

# Global regulation of alternative splicing by adenosine deaminase acting on RNA (ADAR)

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# Outline

## 1 Introduction

## 2 Materials

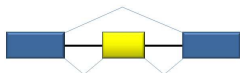
## 3 Results

- Collection of editing sites
- A-to-I editing sites rarely fall within the canonical splicing motifs
- *In silico* assay suggesting A-to-I RNA editing modifies SREs
- ADAR has prominent influence on global splicing pattern
- Splicing pattern changes by ADAR KD  $\Leftrightarrow$  enrichment of A-to-I editing?
- ADAR KD shows significant changes in splicing and RNA processing genes

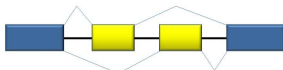
## 4 Summary



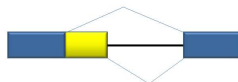
# Alternative splicing



Exon skipping



Mutually exclusive exons



Alternative 5' donor sites



Alternative 3' acceptor sites



Intron retention

- A major mechanism for gene regulation and transcriptome diversity.
- Yet the extent of the phenomenon, the regulation and specificity of the splicing machinery are only partially understood.



# ADAR enzymes

- ADAR: **A**denosine **D**eaminase **A**cting on **R**NA.
- Adenosine-to-inosine (A-to-I) RNA editing of pre-mRNA by ADAR enzymes, which bind **double strand** RNAs.
  - ADAR (ADAR1): two distinct prevalent isoforms: p110 & p150.
  - ADARB1 (ADAR2).
  - ADARB2 (ADAR3).
- Crucial for development [Higuchi *et al.* *Nature* 2000 & Paz-Yaacov *et al.* *Proc. Natl. Acad. Sci.* 2010].
  - ADAR1 knockout: mice die in the embryonic stage.
  - ADAR2 knockout: mice suffer from seizures and die at an early age.
- **Cytosine** is base-paired by reverse transcriptase with **inosine** during cDNA synthesis.



# Editing & pre-mRNA splicing

- A-to-I RNA **editing** and mRNA **splicing** are indeed **coordinated** in specific genes.
- This coordination may be governed by the RNA Pol II carboxy-terminal -domain (CTD) [Laurencikiene *et al.* *EMBO report* 2006; Ryman *et al.*, *RNA* 2007].
  - CTD helps ensure that editing **precedes** splicing of the GluR-B transcript.
- Efficient exonic RNA editing often depends on intronic editing complementary sequences (ECS) for duplex formation.
- Examples for interrelations between editing and splicing are evident early in evolution [Jin *et al.*, *BMC Evol. Biol.* 2007; Agrawal & Stormo, *RNA* 2005].



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## Editing & pre-mRNA splicing (contd.)

- An editing site strengthens an enhancer signal within the exon [Agrawal & Stormo, *RNA* 2005].
- Exonization of intronic sequences:
  - RNA editing in the **NARF** gene in human might lead to exonization of an intronic sequence and the birth of the eighth exon of this gene [Lev-Maor et al., *Genome Biol.* 2007].
- Editing at the branch site of **PTPN6** gene in AML patients was found to impair splicing of the intron, with a probable role in leukemogenesis [Beghini et al., *Hum. Mol. Genet.* 2000].



# Contribution of this paper

To analyze how ADAR **globally** affects alternative mRNA splicing.

- A systematic approach;
- High-throughput expression analysis (exon-specific microarray) & sequencing of transcript data sets (ESTs/mRNA);
- Massively parallel sequencing (MPS; NGS).





# Brief summary of the results

- A-to-I RNA editing rarely targets canonical splicing motifs.
  - Yet it was found to affect splicing regulatory elements (SREs) within **exons**.
- **Cassette** exons were found to be significantly **enriched** with A-to-I editing sites compared with constitutive exons.



