# **UC Santa Cruz**

# **UC Santa Cruz Previously Published Works**

## **Title**

Identification of novel transcripts and peptides in developing murine lens

## **Permalink**

https://escholarship.org/uc/item/29t4w0jc

# **Journal**

Scientific Reports, 8(1)

## **ISSN**

2045-2322

## **Authors**

Khan, Shahid Y Ali, Muhammad Kabir, Firoz et al.

# **Publication Date**

2018

## DOI

10.1038/s41598-018-28727-w

# **Copyright Information**

This work is made available under the terms of a Creative Commons Attribution License, available at https://creativecommons.org/licenses/by/4.0/

Peer reviewed



# **OPEN**

Received: 24 January 2018 Accepted: 19 June 2018 Published online: 24 July 2018

# Identification of novel transcripts and peptides in developing murine lens

Shahid Y. Khan<sup>1</sup>, Muhammad Ali<sup>1</sup>, Firoz Kabir<sup>1</sup>, Ruiqiang Chen<sup>2</sup>, Chan Hyun Na<sup>2</sup>, Mei-Chong W. Lee<sup>3</sup>, Nader Pourmand<sup>3</sup>, Sean F. Hackett<sup>1</sup> & S. Amer Riazuddin<sup>1</sup>

We previously investigated the transcriptome and proteome profiles of the murine ocular lens at six developmental time points including two embryonic (E15 and E18) and four postnatal time points (P0, P3, P6, and P9). Here, we extend our analyses to identify novel transcripts and peptides in developing mouse lens. We identified a total of 9,707 novel transcripts and 325 novel fusion genes in developing mouse lens. Additionally, we identified 13,281 novel alternative splicing (AS) events in mouse lens including 6,990 exon skipping (ES), 2,447 alternative 3' splice site (A3SS), 1,900 alternative 5' splice site (A5SS), 1,771 mutually exclusive exons (MXE), and 173 intron retention (IR). Finally, we integrated our OMIC (Transcriptome and Proteome) datasets identifying 20 novel peptides in mouse lens. All 20 peptides were validated through matching MS/MS spectra of synthetic peptides. To the best of our knowledge, this is the first report integrating OMIC datasets to identify novel peptides in developing murine lens.

Next-generation RNA sequencing (RNA-Seq) has significantly enhanced our ability to decipher whole transcriptomes through the gene expression quantification, identification of novel transcripts, detection of fusion genes, and isoform diversity<sup>1-7</sup>. The mouse genome encodes 53,715 genes, including 21,981 protein-coding genes (GENCODE Ver. M17). However, the total number of transcripts encoded by these genes is believed to be much higher suggesting multiple layers of complexity at the transcriptome level<sup>8,9</sup>.

Fusion genes describe a phenomenon of hybrid RNA resulting from read-through transcripts, composed of two different genes formed during chromosomal re-arrangements<sup>10,11</sup>. Fusion genes could be a product of cis-splicing as well as trans-splicing<sup>12–15</sup>. Alternative mRNA splicing, a phenomenon more prevalent in higher eukaryotes, provides additional diversity in gene expression<sup>8,16</sup>, and according to some estimates >95% of human multi-exonic mRNAs undergo mRNA splicing<sup>9,17,18</sup>.

The ocular tissue especially the retina has been characterized extensively using multiple next-generation based transcriptome studies that revealed highly diverse annotated and novel transcriptome and novel isoforms<sup>19,20</sup>. In contrast, the characterization of the lens expression profile has received less attention and fewer next-generation RNA sequencing-based studies have been completed. Recently, Srivastava and colleagues identified novel transcripts and splicing alterations in developing murine lens<sup>21</sup>.

We previously reported the mouse lens coding and non-coding transcriptome at six developmental time points including two embryonic (E15 and E18) and four postnatal stages (P0, P3, P6, and P9)<sup>22,23</sup>. More recently, we reported a comprehensive proteome of the mouse lens at the same six developmental time points<sup>24</sup>. Here, we extend our analyses to identify novel transcripts and peptides in developing mouse lens.

#### Results

Here, we extend our analysis of the RNA-Seq data using multiple bioinformatics tools to identify novel transcripts, fusion genes, and alternative splicing (AS) in developing mouse lens (Fig. 1). Additionally, we integrate our OMIC (Transcriptome and Proteome) datasets to identify novel peptides in mouse lens and subsequently validated them through matching MS/MS spectra of synthetic peptides (Fig. 1).

