Female	76	52864b61-	48	18625fe4-	48
A6-		tumor			728b-451a-		3c19-45d9-	
2684					a4f9-		9d7c-	
TOOL		D :	P 1	0.7	f922ca6234c2	10	a295fbf83f2e	10
TCGA-	Alive	Primary	Female	85	85ab069a-	48	fde66458-	48
A6-		tumor			51ec-42ed-		b58b-40e6-	
5665					8e01-		89cc-	
TOOA	A 1'	D'	F 1	40	3f41791dc3b1	40	97970b566b85	40
TCGA-	Alive	Primary	Female	40	7d10f16e-	48	d1f1002d-	48
A6- 5667		tumor			737a-4351-		525b-4b8b- b52f-	
3007					ab41- 9e9794b92785		376bf792d74e	
TCGA-	Alive	Primary	Female	83	969794092763	48		48
AA-	Anve	tumor	гепате	03	bf18b4eb-ff17-	40	e3adceb2- 6d55-4812-	40
3496		tunioi			4632-a0ca-		b972-	
5470					9a1c0f002156		e46d843cb261	
TCGA-	Alive	Primary	Female	51	42c5c88c-	48	dbe71479-	48
AA-	Anve	tumor	i cinaic	51	1abd-456b-	טד	abcf-43aa-	0
3660		tunioi			be8c-		b32a-	
5000					612219c1439f		3ffab1ed1af4	
TCGA-	Alive	Primary	Female	81	c3269758-	48	f54f934c-	48
AA-	1 111 10	tumor	1 cilluic	01	60aa-4c03-	ro	181b-4ab7-	rU
3662		tunioi			9085-		9837-	
2002					ef9cc5862242		99c6d6d21875	
	1	1			5175555662212	1	· · · · · · · · · · · · · · · · · · ·	

Table S4. Summary of the TCGA colon cancer patient samples analyzed by JUM and other software

Table S5. Significantly differentially spliced AS events reported by JUM, MISO and rMATS comparing tumor and matched normal tissues in male colon cancer patients (statistical cutoff for each software tool listed in Methods).

JUM					
AS pattern	F46704	AA3511	AA3655	AA3712	AA3713
A5SS	693	574	612	730	695
A3SS	460	373	449	498	623
SE	372	345	365	451	330
MXE	6	8	10	9	8
Composite	766	503	588	694	710
IR	207	252	234	488	273

rMATS					
AS pattern	F46704	AA3511	AA3655	AA3712	AA3713
A5SS	13	16	20	22	35
A3SS	18	8	19	35	40
SE	267	172	167	293	132
MXE	86	35	45	81	74
IR	17	21	30	35	50

MISO

AS pattern	F46704	AA3511	AA3655	AA3712	AA3713
A5SS	51	27	34	41	70
A3SS	56	60	47	80	59
SE	256	161	172	275	190
MXE	109	59	80	89	102
IR	118	128	155	206	258

Table S6. Significantly differentially spliced AS events reported by JUM, MISO and rMATS comparing tumor and matched normal tissues in female colon cancer patients (statistical cutoff for each software tool listed in Methods).

J U WI						
AS pattern	A62684	AA3496	A65667	AA3662	A65665	AA3660
A5SS	1254	655	725	701	1401	532
A3SS	1051	508	565	558	1597	391
SE	571	422	481	417	625	313
MXE	10	13	10	13	13	9
Composite	930	614	773	602	770	503
IR	279	237	315	544	183	168

JUM

rMATS

AS pattern	A62684	AA3496	A65667	AA3662	A65665	AA3660
A5SS	101	33	37	33	282	20
A3SS	134	16	34	41	307	9
SE	395	329	490	169	736	131
MXE	269	66	95	50	461	22
IR	69	58	31	61	99	11

MISO

AS pattern	A62684	AA3496	A65667	AA3662	A65665	AA3660
A5SS	116	56	68	59	162	19
A3SS	144	48	73	72	176	42
SE	343	274	296	162	411	148
MXE	301	123	103	67	502	76
IR	351	252	175	356	585	111

Table S7. Summary of the sequencing depth and read genome mapping results for
tumor and normal colon tissue samples in the colon cancer patient datasets from
TCGA.