## Brief summary of the results (contd.)

- RNA-seq & exon-specific microarray revealed that ADAR knockdown in HepG2 & K562 cell lines leads to **global changes** in gene expression.
  - Hundreds of genes change their splicing patterns.
  - This **cannot** be explained by putative editing sites alone.
- Genes showing significant changes in their splicing pattern are frequently involved in RNA processing & splicing activity.
- Direct A-to-I RNA editing is **NOT** likely to be the primary mechanism for ADAR-mediated regulation of AS.
  - The regulation is suggested to be achieved by modulating *trans*-acting factors.



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# Genomic data

- [hg19/GRCh37](#) (UCSC ftp site): DNA reference for detection of editing sites.
- [RefSeq](#):
  - To define genes and exon–intron boundaries.
  - To determine 5'-SS and 3'-ss consensus motifs.
- [dbSNP 132](#) (from UCSC table browser): SNP sites.
- Repeat data: taken from [RepeatMasker](#).



# Transcript data

- EST & mRNA data and their alignments to hg19:
  - EST: 249,717 reads; mRNA: 7,510,566 reads.
  - Taken from UCSC table browser.
- 454 Life Science RNA-seq data: SRA003647/SRP000614.
  - Including:
    - HBRR (Human Brain Reference RNA);
    - UHRR: Universal Human Reference RNA.
  - Alignment against hg19 using **BLAT**.
- RNA-Seq data (short reads):
  - U87MG cell line:
    - 2 x control + 2 x ADAR KD.
    - Downloaded (Bahn *et al.* [Genome Res.](#) 2012).
  - HepG2 & K562 cell line
    - Illumina GAIIX (76bp; paired-end; alignment: using **TopHat**).





# Microarray experiment setting

- Using an exon-specific microarray (Affymetrix exon 1.0 st).
  - A probe set for each annotated exon.
  - ★ Feasible to compare expression levels of individual exons and thus to evaluate AS.
- For each cell line, control samples and ADAR KD samples were tested.



# A-to-I RNA editing sites detection and collection

- Comparison of mRNA/EST/RNA-seq reads and the reference genome (preliminary SNV sites).
- Then process the following filters:
  - Quality assurance:
    - 1 The SNV site must be distal (20 bases) from sequence ends.
    - 2 Exclude known SNP sites.
    - 3 Enough support:
      - ≥ 5% of all aligned reads that cover the site;
      - ≥ 2 ESTs or ≥ 1 mRNA.
  - Others specific to ADAR enzymes:
    - 1 Clustering: [... A-to-G ... A-to-G ... A-to-G ...] ← 32 bases.
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# Verification of editing sites from RNA-seq analysis

- To verify editing sites predicted based on mRNA/EST, using:
  - SAMtools [pileup](#) and [varScan](#) [Koboldt *et al. Bioinformatics* 2009] on the RNA-seq alignment and scanning for A-to-G or T-to-C.
  - Only sites in both replicates were considered.



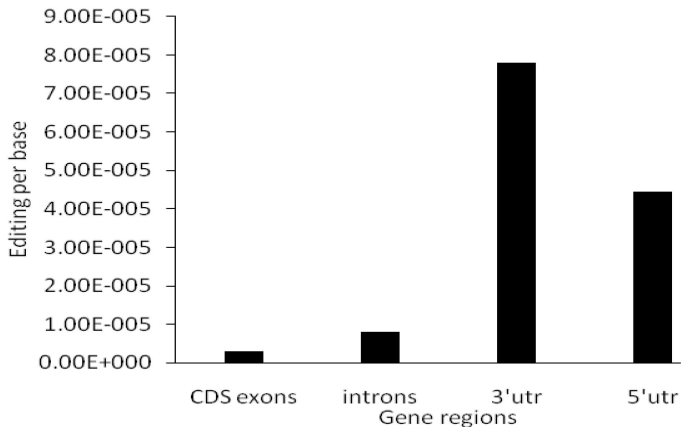
## Category of editing sites predicted based on mRNA/EST

Sites passed all filters:

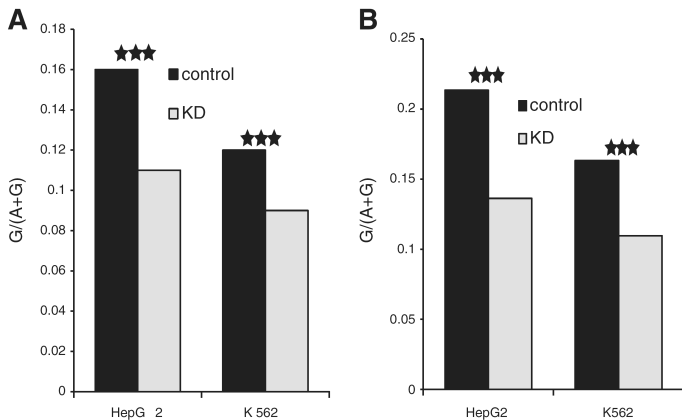
- 33,687 A-to-G sites (42%; total: 80,127 sites).
- 20,283 A-to-G sites in 3,630 genes (the rest: poorly annotated regions?)
  - 156 in CDS;
  - 14,958 in intronic regions;
  - 513 in non-coding exonic regions;
  - 1,115 in non-coding introns;
  - 3,452 in 3'UTR;
  - 89 in 5'UTR;



## Category of editing sites predicted based on mRNA/EST (contd.)

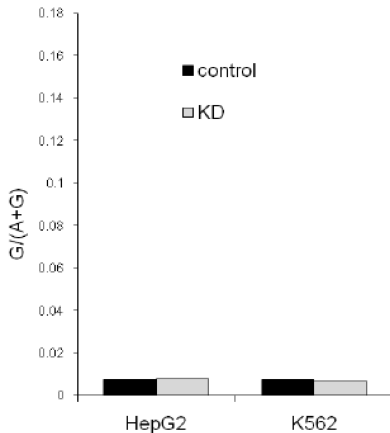


## Reduction in editing level following ADAR KD based on RNA-seq



## Reduction in editing level following ADAR KD (contd.)

- Adenosines not known to be edited (in edited genes).



# Constitutive exons vs. cassette exons

- Categorize the editing sites in exons →
  - 1 constitutive;
  - 2 cassette;
  - 3 other (e.g., retained introns, alternative 5' ss and 3' ss).



## Constitutive exons vs. cassette exons (contd.)

- Enriched in cassette exons over constitutive exons.

**TABLE 1.** A-to-I editing in constitutive and cassette exons

| Exon type    | No. of A-to-I sites <sup>a</sup> | Exon lengths (bases) | A-to-I per base       |
|--------------|----------------------------------|----------------------|-----------------------|
| Constitutive | 363                              | 22,119,390           | $1.64 \times 10^{-5}$ |
| Cassette     | 114                              | 2,380,193            | $4.8 \times 10^{-5}$  |
| Other        | 56                               | 1,171,293            | $4.8 \times 10^{-5}$  |

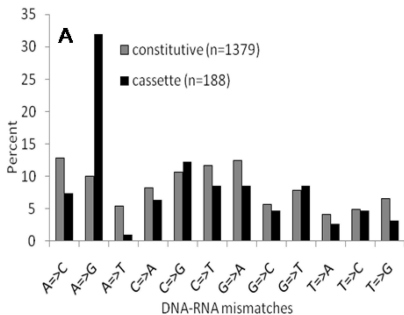
Overall, editing sites are enriched in cassette exons when normalized to the combined exon lengths ( $\chi^2$   $P$ -value  $< 10^{-10}$ ). Similar results were found using different editing sites sets (see Supplement 1, Supplemental Table S4).

<sup>a</sup>Editing sites were taken from DARNED (Kiran and Baranov 2010).

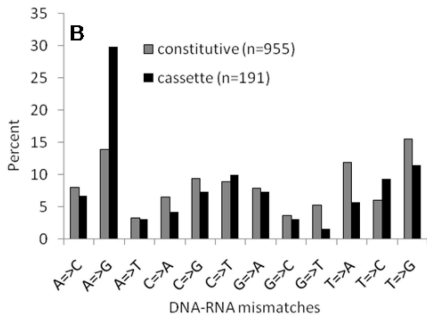


# Constitutive exons vs. cassette exons (contd.)

- Mismatches in exons (mRNA/EST).