<sup>1</sup>The Wilmer Eye Institute, Johns Hopkins University School of Medicine, Baltimore, MD, 21287, USA. <sup>2</sup>Department of Biological Chemistry, Johns Hopkins University School of Medicine, Baltimore, MD, 21205, USA. <sup>3</sup>Department of Biomolecular Engineering, University of California, Santa Cruz, CA, 94305, USA. Correspondence and requests for materials should be addressed to S.A.R. (email: riazuddin@jhmi.edu)

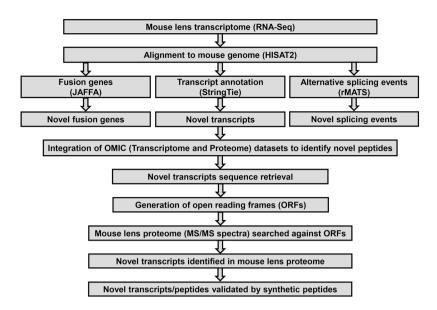


Figure 1. Illustration of the workflow to identify novel transcripts and peptides in developing mouse lens. Briefly, HISAT2, a splice aligner tool was used for the alignment of mouse lens RNA-Seq reads (FASTQ) to the mouse genome, followed by the transcripts annotation and expression quantification using the StringTie algorithm. In parallel, the RNA-Seq aligned data was further processed using JAFFA, and rMATS algorithms to detect fusion genes, and alternative splicing events, respectively, expressing in mouse lens. The novel transcripts ( $\geq 1.0$ TPM) were analyzed using a proteogenomics approach to identify novel peptides. The novel transcripts were translated into potential open reading frames (ORFs) to generate a reference database. The mouse lens proteome data (MS/MS spectra) was searched against this reference database to identify novel peptides. Finally, the novel peptides were validated through matching MS/MS spectra of synthetic peptides.

Developmental	Transcripts expression (≥1.0 TPM)				
Stage	Annotated Novel		Semi-novel	Fusion Genes	
E15	18,087	6,645	11,025	195	
E18	17,500	7,061	10,335	161	
P0	17,257	7,569	11,194	275	
Р3	17,257	7,513	11,199	218	
P6	16,656	7,293	10,831	280	
P9	16,674	7,084	10,605	223	
Total	21,265	9,707	14,113	325	

**Table 1.** Transcripts identified in developing mouse lens. Note: E15 and E18 are embryonic days 15, and 18, and P0, P3, P6, and P9 are postnatal days 0, 3, 6, and 9, respectively; TPM: transcripts per million.

First, the raw reads were mapped to the *Mus musculus* genome resulting in >93% alignment to the genome. Next, the aligned reads were examined for PCR duplicates identifying ~19% of total reads as PCR duplicates that were removed. The remaining mapped reads were processed using StringTie to convert the RNA-Seq alignments into potential transcripts and the expression of each transcript was measured and normalized using transcripts per million (TPM) algorithm. Our analysis identified both annotated and novel transcripts in mouse lens transcriptome. We divided the novel transcripts further into two categories: first, transcripts that map entirely to the unannotated regions of the mouse genome and second, transcripts that partially align to both annotated and unannotated regions of the mouse genome.

We identified a total of 21,265 annotated transcripts expressed in at least one of the six developmental time points (Table 1 & Supplementary Table 1). Of these, we identified 9,707 novel transcripts present in at least one of the six developmental stages mapping entirely to unannotated regions of the mouse genome (Table 1 & Supplementary Table 2). Additionally, we identified 14,113 transcripts aligned to both the annotated and the unannotated regions of the mouse genome (Table 1 & Supplementary Table 3) termed hereafter as semi-novel transcripts.

We further investigated our mRNA sequencing data to identify fusion genes expressed in the mouse lens transcriptome. The analysis identified 325 novel fusion genes including 195, 161, 275, 218, 280, and 223 fusion genes in the mouse lens at E15, E18, P0, P3, P6, and P9, respectively (Table 1 & Supplementary Table 4). Gene ontologies (GO) based functional and mammalian phenotype enrichment analysis of novel fusion genes revealed

(q-value  $\leq$  0.01) unique molecular function, biological process, cellular component and mammalian phenotypes (Supplementary Tables 5–6).

Next, we examined our RNA-Seq dataset using the rMATS pipeline ( $\leq$ 0.01 FDR) to identify the novel AS events across the six developmental time points in mouse lens. In total, we identified five AS events including exon skipping (ES), alternative 3' splice site (A3SS), alternative 5' splice site (A5SS), mutually exclusive exons (MXE), and intron retention (IR) in developing mouse lens (Table 2). The analysis identified 6,990 novel ES splicing events ( $\leq$ 0.01 FDR) across the six developmental time points in mouse lens (Supplementary Table 7). Of these 2,023 events present in at least one developmental time point, and 4,967 ES events in  $\geq$ 2-time points (Supplementary Table 7).