Patient Sample	Sex	# Input reads	# Uniquely	% Unique
			mapped read	mapping
AA3511-Normal	Male	58,669,541	50,311,513	85.75%
AA3511-Tumor	Male	65,542,491	56,312,516	85.92%
AA3655-Normal	Male	55,633,014	46,755,733	84.04%
AA3655-Tumor	Male	51,719,615	44,977,155	86.96%
AA3712-Normal	Male	58,387,107	47,991,007	82.19%
AA3712-Tumor	Male	61,135,422	52,350,015	85.63%
AA3713-Normal	Male	50,238,563	41,950,025	83.50%
AA3713-Tumor	Male	65,100,348	55,663,103	85.50%
F46704-Normal	Male	68,523,456	60,229,537	87.90%
F46704-Tumor	Male	105,993,154	87,417,927	82.48%
A62684-Normal	Female	61,592,972	52,835,140	85.78%
A62684-Tumor	Female	78,210,700	57,466,097	73.48%
A65665-Normal	Female	54,269,419	46,377,687	85.46%
A65665-Tumor	Female	76,057,421	65,877,389	86.62%
A65667-Normal	Female	57,034,366	50,248,336	88.10%
A65667-Tumor	Female	56,642,649	49,641,446	87.64%
AA3496-Normal	Female	37,158,143	30,861,719	83.06%
AA3496-Tumor	Female	63,603,047	55,535,760	87.32%
AA3660-Normal	Female	44,240,295	37,908,252	85.69%
AA3660-Tumor	Female	52,884,618	45,521,931	86.08%
AA3662-Normal	Female	48,553,863	41,206,944	84.87%
AA3662-Tumor	Female	56,215,719	48,707,955	86.64%

Table S8. The test of rMATS and MISO in identifying JUM-predicted, experimentally-validated, significantly changed AS events in mutant PSI Drosophila male head that are functionally associated with the aberrant courtship behavior phenotype. The AS pattern type, associated gene name, and the coordinates of the JUMidentified significantly differentially spliced AS events are listed in columns 1-3. The analysis of rMATS or MISO on these events are listed in column 4 and 5, respectively. If an AS event is identified or partially recognized, the coordinates of the AS events are listed for rMATS and MISO. If the AS event is not identified by either of the two tools, the reason is specified, almost exclusively because the AS event is not included in the AS annotation table used by MISO or not recognized by rMATS even with the aided novel splicing junction detection mode.

Gene	AS event type	JUM-identified and RNA-seq experiment-validated AS event coordinate (qvalue <= 0.1; dpsi >= 5%)	rMATS output (novel junction detection mode; qvalue <= 0.1; dpsi >= 5%)	MISO output (Bayes factor 10; fold change 5%; at least 5 read support for each isoform)
fne	A5SS	chrX:12811843 12811847 12812046- 12812608 (+)	Not recognized	chrX:12811847 1281 2046-12812608 (+) (partial; 2 A5SS sites out of 3)
	A5SS	chrX:12836880 12836889-12837117 (+)	Not recognized	chrX:12836880 1283 6889-12837117 (+)
	Composite	See supplemental table		
fru	A3SS	chr3R:14243022 14248904 14252888- 14256552 (-)	Not recognized	Not annotated
	Composite	See supplemental table		
cac	ÎR	chrX:11829763-11829831 (-)	Not recognized	chrX: 11829763- 11829831 (-)
	A5SS	chrX:11848314- 11850953 11854106 11856051 (-)	Not recognized	Not annotated
	Composite 3X	See supplemental table		
dlg1	A5SS	chrX:11268543 11270751-11270873 (+)	Not recognized	Not annotated
	Composite 2X			
slo	A5SS	chr3R:20488244 20488285 20488293 -20490084 (+)	Not recognized	Not annotated
	MXE	chr3R: 20517655- 20517925:20518038- 20519493:20519606-20520677	chr3R: 20517655- 20517925:2051 8038- 20519493:2051 9606-20520677	Not annotated