- Mismatches at 150-base intronic regions flanking exons (mRNA/EST).





## Constitutive exons vs. cassette exons (contd.)

- A possible explanation:
  - Cassette and their flanking introns contain more *Alu* repeats.
- Nevertheless, counting only *non-Alu* editing sites:
  - cassette vs. constitutive:  
 $1.52 \times 10^{-5}$  sites/base vs.  $1.29 \times 10^{-5}$  sites/base. (not significant)



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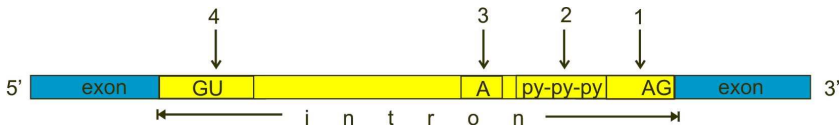


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## Fundamental sequence motifs required for canonical splicing



- 1: 3' splice site (5' ss);
- 2: poly-pyrimidine-tract (PPT);
- 3: branch point
  - branch site (BS) consensus motif:  $yUnAy$ ;
- 4: 5' splice site (5' ss).



## Editing sites rarely fall within the primary consensus sites of canonical splicing

- For editing sites within 5' ss or 3' ss consensus motifs:
  - Only 3 and 2 are within 5' ss and 3' ss resp (mRNA/EST).
  - Only 24 are within 5' ss or 3' ss for ALL data.
- For editing sites overlapping the branch-site consensus motif yUnAy:
  - None.



# Splicing regulatory elements (Data preparation)

- Experimentally proved SREs:
  - Akerman *et al.* [*Genome Biol.* 2009].
  - Piva *et al.* [*Bioinformatics* 2009].
- Computational verification:
  - Skippy [Woolfe *et al.* *Genome Biol.* 2010].



# Created/abolished SREs

- ★ Splicing factor proteins (e.g., hnRNPs and SR-proteins) bind to SREs in mRNA and regulate the type and the level of intron inclusion/exclusion.
- The approach: Searching for potential SREs in exons that have  $\geq 1$  putative editing site.
  - Control: randomly select adenosines in the exon and then change them to guanosines.
    - Count the cases where the changes create or abolish SREs.
  - Repeat the process for 1,000 times.
- The same procedure was applied for SREs located within the 150-base intronic regions flanking the exons.

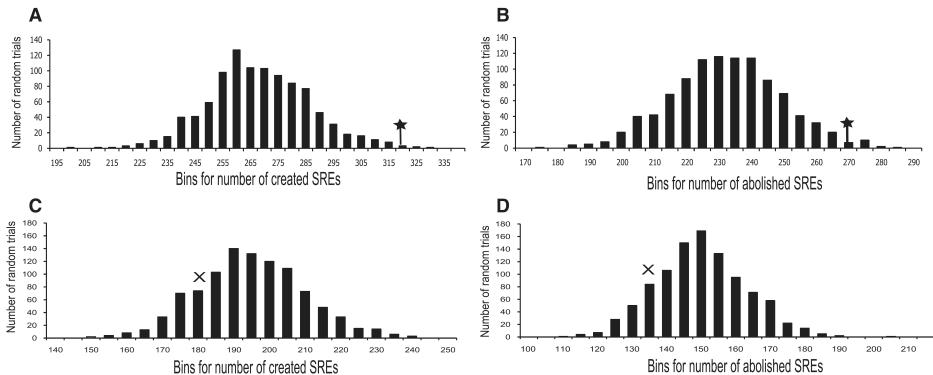


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- **Note:** Only 244 editing sites within 193 exons of 188 genes, while AS analysis of RNA-seq and microarray data revealed **thousands** of AS regions



