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Interpretation of mRNA splicing mutations in genetic disease: review of the literature and guidelines for information-theoretical analysis.

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REVIEW

Interpretation of mRNA splicing mutations in genetic disease: review of the literature and guidelines for information-theoretical analysis [version 2; referees: 2 approved]

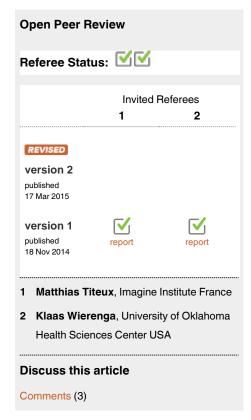
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Late

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Abstract

The interpretation of genomic variants has become one of the paramount challenges in the post-genome sequencing era. In this review we summarize nearly 20 years of research on the applications of information theory (IT) to interpret coding and non-coding mutations that alter mRNA splicing in rare and common diseases. We compile and summarize the spectrum of published variants analyzed by IT, to provide a broad perspective of the distribution of deleterious natural and cryptic splice site variants detected, as well as those affecting splicing regulatory sequences. Results for natural splice site mutations can be interrogated dynamically with Splicing Mutation Calculator, a companion software program that computes changes in information content for any splice site substitution, linked to corresponding publications containing these mutations. The accuracy of IT-based analysis was assessed in the context of experimentally validated mutations. Because splice site information quantifies binding affinity, IT-based analyses can discern the differences between variants that account for the observed reduced (leaky) versus abolished mRNA splicing. We extend this principle by comparing predicted mutations in natural, cryptic, and regulatory splice sites with observed deleterious phenotypic and benign effects. Our analysis of 1727 variants revealed a number of general principles useful for ensuring portability of these analyses and accurate input and interpretation of mutations. We offer guidelines for optimal use of IT software for interpretation of mRNA splicing mutations.





This article is included in the Rare diseases channel.

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Competing interests: PKR is the inventor of US Patent 5,867,402 and other patents pending, which underlie the prediction and validation of mutations. He is one of the founders of Cytognomix, Inc., which is developing software based on this technology for complete genome or exome splicing mutation analysis.

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REVISED Amendments from Version 1

All figure and table titles have been adjusted to reflect the order in which they appear in the main text. Both Supplementary Table and the Splicing Mutation Calculator (SMC) software now include all benign natural site variants, and Supplementary Table 6 was added which includes these benign variants. In Supplementary Table 4, we found a small number of variants which were excluded from the original list of Deleterious Natural Site Variants (used to create Figure 1B) due to inconsistent formatting. This has been corrected, Figure 1 has been updated, and the correlation coefficients were recalculated (slightly increasing this value for donor site mutations; p.7 last paragraph). The citations of references which have changed since the initial submission have been updated. Additionally, since the original submission, all of software programs described, excluding SMC, have been integrated into a single application. The corresponding URLs have been changed to www.mutationforecaster.com. Finally, all tables were edited to improve uniformity of presentation.

Although this article exceeds the lengths of other reviews published in *F1000Research*, we wanted the paper to be as comprehensive as possible. We structured the article to enable readers to find and read particular sections of interest, without having familiarity with all of the preceding material.

See referee reports

Introduction

Pre-mRNA splicing is a necessary step in the production of a functional protein product. It consists of the recognition of intron/exon boundaries, and the subsequent excision of the introns. It is important to distinguish between alternate splicing isoforms and mutant splice forms. The former consists of using different combinations of splice sites for the same gene. It is estimated to occur in over 60% of human genes, some of which will have multiple alternate isoforms^{1,2}. For example, NF1 (responsible for neurofibromatosis type 1 disease) is reported to produce 46 splice variants³. The cell regulates this naturally occurring process through the availability of tissue-specific splice factors. Alternative splicing is not generated by changes in the unspliced RNA sequence, whereas mutations that produce non-constitutive splice forms are the result of dysregulation of natural splice site recognition. Mutations can have various consequences to RNA processing, such as exon skipping, cryptic splicing, intron inclusion, leaky splicing, or less frequently, introduction of pseudo-exons into the processed mRNA. A broad range of molecular phenotypes are possible depending on the type and severity of the mutation, making it imperative to understand the consequences of splicing mutations. For the purposes of this review, we consider sequence changes in genes that affect transcript structure or abundance to be mutations, regardless of their allele frequencies. Although spliceosomal recognition and RNA binding factors are operative in mutation-derived and normal alternative mRNA splicing events, this review is focused on aberrant sequence changes that alter constitutive splicing, and often result in clinically abnormal phenotypes.

The process of U1/U2-based mRNA splicing involves the recognition of a number of key sequence components^{4,5}, with exons defined by both intronic and exonic features^{4,6}. The intronic sequence

flanking the 3' end of an intron is termed the donor site and the 5' end, the acceptor site. In typical mRNA splicing, the natural donor and acceptor splice sites of an exon span intervals of 10 and 28 bases in length, respectively. It is a common misconception that these sequences (especially the dinucleotides immediately intronic to the exon) are invariant. Although highly conserved, these sequences vary at different splice junctions within a gene as well as between genes. The particular combination of nucleotides at each position within the same splice site determines its overall strength, which dictates the likelihood of recognition by the U1 and U2 spliceosomes. Indeed, the recognition of internal exons is reliant on the strength of both natural splice sites⁷. The alteration of exonic splicing signals (described in the following paragraph) by coding variants is common (~25%)8, which plays a significant role in disease due to aberrant mRNA processing. The creation and loss of binding sites for these splicing factors can also result in small changes in mRNA structure and overall gene expression, and is part of the diverse tissue-specific regulatory ecosystem of the cell⁹.

In addition, binding sites for splicing regulatory elements have been shown to reside over a range of distances from the corresponding natural splice sites 10; the impact of these sites appears to be related to their binding affinities to the cognate RNA binding proteins and to their distance from the proximate intron/exon boundary¹¹. Recognition sites for these regulatory proteins can reside either within introns or exons. Those within exons are commonly referred to as exonic splice enhancers or silencers (ESE or ESS, respectively), whereas the corresponding designations for intronic elements are ISE or ISS. Sequence variants affecting these protein-binding sites (or mutations in the binding proteins themselves) have been documented as contributing to aberrant splicing and pathogenic phenotypes. We focus on variants occurring in cis with target genes, as opposed to those in the splicing complex (in trans), leading to abnormal splicing. The efficiency and specificity of splicing depends on the combination of natural splice site strengths and the binding of splicing regulatory proteins that orchestrate exon recognition¹².

Mutations that affect pre-mRNA splicing account for at least 15% of disease-causing mutations¹³ with up to 50% of all mutations described in some genes^{14,15}. Interpreting the effects that these variants have on splicing is not straightforward because natural and regulatory splice sites exhibit considerable sequence variation. Furthermore, performing in vitro experiments to verify the consequences of each variant is costly and time consuming, and may not be practical. *In silico* prediction methods have become essential resources for analyzing these variants. Software programs for splicing analysis use a wide variety of bioinformatics approaches. Several splice site prediction tools compare the predicted mutant sequence to a consensus sequence, based on a set of functional acceptor or donor splice sites 16. A drawback of this approach is that low-frequency nucleotides present in functional splice sites are not represented, which can lead to misinterpretation and false-positive mutation predictions. One example of this was illustrated by Rogan and Schneider (1995), in which the MSH2 (hereditary non-polyposis colon cancer) variant described by Fishel et al. (1993), IVS12-6T>C, was predicted to be benign, despite being located 6 nt from the natural acceptor splice junction^{17,18}. The consensus sequence fails to indicate that C and T

at this position are nearly equally probable, which reclassified this transition as a polymorphism rather than a pathogenic variant. This conclusion is supported by evidence that ~10% of normal individuals without predisposition to non-polyposis colon cancer harbour this alternate allele¹⁹.

Over the last 20 years, we and others have developed an information theory (IT)-based approach for prediction of splicing mutations, and their impact on mRNA structure and abundance. The effects of these mutations is founded on the formal relationship between IT and the second law of thermodynamics, in that the change in information ascribed to a sequence variant within a splice site is directly related to thermodynamic entropy and free energy of binding^{20,21}. A weight matrix consisting of the Shannon information (product of the probability of each nucleotide and -log, of its probability) at each position of the splice site is constructed. The individual information for a splice site (R, in bits)is defined as the dot product of this weight matrix and the unitary vector of a particular splice site sequence. The magnitude of the information content of a nucleotide within a given site is an indication of its level of conservation relative to a set of functional sites. This method retains all of the sequence variability inherent in each model of donor and acceptor splice sites. By contrast, each base in the consensus sequence has the maximum R value, which is actually rare in the human genome, and is generally not representative of the preponderance of natural splice sites. Prior to the introduction of IT-based approaches, consensus sequencebased methods were widely used¹⁶. The use of neural networks, trained on sequences experimentally determined to be "bound" and "unbound", was another early approach used to predict splice sites²². However, these unbound sets of sequences are known to harbour some contaminating functional sites^{23,24}, which can limit the sensitivity and specificity of these networks²⁵.

There are instances when IT does not accurately predict the consequences of a splice variant. This can often be attributed to instances involving multiple sites or multiple regulatory factors, which are not components of current splicing models. In addition, splicing regulatory proteins can share overlapping and degenerate binding sites, and may exert conflicting effects (for example, serine-arginine [SR] vs. hnRNP proteins), making *in silico* prediction less reliable and less accurate in these cases²⁶. Finally, functional cryptic splicing motifs occurring deep within the introns can be challenging to identify, because they tend to be less well conserved than natural splice sites^{27,28}.

Nevertheless, a number of authors have recommended IT methods for analysis of splice site variants (N = 29; Supplementary Table 1). In fact, this approach has been described as equivalent to using a general reference textbook as a diagnostic tool, which complemented by functional assays, may provide a complete molecular diagnosis²⁹. Most of the applications of IT for splicing mutation analysis have involved predominantly rare diseases, as well as some low frequency variants associated with more common genetic conditions. This is because IT has been used to assess how well computed changes in binding affinity conform to levels of expression and/or patient phenotypes.

Many IT studies have focused on sequence variants in individual disorders or genes. Our synopsis of the broader implications of this work sets the stage for this compilation of peer-reviewed variants with accompanying IT analyses. We cover all publications retrieved through PubMed and Google Scholar that cite the use of IT (N = 367;Supplementary Bibliography) before September 2014. These items include primary research articles, review articles, presentations, and theses. Of all references, 216 publications reported variants or other results or analyses pertinent to this review (Supplementary Table 2). In the remaining studies, analyses were either not performed, insufficient information was provided to reproduce the reported result, or authors described unrelated applications of IT-based analysis. We summarize the spectrum of variants analyzed to obtain a global perspective of splicing mutations resulting in genetic disease. We also highlight common errors that can occur in variant analysis and interpretation, and offer guidelines for optimal use of our software programs for interpretation of splicing mutations.

Information theory and splice site analysis

IT was first introduced by Claude Shannon in 1948 and is now used in a variety of disciplines to express the average number of bits (i.e. the information content) needed to communicate symbols in a message³⁰. Bits are the basic unit used in computing and can have one of two values (typically the answer to a yes/no, true/false, or +/- problem). In nucleic acid molecular biology, the symbols in the message comprise a group of related, aligned sequences, with the average number of bits in the set corresponding to the amount of information in the message. This is determined from the information content at each position in the sequence, summed over all positions³¹. The average information is depicted graphically by a sequence logo, which stacks the individual nucleotides at each position ranked by frequency, and where the height of the stack is the position-specific contribution to the average information³². If the set of sequences are functional binding sites recognized by the same factor, the individual information in each site (i.e. R, value) is related to thermodynamic entropy, and thus, to the free energy of binding²¹.

The information content of a nucleic acid binding site is related to the affinity of its interaction with proteins and other macromolecular complexes, such as in the case during mRNA splicing²¹. Information theory-based position weight matrices (PWM; R, [b,l] - also referred to as a ribl - where b and l correspond to the nucleotide and position in the splice site) can be determined for a set of known binding sites, in this case, for the purpose of calculating individual and average sequence information³¹. Figure 1 shows an example of sequence logos for the canonical acceptor (or 3', recognized by the U2 spliceosome) and donor (or 5', recognized by the U1 spliceosome) splice sites, computed from the majority of constitutive sites at annotated splice junctions in the human genome³³. The information contained within the natural splice donor site is distributed between the last codon of each exon and the adjacent 6 nucleotides of intronic sequence, whereas the acceptor sites are almost entirely intronic, extending 26 nucleotides upstream from the exon boundary.