	MXE	chr3R:20513019- 20513521:20513627- 20515043:20515149-20517180 (+)	chr3R:2051301 9- 20513521:2051 3627- 20515043:2051 5149-20517180 (+)	Not annotated
	Composite 3X			
CASK	SE	chr3R:17615482- 17616430:17616460-17617251 (-)	chr3R:1761548 2- 17616430:1761 6460-17617251 (-)	Not annotated
	Composite			
pros	IR	chr3R:7201560-7202042 (+)	Not recognized	chr3R:7201560- 7202044 (+)
	A5SS	chr3R:7155678 7159275 7161344 716 2787 7164714-7165378 (+)	Not recognized	Not annotated
Fmr1	A5SS	chr3R:5930732-5930780 5930789 (-)	Not recognized	Not annotated
Moe	A5SS	chrX:8770785- 8771045 8772500 8774323 (-)	Not recognized	Not annotated
	A5SS	chrX:8774433- 8785593 8788090 8791870 8792215 (-)	Not recognized	Not annotated
qtc	SE	chr2L:5068394-5069126:5069219- 5070095 (+)	chr2L:5068394- 5069126:50692 19-5070095 (+)	chr2L:5068394- 5069126:5069219- 5070095 (+)
lig	A5SS	chr2R:3955516 3955585 3955871 395 6339-3957374 (+)	Not recognized	Not annotated
	Composite			
eag	SE	chrX:14884465-14885378:14884464- 14886751	chrX:14884465- 14885378:1488 4464-14886751	Not annotated
ļ	Composite			
para	A3SS	chrX:16371604 16374835-16375357	Not recognized	Not annotated
	Composite X3			
Nrg	A5SS	chrX:8412431 8424347-8425556 (+)	Not recognized	Not annotated
	Composite			
egh	A5SS	chrX:2483539 2486381 2486695 2488233-2489757 (+)	Not recognized	Not annotated

Table S9. The test of JUM in detecting rMATS-predicted significantly differentially spliced AS events that are within genes associated with male courtship behavior regulation in mutant PSI Drosophila male head transcriptome versus wildtype. The AS event associated gene name, AS pattern type, and the coordinates of the rMATS-identified significantly differentially spliced AS events in male courtship regulatory genes are listed in columns 1-3. A visual genome browser verification of each AS event was performed and the results presented in column 4. The performance of JUM analysis on these AS events are listed in column 5.

rMATS identified AS event gene	rMATS identified AS event type	rMATS identified AS events coordinate	Genome browser verification	JUM prediction
fru	IR	chr3R:14332050-14332284 (-)	Incorrect annotation; not an IR event	N/A
	SE	chr3R:14261512-14275956:14276104- 14332215 (+)	Composite	Detected by JUM as a Composite AS event
dlg1	A5SS	chrX:11283888 11283730 11283814- 11284263 (+)	Annotated alternative isoforms not/poorly expressed in fly head tissue	N/A
	SE	chrX:11290136-11293774:11293849- 11299306 (+)	Composite event 1	Detected by JUM as a Composite AS event
	SE	chrX:11294865-11296739:11296820- 11299306 (+)	Composite event 1	Detected by JUM as a Composite AS event
	SE	chrX:11290136-11293774:11293849- 11294820 (+)	Composite event 1	Detected by JUM as a Composite AS event
	SE	chrX:11276013-11276968:11277145- 11281804 (+)	Composite event 2	Detected by JUM as a Composite AS event
slo	SE	chr3R:20490517-20490618:20490807- 20495262 (+)	Composite event 1	Detected by JUM as a Composite AS event
	SE	chr3R:20501522-20505207:20505299- 20508029 (+)	Composite event 2	Detected by JUM as a Composite AS events
	SE	chr3R:20501522-20502965:20503057- 20508029 (+)	Composite event 2	Detected by JUM as a Composite AS event