# Microarray analysis

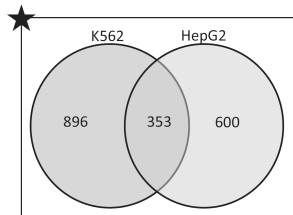
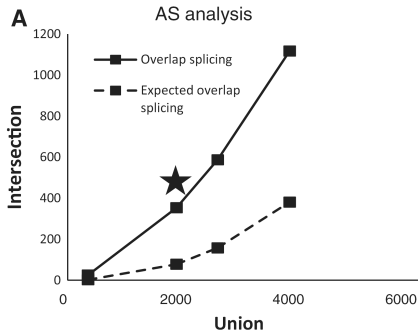
- Tools:
  - **Partek** genomic suite (for microarray data).
  - AS ANOVA (for splicing analysis) & express ANOVA (for total gene expression level).
- Only genes without a large change in expression (fold-change  $\leq 1.5$ ) were considered in the AS analysis.
- Lists of AS genes were extracted using four different significant thresholds (AS ANOVA  $P$ -values of 0.001, 0.01, 0.015, 0.025).
- Under the independence assumption:

$$N_{\text{exp}} = \left( \frac{N_{\text{HepG2}}}{N} \right) \times \left( \frac{N_{\text{K562}}}{N} \right) \times N.$$

- $N$ : the total number of genes represented on the array.
- $N_{\text{HepG2}}$ : the number of detected genes in HepG2.
- $N_{\text{K562}}$ : the number of detected genes in K562.



# Microarray analysis (contd.)



# Differential expression & alternative splicing analysis of RNA-seq

- Both are done using [AltAnalyze](#).  
Emig *et al.* *Nucleic Acids Research* 2010 & Salomonis *et al.* *Proc. Natl. Acad. Sci.* 2010.
- Differential expression analysis:
  - Count the reads for each **constitutive** exons in Ensembl genes (V.62) and use AltAnalyze quintile normalization.
  - Use fold-change ratios of 1.4, 2, and 2.5.
  - # DE genes in both cell lines (as they did in the microarray analysis).



# A simple example of quintile normalization

|   |   |   |   |
|---|---|---|---|
| A | 5 | 4 | 3 |
| B | 2 | 1 | 4 |
| C | 3 | 4 | 6 |
| D | 4 | 2 | 8 |



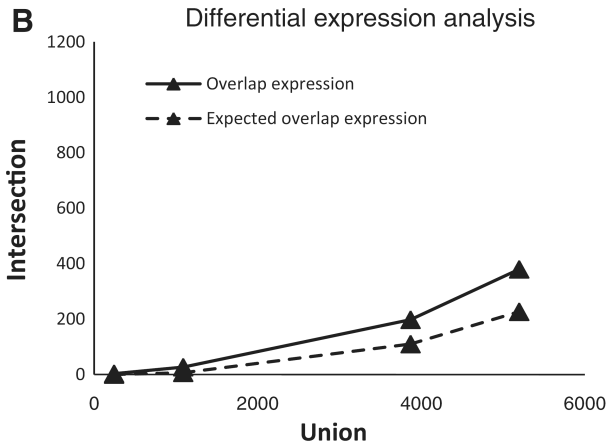
|   |     |     |     |
|---|-----|-----|-----|
| A | iv  | iii | i   |
| B | i   | i   | ii  |
| C | ii  | iii | iii |
| D | iii | ii  | iv  |

|   |   |   |   |         |   |   |   |   |
|---|---|---|---|---------|---|---|---|---|
| A | 5 | 4 | 3 | becomes | A | 2 | 1 | 3 |
| B | 2 | 1 | 4 | becomes | B | 3 | 2 | 4 |
| C | 3 | 4 | 6 | becomes | C | 4 | 4 | 6 |
| D | 4 | 2 | 8 | becomes | D | 5 | 4 | 8 |

|   |           |        |        |     |
|---|-----------|--------|--------|-----|
| A | (2 1 3)/3 | = 2.00 | = rank | i   |
| B | (3 2 4)/3 | = 3.00 | = rank | ii  |
| C | (4 4 6)/3 | = 4.67 | = rank | iii |
| D | (5 4 8)/3 | = 5.67 | = rank | iv  |

|   |      |      |      |
|---|------|------|------|
| A | 5.67 | 4.67 | 2.00 |
| B | 2.00 | 2.00 | 3.00 |
| C | 3.00 | 4.67 | 4.67 |
| D | 4.67 | 3.00 | 5.67 |