The distributions of R_i values for these sets are approximately Gaussian, with a couple of important exceptions, namely the

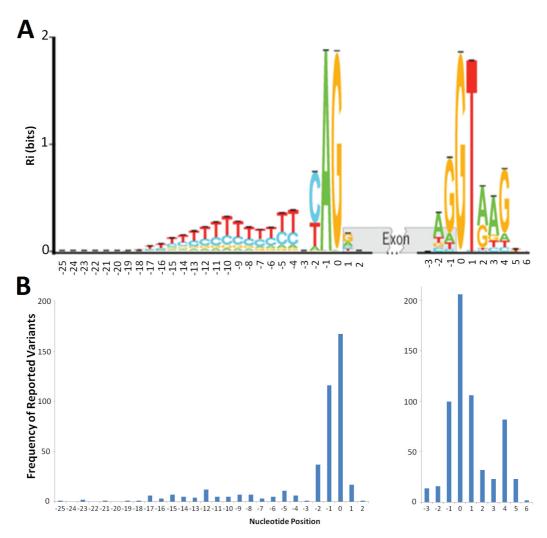


Figure 1. Distribution of deleterious natural site variants relative to information content. A) The sequence logo for human acceptor and donor splice sites based on the positive (+) strand of the October 2000 (hg5) genome draft. The logo shows the distribution of information contents (R_i in bits) at each position over the region of 28 nucleotides for acceptor [-25, +2] and 10 nucleotides for donor [-3, +6] from the first nucleotide of the splice junction (position 0). Nucleotide height represents its frequency at that position. The horizontal bar atop each stack indicates the standard deviation at that position. This figure was modified from Rogan *et al.* (2003) to include splice sites in genes on both strands of the annotated human reference genome³³. B) The distribution of deleterious single-nucleotide variants reported at the natural acceptor (left) and donor (right) splice sites. The variants used to populate this graph (Supplementary Table 4) were included only if they were reported to negatively affect splicing (N = 431 for acceptors, 604 for donors). The image was aligned to the sequence logo (A) to illustrate potential correlation of number of splicing variants at a position to the information content at that position.

distribution has defined upper and lower bounds²¹. The upper limit corresponds to the consensus sequence, as it is not possible to have stronger binding than an exact match to this sequence. The theoretical lower limit corresponds to $R_i = 0$ bits. An R_i value less than zero implies that energy would be required ($\Delta G > 0$ kcal/mol) for a stable binding complex to form (i.e. that the event would not occur spontaneously without an exogenous source of energy). The minimum strength site is zero bits, the equilibrium state ($\Delta G = 0$). Assuming the contacts at each position in the same binding site form independently, this approach is accurate and quantitative. Altering a nucleotide with high information (implying high prevalence and conservation at that position) will have a greater impact on binding, than if a less-well conserved base were altered. The

change in information due to a mutation in a site (ΔR_i) is the difference between $R_{i,final}$ and $R_{i,initial}$ values, where $R_{i,final}$ is the information of the sequence containing the variant, and $R_{i,initial}$ the information of the reference (wild-type) sequence. The minimum fold change in binding affinity resulting from the mutation is an exponential function based on ΔR_i , or $\geq 2^{\Delta Ri}$ (Ref. 21).

Software resources

Delila package/system

Information analysis was originally performed using the Delila sequence analysis system, which included a language to process nucleic acid sequences, and a library of sequence tools to retrieve and process various types of sequence data^{34,35}. Tools to measure

information content of nucleic acid sequences were subsequently added to Delila³¹. Initially, models of information content of bacteriophage T7 RNA polymerase binding sites and other bacterial control systems were studied, and mRNA splice sites were subsequently developed31,36. Later, tools to display binding sites as sequence logos of average information, and sequence walkers showing individual information - were incorporated into Delila^{23,32}. The Automated Splice Site Analysis (ASSA) server introduced in 2004, and its successor, the Automated Splice Site and Exon Definition Analysis server (ASSEDA), have been freely available throughout the last decade, and have been used for IT-based calculations on nucleic acid sequences for the preceding 20 years^{37,38}. Both ASSA and ASSEDA still use the Delila program suite to retrieve sequences, calculate information content, and create sequence walker representations of individual binding sites. ASSEDA is now available in a common interface with the other information theory-based tools described below at www.mutationforecaster.com.

ASSA/ASSEDA

To simplify mutation analysis, we built a web interface for variant analysis using Delila software as the processing backbone³⁷. Our aim was to standardize and facilitate IT-based mutation analysis by using Human Genome Variation Society (HGVS)-approved variant nomenclature (which has since become the worldwide standard), employing server-based retrieval/processing, and reporting results as concise predictions in both tabular and sequence walker display formats. Initially, ASSA results described mutations in relation to genome annotations from the first finished genome release (hg15)³⁷. While many publications cited this version of ASSA for novel splicing mutation analysis, continued improvements have introduced more accurate reference sequences, annotations, and models (for both constitutive and regulatory splice sites) based on more comprehensive sets of binding sites. The ASSA server contained the original donor and acceptor information position weight matrices derived by manual curation of GenBank entries, murine donor and acceptor weight matrices, a subset of splicing enhancer elements (SF2/ASF, SC35 and SRp40), and the lariat branchpoint recognition sequence³⁶. ASSA reported the strengths of all potential sites predicted within the window selected by the user, highlighted those with the largest changes in R, and computed the minimum fold change in binding affinity for each mutation or polymorphism. Tabular results were colour-coded. Unaltered sites above and below the $R_{i,min}$ (described in Minimum splice site information content and exceptions) were highlighted grey and white, respectively. Pre-existing sites abolished by the variant (where $R_{i,final} < R_{i,min}$) were marked in red, while leaky natural sites ($R_{i,final}$ $\geq R_{i,min}$) were highlighted in blue. Cryptic sites that were created, strengthened, or weakened were highlighted in pink, green and teal, respectively. The server parsed any mutation type described precisely by the HGVS notation, including substitutions, insertions, deletions, and combinations of these changes³⁹. Recapitulating variants described in articles before these guidelines were widely adopted proved to be time-consuming and error-prone²⁵. Multiple binding factors had to be analyzed simultaneously; however, results were reported independently. The analysis did not consider other factors relevant to splice site recognition, such as the resulting exon size, or potential formation of cryptically spliced exons.

ASSEDA, the successor software to ASSA, provides a new isoformoriented type of mutation interpretation, updates the coordinate system to HG19 (GRCh37), adds current gene and single nucleotide polymorphism (SNP) annotations (dbSNP135), and provides additional ribls for other splicing regulatory sites (SRp55, TIA1, ELAVL1, hnRNP A1, hnRNP H, and PTB). All models, except those for SRp55 and hnRNPH, have been built using sequences from publicly available CLIP-seq data, and are based on a larger number of binding site sequences. They have been tested by comparing predictions to validated binding sites from published primary literature, and to any splice-altering variants found within them38. ASSEDA introduces in silico exon definition analysis by computing the total splicing information across an exon³⁸. Total exon information $(R_{i,total})$ is the sum of the corresponding donor and acceptor R, values, and corrected for the gap surprisal term, which is based on the length of the potential exon formed using those sites (from RefSeq)⁴⁰. The gap surprisal function is based on the genome-wide distribution of constitutive exon lengths, also known as self-information. This term ensures that exons are computationally defined using donor and acceptor splice sites in close proximity^{40,41}.

Exons of uncommon length lead to large negative gap surprisal terms, which reduces $R_{i,total}$. When applied to predicted exons that activate a cryptic splice site, comparison of $R_{i,total}$ values can more accurately predict cryptic site use than the strength of this site alone. The gap surprisal term decreases the predicted $R_{i,total}$ value of particularly long internal exons (eg. the 3.4 kb long exon 11 of BRCAI; $R_{i,total} = 1.4$ bits), which tends to compensate for this effect with strong splice sites and other sequence elements that enhance natural splice site recognition and suppress internal cryptic splice sites.

The exon definition paradigm extends to the assessment of the impact of mutations in ESE/ISS elements. ASSEDA calculates $R_{i,total}$ by adding the R_i value of a regulatory splicing element to the contributions of constitutive splice sites, and applying a second gap surprisal term based on the frequency of distance from the splicing element to the nearest natural site. Currently, the effect of only one splicing factor can be evaluated by the software at a time, although the approach itself is generalizable to multiple regulatory binding sites. If a variant causes changes in the R_i values of multiple sites, such as the simultaneous creation of both splicing enhancer and repressor elements, there will be less confidence in ASSEDA's predictions.

Two distinct sets of IT-based models for donors and acceptors are available on ASSEDA. The manually curated ribls were originally determined from 1799 donor and 1744 acceptor sites 36 . We subsequently derived a set of ribl matrices from genome-wide exon annotations 33 . These models were automatically curated using the criteria that enforced $R_i > 0$ for correctly annotated sites. The resultant models consisted of 108,079 acceptor and 111,772 donor splice sites, however these were not formally implemented on the ASSA server until 2011 33 . These genome-wide models are used in the calculation of $R_{i,total}$ values. The ΔR_i values for a single nucleotide splicing variant are similar for both sets of models. Variants having opposite predicted effects between the respective donor or acceptor ribls have not been reported. In general, the genome-wide models report slightly lower information contents, however the frequencies of nucleotides

at the 5' end of the acceptor site differ significantly. This results in differences in the weights in the -4 to -20 nt region between the manually-curated and the genome-wide acceptor ribl matrix, which can significantly lower R_i values based on the genome-wide model. In the genome, thymine is more prevalent than cytosine at these positions and has a higher positive contribution to the overall R_i . This can account for up to a 1.97 bit difference between the models. Guanine nucleotides within this sequence window significantly lower the R_i values computed from the genome-wide acceptor ribl, as well. While these differences contribute only a 0.1–0.4 bit difference to the R_i per nucleotide, the cumulative effect of multiple differences within this window can lead to significant differences between the acceptor R_i values.

Shannon Pipeline and Veridical

High-throughput DNA sequencing is generating a deluge of novel variants in patients with genetic diseases, most of which currently have unknown significance (VUS). For example, 20% of the patients with Pelizaeus-Merzbacher disease possess VUS in the *PLP1* gene, among which are single or compound heterozygous, rare pathogenic mutations⁴². Many solutions have been proposed, however prediction of pathogenicity by bioinformatic analyses is often inaccurate⁴³. The Shannon Human Splicing Mutation Pipeline software predicts mutations at genome scale to predict which variants may alter mRNA splicing and is based on the same principles and IT models used in ASSA and ASSEDA44. However, this software processes ~5 million substitutions and/or indels in 10-15 minutes. While initially only available for the CLC-Bio Genomics platform, this software is now also offered as a web service in the suite of programs available through Mutation Forecaster (www.mutationforecaster.com). Variants are batched in standard variant call format (VCF). The pipeline reports any genic variant that affects a known natural site or a cryptic site where $R_{i,initial}$ or $R_{i,final}$ are ≥ 0 bits and $\Delta R_i \geq 1.0$ bits, however more stringent criteria for selecting variants with significant information changes can be applied.

In Shirley et al. (2013), all variants from the complete genomes of three cancer cell lines (A431, U2OS, U251; N = 816,275) were analyzed⁴⁴. Variants that were common (≥ 1%) were removed. Variants that weakened natural sites, or strengthened cryptic sites to levels comparable to or exceeding the strength to the nearest natural site, were flagged. Variants that strengthen a natural site could have an effect on the splicing profile of a gene (i.e. reduce the frequency of exon skipping for the corresponding exon), but are less likely to cause a deleterious phenotype. The overall fraction of mutations flagged, after filtering out distant cryptic sites and small ΔR values, averaged 0.016%, illustrating how the software can be used for prioritizing variants. Some of the prioritized variants occurred in genes with known defective functional and biochemical pathways in these cancer cell types, i.e. cytokine signalling (in A431), DNA replication and cell cycle (in U2OS). Natural splice mutations were confirmed by expression data to a greater extent than either leaky or cryptic splice site variants.

In a complete cancer cell line genome, the number of cryptic sites with altered R_i values greatly exceeds the number of affected natural splice sites. Many of these are weak decoys, which can occur throughout genes. Using the principle that novel cryptic sites that

are likely to be activated must compete with the natural splice site for spliceosomal recognition, the relevant cryptic sites are restricted to those with R_i values comparable to or greater than the corresponding strength of the adjacent natural site of the same polarity²⁵. Additionally, the proximity of potential cryptic sites to the natural site should be considered in assessing whether an exon could be formed with the natural splice site of opposite polarity. Cryptic sites that are considerably weaker than the nearest natural site of the same type, or cryptic sites that would lead to unusually large exons, diminish the likelihood of cryptic site activation. Benaglio et al. (2014) used the Shannon Pipeline to screen 303 sequenced patients and flagged five variants that each strengthened or created a different cryptic site⁴⁵. While comparable in strength to the natural site, these were all distant (> 400 nt away) and thus, less likely to be recognized. The authors also stated that the ΔR values for three of these sites were discordant with results obtained with NNSplice, a neural network-based splicing prediction program. In fact, both the Shannon Pipeline and NNSplice demonstrated strengthening of these decoy cryptic splice sites.