We identified 2,447 novel A3SS splicing events ( $\leq$ 0.01 FDR) including 809 events detected in a single developmental time point and 1,638 events in  $\geq$ 2-time points (Supplementary Table 8). Likewise, we identified 1,900 novel A5SS splicing events including 719 events detected in a single developmental time point and 1,181 events in  $\geq$ 2-time points (Supplementary Table 9). Furthermore, we identified 1,771 novel MXE splicing events ( $\leq$ 0.01 FDR) including 387 events detected in a single developmental time point and 1,384 events in  $\geq$ 2-time points (Supplementary Table 10). Lastly, our analysis identified 173 IR splicing events ( $\leq$ 0.01 FDR) in mouse lens (Supplementary Table 11).

Our RNA-Seq datasets are critical in identifying novel transcripts; however, the biological significance of these events is incomplete without knowing the corresponding changes at the protein level. We recently investigated the proteome profile of developing mouse lens through mass spectrometry-based protein sequencing<sup>24</sup>. We integrated our OMIC datasets to identify novel peptides in mouse lens. As mentioned above, we identified a total of 9,707 novel transcripts that were translated into three open reading frames (ORFs) to identify all theoretical peptides translated by the novel transcripts. This theoretical peptide dataset was interrogated against the mouse lens proteome to identify peptides originating from a sequence of the novel transcripts (9,707 novel transcripts identified in the mouse lens transcriptome). The analysis identified 55 peptides in the mouse lens proteome based on TMT spectra. All of the 55 candidate peptides were screened against the mouse non-redundant (nr) protein database (NCBI) and peptides with  $\geq$ 2 amino acids mismatches and an XCorr score  $\geq$ 2.5 were considered novel. This criterion identified a total of 20 novel peptides that were retained for further analysis.

All 20 novel peptides along with three control peptides were synthesized commercially and the respective spectra of these synthetic peptides were generated using the Orbitrap Fusion Lumos Tribrid Mass Spectrometer. The MS/MS fragmentation patterns of synthetic peptides were manually compared with MS/MS spectra generated from the proteomic analysis of mouse lens. The control peptides revealed similar spectra consistent with the MS/MS fragmentation patterns originating from mouse lens proteome (Supplementary Figs 1–3). The MS/MS fragmentation patterns of all 20 synthetic peptides (representing 20 novel peptides) exhibited spectrum consistent the MS/MS fragmentation patterns originating from mouse lens proteome dataset (Table 3, Fig. 2, Supplementary Figs 4–20, and Supplementary Table 12).

## Discussion

We previously investigated mouse lens transcriptome at two embryonic (E15 and E18) and four postnatal (P0, P3, P6, and P9) time points using next-generation RNA sequencing, which identified a total of 14,465 genes along with 12 different classes of non-coding RNAs (ncRNAs) in mouse lens<sup>22,23</sup>. More recently, we completed a comprehensive proteome of mouse lens at the same six developmental time points identifying 5,404 proteins<sup>24</sup>. A brief overview of these published datasets is provided in Table 4. In here, we extend our analyses to identify novel transcripts and novel peptides in developing mouse lens.

Our analysis revealed 9,707 novel transcripts identified in six developmental time points (Table 1, and Supplementary Table 2). Of these, ~25% are multi-exonic and ~40% are expressed in all six developmental time points (Supplementary Table 2). In addition to novel transcripts, we identified a total of 14,113 semi-novel transcripts in lens transcriptome (Table 1, and Supplementary Table 3). In contrast to the novel transcripts where a majority (~75%) of the transcript are single exon, most of the semi-novel transcripts (>85%) revealed a multi-exonic structure i.e.  $\geq$ 2.0 exons (Supplementary Tables 2 and 3).

We identified 325 novel fusion genes in developing mouse lens (Table 1). Among these, we identified multiple fusion transcripts for  $Cry\alpha A$ ,  $Cry\alpha B$ ,  $Cry\beta A1$ ,  $Cry\beta A2$ ,  $Cry\beta A4$ ,  $Cry\beta B1$ ,  $Cry\beta B2$ ,  $Cry\beta B3$ ,  $Cry\gamma A$ ,  $Cry\gamma A$ ,  $Cry\gamma C$ ,  $Cry\gamma D$ ,  $Cry\gamma D$ ,  $Cry\gamma D$ , and  $Cry\gamma D$  (Supplementary Table 4). Additionally, we identified fusion transcripts for Bfsp1, Bfsp2, Tdrd7, Mip, Lim2, Pax6, and  $Dnase2\beta$  in mouse lens (Supplementary Table 4). Multiple studies have reported fusion genes in normal human and mouse tissues and more importantly, in tumorigenesis<sup>25–28</sup>. We did not find any reports in literature, and therefore this would be the first report describing fusion genes in the ocular lens.