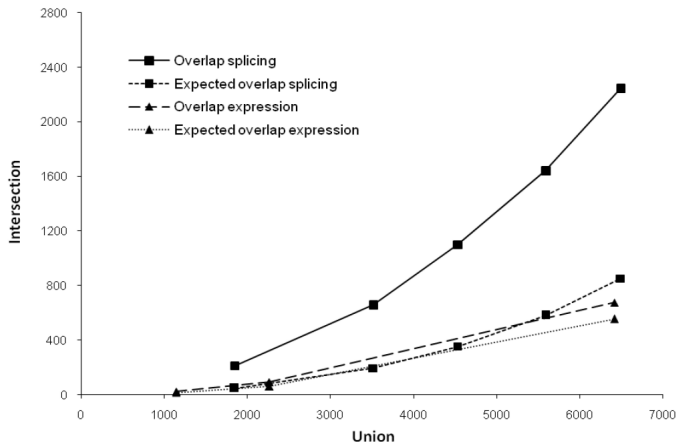




## Differential expression & alternative splicing analysis of RNA-seq (contd.)

- Alternative splicing analysis:
  - Base on alignment and junctions obtained by TopHat.
  - Using AltAnalyze
    - Splice-index (SI).
      - ★ Expression of a given exon relative to the total gene expression.
    - Analysis of splicing by isoform reciprocity (ASPIRE) [Ule *et al.* *Nature Genetics* 2005].
      - ★ Using reads mapped to junctions.
- Only exons detected as AS by both methods and whose genes were NOT found to be differentially expressed ( $|\text{fold-change}| \leq 2$ ) were considered as AS exons.
  - Genes with  $\geq 1$  AS exon were considered as AS genes.







Are genes that significantly change their splicing pattern in ADAR KD cells enriched with A-to-I RNA editing sites?



**TABLE 2.** Editing in AS genes detected by RNA-seq

| Cell line | Splicing pattern | Number of A-to-I sites <sup>a</sup> | Genomic size (bases) | A-to-I per base       |
|-----------|------------------|-------------------------------------|----------------------|-----------------------|
| HepG2     | Changed          | 12,043                              | 338,829,808          | $3.5 \times 10^{-5}$  |
| HepG2     | Unchanged        | 15,973                              | 731,790,993          | $2.18 \times 10^{-5}$ |
| K562      | Changed          | 12,971                              | 343,111,651          | $3.78 \times 10^{-5}$ |
| K562      | Unchanged        | 14,897                              | 679,627,158          | $2.19 \times 10^{-5}$ |

Editing sites are enriched in AS genes ( $\chi^2$   $P$ -value  $< 10^{-10}$  for both HepG2 and K562).

<sup>a</sup>Editing sites were taken from DARNED (Kiran and Baranov 2010).



- It is still difficult to determine if editing mediates the AS regulation, or whether other ADAR-dependent events are responsible for this effect on AS.
  - Based on the RNA-seq experiments, only 17 verified editing sites in the vicinity (1,000 bases flanking) of the detected AS cassette exons are detected.
- ★ Direct editing is not the sole explanation for AS.