Shirley et al. (2013) evaluated the predictions of the Shannon Pipeline by manually inspecting RNAseq data for each variant with significant information changes in each cell line⁴⁴. However, manual review is unfeasible for many large datasets, especially from tumors, because of the large numbers of potential somatic mutations affecting splicing in each genome. Veridical, an in silico method for validation of DNA sequencing variants that alter mRNA splicing, has been developed to provide high throughput, statistically-robust unbiased evaluation based on RNAseq data⁴⁶. The method has been implemented as software for analysis of potential splicing variants from large datasets and catalogues their effects. Veridical takes Shannon Pipeline output from predicted genomic variants with effects on splicing and performs a case-control analysis of corresponding expressed transcripts that cover the same genomic region, taken from normal tissues. Upon Yeo-Johnson transformation of the expressed read count distribution, parametric statistics are used to compare normal and abnormal mRNA species (exon skipping, intron inclusion, and cryptic site use). Veridical is designed to be used with large data sets, as the statistical analysis gains power with increasing numbers of control samples. A recent study of 442 breast cancer tumors from the Cancer Genome Atlas Project revealed 5,206 putative splicing mutations using the Shannon Pipeline. Veridical was then used to confirm exon skipping, leaky or cryptic splicing of 988 of these variants⁴⁷. Veridical is also available through the same interface as the above mentioned tools (www.mutationforecaster.com).

Natural sites

The early splice site recognition literature often over simplified the composition of the U1/U2-type 5' donor and 3' acceptor sites by presenting only consensus sequences and truncating the positions in each site 16,48,49. However, the conserved tracts extend well beyond the canonical GT and AG dinucleotides adjacent to intron/exon junctions. Furthermore, a small, albeit significant, proportion of natural donor sites (~800, or 0.7%) contain cytosine at position +2 in the genome. This is reflected by a corresponding small decrease in average information at this position (Figure 1). Sequences adjacent to these positions are more variable, but are nevertheless essential for

the accurate recognition by the spliceosome. Specifically, the donor site is defined by the three terminal nucleotides of each exon and the first seven bases of the downstream intron. Conversely, acceptor sites are represented by the first two bases of the exon, and the last 26 bases of the upstream intron. Because ASSA and ASSEDA use an integer-based coordinate system, there is a zero coordinate at the first intronic base of each splice site (Figure 1), which is not used in the conventional numbering system. The coordinate ranges for the donor and acceptor site positions are therefore [-3, +6] and [-25, +2], respectively. Individual information analysis computes the R_i values over these intervals for normal and variant-containing splice sites. As discussed below, information content present in intronic intervals justifies sequencing and analysis of sequences well beyond the locations of the splice junctions themselves.

Certain variants within donor and acceptor sites are tolerated and may even have benign effects, while others have a deleterious impact on spliceosomal recognition. IT accounts for all of these possible outcomes. Unusual donor sites (i.e. with cytosine at position +2) are detected by information analysis, but could be falsely called deleterious by consensus sequence-based methods. Although the terminal position of exons contributes significantly to donor splice sites with a preference for G, a significant proportion of sites naturally possess A or U at this position, or less frequently, C.

Of the published IT-based variant analyses, single nucleotide variants (SNVs) that were reported to affect a natural splice site (multi-nucleotide and insertion/deletion variants are listed separately in Supplementary Table 3) were compiled and reanalyzed. After reducing this set to only those variants occurring within the intervals covered by the splice site information weight matrices described above, 1120 SNVs were reported to affect the strengths of either natural donor or acceptor sites. A variant was considered deleterious if it was predicted to affect splicing (either leaky expression or exon skipping), or if it was experimentally shown to reduce or abolish splicing of the corresponding exon. In instances where prediction and validation did not concur, the latter were used to determine the effect of the variant. Variants predicted to have a neutral effect but demonstrated to be deleterious in the validation study were classified as damaging. In total, 1036 deleterious natural splice site variants were analyzed (Supplementary Table 4).

Sequence conservation has long been considered a surrogate measure of evolutionary constraint and, by inference, functional significance. The average information quantitates the relative conservation at each of the positions within a binding site. We compiled the mutation spectra for all mutations that significantly affected the strengths of donor and acceptor splice sites and compared these with the average information contents at each position. Figure 1b indicates, at each position of the natural acceptor and donor sites the frequencies of variants deemed deleterious by information analysis. Interestingly, when the sequence logo is overlaid with the histogram of the corresponding mutation spectra, the relative frequencies of deleterious mutations and the average information are comparable. Indeed, these frequencies and the information contents across each type of site are strongly correlated (r = 0.95for acceptors and 0.90 for donors). Our interpretation is that the susceptibility to deleterious mutation at a position is related to its overall conservation within the splice site, which reflects the contribution of that ribonucleotide to the stability of the interaction with the corresponding spliceosome. Nevertheless, there is an unstated bias in ascertainment in these mutation spectra. Variants occurring at sites with low information and/or that are benign are under represented, as they are less likely to be associated with genetic disease, and were less likely to be reported. Also, the distribution is dependent on the region sequenced by the authors of the reviewed publications; in early work, the full sequence interval containing the entire splice site was sometimes not included or unavailable for analysis.

An interactive website was created to summarize this set of SNVs. This software application renders interpretations of variant effects in a more practical, useful way than the corresponding table of supplemental data (Supplemental Table 5). The "Splicing Mutation Calculator" (SMC; http://splicemc.cytognomix.com) is a web service that amalgamates all published results for the same type of substitution in a natural splice site, regardless of genic context. Variants that create cryptic splice sites that do not alter the strength or have a marginal effect on the natural site were excluded. We consider these cases to be sequence-specific as opposed to positional. With this program, users have the option of exploring mutation data (at present, only SNVs can be analyzed) linked to the original literature citations. SMC processes and provides literature support for the variants that occur within the defined regions spanned by natural splice sites. The user first selects the type of site (donor or acceptor), position (based on ASSEDA's integer-based system), wild-type or reference nucleotide, and the alternate substitution at that position (Figure 2a). The software tool outputs the ΔR_1 and the number of variants that have been reported and analyzed to date using IT (Figure 2b). SMC provisionally classifies the reported variants based on the degree to which these predicted effects are expected to decrease spliceosomal affinity, and consequently splicing. The following criteria are empirically based on affinity changes and a summary of published phenotypes associated with these changes: "Deleterious" (if the site is weakened by more than 7.0 bits), "Probably Deleterious" (if the site is weakened such that -4.0 bits $\geq \Delta R_i \geq -7.0$ bits), "Leaky" (the site is weakened such that -1.0 bits $\geq \Delta R \geq$ -4.0 bits), or "Benign, probable polymorphism" (if the site is weakened by less than 1.0 bits). The "Benign" variants, which are likely polymorphisms are now catalogued (See Supplementary Table 6 for the list of benign variants that were added). It is important to appreciate that the ΔR is a constant for a specific nucleotide change at a specific position, though the absolute strength of the splice site depends on the sequence context of the mutation. This context varies between mutations, and $R_{i,initial}$ is not the same for each case, which can result in different $R_{i,final}$ values for different mutations.

Besides published sources, the software can also predict effects of mutations by computing ΔR_i values directly. Particular substitutions that have not been reported in Supplemental Table 5 can nonetheless be provisionally interpreted. The ΔR_i value is computed and reported from the ribl. While SMC enables rapid exploration of results for validated and novel mutations, it is, however, not a replacement for ASSEDA or the Shannon Pipeline, since it does not consider the sequence context, which can also influence the interpretation of deleterious, leaky, or benign variants.

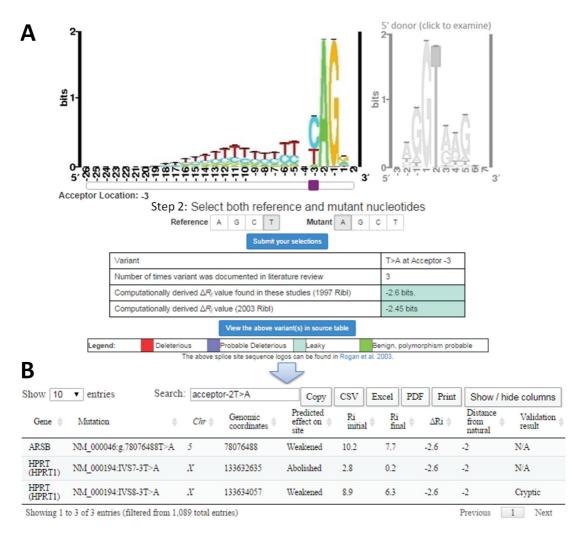


Figure 2. Sample retrieval of average change in information content (ΔR_i) with splicing mutation calculator (SMC) for published mutations. A) Example mutation input for SMC (T>A at the 3rd intronic position of natural acceptor). The type of splice site is selected by clicking on the corresponding sequence logo (acceptor [left] or donor [right]). The purple slider bar appearing below the logo is used to select the position of the mutation. The reference and mutant nucleotides are then designated, and the variant is submitted to the software ('Submit your selection'). SMC outputs a table indicating the user input, the number of instances in the literature where this substitution has been analyzed using IT, and the computed ΔR_i values (in bits) using both the old (1992; top) and new (2003; bottom) ribls. The cell colour for ΔR_i values indicates the predicted severity of the inputted variant according to defined thresholds^{25,157}. B) Tabular output detailing each instance of the selected mutation from the source table. The user may view, in a separate window, extensive details of all variants referred to in SMC output (Supplementary Table 5).

Minimum splice site information content and exceptions

The minimum theoretical information content of a binding site, $R_{i,min}$, is zero bits²¹. Comparison of the R_{i} values of a series of inactivated and minimally active splice sites revealed the minimum strength of functional splice sites $(R_{i,min})$ to be at least 2.4 bits for the original donor and acceptor models of Stephens and Schneider (1992) (based on 103 mutations with functional validation, including 57 natural and 46 cryptic site activating mutations)²⁵. This value was redefined based on information models from a genome-wide set of donor and acceptor models (Figure 1a) to be 1.6 bits using the identical set of mutations³³. It is likely that the differences between these values are not significant and are attributable to the increased precision of the ribl using the ~50-fold larger set of sites. Weakened

natural sites, with significantly reduced R_i values that remain above these thresholds, are considered to be leaky (lower affinity binding), whereas those below this threshold are found to completely abolish natural splice site recognition, resulting in either exon skipping or activation of neighbouring cryptic splice sites. However, these outcomes are not mutually exclusive, since leaky splice site mutations may also result in exon skipping and/or activate neighbouring cryptic sites. Natural splice sites below these thresholds are extremely rare, and their recognition is likely enhanced through the binding of specific RNA binding proteins that promote exon definition (eg. XPC exon 4 acceptor and MYBPC3 exon 12 acceptor, genes involved in xeroderma pigmentosum and hypertrophic cardiomyopathy, respectively 50,51).

Leaky natural sites have R_i values exceeding the $R_{i,min}$ threshold, which, in theory, retain some capacity to be recognized by the spliceosome. There were 84 variants predicted to cause leaky splicing, of which 19 were shown experimentally to lead to exon skipping without any detectable residual natural splicing (Supplementary Table 2: #32, 120, 128/380, 195, 276.5, 355, 360, 363, 364, 365, 379, 409, 477/496/934, 573, 842, 853, 883/1589, 886, and 918). Of those, seven are donor splice site mutations at position +5 ($\Delta R_i \sim$ -3.5 bits; #128/380, 195, 355, 842, 853, 883/1589, 886), four alter the first exonic nucleotide of a donor site ($\Delta R_1 \sim -3.0$ bits; #276.5, 360, 379, 409), and three are donor mutations at position +4 (ΔR ~ -2.6 bits; #120, 365, 573). The $R_{i,final}$ values of these 19 inactivated natural sites range from 2.7 to 8.8 bits, which suggests the possibility that the variant may also simultaneously affect other adjacent or overlapping sites that preclude recognition of the mutated natural site. Additionally, weakening of 11 of these variants activates a neighbouring cryptic splice site, in which no residual natural splicing was detected. However, changes in splice site preference due to small changes in binding affinity within exons are probably related to the processive nature of donor splice site selection⁵².

Leaky splicing mutations are readily detected when the expressed transcript contains the causative variant or a neighbouring polymorphism. However, there are a number of practical limitations on the methods for experimental validation of leaky splicing mutations. RT-PCR alone would only be considered reliable for confirmation of homozygous mutations (and in one case, a compound heterozygote where two separate variants abolished natural splicing of the same exon), unless combined with a secondary quantitative methodology⁵³. Similarly, it is difficult to assess leaky splicing of heterozygotes using RNAseq data, as reduced levels of wild-type splicing are challenging to determine without adequate read coverage and controls for comparison. However, leaky splicing can be assessed by comparing the frequency of the causative allele to the normal allele in the same cell line when the variant is present within the sequenced reads⁴⁴. These are special cases however, as the variant itself must either be expressed within an exon or, if intronic, must lead to an activation of a cryptic site further into the corresponding intron.