Multiple transcriptome-based studies have revealed extensive AS in normal human and mouse ocular tissues<sup>29–35</sup>. We identified 13,281 novel AS events in developing mouse lens with a predominant contribution from ES, A3SS, A5SS, and MXE while a small number of IR splicing events identified in developing mouse lens (Table 2). The ES events contribute to the diversity of the transcriptome and consistent with this notion, we identified a total of 6,990 ES events in developing mouse lens. Interestingly, most of the ES were identified at embryonic time points (Table 2).

Recently, Srivastava and colleagues reported the identification of 1,241 AS events in developing mouse lens<sup>21</sup>, examining RNA-Seq datasets recently published by our group<sup>22</sup>. We identified a total of 13,281 AS events in developing mouse lens analyzing the same RNA-Seq datasets. The difference in the numbers of AS events published by Srivastava and colleagues and identified in the current study may be attributed to different cut-off values. Srivastava and colleagues used PSI (Percent Spliced Index) cut-off value for significant (<1% FDR) AS events<sup>21</sup>, whereas we used a cut-off value of  $\le 0.01$  FDR for the identification of AS events in developing mouse lens.

<b>Developmental Stage</b>	Types of AS Events	<b>Total AS Events</b>	Significant Novel AS Events*	
	ES	22160	416	
	MXE	3069	93	
E15 vs. E18	A5SS	9753	162	
	A3SS	13755	306	
	IR	575	23	
	ES	26560	521	
	MXE	4379	124	
E15 vs. P0	A5SS	10743	97	
	A3SS	14818	93	
	IR	646	11	
	ES	23261	336	
	MXE	3881	107	
E15 vs. P3	A5SS	10247	106	
113 10.13	A3SS	14215	107	
	IR	605	8	
	ES	22898	459	
	MXE		129	
E15 vs. P6	A5SS	3827 10119	110	
E15 VS. P0				
	A3SS	14093	119	
	IR	617	8	
	ES	21982	444	
	MXE	3872	121	
E15 vs. P9	A5SS	9859	97	
	A3SS	13623	94	
	IR	559	13	
	ES	23579	1107	
	MXE	3470	194	
E18 vs. P0	A5SS	9295	259	
	A3SS	12849	309	
	IR	557	26	
	ES	20212	810	
	MXE	3321	219	
E18 vs. P3	A5SS	8888	233	
	A3SS	12271	287	
	IR	515	19	
	ES	19789	931	
	MXE	3109	198	
E18 vs. P6	A5SS	80692	238	
	A3SS	12123	300	
	IR	503	21	
	ES	18776	921	
	MXE	2938	188	
E18 vs. P9	A5SS	8384	241	
	A3SS	11645	290	
	IR	452	15	
	ES	24298	281	
	MXE	4296	131	
P0 vs. P3	A5SS	9669	82	
	A3SS	13227	108	
	IR	586	5	
	ES	23843	194	
	MXE	4265	33	
P0 vs. P6	A5SS	9581	46	
1 0 75. 1 0				
	A3SS	13119	88	
	IR	583	6	

<b>Developmental Stage</b>	Types of AS Events	<b>Total AS Events</b>	Significant Novel AS Events*	
	ES	22985	214	
	MXE	4137	49	
P0 vs. P9	A5SS	9293	67	
	A3SS	12681	114	
	IR	533	9	
	ES	20632	149	
	MXE	4121	108	
P3 vs. P6	A5SS	9142	62	
	A3SS	12526	89	
	IR	542	3	
	ES	19721	143	
	MXE	3816	60	
P3 vs. P9	A5SS	8832	54	
	A3SS	12003	78	
	IR	499	4	
	ES	19208	64	
	MXE	4083	17	
P6 vs. P9	A5SS	8672	46	
	A3SS	11934	65	
	IR	492	2	

**Table 2.** Alternative splicing events identified in developing mouse lens. Note: AS: alternative splicing; ES: exon skipping; MXE: mutually exclusive exon; A5SS: alternative 5' splice site; A3SS: alternative 3' splice site; and IR: intron retention. \*Significant events based on false discovery rate (FDR) <0.01. E15 and E18 are embryonic days 15, and 18, and P0, P3, P6, and P9 are postnatal days 0, 3, 6, and 9, respectively.

Finally, we adopted a proteogenomics approach to identify expression of novel transcripts in mouse lens proteome and subsequently validated these novel peptides through MS/MS spectra of corresponding synthetic peptides. In silico analyses identified a total of 55 novel peptides in mouse lens protome. Of these, only 20 peptides passed a more stringent criterium i.e.  $\geq$ 2 amino acids mismatches and an XCorr score  $\geq$ 2.5. These 20 novel peptides were validated through MS/MS spectra of corresponding synthetic peptides. We are currently investigating the identity of the proteins harboring these novel peptides and examining their biological significance in lens morphogenesis.