## Significant changes in RNA processing and splicing machinery genes?

**TABLE 3.** Detected AS genes are enriched with RNA processing and splicing functions

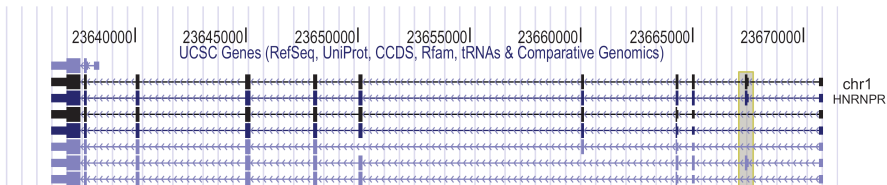
| GO    |  | HepG2           |                       | K562            |                       | U87MG           |                      |
|-------|--|-----------------|-----------------------|-----------------|-----------------------|-----------------|----------------------|
| ID    | Term                                   | No. of AS genes | FDR                   | No. of AS genes | FDR                   | No. of AS genes | FDR                  |
| 6396  | RNA processing                         | 229             | $1.2 \times 10^{-17}$ | 246             | $2.8 \times 10^{-19}$ | 130             | $5.4 \times 10^{-9}$ |
| 16071 | mRNA metabolic process                 | 153             | $2.9 \times 10^{-10}$ | 168             | $1.0 \times 10^{-12}$ | 95              | $7.8 \times 10^{-9}$ |
| 3723  | RNA binding                            | 290             | $6.0 \times 10^{-20}$ | 305             | $2.1 \times 10^{-20}$ | 152             | $8.8 \times 10^{-7}$ |
| 8380  | RNA splicing                           | 123             | $2.0 \times 10^{-9}$  | 128             | $8.4 \times 10^{-9}$  | 80              | $2.5 \times 10^{-8}$ |
| 398   | Nuclear mRNA splicing, via spliceosome | 71              | $5.6 \times 10^{-6}$  | 71              | $1.8 \times 10^{-4}$  | 43              | 0.002                |

All three RNA-seq data sets (HepG2, K562, and U87MG) show significant enrichment for these functions.

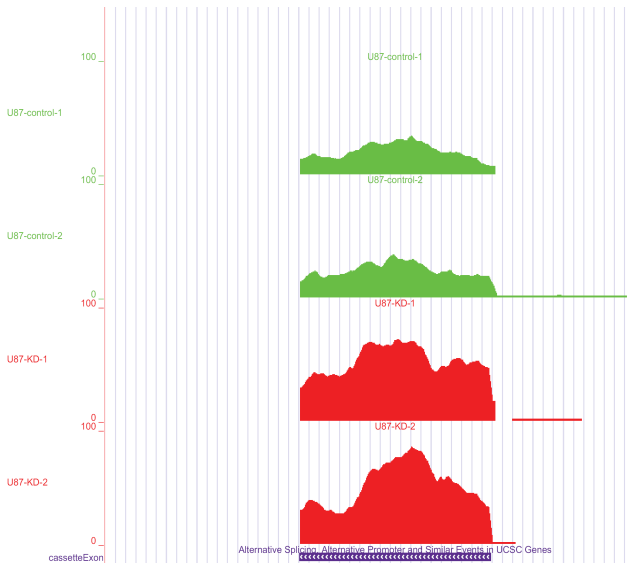


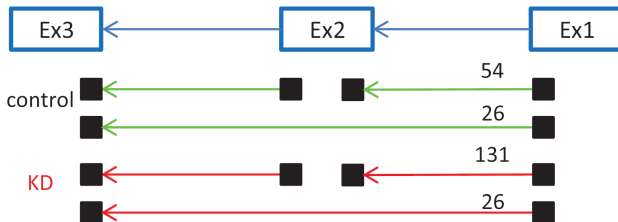
## Significant changes in RNA processing and splicing machinery genes?

- ADAR-dependent AS in *HNRNPR* based on U87MG RNA seq [Bahn et al. *Genome Res.* 2012].



## ADAR KD shows significant changes in splicing and RNA processing genes





- The KD sample contains more reads supporting inclusion of the second exon than reads supporting its exclusion ( $P$ -value: 0.0075).



# Summary of the results

- A-to-I RNA editing rarely targets canonical splicing motifs, yet it affects SREs within exons.
- Cassette exons were found to be significantly enriched with A-to-I editing sites compared with constitutive exons.
- ADAR knockdown in HepG2 & K562 cell lines leads to global changes in gene expression and hundreds of genes changing their splicing pattern, yet this cannot be explained by putative editing sites alone.
- Genes showing significant changes in their splicing pattern are frequently involved in RNA processing & splicing activity.
- The primary mechanism for ADAR-mediated regulation of AS is suggested to be achieved by modulating *trans*-acting factors.





Thank you.