	SE	chr3R:20505299-20508029:20508121- 20512908 (+)	Composite event 2	Detected by JUM as a Composite AS event
	SE	chr3R:20517655-20519493:20519533- 20520678 (+)	Composite event 2	Detected by JUM as a Composite AS event
	SE	chr3R:20521848-20525097:20525148- 20526427 (+)	Composite event 3	Detected by JUM as a Composite AS event
	SE	chr3R:20521848-20527809:20527884- 20528742 (+)	Composite event 3	Detected by JUM as a Composite AS event
	SE	chr3R:20525148-20526427:20526451- 20527809 (+)	Composite event 3	Detected by JUM as a Composite AS event
	SE	chr3R:20525148-20526430:20526451- 20528742 (+)	Composite event 3	Detected by JUM as a Composite AS event
	SE	chr3R:20521139-20523919:20523991- 20528839 (+)	Composite event 3	Detected by JUM as a Composite AS event
	SE	chr3R:20521139-20521812:20521848- 20528839 (+)	Composite event 3	Detected by JUM as a Composite AS event
	SE	chr3R:20523991-20525097:20525148- 20528742 (+)	Composite event 3	Detected by JUM as a Composite AS event
	SE	chr3R:20521848-20525097:20525148- 20528742 (+)	Composite event 3	Detected by JUM as a Composite AS event
	MXE	chr3R: 20517655-20517925:20518038- 20519493:20519606-20520677	True MXE event	Detected by JUM as an MXE AS event
	MXE	chr3R:20513019-20513521:20513627- 20515043:20515149-20517180 (+)	True MXE event	Detected by JUM as an MXE AS event
CASK	A5SS	chrX:17633456-17634210 17634338 (-)	Composite event	Detected by JUM as a Composite AS event
	SE	chr3R:17613824-17614595:17614694- 17615170 (-)	Incorrect annotation; not SE event	N/A

	SE	chr3R:17615482-17616430:17616460- 17617252 (-)	True SE event	Detected by JUM as an SE AS event
Moe	A5SS	chrX:8772638-8772692 8772696 (-)	Annotated alternative isoforms not/poorly expressed in fly head tissue	N/A
	SE	chr3R:8774433-8791871:8791960- 8792216 (-)	Annotated alternative isoforms not/poorly expressed in fly head tissue	N/A
	SE	chr3R:8769893-8770065:8770092- 8770605 (-)	Composite event	Detected by JUM as a Composite AS event
qtc	SE	chr2L:5068394-5069133:5069219- 5070096 (-)	Incorrect annotation; not SE event	N/A
	SE	chr2L:5068394-5069126:5069219- 5070096 (-)	True SE event	Detected by JUM as an SE AS event
lig	A5SS	chr2R:3955585 3955516 3955871- 3957375 (+)	Annotated alternative isoforms not/poorly expressed in fly head tissue	N/A
eag	SE	chrX:14884465-14885378:14884464- 14886751 (+)	True SE event	Detected by JUM as an SE AS event
para	SE	chrX:16392929-16394539:16394561- 16398022 (-)	Composite event 1	Detected by JUM as a Composite AS event
	SE	chrX:16392929-16394539:16394602- 16398022 (-)	Composite event 1	Detected by JUM as a Composite AS event
	A5SS	chrX:16377922-16380373 16380412 (-)	Composite event 2	Detected by JUM as a Composite AS event
	A5SS	chrX:16377892-16380373 16380412 (-)	Composite event 2	Detected by JUM as a Composite AS event
	A3SS	chrX:16377922 16377892-16380412 (-)	Composite event 2	Detected by JUM as a Composite AS event

	A3SS	chrX:16377922 16377892-16380373 (-)	Composite event 2	Detected by JUM as a Composite AS event
	A5SS	chrX:16394602-16398022 16398094 (-)	Composite event 3	Detected by JUM as a Composite AS event
Nrg	A5SS	chrX:8411457 8411542 8411607 8411609 8411611 8411623 8411635 8411639 84116 67 8411703-8425729	Annotated alternative isoforms not/poorly expressed in fly head tissue	N/A

Supplemental Datasets.