In conclusion, we represent a comprehensive developing mouse lens profile through the identification of novel transcripts, novel fuson genes, and novel AS events. Additionally, we integrate our OMIC datasets to identify novel peptides in developing mouse lens.

#### **Materials and Methods**

mRNA sequencing data. The Illumina paired-end mRNA sequencing data (GEO series accession number GSE69221) was used for the downstream bioinformatics analysis. The paired-end raw reads were processed to remove the adapter sequences using SeqPrep (https://github.com/jstjohn/SeqPrep). The quality of the pre-processed reads was evaluated with FastQC (www.bioinformatics.babraham.ac.uk/projects/fastqc) and low-quality reads were removed prior to the downstream analysis.

Mapping and transcript annotation of mRNA sequencing data. HISAT2 (Hierarchical Indexing for Spliced Alignment of Transcripts), a spliced alignment tool (Ver. 2.1.0-beta) was used to map pre-processed reads to the mouse genome (NCBI37/mm9) with default parameter settings³6. The BAM output files were generated for each sample and PCR duplicates were marked and removed from BAM files using Picard software (Ver. 2.8.3; https://github.com/broadinstitute/picard). Subsequently, StringTie algorithm (Ver. 1.3.3b) was used with default parameter settings to assemble RNA-Seq alignments into annotated and novel transcripts and estimate their respective expression level³7. The expression of these transcripts was normalized using transcripts per million (TPM) algorithm and the number of known, and novel transcripts were estimated from the output GTF file generated by StringTie with expression threshold (≥1.0 TPM).

**Identification of AS events.** AS events were identified through rMATS software (Ver. 3.2.5)<sup>38</sup>. The mRNA-Seq alignment files (bam files) generated by the HISAT2 was used as an input for the rMATS analysis. The Mus musculus RefSeq gene annotations (GRcm38/mm10) was used as a reference with default parameter settings. Finally, the rMATS was used to calculate p-value and false discovery rate (FDR) for AS events among different developmental time points.

**Identification of fusion genes.** JAFFA (Ver. 1.08), a multi-step pipeline was used in a hybrid mode to detect fusion genes in mRNA sequencing data<sup>39</sup>. The Mus musculus reference genome (GRcm38/mm10),

No.	Novel Peptide	Amino Acid Length	Number of PSMs	Novel Transcript ID	Genomic Coordinates (mm10)
1	AAESDLSTARPAPPEPR	17	1	MSTRG.4120.3	Chr11: 117620218- 117620288
2	AFAHAEPR	8	2	MSTRG.6156.3	Chr13: 120244503- 120244596
3	ATEDCFQER	9	2	MSTRG.5109.18	Chr12: 113023646- 113023713
4	AVGVDCSAPEPR	12	2	MSTRG.3713.5	Chr11: 97361423- 97363714
5	DLGGVESASPSAAR	14	1	MSTRG.19717.4	Chr7: 137903048- 137903154
6	DREIWLNR	8	4	MSTRG.12904.4	Chr2: 177493993- 177494080
7	GLQRPDGGDHR	11	2	MSTRG.398.2	Chr1: 65973222- 65973464
8	LCGACGTASGTK	12	3	MSTRG.16432.2	Chr5: 112688277- 112688395
9	LRHLNNVNILK	11	2	MSTRG.11709.1	Chr2: 38729037- 38735032
10	NYFYTGAEIK	10	1	MSTRG.19785.1	Chr7: 146523115- 146545389
11	QGISSISTFK	10	3	MSTRG.18410.1	Chr7: 19857400- 19857609
12	SAQALVK	7	2	MSTRG.6483.20	Chr14: 48326083- 48326173
13	SINEVIK	7	1	MSTRG.5839.2	Chr13: 74088982- 74089093
14	SMGEDTVPK	9	1	MSTRG.6973.3	Chr14: 121639196- 121639264
15	WLIEISK	7	3	MSTRG.8658.5	Chr17: 3516990- 3517538
16	FLTVSTSPGFPGT	13	1	MSTRG.16436.1	Chr5: 112684967- 112698364
17	AAGDAEPEDQAQPQPQPEPEPR	22	4	MSTRG.5528.4	Chr13: 46517220- 46517274
18	LGHVGGADGANPSSAGSPQDGR	22	1	MSTRG.3412.1	Chr11: 77839387- 77839530
19	SPGSEPQTQEAQEAGSDPQAARPQR	25	2	MSTRG.18532.2	Chr7: 28289684- 28289782
20	ERPTPDVGDGQGPQLSESSSSPFSIPPDK	29	11	MSTRG.12232.3	Chr2: 120330209- 120330655