We previously suggested that weaker splice sites are more susceptible to mutational inactivation relative to stronger sites²⁵. In the present study, all experimentally verified variants affecting natural sites (where leaky and abolished splicing could be differentiated) were analyzed (N = 98). Variants predicted to abolish splicing $(R_{i,final} < R_{i,min})$ and/or $\Delta R_i < 7.0$ bits) were filtered out, as large changes in binding affinity will essentially abolish splicing, despite remaining binding strength and regardless of initial R₂ value. Supplementary Figure 1 illustrates the frequency of inactivation by these variants relative to initial R value. Variants occurring at weak splice sites $(R_{i,initial} < 4 \text{ bits})$ abolish splicing in 5 of 6 cases (where $\Delta R_i < 7.0$ bits), but are not represented as they all weaken the site below $R_{i,min}$. The remaining variant slightly weakens a site where $R_{i,initial}$ is -0.1 bits (where $\Delta R_i = 0.5$ bits), and its recognition may be supported by SR elements⁵⁰. Moderate strength splice sites (5.0–11.0 bits are inactivated in 25–60% of cases), and mutations at strong splice sites $(R_{i,initial} \ge 12 \text{ bits})$ tend to be leaky (Supplementary Figure 1b).

Mutations that abolish natural sites (without cryptic splice site activation) are expected to result in a complete loss of normal splicing. However, of the 94 variants that reduced natural splice site strength below $R_{i,min'}$, 11 were reported to have residual normal splicing activity (Supplementary Table 2: #185/750, 275, 881, 914, 1315, 1321, 1325, 1326, 1361, 1380, and 1407)^{25,44,54,55}. Two of these occurred at the G of the +1 position of the donor site (Supplementary Table 2: #185/750 and 1326), which is essentially invariant in functional splice sites. This suggests potential problems in IT or experimental analysis of these mutations. Surprisingly, the majority of these variants occur at the +2 position of a donor splice site and are T>G mutations, which are predicted to abolish splicing activity⁴⁴. However, the analysis of RNAseq data for these variants showed no splicing defects (Supplementary Table 2: #1315, 1321, 1325, 1361, 1380 and 1407). One explanation is that resultant aberrantly spliced transcripts were subjected to nonsense-mediated decay (NMD) and degraded. Another possibility is that the coverage of these splice junctions is insufficient to distinguish expression of a single allele from that same allele plus the leaky splice junction. The remaining variants differ in the position within the splice site and decrease natural site strengths to between 0.9 to 2.2 bits^{25,54}.

Theoretically, a site lacking the canonical G at +1 (donor) or -1 (acceptor) position of a natural site may exceed $R_{i,min}$. Ozaltin *et al.* (2011) and Di Leo *et al.* (2009) each assessed mutations at positions +1 or -1, which weaken natural splice sites to $R_i > R_{i,min}$, and note that these sites are predicted to be leaky^{56,57}. However, this is not the sole criterion for interpreting splice site mutations using IT-based methods. The overall change in binding affinity must also be considered, as both mutated sites were predicted to have only 0.4–0.5% of the binding affinity of the corresponding natural splice sites^{56,57}.

Branch-point mutations

Although branch-point site (BPS) recognition occurs independently and post-exon definition, mutations in this sequence have also been described, due to its proximity to the natural acceptor site. Following the recognition of and binding to the 5'ss (upstream donor site) by the U1 snRNP, the U2 is recruited to the 3'ss (downstream acceptor) and recognizes the BPS, resulting in the formation of the pre-spliceosome⁵⁸. Association of U2 with the BPS is essential, as it is the first energy-requiring step, allowing for the tri-snRNP complex of U4/U6 × U5 to be recruited to the BPS, which produces a catalytically active spliceosome⁵⁹. The BPS typically contains a conserved adenosine and a downstream polypyrimidine tract. It is located within 40 nt of the natural 3'ss, however there are reported cases where it can be up to 400 nt away.

Recognition of the BPS is thus a crucial step in proper splicing, and sequence variants can disrupt this event, impede lariat formation, and intron excision. The complete list of BPS variants analyzed using the ASSA and ASSEDA server can be found in Supplementary Table 7. The variants range in distance from 0–76 nt from the natural acceptor junction, and either weaken, abolish or strengthen the BPS. When validation assays were performed, the prediction by the server was correct in 9/11 cases. We deemed the two other cases to be partially discordant (NM_004628:c.413-24A>G and NM_005902:IVS8-55A>G). ASSEDA predicted these variants to

abolish the BPS, but leaky and normal splicing were observed, respectively. The predictions are partially concordant with experimental findings because ASSEDA also predicted the existence of nearby alternative BPS, which if used, could account for the observed phenotype.

Although IT-based prediction of a variant effects on BPS has been accurate, the number of validated sites used to compute the ribl is substantially smaller (N = 20), and it is not as reliable as those used to determine R_i values of natural acceptor and donor sites. Furthermore, these motifs are short and relatively frequent in unspliced mRNA. One possible explanation for the rarity of BPS mutations is that compensatory, alternative BPS sequences can be recognized and used. Furthermore, the weak constraint on the precision of the distance between the BPS and the 3' (acceptor) splice site (Figure 3) further enables activation of these alternative sites. These factors increase the chance that a variant will be falsely predicted to affect a BPS. For example, variants within donor splice site sequences are routinely predicted to alter strength of false BPS. This error is easily avoidable if the potential recognition sequence is filtered for the genomic context of the variant, as well as its proximity to acceptor splice sites.

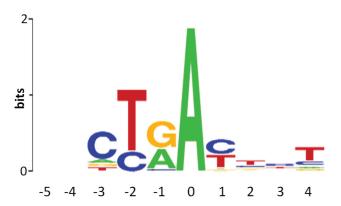


Figure 3. R₁(b,I) matrix used for the prediction of a variant's effect on branch-point sites. Sequence logo for information model for the branch-point site, created using 20 annotated branch-point sequences.

Activation of cryptic splicing

It has been estimated that 1.6% of disease causing missense mutations can affect splicing and recent predictions suggest that approximately 7% of exonic variants in the general population may disrupt splicing, which includes cryptic splicing^{60,61}. The genome is replete with pseudo (or decoy) splice sites with varying degrees of similarity to natural sites that are not recognized in constitutive splicing⁶². However, mutations that alter the strengths of either these decoys or the natural splice site of the same polarity may shift the balance of isoforms towards non-constitutive splice isoforms that predominate over or eliminate normal mRNAs (Figure 4). Mutations can create a cryptic splicing event by creating or strengthening a site in either intronic or exonic regions (Figure 4, Type 1), weaken the natural site while simultaneously altering an overlapping decoy site (Figure 4, Type 2), or exclusively weaken the natural site, leading to the activation of a pre-existing decoy site (Figure 4, Type 3). Although the contributions of cryptic splicing to genetic disease

have long been recognized, IT analysis correctly predicts most, but not all, cases (Figure 4). The challenges in identifying potential cryptic sites or determining activation are attributable to our incomplete understanding of the requirements for activation 63-65, which include exon length, processivity of donor site recognition, and involvement of splicing regulatory factors. A database of aberrant 3′ and 5′ splice sites has been compiled 65.

Another bioinformatics method for cryptic site recognition relies on a training set composed of cryptic sites that are known to be used⁶⁶. There are a number of drawbacks to this approach: the training set is itself not representative of all cryptic sites; and sites that are altered but unused cannot be discriminated from those that are activated (since the latter group also depends on the strength of the corresponding natural splice site). IT-based methods rank cryptic and cognate natural site strength in a way that predicts whether the site will be activated, as well as the abundance of each pair of splice isoforms. Furthermore, the structures of the prospective isoforms are presented by ASSEDA with relative quantitation of each, both prior to and post-mutation.

During our review, we noted 203 variants with experimental support for cryptic splicing (Supplementary Tables 8–10). Of these, 38 variants resulted in Type 1 cryptic splicing. From those, site activation (existence of the site and strength \geq 2.4 bits²⁵) was correctly predicted by ASSEDA in 34 cases (89.5%). We identified 56 variants resulting in Type 2 splicing, 38 of which (67.7%) were accurately predicted, while the remaining 119 variants resulted in Type 3 cryptic splicing and 99 (90.8%) of the alternate splice sites matched predictions.

Prediction of Type 3 cryptic splicing was more accurate than Types 1 or 2. The criteria for concordance with experimental data were that ASSEDA predicted both the cryptic site and that the variant weakened the natural site. However, the strength of a site is not the sole determinant of whether or not a site is activated. Unlike natural sites, novel cryptic sites are not under selection to maintain binding to the spliceosome, and their genomic context is less constrained than natural splice sites. The presence of cooperative splicing enhancer or repressor elements adjacent to cryptic sites, which could influence cryptic splice site activation, is not yet predictable. Additionally, many of the reported activated cryptic sites have been confirmed using non-quantitative approaches, and these may not constitute the predominant splice forms relative to constitutive exons with stronger natural sites. Finally, certain isoforms may not be detected; as aberrant transcripts are often subject to degradation and the tools used to evaluate functional splicing consequences do not always have sufficient resolution to distinguish small differences in isoform structure. All of these factors can affect the concordance of predicted cryptic site activation with experimental validation.

We also separated each sub-group of cryptic splice variants by location (intronic vs. exonic) and computed the average difference in strength between pairs of natural (post-mutation) and the activated cryptic sites. For intronic Type 1 variants, activated cryptic sites were 0.9 ± 5.3 bits stronger than the corresponding natural site (N = 12). There were eight Type 1 variants (4 at acceptors and 4 at donors) that were missed, because the $R_{i,inval}$ value of the natural

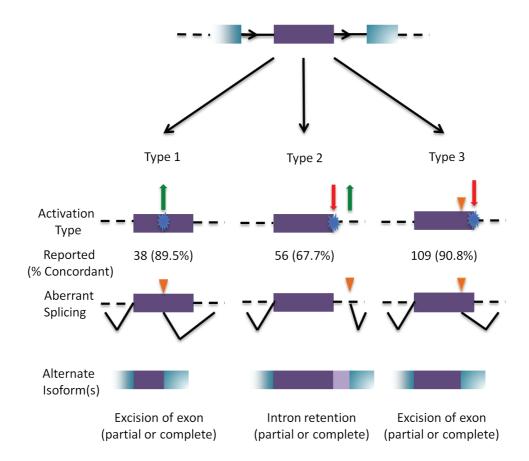


Figure 4. Outcomes of cryptic splicing mutations. A prototypical internal exon (in purple) with flanking exons (in blue); introns are represented by black solid, and dashed lines (top). The three types of cryptic splice site activation are then illustrated. Type 1 cryptic splice site activation (left) is caused by the activation (green arrow) of a cryptic site by strengthening a pre-existing site, or by creating a novel splice site (blue). Type 2 (middle) results from the simultaneous weakening or abolition (red arrow) of the natural splice site while strengthening or creating (green arrow) a cryptic site. Type 3 (right) involves the activation of a pre-existing cryptic site due to the weakening or abolition of the natural splice site (indicated by orange triangle). The number of cases that have been reported in the literature that has been analyzed by IT for each type is indicated, with the percent accuracy in parentheses. The bottom row represents the resulting mRNA structure due to the activated cryptic splice site.

site exceeded the strength of the corresponding cryptic site by ≥ 1.0 bits (variants with ΔR_{i} < 1.0 bits are not reliably detected experimentally). We hypothesize that these cases could be explained by concomitant changes in surrounding regulatory binding site sequences. Exonic Type 1 variants were often slightly weaker than their cognate natural sites (-1.1 \pm 3.8 bits; N = 26). Nearly all of these involved ectopic donor site activation (12 of 13), consistent with a processive mechanism for donor site recognition, which searches downstream from the acceptor splice site to the first donor site of sufficient strength to form an exon³⁸. The opposite pattern was observed with intronic Type 2 cases, in which 20 of 21 exceptions occurred at acceptor sites. On average, the activated cryptic site exceeded the strength of the cognate natural site $(1.4 \pm 4.6 \text{ bits};$ N = 57). Activated, exonic Type 2 acceptor cryptic sites tended to be weaker than their natural site counterparts (-2.3 \pm 3.4 bits; N = 4). This result may be attributable to a low sample size, with 2 of these mutations exhibiting natural sites that were stronger (≥ 1.0 bits) than the corresponding cryptic site (1 donor and 1 acceptor). Finally, Type 3 activated intronic cryptic sites exhibited the greatest difference between the strengths of cryptic sites and cognate natural

splice sites (6.3 \pm 4.9 bits; N = 104). This category contained the fewest number of exceptional cryptic sites, with R_i values less than those of natural sites (5 acceptors and 3 donors). This is consistent with the idea that the intronic cryptic sites are generally not under selection for adjacent functional regulatory binding sites, and, in order to be activated, are required to be substantially stronger than the natural site. Although $R_{i,final}$ values were stronger (2.1 \pm 1.9 bits; N = 20) than the natural site, exonic Type 3 cryptic splice sites did not show as great a difference in strength with a single exceptional case (of an acceptor). Despite these exceptions, activated cryptic splice sites are generally stronger than the corresponding natural splice sites²⁵.