Dataset S1-S34: Differential AS analysis results using four different software tools (JUM, MISO, rMATS and IRFinder) on the TCGA colon cancer tumor versus matched normal tissue samples. **Dataset S1:** AA3511_JUM_differential_AS_qvalue_0.05_dpsi_10%.xlsx **Dataset S2:** AA3511_MISO_differential_AS_filtered.xlsx **Dataset S3:** AA3511_rMATS_differential_AS_qvalue_0.05_dpsi_10%.xlsx Dataset S4: AA3655_JUM_differential_AS_qvalue_0.05_dpsi_10%.xlsx **Dataset S5:** AA3655_MISO_differential_AS_filtered.xlsx Dataset S6: AA3655 rMATS differential AS gvalue 0.05 dpsi 10%.xlsx Dataset S7: AA3712_JUM_differential_AS_qvalue_0.05_dpsi_10%.xlsx **Dataset S8:** AA3712 MISO differential AS filtered.xlsx **Dataset S9:** AA3712_rMATS_differential_AS_qvalue_0.05_dpsi_10%.xlsx Dataset S10: AA3713 JUM differential AS qualue 0.05 dpsi 10%.xlsx Dataset S11: AA3713 MISO differential AS filtered.xlsx Dataset S12: AA3713_rMATS_differential_AS_qvalue_0.05_dpsi_10%.xlsx Dataset S13: F46704 JUM AS differential gvalue 0.05 dpsi 10%.xlsx **Dataset S14:** F46704_MISO_AS_differential_filtered.xlsx Dataset S15: F46704 rMATS differential AS qualue 0.05 dpsi 10%.xlsx Dataset S16: F46704 IRFinder differential IR pvalue 0 05 dpsi 10%.xlsx Dataset S17: A62684_JUM_differential_AS_qvalue_0.05_dpsi_10%.xlsx **Dataset S18:** A62684_MISO_differential_AS_filtered.xlsx Dataset S19: A62684 rMATS differential AS qualue 0.05 dpsi 10%.xlsx Dataset S20: A65665 JUM differential AS qualue 0.05 dpsi 10%.xlsx Dataset S21: A65665 MISO differential AS filtered.xlsx **Dataset S22:** A65665_rMATS_differential_AS_qvalue_0.05_dpsi_10%.xlsx Dataset S23: A65667 JUM differential AS qualue 0.05 dpsi 10%.xlsx **Dataset S24:** A65667_MISO_differential_AS_filtered.xlsx **Dataset S25:** A65667 rMATS differential AS gvalue 0.05 dpsi 10%.xlsx Dataset S26: AA3496_JUM_differential_AS_qvalue_0.05_dpsi_10%.xlsx **Dataset S27:** AA3496_MISO_differential_AS_filtered.xlsx Dataset S28: AA3496 rMATS differential AS qvalue 0.05 dpsi 10%.xlsx Dataset S29: AA3660 JUM differential AS qualue 0.05 dpsi 10%.xlsx Dataset S30: AA3660 MISO differential AS filtered.xlsx **Dataset S31:** AA3660_rMATS_differential_AS_qvalue_0_05_dpsi_10%.xlsx **Dataset S32:** AA3662_JUM_differential_AS_qvalue_0.05_dpsi_10%.xlsx Dataset S33: AA3662 MISO differential AS filtered.xlsx **Dataset S34:** AA3662_rMATS_differential_AS_qvalue_0_05_dpsi_10%.xlsx **Dataset S35:** Significant GO term enrichment for genes affected by IR in each patient. **Dataset S36**: $\Delta \Psi$ values in IR events that are identified as significantly changed in at least one patient by JUM and also annotated in the MISO library (deltaPSI_value_in_IR_sig_change_in_at_least_one_patient_and_annotated_in_MISO_li brary.xlsx).

Dataset S37: $\Delta \Psi$ values in IR events that are identified as significantly changed in at least one patient by JUM

(deltaPSI_value_in_IR_sig_change_in_at_least_one_patient.xlsx).

Dataset S38: $\Delta \Psi$ values in IR events that affect splicing factors and are identified as significantly changed in at least one patient by JUM

(deltaPSI_value_in_IR_affecting_splicing_factor_in at_least_1_patients.xlsx).

Dataset S39: $\Delta \Psi$ values in IR events that affect splicing factors and are identified as significantly changed in at least three patients by JUM

(deltaPSI_value_in_IR_affecting_splicing_factor_in at_least_3_patients.xlsx).

Dataset S40: Differential AS analysis results using JUM on the SRSF2 single mutation carrying K562 cell lines versus wildtype

(SRSF2mut_JUM_differential_AS_qvalue_0.1_dpsi_10%.xlsx).

Dataset S41-S43: Differential AS analysis results using three different software tools (JUM, MISO and rMATS) on the male fruit fly heads carrying the PSI Δ AB mutation versus wildtype.

Dataset S41: PSIdeltaAB_JUM_differential_AS_qvalue_0.1_dpsi_5%.xlsx

Dataset S42: PSIdeltaAB_MISO_differential_AS_filtered.xlsx

Dataset S43: PSIdeltaAB_rMATS_differential_AS_qvalue_0_1_dpsi_5%.xlsx

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- 2. Robinson JT, *et al.* (2011) Integrative genomics viewer. *Nat Biotechnol* 29(1):24-26.