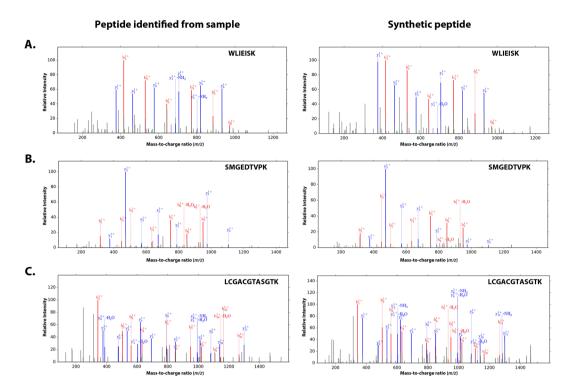
**Table 3.** Novel peptides identified in mouse lens through integration of OMIC (Transcriptome and Proteome) datasets<sup>22,24</sup>. All 20 peptides were validated through matching MS/MS spectra of synthetic peptides. Note: PSMs: Peptide Spectrum Matches.

transcripts annotations and sequences from mouse GENCODE Ver. M15 (GRCm38) were used as a reference for fusion gene identification using default JAFFA parameter settings.

**Gene ontologies functional enrichment analysis.** A functional annotation analysis of mouse lens genes was investigated using Visual Annotation Display (VLAD; Ver. 1.6.0), a web-based tool from the Mouse Genome Informatics (MGI)<sup>40</sup>. The VLAD tool performs the statistical analysis to test the enrichment of gene ontology (GO) terms based on their annotations to gene function and mammalian phenotype<sup>40</sup>. A complete set of mouse genes was used as a reference annotation dataset and ontological terms annotated with the evidence code ND (no biological data) were excluded from the enrichment analysis. The statistically significant enriched terms were sorted based on their corrected p-value ( $\leq$ 0.01) calculated using multiple testing and positive false discovery rate for each term.

**Proteogenomic analysis of novel transcripts in lens proteome.** The mRNA sequencing data was used to extract Fasta sequences of novel transcripts using bedtools getfasta tool (Ver. 2.25.0; http://bedtools.readthedocs.io/en/latest/content/tools/getfasta.html) with the transcript coordinates output by StringTie. The novel transcripts were translated into three open reading frames (ORFs) using in-house generated Python script to generate a dataset of all potential proteins resulting from the translation of the novel transcripts. The theoretical protein dataset was screened to remove shorter proteins (<6 amino acids long) and the resulting dataset was used as a reference database.

The MS/MS spectra from mouse lens proteome were interrogated against the reference database (generated above, using the Python script) using the SEQUEST search algorithm through the Proteome Discoverer Suite



**Figure 2.** Validation through matching MS/MS spectra of synthetic peptides. (**A**) MS/MS spectra of a novel peptide (WLIEISK) shown with a similar fragmentation pattern observed from the corresponding synthetic peptide. (**B**) MS/MS spectra of a novel peptide (SMGEDTVPK) shown with a similar fragmentation pattern observed from the corresponding synthetic peptide. (**C**) MS/MS spectra of a novel peptide (LCGACGTASGTK) shown with a similar fragmentation pattern observed from the corresponding synthetic peptide. Note: the term "peptide identified from sample" refers to the MS/MS spectra identified in mouse lens proteome<sup>24</sup>, and the synthetic peptide refers to MS/MS spectra of the peptide synthesized by JPT Peptide Technologies (Berlin, Germany).

A. Mouse Lens Transcriptome (RNA-Seq)			B. Mouse Lens Proteome (TMT)				
Stage	Replicates	Genes	<b>Total Genes</b>	Stage	TMT	Proteins	<b>Total Proteins</b>
E15 E15A E15B		13,274		E15			
				E18			
			P0	Set 1	4,630		
E18 E18A F18B		13,900	14,465	P3	3611	4,630	5,404
	E18A E18B			P6			
				P9			
		12,560		E15		4,426	
P0	P0A P0B			E18			
				P0	Set 2		
				P3	Set 2		
	P3A P3B			P6	1		
				P9			
		12,130		E15		3,747	
P6	P6A P6B			E18			
				P0	62		
P9	P9A P9B	12,229		P3	Set 3		
				P6			
				P9	1		

**Table 4.** Data retrieved from previously published OMIC (Transcriptome and Proteome) datasets<sup>22,24</sup>. Note: E15 and E18 are embryonic days 15, and 18, and P0, P3, P6, and P9 are postnatal days 0, 3, 6, and 9, respectively.

(Ver. 2.1; Thermo Scientific, Bremen, Germany). The parameters for the Proteome Discoverer included, trypsin as a proteolytic enzyme with a maximum of two missed cleavages, acetylation of protein N-termini and oxidation of methionine as variable modifications, carbamidomethylation of cysteine as fixed modification, a minimum peptide length of 6 amino acids, and the mass tolerances of 10 ppm and 0.02 Da for precursor and fragment ions, respectively. The matched spectra or candidate peptides were filtered using the Percolator algorithm within the Proteome Discoverer suite using the false discovery rate (FDR < 0.01) at protein and peptide levels.