The distribution of activated cryptic sites relative to their natural splice site is indicated in Figure 5. Among the reported mutations, donor or acceptor cryptic sites are activated with similar frequencies (113 donors and 108 acceptors). These cryptic sites are located within both introns and exons (59.3% of cryptic donors and 38.0% of acceptors are intronic, the remainder are exonic). Cryptic sites have been confirmed to occur over a broad range of

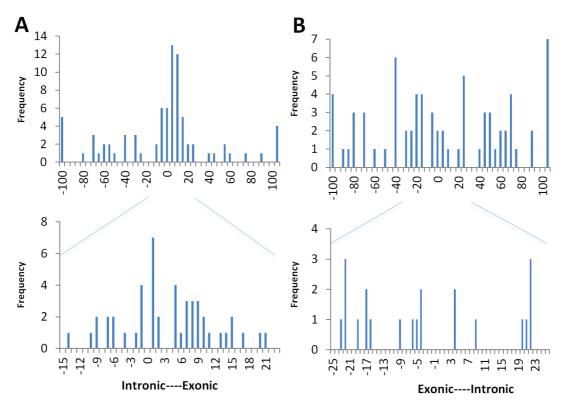


Figure 5. Distribution of activated cryptic sites. The frequency of validated cryptic splice acceptors (A) and donors (B) occurring at positions relative to the natural splice site. Positions are given using ASSEDA coordinates. Lower two panels magnifies the cryptic site distribution of the region circumscribing the natural splice site.

distances from corresponding natural sites, however there is a distinct preference for cryptic site activation adjacent to the acceptor intron-exon junction. These splice sites are most common at the first nucleotide downstream from the natural acceptor splice junction (Figure 1), which has particular implications for the approaches used to verify the structure of the aberrant transcript (See Validation methods).

Combinatorial effects

While functional natural splice sites and an intact BPS are integral for accurate and efficient splicing, other genetic elements have been shown to make essential contributions to exon definition⁶⁷. Introns will often contain more than one potential splice site recognition sequence, but nevertheless, the correct natural site is consistently selected⁶². Differences among the strengths of potential sites, as determined by IT analysis, are a major, but not the sole, determinant of splice site utilization. The implication is that additional sequences within the gene are necessary to ensure specificity and precision of exon recognition. Studies of facultatively expressed alternative exon structures have revealed cis-acting sequence elements that function to enhance or repress exon recognition. These sequences cooperate with factors that recognize natural splice sites, whose sequences and relative strengths can vary considerably. Depending on their context, these elements have been referred to as exonic splicing enhancers (ESEs), exonic splicing silencers (ESSs), intronic splicing enhancers (ISEs) or intronic splicing silencers (ISSs). In general, these elements serve as binding sites for trans-acting elements, which will either promote or impede the

spliceosomal recognition of a splice site. The majority of enhancer elements will act through the recruitment of SR proteins and associate components of the U1 and U2 spliceosomes^{68,69}. Silencers are often of the hnRNP class, which act through a diversity of mechanisms including steric hindrance, the formation of dysfunctional complexes, or blocking processiveness^{70–72}. To add to the complexity of splicing regulation, it has recently been shown that SR protein function is dependent on context, i.e. whether the corresponding binding site is intronic or exonic^{73,74}.

To improve accuracy of exon definition, the strengths of regulatory elements (i.e. their R_i values) have been incorporated into splicing mutation prediction. The significance of regulatory elements in disease has been demonstrated in many cases. For example, in the NFI gene, ESE disruption is the primary cause of exon skipping⁷⁵. Many other genes [Adenomatous polyposis coli (APC), survival motor neuron (SMN), bestrophin 1 (BESTI), pyruvate dehydrogenase alpha 1 (PDHAI)]^{76–79} have been proven to harbour variants that disrupt ESEs and have a confirmed impact on mRNA splicing.

Adding to the complexity, the recognition sequences for these RNA binding factors, while well defined, tend to be short, and can vary to the degree that the same sequence may contain overlapping elements of binding sites for multiple factors. However, this does not necessarily imply that such a sequence is bound with similar affinity by each factor or that it contributes to exon definition. At the same time, these sequences tend to be evolutionarily conserved and may be required for proper splicing ^{80,81}.

ASSEDA optionally incorporates PWMs for regulatory binding sites for mutation analysis (Table 1) in addition to the default donor and acceptor sites. The program selects the most proximate predicted ESE/ISS to the natural splice site when calculating $R_{i,total}$ The molecular phenotype, which dictates the splice isoforms (and their relative abundance) that are predicted, accounts for both the potential effect on the natural site and the most relevant splicing regulatory site. For these regulatory binding sites, a second gap surprisal term specific to the ESE/ISS of interest is applied to the R_{inter} calculation³⁸. The gap surprisal functions for SF2/ASF and SC35 have been previously described³⁸, where the most common distance of the ESE/ISS is within 10 nt of the natural site. The gap surprisal penalty gradually increases with distance from the natural site. Gap surprisal distributions for ELAVL1, TIA1 and SRp55 show a similar pattern, while hnRNPA1 and PTB binding sites are strongly clustered around splice junctions. It should be feasible to include the contributions of multiple splicing regulatory binding sites of the same or different RNA binding proteins in determining $R_{i total}$; however this capability had not yet been implemented. Currently, if multiple sites of the same type are altered, the strongest (before or after mutation) is chosen by ASSEDA software.

Although the disruption of splicing regulatory sequences can cause aberrant splicing, the interpretation of variants affecting these sites is not as straightforward. Due to their degenerate nature, short sequence, and a lack of understanding of the context of their use, altered regulatory sites should be functionally validated before being deemed pathogenic¹⁰. Using variants from a number of different studies, ASSEDA accurately predicted experimentally determined changes in binding at a splicing regulatory site 75% of the time $(N = 12)^{38}$. However, there were instances where regulatory sequences had been analyzed by IT, and considered to contribute to disease, but the results were not reproducible. For example, Kölsch et al. (2009) described SNPs associated with Alzheimer's Disease, one of which strengthened and created SRp40 and SRp55 sites, respectively, but were reported by authors to be abolished⁹⁷. This study did not report any evidence to support the significance of these predictions.

Functional validation of the effects of these mutations could contribute to understanding the roles of these factors in regulating constitutive splicing. Similarly, there is still little understanding on how multiple regulatory binding sites within the same region function as a unit. Using a pull-down assay, Olsen *et al.* (2014) demonstrated how different variants affect the binding of multiple regulatory proteins²⁶. One mutation was predicted to create and strengthen multiple hnRNPA1 sites and slightly strengthen an SF2/ASF (SRSF1) site. The pull-down studies showed up-regulation of hnRNPA1 binding and a decrease in SF2/ASF binding. However, SF2/ASF binding increased when a mutation disrupting hnRNPA1 affinity was introduced, suggesting that the strong hnRNPA1 sites out-compete the weaker SF2/ASF site.

In some instances, alterations in regulatory splice site recognition sequence and natural splice strength occurred concomitantly, with both predicted to have similar effects on splicing. Alteration of a regulatory sequence can sometimes provide a plausible explanation for discordant *in silico* prediction and experimental validation.

As an example, Smaoui *et al.* (2004) analyzed a donor site mutation (NM_001040667:c.1327+4A>G) in *HSF4* in a family with congenital cataracts⁵³. This variant was predicted to cause leaky splicing ($R_{i,final} = 5.4$ bits; $\Delta R_i = -2.6$ bits; 67.5% residual binding), however RT-PCR showed complete exon skipping. Our further analysis showed that it is predicted to also create an overlapping hnRNPA1 site ($R_{i,final} = 4.2$ bits; $\Delta R_i = 17.1$ bits). Another case involved a mutation in the *XPC* gene (NM_004628: c.2033+2T>G) that created a novel intronic cryptic site 4 nt downstream of a natural donor site⁹⁸. However, a weaker site 68 nt downstream from the natural site was activated. A possible explanation could be that activation of the cryptic site is influenced by a neighbouring hnRNPA1 site that is itself strengthened ($R_{i,final} = 5.2$ bits; $\Delta R_i = 2.2$ bits) and an SRp55 site that is significantly weakened ($R_{i,final} = 1.9$ bits; $\Delta R_i = -4.0$ bits).

The effects of changes in regulatory binding site strengths may ascribe potential functions to previous VUS. For example, Maruszak et al. (2009) present a *PIN1* variant associated with late-onset Alzheimer's Disease (NM 006221:c.58+64C>T)⁹⁹. Based on IT, it is expected to abolish an intronic SC35 site, which could have either an enhancing or silencing effect (Table 1). A 2.82-fold decrease in transcript levels was demonstrated, which is concordant with previous findings reporting decreased PIN1 levels in the brains of patients with Alzheimer's Disease. Another study described an exonic missense variant within the ETFDH gene in a patient with multiple acyl-CoA dehydrogenase deficiency (NM_004453:c.158A>G) that showed evidence of exon skipping. The variant was predicted to be "benign" or "tolerated" when evaluated with PolyPhen and SIFT²⁶. ASSEDA, on the other hand, predicted the creation of an hnRNPA1 site $(R_{i final} = 5.9 \text{ bits}; \Delta R_i = 17.1 \text{ bits}), \text{ a slightly strengthened hnRNPH}$ site $(R_{i,final} = 4.0 \text{ bits}; \Delta R_i = 0.2 \text{ bits})$, the abolition of an SRp40 site $(R_{i,final} = -3.3 \text{ bits}; \Delta R_i = -6.3 \text{ bits})$ and two novel, weak SF2/ASF sites $(R_{i,final} = -4.6 \text{ bits}; \Delta R_i = 0.8 \text{ bits})$ and $R_{i,final} = -2.4 \text{ bits}; \Delta R_i = 0.4 \text{ bits}$ bits)²⁶. The natural donor site was unaltered by the mutation. As indicated earlier, the mutation was confirmed experimentally to increase hnRNPH and hnRNPA1 and decrease SRp40 and SF2/ ASF binding.

Validation of results

A number of early mutation studies did not perform expression analysis and relied solely on the ASSEDA or ASSA server to interpret potential mutations. This is not recommended, as there are limitations to any *in silico* predictive method, which impacts accuracy and precision of the prediction. Assuming that the impact of the mutation on expression can be detected, experimental validation of IT-based mutation analysis can reveal its limitations. We describe the various validation methods that were employed in the articles where expression data were available. Below, advantages and disadvantages of these approaches are explored, as well a show lower sensitivity validation can result in misinterpretation. Finally, we determine the accuracy of IT-based prediction, and point out some instructive, discordant cases.

Validation methods

The two most widely used methods for validating mutant mRNA splicing isoforms have been RT-PCR analysis of patient mRNA, and transfection of minigene constructs expressing the mutated exon into

Table 1. Splicing regulatory protein binding sites ASSEDA scans for and their associated effect on splicing.

Splicing Factor	R _{sequence} (bits)	Sequence Logo	Location-dependent effect on splicing			
3	sequence (*** *** ***		Intronic	Exonic		
hnRNPH	8.9 ± 1.8		E82,83 / S84,85	<u>\$</u> / E ⁸⁶		
hnRNPA1	4.6 ± 1.5		S / E ⁸⁷	<u>S</u>		
TIA1	7.6 ± 3.1	1 A A T A A A A A A A A A A A A A A A A	Ē	N/A		
SRSF6 (SRp55)	5.2 ± 1.4		E / S ⁸⁵	E /S		
SRSF5 (SRp40)	4.5 ± 1.5		E / S ⁸⁵	E / S ⁸⁸		
SRSF2 (SC35)	4.5 ± 1.6		E / S ⁸⁹	E / S ⁹⁰		
SRSF1 (SF2/ASF)91	5.8 ± 1.5	THE THE PERSON NAMED IN TH	E / S ^{39,92,93}	E /S		
PTB ^{II}	4.9 ± 1.9		S / E ⁹⁴	<u>s</u>		
ELAV1	9.6 ± 3.4		S / E / N ^{95,96}	<u>s</u>		

Reported dominant effect is bolded. E – Enhancer; S – Silencer; N – Neutral.

Enhancer activity by hnRNP A1 occurs at the junction⁸⁷. ^{II}PTB does not directly enhance splicing, but can do so indirectly by preventing the binding of splicing repressors⁹⁴.

cell lines, followed by RT-PCR. These assays were, in some cases, accompanied by other techniques such as direct sequencing of cDNA, Western blotting, luciferase expression assays or immunostaining. A number of studies used quantitative RT-PCR or real-time PCR to estimate isoform abundance. RNA or cDNA sequencing and exon expression microarrays were also used in several studies to support in silico predictions. Certain functional assays that we reviewed were unique to a single study, including: allelic instability, exon trapping, immunoprecipitation of splicing factors, and flow cytometry^{26,100–102}. Other indirect methods of justifying the association between a splice site variant and disease included fundoscopy, loss of heterozygosity, blood protein levels, and segregation with disease 103-106. Because a variant may result in aberrant splicing but might not be accompanied by a detectable phenotypic change, we excluded the results of indirect assays of phenotype. Indirect measures of phenotype can support disease association, but do not inform about accuracy of splicing prediction.