Finally, all peptides identified above (by interrogating the MS/MS spectra from mouse lens proteome against the reference database) were screened against the mouse nr protein database (NCBI) to identify novel peptides not present in the mouse nr protein database. Peptides with  $\geq 2$  amino acids mismatches (mouse nr protein database) and XCorr score > 2.5 were considered novel and retained for further analysis.

Validation of novel peptides through LC-MS/MS analysis of synthetic peptides. All synthetic peptides were purchased from JPT Peptide Technologies (Berlin, Germany). The synthetic peptides were pooled and labeled with 1-plex TMT reagents according to the manufacturer's instructions (Thermo Fisher Scientific). The labeling reaction was performed for one hour at room temperature followed by quenching of the labeling reaction with 100 mM Tris-HCl (pH 8.0). The labeled peptides were desalted with C<sub>18</sub> Sep-Pak (Waters Corporation, Milford, MA), dried and resuspended in 0.1% formic acid. Peptides were subjected to Orbitrap Fusion Lumos Tribrid Mass Spectrometer coupled with the Easy-nLC 1200 nano-flow liquid chromatography system (Thermo Fisher Scientific) with similar parameters used for the mouse lens proteome profiling<sup>24</sup>.

#### References

- 1. Mortazavi, A. et al. Mapping and quantifying mammalian transcriptomes by RNA-Seq. Nat. Methods 5(7), 621 (2008).
- 2. Cloonan, N. et al. Stem cell transcriptome profiling via massive-scale mRNA sequencing. Nat. Methods 5(7), 613 (2008).
- 3. Morin, R. et al. Profiling the HeLa S3 transcriptome using randomly primed cDNA and massively parallel short-read sequencing. Biotechniques 45(1), 81 (2008).
- 4. Sultan, M. et al. A global view of gene activity and alternative splicing by deep sequencing of the human transcriptome. Science 321(5891), 956 (2008).
- 5. Maher, C. A. et al. Transcriptome sequencing to detect gene fusions in cancer. Nature 458(7234), 97 (2009).
- 6. Wang, Z., Gerstein, M. & Snyder, M. RNA-Seq: a revolutionary tool for transcriptomics. Nat. Rev. Genet. 10(1), 57 (2009).
- 7. Roberts, A. et al. Identification of novel transcripts in annotated genomes using RNA-Seq. Bioinformatics. 27(17), 2325 (2011).
- 8. Xu, Q., Modrek, B. & Lee, C. Genome-wide detection of tissue-specific alternative splicing in the human transcriptome. *Nucleic Acids Res.* **30**(17), 3754 (2002).
- 9. Wang, E. T. et al. Alternative isoform regulation in human tissue transcriptomes. Nature 456(7221), 470 (2008).
- 10. Mitelman, F., Johansson, B. & Mertens, F. The impact of translocations and gene fusions on cancer causation. *Nat. Rev. Cancer* 7(4), 233 (2007).
- 11. Honeyman, J. N. et al. Detection of a recurrent DNAJB1-PRKACA chimeric transcript in fibrolamellar hepatocellular carcinoma. Science 343(6174), 1010 (2014).
- 12. Gingeras, T. R. Implications of chimaeric non-co-linear transcripts. Nature 461(7261), 206 (2009).
- 13. Li, H. et al. Gene fusions and RNA trans-splicing in normal and neoplastic human cells. Cell Cycle 8(2), 218 (2009).
- 14. Zhang, Y. et al. Chimeric transcript generated by cis-splicing of adjacent genes regulates prostate cancer cell proliferation. Cancer Discov. 2(7), 598 (2012).
- 15. Qin, F. *et al.* Discovery of CTCF-sensitive Cis-spliced fusion RNAs between adjacent genes in human prostate cells. *PLoS. Genet.* **11**(2), e1005001 (2015).
- 16. Croft, L. *et al.* ISIS, the intron information system, reveals the high frequency of alternative splicing in the human genome. *Nat. Genet.* **24**(4), 340 (2000).
- 17. Pan, Q. et al. Deep surveying of alternative splicing complexity in the human transcriptome by high-throughput sequencing. Nat Genet. 40(12), 1413 (2008).
- 18. Nilsen, T. W. & Graveley, B. R. Expansion of the eukaryotic proteome by alternative splicing. Nature 463(7280), 457 (2010).
- 19. Kim, J. W. et al. NRL-Regulated Transcriptome Dynamics of Developing Rod Photoreceptors. Cell Rep. 17(9), 2460 (2016).
- 20. Yasuda, M. et al. Transcriptome profiling of the rat retina after optic nerve transection. Sci. Rep. 6, 28736 (2016).
- 21. Srivastava, R. et al. Transcriptome analysis of developing lens reveals abundance of novel transcripts and extensive splicing alterations. Sci. Rep. 7(1), 11572 (2017).
- 22. Khan, S. Y. et al. Transcriptome Profiling of Developing Murine Lens Through RNA Sequencing. Invest Ophthalmol. Vis. Sci. 56(8), 4919 (2015).
- 23. Khan, S. Y., Hackett, S. F. & Riazuddin, S. A. Non-coding RNA profiling of the developing murine lens. Exp. Eye Res. 145, 347 (2016).
- 24. Khan, S. Y. et al. Proteome Profiling of Developing Murine Lens Through Mass Spectrometry. Invest Ophthalmol. Vis. Sci. 59(1), 100 (2018).
- 25. Heim, S. & Mitelman, F. Molecular screening for new fusion genes in cancer. Nat. Genet. 40(6), 685 (2008).
- 26. Babiceanu, M. et al. Recurrent chimeric fusion RNAs in non-cancer tissues and cells. Nucleic Acids Res. 44(6), 2859 (2016).
- 27. Jia, Y., Xie, Z. & Li, H. Intergenically Spliced Chimeric RNAs in Cancer. Trends Cancer 2(9), 475 (2016).
- 28. Tang, Y. et al. Recurrent fusion RNA DUS4L-BCAP29 in non-cancer human tissues and cells. Oncotarget. 8(19), 31415 (2017).
- 29. Wan, J. et al. Dynamic usage of alternative splicing exons during mouse retina development. Nucleic Acids Res. **39**(18), 7920 (2011). 30. Gamsiz, E. D. et al. Genome-wide transcriptome analysis in murine neural retina using high-throughput RNA sequencing.
- Gamsiz, E. D. et al. Genome-wide transcriptome analysis in murine neural retina using nigh-throughput RNA sequencing. Genomics. 99(1), 44 (2012).
   Farkas, M. H. et al. Transcriptome analyses of the human retina identify unprecedented transcript diversity and 3.5 Mb of novel
- transcribed sequence via significant alternative splicing and novel genes. *BMC. Genomics.* **14**, 486 (2013).

  32. Li, M. *et al.* Comprehensive analysis of gene expression in human retina and supporting tissues. *Hum. Mol. Genet.* **23**(15), 4001 (2014).
- 33. Pinelli, M. et al. An atlas of gene expression and gene co-regulation in the human retina. Nucleic Acids Res. 44(12), 5773 (2016).
- 34. Zelinger, L. & Swaroop, A. RNA Biology in Retinal Development and Disease. Trends Genet (2018).
- 35. Akin, D. *et al.* RNA-seq analysis of impact of PNN on gene expression and alternative splicing in corneal epithelial cells. *Mol. Vis.*
- 36. Kim, D., Langmead, B. & Salzberg, S. L. HISAT: a fast spliced aligner with low memory requirements. Nat Methods 12(4), 357 (2015).
- 37. Pertea, M. et al. StringTie enables improved reconstruction of a transcriptome from RNA-seq reads. Nat Biotechnol. 33(3), 290 (2015).
- 38. Shen, S. et al. rMATS: robust and flexible detection of differential alternative splicing from replicate RNA-Seq data. Proc. Natl. Acad. Sci. USA 111(51), E5593–E5601 (2014).

- 39. Davidson, N. M., Majewski, I. J. & Oshlack, A. JAFFA: High sensitivity transcriptome-focused fusion gene detection. *Genome Med.* 7(1), 43 (2015).
- 40. Richardson, J. E. & Bult, C. J. Visual annotation display (VLAD): a tool for finding functional themes in lists of genes. *Mamm. Genome* 26(9-10), 567 (2015).

#### Acknowledgements

The work was supported by National Eye Institute Grant R01EY022714 (SAR).

#### **Author Contributions**

S.Y.K., C.H.N. and S.A.R.: conceived and designed the experiments; C.H.N. and N.P. and S.A.R.: contributed reagents, materials, and analytical tools; S.Y.K., M.A., F.K., R.C., C.H.N., S.F.H. and S.A.R.: performed experiments; S.Y.K., R.C., C.H.N., M.C.W.L. and S.A.R.: analyzed the data; S.Y.K., M.A., F.K., R.C., C.H.N., M.C.W.L., N.P., S.F.H. and S.A.R.: contributed to writing the manuscript.

#### **Additional Information**

**Supplementary information** accompanies this paper at https://doi.org/10.1038/s41598-018-28727-w.

**Competing Interests:** The authors declare no competing interests.

**Publisher's note:** Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons license, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons license, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons license and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this license, visit <a href="https://creativecommons.org/licenses/by/4.0/">https://creativecommons.org/licenses/by/4.0/</a>.

© The Author(s) 2018