Endpoint RT-PCR and minigene assays probe the specific variant in question, but do not reveal relative abundance of each isoform, whereas qPCR does. Neither method resolves mRNA sequence at the nucleotide level, which can fail to confirm predicted splicing mutations, especially in instances where a small number of nucleotides are retained at the constitutive splice junction¹⁰⁷. The resultant frameshifted mRNAs can cause premature truncation of the transcript (PTC), instability, and NMD, leaving no evidence of the mutated isoform (unless the cells had been treated with an NMD inhibitor). A disadvantage is that in cases where the protein is not degraded, but still impaired or dysfunctional, the result will be incorrectly categorized as benign. For example, Wessagowit et al. (2005) used sequencing of a COL7A1 variant (NM 000094: c.341G>T), responsible for recessive dystrophic epidermolysis bullosa, to demonstrate a 87 nt deletion in the cDNA¹⁰⁸. The authors also performed immunostaining of the corresponding protein with a monoclonal antibody, which showed no difference between wildtype and mutant samples because the epitope was not disrupted by the deletion. Had the authors only performed the binding assay, the variant would have likely been disregarded. NMD can be a predominant cause of false-negative results when validating splice variants. When aberrant splicing causes a frameshift and PTC, translation of truncated proteins is prevented, which otherwise can have dominant negative effects or exhibit gain-of-function¹⁰⁹. However, if these transcripts are degraded and only the normal allele is detectable (in the case of a heterozygote or leaky splicing), then the splicing prediction will not be supported. Interestingly, Khan et al. (2004) were able to show that NMD had occurred by comparing levels of total message (qPCR) between wild-type and mutant samples⁵⁰. Experimental methods have been developed to stabilize transcripts with premature termination of translation, thus circumventing NMD. The use of emetine, which inhibits translation and stabilizes RNA transcripts, can increase the relative amount of aberrant transcript observed^{110,111}. However this approach can induce a stress response within the cell and further transcription must be halted using actinomycin D. This combination was used by Bloethner et al. (2008) in an approach called Gene Identification by NMD Inhibition¹¹². Similarly, the use of puromycin and cycloheximide were shown to inhibit NMD and restore predicted aberrant splice forms 100,113.

Furthermore, certain mutations proximate to the penultimate exon evade NMD^{114,115}.

Regulatory sequence variants

A number of assays have been developed to confirm direct effects of variants on splice site recognition, however fewer methods are available to measure effects of mutations at binding sites of splicing regulatory proteins 116. The most reliable approach is to associate a change in splicing with a change in regulatory protein binding. A combination of electrophoretic mobility shift assay and RT-PCR were used to confirm that a predicted change in an SF2/ASF binding site caused exon skipping in the *CFTR* gene responsible for cystic fibrosis 117. Others performed RNA affinity purification in combination with Western blotting 26.

Another approach tests multiple variants at the same position through minigene assays. Anczuków et al. (2008) observed that two variants at the same position in the highly penetrant hereditary breast/ovarian cancer gene BRCA1 (c.3600G>T and c.3600G>C) predicted different effects on regulatory sequences, as well as different observed effects on splicing118. The G>T variant was predicted to abolish a SRp40 site and weakening of an SF2/ASF site by both ASSA and ESEfinder, and showed a significant reduction in the relative amount of normal transcript. The G>C variant, which did not elicit a change in splicing, was not predicted by ASSA to have a significant effect on either site (although ESEfinder predicted weakening of the SRp40 site below its default threshold). The difference in splicing efficiency could be due to the loss of binding by one or both of these regulatory proteins. This assay associates predicted changes to regulatory protein binding site strength to changes in splicing. A direct binding assay would lend key support for such predictions.

Accuracy of IT-based prediction

We previously evaluated the accuracy of IT-based prediction using a set of validated splicing mutations (85.2%; N = 61)²⁸. Other studies have also evaluated the accuracy of ASSA/ASSEDA while evaluating differences between multiple predictive programs and have shown varying levels of concordance (68.8%, N = 16; 90.1%, N = 22; 100%, N = 24)^{54,107,119}. With a comprehensive list of all published variants analyzed using IT-based methods (Supplementary Bibliography), we perform a meta-analysis of all of these variants to minimize bias in interpretation and impact of ascertainment of specific phenotypes from individual studies. The list of variants is more extensive than any previous study examining accuracy of IT-based methods. The variants are not restricted to a single or even group of diseases, but rather cover over 150 different conditions (see Supplementary Table 2).

In total, 905 variants were reported in 122 different publications to have been validated for their effects on splicing (1,727 total variants analyzed from 216 papers – Supplementary Table 11). In all cases, the authors performed information analysis; however, the validation experiments were sometimes contained in the original reports and in other cases, later studies. In a minority of mutations, the validation results were either uninformative (N=36) or the methods did not directly imply an effect on splicing (N=2); these mutations

were therefore excluded in determining the accuracy of predictions (shaded in grey in Supplementary Table 11).

More specifically, in order for experimental results and predictions to be considered concordant, one or more of the following criteria had to be met:

- a. A variant predicted to abolish a splice site did abolish splicing, with no residual splicing observed. Exceptions to this were assays in which both the mutant and wild-type alleles were expressed in the same cell line or patient sample, and could not be discriminated from one another (i.e. RT-PCR);
- A variant predicted to be leaky exhibited residual normal splicing, with the exception of cases where a much stronger cryptic splice site was activated;
- A variant that strengthened the natural site and showed normal or increased levels of the wild-type isoform, consistent with it having a benign phenotype and/or polymorphic;
- d. A variant predicted to activate a pre-existing splice site, while also reducing the natural splice site strength, was demonstrated experimentally to result in cryptic splicing, regardless of whether it was predicted it to be the predominant isoform;
- e. A variant predicted to affect a splicing regulatory proteinbinding site was consistent with validation experiments explicitly assessing binding affinity and associated splicing alterations.

Cumulatively, 87.9% of variants documented by expression studies (762 of 867) that satisfied these criteria were accurately predicted by ASSEDA. A minority of papers reported variants to be "partially concordant" (3.1%; 27/867), meaning that while the cryptic site observed was predicted, it was not the most likely splice isoform relative to other predicted cryptic exons. Because this method of scoring met our criteria (see point d above), we included these in our determination.

Predicted mutations discordant with validation results

Limitations of both the predictive model and the validation data/ methods were the primary reasons for discordance. Where information analysis predicted a neutral change or no effect, but validation showed aberrant splicing, we hypothesize that there are either unrecognized splicing regulatory protein binding sites that are weakened or abolished, or that there are underlying mechanisms that are not currently addressed by current information models^{26,38,53-55,57,99,101,102,117,120-130}. The validation methods used can also contribute to discordant results. We note that 41 discordant results originated from one of our own studies44. This study used RNAseq data to validate predictions, a genome-wide approach that should be used with caution when inferring changes resulting from potential splicing mutations. Until this study was published, IT-based mutation analysis was based on single or candidate disease gene studies. RNAseq reveals all changes in transcript levels for all genes, which although potentially relevant to splicing, may not necessarily contribute to the phenotype in question. This leads to the possibility, especially in cancer phenotypes, of bystander effects (global splicing dysregulation, natural alternative splicing) that are not directly attributable to

the predicted mutations. Furthermore, because the sequence reads at splice junctions are short, and often limited in number, a relevant splicing aberration may result from a given variant, but it was not detectable. Finally, the predictions of IT can pick up variants that should alter splicing for example, of rare recessive alleles, that may not have any disease relevance.

Misinterpretation of variant effects

While preparing this review, several variants misinterpreted with IT-based tools were noted. These variants have been re-analyzed to disseminate the correct findings and to avoid making similar errors in the analysis of newly discovered variants. Supplementary Table 2 contains these results. The most common problems result from unfounded emphases on altered or pre-existing cryptic sites that are determined to be significantly weaker relative to the cognate natural site 112,131-135, and from selectively reporting a single change in the R_i value when, in fact, multiple significant changes can be detected^{51,131,136-139}. An example of the first type of error is exemplified by a variant in CGI-58 (ABDH5) in a patient with Dorfman-Chanarin syndrome, where the natural splice site is 9.1 bits (or \geq 549-fold) stronger than the reported cryptic site¹³². Henneman et al. (2008) selectively reported the effect of a mutation that weakens a natural donor splice site in APOA5 and is thought to cause hypertriglyceridemia, however only a change in the information content of an SC35 binding site was indicated¹³⁹.

Other common problems include incorrect declaration of small ΔR_i values as significant changes 112,140,141 , use of incorrect $R_{i,min}$ values 142,143 , and the computation of predicted binding strength changes on a linear scale¹⁴⁴ rather than the correct exponential function (i.e. $\leq 2^{\Delta Ri}$)²¹. Smaoui et al. (2004) described an 8.0 bit donor site as weak, which is actually equivalent in strength to $R_{sequence}$, the average strength³⁶. Allikmets et al. (1998) and Ozaltin et al. (2011) both described an inactivating mutation as leaky, because the weakened site remained above the $R_{imin}^{56,137}$. However, the variant mutation produces a site with < 0.7% of its original binding affinity, which would substantially reduce exon recognition and lead to exon skipping¹¹⁶. Also, cryptic sites created in the promoter regions of genes should not be considered to be splicing mutations¹⁴⁵. Variants that are predicted to create a cryptic site upstream or overlapping a natural site of the opposite polarity (i.e. cryptic donor upstream of a natural acceptor) have been reported^{134,135,146}, which would be inconsistent with established splicing mechanisms³⁸. A rare exception that could render such a site active is to the creation of a cryptic exon that occurs in conjunction with a proximate, correctly oriented, pre-existing cryptic splice site of opposite polarity^{25,33}. Insufficient numbers of examples of mutations creating cryptic exons have been reported to date for ASSEDA to accurately predict these exons by default.

Several results were generated by incorrect entry of mutations into ASSA/ASSEDA. For example, altered cryptic splice sites have been confused with natural sites^{51,140,147,148}. Additionally, 'residual binding strength' displayed has been misinterpreted as a percent decrease^{147,149}. Strong, pre-existing cryptic sites outside of the default sequence analysis window (54 nt circumscribing the mutation) have also been missed because the window was not expanded to include these sites¹⁵⁰. Although the predicted isoform structure generated by ASSEDA will, by default, display skipping for mutated natural sites with $R \ge -7.0$ bits (or ≥ 128 -fold)¹¹⁶, smaller decreases in natural site

strength of an internal exon can sometimes partially induce exon skipping. This value is adjustable, and it may be advisable to explore different thresholds depending on the particular susceptibility of a splice junction to exon skipping. Sharma et al. (2014) used the default threshold from ASSEDA to interpret CFTR mutations c.2988G>A (9.6 to 6.6 bits, natural donor site of exon 18) and c.2657+5G>A (9.1 to 5.6 bits, natural donor site of exon 16), but exon skipping was documented54. IT analysis was not discordant for these variants, which significantly weaken the corresponding splice sites by ≥8- and 11-fold, respectively, and has been shown in other genes to lead to exon skipping, leaky splicing, or both of these outcomes. Aissat et al. (2013) tabulated variants that were predicted to affect strengths of ESE binding sites, but did not comprehensively report all findings even though predictions by ASSA and ESEfinder were concordant (eg. CFTR: c.1694A>G). Alternate mutation entry methods, which do not use contextual gene name annotations, such as entry by rsID, report predicted binding changes on both strands. And in a study of hereditary Alzheimer's disease, the abolition of SRp40 binding sites on the antisense strand was confused with binding sites for CYP46A1, which is transcribed from the sense strand¹⁵¹.

Other problems include inadvertent mislabelling of splice site type or location $^{152-154}$, interchange of the terms information content and change in information (R_i and $\Delta R_i)^{125}$, and unclear variant interpretation (i.e. "run on into the intron") 155 . Moriwaki $et\ al.$ (2009) claim ASSA did not predict a mutated natural donor site, but in fact, the site was present in our reanalysis 156 . Published R_i values from Rogan $et\ al.$ (1998) and von Kodolitsch $et\ al.$ (1999) are in some instances different from current values due to updates of the reference genome sequence 25,157 . Nevertheless, the overall predicted effect did not change, but initial and final R_i values were inconsistent. Interpretations of certain mutations could not be reproduced in some instances $^{106,148,158-160}$. Finally, we noted that ASSEDA can sometimes improperly parse indels entered using c. or IVS notation. Such errors have led to published false results 70,119,161,162 .

Interpretation of published variants in studies that use information analysis

Genotype-phenotype association

The severity of phenotype due to splicing mutations can be related to their effects on mRNA splicing, after careful consideration of the overall impact on mRNA levels and protein coding¹⁶³. Significant information changes (where $\Delta R_i \ge 7.0$ bits or where $R_i \le 2.4$ bits) of splicing variants in hemophilia patients (F8C and F9) were shown to correspond to the severe clinical phenotypes of the disease (reduced protein activity, increased clotting time, bleeding frequency)¹³⁰. The overall effect on the coding potential of the mutated transcript should be considered, as skipping events that maintain the reading frame commonly lead to milder phenotypes 105,164,165. Nevertheless, two variants that abolish splice site recognition in PTPRO in Idiopathic Nephritic Syndrome reported by Ozaltin et al. (2011) had similar phenotypes even though one retained the reading frame and the other caused a frameshift⁵⁶. The exon deleted by the in-frame skipping event is highly conserved⁵⁶. Exon skipping events that cause frameshifts close to the carboxy-terminus may lead to mild phenotypes, as they avoid NMD115,166. Dominant negative mutations with either $R_i > R_{i,min}$ or with modest decreases in ΔR_i , may be less likely to cause severe phenotypes, as a residual amount of the natural isoform continues to be expressed ^{106,120,144,157,167–170}. The impact of cryptic site-activating variants on phenotype can be similarly assessed. Activated cryptic sites which shift the reading frame have been shown to be more severe clinically relative to those which maintain the same reading frame as the native gene ^{105,108,171,172}.

IT-based tools exhibit high specificity for analysis of splicing neutral variants in hereditary breast/ovarian cancer and other disorders¹¹⁹. These predictions can reduce the requirement for experimental validation of low-priority candidate mutations with minimal changes in information content^{17,25}. IT analysis has been used in numerous studies to infer neutral effects of variants^{17,37,100,112,119,122,131,132,154,160,161,173–187}. Similarly, variants that strengthen natural splice sites^{188–190} are also likely to be neutral, though these variants can increase retention of exons that are otherwise frequently alternatively spliced^{191,192}. However, binding site variants with minimal splicing information changes may still alter mRNA processing by disrupting mRNA secondary structure¹⁹³.

Polymorphisms and splicing

Early studies suggested that common polymorphic sequence variations at splice sites corresponded to small ΔR values, consistent with these changes having little impact on mRNA abundance²⁵. More recently, it has been appreciated that certain rare SNPs have significant genetic loads, can actively alter mRNA splicing profiles, and lead to non-obvious splicing phenotypes^{61,191}. Nevertheless, it is not uncommon for reports to solely analyze novel variants and ignore known SNPs^{139,160,162,194}, or limit results only to those that occur in the vicinity of natural splice sites 186. We find that 56.4% of common SNPs (with population frequencies $\geq 1\%$ in Supplementary Table 2) within natural sites significantly alter their strength (12.8% abolish and 28.2% cause leaky splicing, 15.4% modestly strengthen sites [ΔR_i < 2.6 bits]), and 43.6% have insignificant ΔR_i values, as expected (N = 39). The mean $R_{i,final}$ and ΔR_i values, for these natural sites are 7.9 \pm 4.0 bits and -1.4 \pm 3.0 bits, respectively, which suggests the effects of these polymorphisms on splicing are nil to limited. However, polymorphisms can significantly modulate splicing, as some common SNPs are predicted to abolish natural splicing (Supplementary Table 2: #1291, 1296, 1431, 1435, and 1436). These include rs10190751 in CFLAR, which modulates the production of two short isoforms, and is associated with an increased risk of lymphoma 191,195, rs3892097, which alters exon inclusion in CYP2D633 and leads to a non-functional protein and altered drug metabolism¹⁹⁶, and rs1805377 in XRCC437, which has been associated with oral cancer susceptibility¹⁹⁷ and increased risk of gliomas¹⁹⁸. There is also experimental support for common SNPs that have been predicted to affect splicing^{25,101,110,113,117,121,152,167,191,199}. For example, experimental evidence for increased exon inclusion has been described for three of six SNPs that increase strength of natural splice sites 191,192. Numerous common SNPs, which were either deemed neutral or predicted to affect splicing, have not been confirmed experimentally^{17,25,28,37,55,97,102,134,136,147,148,151,154,157,168,169,181,185,187,190,200–210}. Polymorphisms with significant information changes should be investigated, as they may not be completely benign and can have a significant impact on mRNA splicing.

Inference of variant pathogenicity by IT analysis

Recently, American College of Medical Genetics and Genomics recommendations for reporting incidental findings in sequencing have suggested that bioinformatics predictions are not sufficient to declare clinical significance²¹¹. Preceding the publication of these guidelines, numerous peer-reviewed articles suggested variants analyzed by IT to be causative/pathogenic/disease-causing, without confirmation of the predicted splicing effect 104,138,140,153,164,170,180,207,212-220. Other authors have qualified the interpretation of bioinformatic results with less certain terms (i.e. 'suggest' and 'likely' pathogenic)^{113,115,178,221-225}. Leclerc et al. (2002) state that a predicted variant confirmed to affect splicing is likely deleterious, but could not be unequivocally shown to cause the observed phenotype¹⁶⁹. Although IT predictions can relate a sequence change to the resultant phenotype, caution should be exercised when deeming a predicted splicing variant as pathogenic in the absence of other functional evidence. The high level of concordance between IT mutation analysis and experimental findings indicates that this approach, in conjunction with other evidence, can be used to detect splicing effects, which may be used to explain disease phenotypes.

Comparisons to other software programs

There are now over a dozen other publically available splicing prediction tools, some using strategies similar (MaxEntScan [MES]) and others, which are quite different (NNSplice) that are compared with IT^{226,227}. Vreeswijk *et al.* (2009) assessed the applicability of different splice prediction programs to diagnose *BRCA1/2* variants¹⁵⁰. These authors recommended that the outcome of 3 programs was sufficient for analysis, unless all three predictions were discordant from one another (2 for false positive predictions). Despite the obvious appeal of consensus between different analytical methods, a major caveat in using polling strategies for mutation assessment is that these approaches are prone to both systematic and sampling errors⁴³.

prediction tools and one or more alternate prediction tool (14 for 5′ and 3′ splicing, six for splicing regulatory proteins) to assess mutations^{26,42,100,102,106,114,117–120,126,133,135,144,150,160,162,168,169,173,181,187,191,199,212,220,228–237}. The analysis performed by the authors allowed us to compare the similarity of predictions to those programs and IT in Table 2a and Table 2b. Those most commonly used for 5′ and 3′ splice sites (NNsplice, MES, NG2, HSF and SSF) were highly concordant for natural sites (85.4% for donor and 77.6% for acceptor sites; Table 2a). Discordance of acceptor predictions may be due to methodologies that do not analyze the complete acceptor site (HSF analyzes only 14 intronic nucleotides upstream of acceptor splice

sites)²³⁸. Some programs (SSF, HSF) exhibit greater concordance

We summarize results of 36 publications that used both IT-based

with IT for cryptic splice site prediction (96% for donor and 76.9% for acceptor sites). The level of discordance between IT and other commonly used software programs (59.5% for donor and 60% for acceptor sites) may be attributable to the empirically-derived scoring thresholds and the validation sets used to predict mutated splice sites. Models that are typically built (or trained) using known natural splice sites may be less sensitive for differentiating true cryptic splice forms from decoys in the genome, which tend to be weaker than natural splice sites. Tools are highly consistent when analyzing variants expected to be neutral with respect to splicing (100%; N = 71). Colombo *et al.* (2013) compared nine programs to evaluate accuracy in predicting mRNA splicing effects and reported that ASSA, along with HSF, demonstrated 100% informativeness and specificity¹¹⁹.

ASSEDA has also been used to analyze RNA binding proteins that enhance or silence exon recognition (Table 2b). ESEfinder was used for 42.2% of these mutations in one or more regulatory binding sites^{239,240}. However, variants predicted by ESEfinder to have deleterious effects are discordant with some IT predictions (6 of 15; Table 2b). The discordance with ESEfinder may be associated with differences in the respective analytic methods, as several of the models (SF2/ASF, SC35, SRp40) used by ASSA and ESEfinder were created from the same source of experimental data^{90,241}. While the majority of the discordant results were cited in a single study¹¹⁴ (5/6 variants), the small size of the dataset (ranging from 28–34 sites) may artificially exacerbate differences between these results. In multiple instances, ASSA has been used to analyze SR proteins, but other programs were used to analyze 5' and 3' splice site mutations^{26,102,118}. This was surprising, since the donor and acceptor R, values are generated by default by ASSA and ASSEDA. The advantage of performing both constitutive and regulatory splice site analysis with IT is that all results are reported on the same scale, and the strengths of all interactions, and effects of mutations are directly comparable to one another.

Other applications of information theory-based splice site analysis

The use of IT to analyze splicing is not limited to sequence variant analysis. The natural and alternative splicing of several genes have been characterized using this method^{110,202,242}. Khan *et al.* (2002) scanned all natural sites in the *XPC* gene and found a weak acceptor (-0.1 bits), and with RT-PCR found that this exon (exon 4) was skipped to a greater extent than another (exon 7), which possessed a strong acceptor, illustrating a relationship between the information content of a natural splice site and its level of alternative splicing¹¹⁰. IT has also been used in genetic engineering in the design and alteration of binding sites, and has been used in the design of

Table 2a. Concordance of splice-prediction programs to information theory-based tools for natural and cryptic sites.

	MES ¹	BDGP ¹	NG2 ¹	HSF	SSF ^{1,2}	SSqF ¹	GS	sv	SP	SS	GenS	ASD	GeneS	GM
Nat. Donors	42/48	37/39	24/32	23/28	25/27	15/18	6/11	9/9	5/8	2/2	1/2	1/1	1/1	-
Nat. Acc.	21/26	14/19	14/20	12/16	15/18	9/11	3/5	4/5	3/5	-	-	-	-	-
Cryp. Donors	16/24	4/8	5/10	16/17	8/8	0/7	2/2	-	-	-	0/1	0/1	-	-
Cryp. Acc.	7/13	2/3	3/4	8/11	2/2	2/2	-	-	-	-	-	-	-	0/1
Neut. Mut.	31/31	8/8	4/4	26/26	-	-	-	-	-	2/2	-	-	-	-

Table 2b. Concordance of splice-prediction programs to information theory-based tools for splicing regulatory proteins.

	ESEfinder ^{3,4}	Rescue-ESE	Ex Skip ^{3,4}	ESEsearch	PESX
ESEs (all types)	9/15	3/4	4/14	2/3	1/1
Neut. Mut.	4/4	1/1	3/3	-	-

Concordance was assessed from the analysis of variants from 36 publications which used IT-based tools and a secondary predictive method. Each value corresponds to the number of variants that were concordant with IT-based tools versus the total number of variants for each category. ¹ – includes Vreeswijk *et al.* (2009), which may not have properly reported predicted cryptic sites, as they did not report any cryptic sites predicted by ASSA beyond the default window size (54 nt) from the mutation¹50. ² – predictions made using the SSF-like algorithm in the Alamut splicing prediction module were combined with the SSF category (SSF is no longer supported). ³ – Aissat *et al.* (2013) contributes highly to the discordance of these programs, and may be due to improper reporting/analysis¹¹7. ⁴ – Mutations predicted by alternate program to affect SR protein to which ASSEDA has no model (i.e. 9G8) were not included in statistics.

MES – MaxEntScan; BDGP – Splice Site Prediction by Neural Network, NNSplice; NG2 – NetGene2; HSF – Human Splice Finder; SSF – Splice Site Finder; SSGF – Splicing Sequences Finder; GS – GeneSplicer; SV – SpliceView; SP – Splice Predictor; SS – Shapiro-Senapathy; GenS – GenScan; ASD – ASD-Intron analysis; GeneS – GeneScan; GM – GeneMark; PESX – Putative Exonic Splicing Enhancers/Silencers.

constructs for transgenic animal models^{243–245}. Thus, IT-based splice site analysis can be adapted for other important molecular genetic applications.

Guidelines for information theory-based splicing mutation analyses

Our comprehensive review of the use of IT in splicing mutation analysis has led us to propose general recommendations, which we formulate as guidelines. Adoption of these guidelines should ensure the accurate and comprehensive results from IT analyses of VUS and other pathogenic variants that alter mRNA splicing.

Report gene isoform and genomic coordinates

When analyzing a variant with ASSEDA, the user is prompted to select an mRNA isoform (GenBank or RefSeq accession) from the gene in question. When entering the same variant (in either IVS or c. notation) for different isoforms, either the variant will parse one but not the other representation, or the variant syntax will be processed for both. In the first situation, the user is prompted to verify the position and substitution, which may elicit the realization that the incorrect isoform had been selected. However, in the case where the variant can still be parsed (despite being incorrectly entered for the isoform selected), an incorrect nucleotide may co incidentally have the same sequence, and the user may not necessarily realize that the intended position is not being analyzed. We were unable to reproduce results for several variants, because the mRNA or gene isoform was not reported. This issue could be resolved by comparing the genomic sequence in papers where the context of the mutation was included^{53,98,144,181,246–248}. Where flanking sequences were unavailable, the location of the mutation was inferred from either descriptions in the text, the corresponding R_i value of the splice site, or relative coordinate numbering 147,249,250. Although we attempted to reproduce all the results, this was not always possible if the specified sequence was ambiguous or the source was deprecated (GenBank accession numbers, BAC clones, etc.)^{51,100,174,181,182,210,229,234,251,252}.

We note that ASSA/ASSEDA cannot account for genes with redacted exons, where the exon numbering or sequence in the original mRNA accession has not been corrected. A well-known example is *BRCA1*, for which the constitutive isoform lacks the exon designated as number 4. IVS notation beyond this point in this gene must be reduced by one intron. Alternatively, one of the HGVS-approved methods can be used to input variants, or the variant can be designated with the genomic coordinate (g.) format. Review of ASSA/ASSEDA output (coordinates and/or the sequence walker²⁰) is a prudent approach to confirm that the correct region has been analyzed.

To eliminate ambiguity, we recommend that reported variants be accompanied by the accession number used in its analysis (consistent with HGVS notation³⁹) and the genomic coordinates with the corresponding reference genome build. The table of results from ASSEDA or Shannon pipeline output could also be included as supplementary published material. This will ensure that reported results can be reproduced and compared to other experimental or *in silico* results.

Report R, values

The results generated by IT software provide $R_{i,initial}$, $R_{i,final}$, and ΔR_i for donor and acceptor sites by default, and for all other ribl matrices selected. Reporting these values along with the interpretation improves the clarity of said interpretation. Several publications have not reported R_{i} , and instead only the interpretation of these values 128,141,149,214,229,253,254. This presumes that the analysis was performed correctly, and accurately interpreted. In one instance, our reanalysis differed from the published interpretation¹⁴¹. Other publications provide R_i values, but were incorrectly reported, which resulted in misinterpretations^{51,125}. Simply reporting ΔR itself does not provide sufficient information about the context of the mutation or possible cryptic splice sites, which is necessary to fully appreciate the resultant effect on splicing 139,247,255 . We recommend R, values be provided for each variant analyzed. We also suggest that the specific donor and accept or ribl used for variant analysis be indicated, because of the differences obtained using the genome-wide and original PWMs in IT analysis^{33,36}. The distinction can also be significant, when the $R_{i,final}$ value of a mutated splice site approaches $R_{i,min}$.

Consider impact of missense and synonymous mutations on mRNA splicing

Missense and synonymous mutations can alter natural splicing, create cryptic sites, and alter crucial ESE and ESS binding sites²⁵⁶. IT tools have been employed to analyze exonic variants that strengthened or create exonic cryptic sites, which were also confirmed experimentally^{28,42,44,46,101,108,119,127,133,152,154,180,257,258}. Similarly, IT tools can predict potential effects on strengths of SR and hnRNP protein recognition sites^{26,120}. There is no justification for cataloguing intronic and exonic variants, but only assessing splicing effects for the intronic variants or those within natural splice sites^{122,135,177,188,210,212,216,217,250,259,260}.

We recommend that IT-based analysis should evaluate all variants within a gene for potential splicing mutations.

Experimentally validate variants

Many studies have reported only coding changes and the results of IT (or other *in silico*) analyses without experimental validation. Our review indicated that IT-based splicing predictions are highly concordant with validation results (87.9%). Nevertheless, the discordant mutations support the need for robust post-prediction validation, since even a single discordant result can lead to misdiagnosis. We do not detect any consistent pattern amongst the discordant predictions to provide guidance as to which IT analyses will be erroneous. Experimental verification will mitigate incorrect interpretations of IT predictions and has been recommended by others²⁹.

Report the sequence window used in the analysis

ASSA/ASSEDA allows the user to alter size of sequence window range surrounding the mutation. The default window range has been set to maximize the speed of analysis, which is to some degree dictated by the number of matrices and the length of the sequence analyzed. Arbitrary abbreviation of the sequence analysis window can result in the failure to detect activated intronic or exonic cryptic sites, which can in some instances significantly lengthen (eg. 231 and 313 nucleotide extensions, respectively^{166,171}) or shorten the corresponding natural exon. Therefore, we suggest expanding this window if one wishes to assess the possibility that long range, pre-existing cryptic splice sites may be activated.

We note that unequivocal prediction of cryptic splice site use in large exons (> 1000 nt) can be challenging due to the reliance of these gene regions on splicing enhancers, silencers, and other regulatory elements to prevent ectopic splice site use and ensure fidelity of splicing²⁶¹. In a case of familial hypobetalipoproteinaemia, Di Leo *et al.* (2007) determined a variant abolishing the natural acceptor for exon 26 of *APOB* (7572 nt long), causing the activation of a weak cryptic site 1180 nt downstream²⁶². There are several other stronger candidate cryptic splice sites that occur between the natural and cryptic splice site, but there is no evidence that any are used in the individual carrying this mutation.

Designate genic rearrangements (insertions, deletions, duplications) with genomic coordinates

Complex insertions and deletions in IVS or c. notation may occasionally be parsed to the wrong coordinates within a gene. Indels will parse properly when genomic coordinates are used. If IVS or c. notation is used, it is suggested that users confirm that the expected alteration of the mutation is correct by reviewing the sequence walker display generated by ASSEDA for all insertions, deletions and duplications.

Dataset 1. New dataset for mRNA splicing mutations in genetic disease

http://dx.doi.org/10.5256/f1000research.5654.d43956

Dataset for mRNA splicing mutations in genetic disease. All data from the extensive review of the literature presented in the article are reported as Supplementary tables 1 through 10. The following data are provided: 1) articles referring to information theory as a tool for splice site mutation analysis; 2) complete list of reviewed variants; 3) indels, duplications and multinucleotide variants; 4) deleterious natural site variants; 5) splicing mutation calculator data; 6) Benign Natural Site Variants; 7) branch-point variants; 8–10) Types 1–3 cryptic splice site variants; 11) validated variants.

Data availability

F1000Research: Dataset 1. New dataset for mRNA splicing mutations in genetic disease, 10.5256/f1000research.5654.d43956²⁶³

Software availability

Software access

The Splicing Mutation Calculator (SMC) is available at http://splicemc.cytognomix.com.

Latest source code

https://github.com/F1000Research/splicemc

Archived source code as at the time of publication http://dx.doi.org/10.5281/zenodo.15692²⁶⁴

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Author contributions

PKR conceived, coordinated, and directed this study. NGC compiled the literature and determined which articles were eligible for inclusion. NGC and EJM summarized the articles. NGC, EJM and PKR wrote the manuscript, which has been approved by all authors.

Competing interests

PKR is the inventor of US Patent 5,867,402 and other patents pending, which underlie the prediction and validation of mutations. He is one of the founders of Cytognomix, Inc., which is developing software based on this technology for complete genome or exome splicing mutation analysis.

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Supplementary material

Supplementary file containing Supplementary Figure 1 and Supplementary Bibliography.

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Open Peer Review

Current Referee Status:





Version 1

Referee Report 09 February 2015

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Klaas Wierenga

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The paper by Caminsky *et al.* is a welcome and timely review of the complexities of pre-mRNA splicing, the relationship between splicing mutations, detection thereof by IT and/or laboratory, and new challenges posed by next generation sequencing.

It is a rather lengthy and somewhat intimidating review, and I can imagine that many readers, even interested ones, may not make it all the way to the end, certainly not in one session. On the other hand, the review paper is likely to reside on the desk of molecular laboratory directors and and other genetics professionals with an interest in the molecular aspects of genetics.

The review is well written, and the order to topics discussed is logical. Maybe the introduction to splicing is a little short, e.g. little space is dedicated to discussing the spliceosome. The review of the various splice 'sensing' software, and the technology underlying these was in depth.

The relationship between IT predicting splice mutations and laboratory studies to confirm the actual results of aberrant splicing was very well done, and the discussion of NMD and other causes of technical issues relating to demonstrating mutant mRNA resulting from splicing mutations was delightful.

The discussion about laboratory standards (also related to ACMG recommendations) regarding splicing was excellent.

Lastly, the discussion of the impact of splicing mutations and IT in the era of large datasets, including NGS was concise and accurate.

In summary, this review ought to be mandatory reading for all genetics professionals in molecular laboratories, incl. those involved in whole exome/genome sequencing.

The figures were well-selected, and the tables were helpful.

One minor remark: I would mention PLP1 as the gene associated with Pelizaeus-Merzbacher disease (p6, R, middle para).

I have read this submission. I believe that I have an appropriate level of expertise to confirm that it is of an acceptable scientific standard.



Competing Interests: No competing interests were disclosed.

Author Response 27 Feb 2015

Peter Rogan, University of Western Ontario, Canada

- 1. While we agree that a detailed understanding of the mechanisms underlying splicing is important to include, we have opted to guide the reader to other pertinent reviews on the spliceosome and relevant mechanisms, so as to not extend the length of this already lengthy article (modifications have been made to the Introduction p.3 second paragraph on left panel). We do not discuss this in detail later on in the review. We have chosen to provide more details on components and processes of splicing that we later discuss in our review, such as splicing regulatory factors, donor and acceptor sites, the branch-point, etc.
- We have stated that *PLP1* is the gene associated with Pelizaeus-Merzbacher disease (p6, R, middle para). This prompted us to do the same for other diseases and genes that were mentioned throughout the text including: *NF1* (neurofibromatosis type 1 disease p.3 and p.13), *MSH2* (hereditary nonpolyposis colon cancer p.3), *XPC* (xeroderma pigmentosum p.9), *MYBPC3* (hypertrophic cardiomyopathy p.9), *COL7A1* (recessive dystrophic epidermolysis bullosa p.15), *CFTR* (cystic fibrosis p.15), *BRCA1* (hereditary breast/ovarian cancer p.15), *CGI-58* (Dorfman-Chanarin syndrome p.16), *APOA5* (hypertriglyceridemia p.16), *CYP46A1* (Alzheimer's disease p.17), *APOB* (familial hypobetalipoproteinaemia p.20).

Competing Interests: No competing interests were disclosed.

Referee Report 18 December 2014

doi:10.5256/f1000research.6038.r6917



Matthias Titeux

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The manuscript by Caminsky *et al.* reviews the use of Information Theory (IT) based tools to predict splicing and splicing defects and their possible consequences on the matured transcripts. It is well written and well organized to guide the reader.

Following an introduction covering the basics of the splicing mechanism and signals on the pre-mRNA used by the spliceosome to define the exonic and intronic sequences, the authors described the mathematics behind *in silico* prediction and then focus on the use of their tools (ASSEDA, SMC and Shannon pipeline) and their evolution over the past decade. They review the possibilities and limitations of such tools and compare them to other splicing prediction softwares (HSF, SSF, NNsplice, ESEFinder, RESCUE-ESE...).

Over the years, IT-based splicing predictions have made progress and the overall rate of predictions concordant with experimental validations is around 88%. It has thus become a valuable tool for geneticists and molecular biologists. The authors also list the most common mistakes made by researchers while using their tools, and the ways to avoid them. They also stress the difficulties in predicting the consequences of splicing defect in particular cases due to poorly defined ESE/ESS



sequences, combinatorial effects of splicing regulatory proteins (SR proteins and hnRNPs) and large exonic sequence which contains a large number of cryptic donor and splice sites and thus their definition is dependent on the binding of these regulatory proteins.

The manuscript is therefore of great importance for people that use such splicing prediction software as it presents their possibilities, limitations and the best way to report the results. Experimentally validated variants, associated with their predictions(should the authors properly report how the prediction was performed) will help to refine the tools.

Such *in silico* tools are even more valuable in a genomic era where large number of variants are identified by deep sequencing (exomes, whole genome sequencing...) some of which being of unknown significance. Adding better splicing defects prediction (apart from the 2 bp most conserved in the natural splice sites) to the filters used in the prioritization pipeline of next generation sequencing projects should be considered.

I therefore recommend the manuscript for indexation without reservations, if small minor issues listed below can be addressed.

Minor issues:

- Figure 5 is not called in the text.
- Since the journal uses a numbered formatting style for the references, please add the number of the reference in sentences like "Smaoui *et al.* 2004 described...." (page 17), since it is easier to find the given reference among over 260.
- In the supplementary table 2, in the column "concordance (Y/N)" there is in some cases a "P" indicated whose meaning is not clear.

I have read this submission. I believe that I have an appropriate level of expertise to confirm that it is of an acceptable scientific standard.

Competing Interests: No competing interests were disclosed.

Author Response 27 Feb 2015

Peter Rogan, University of Western Ontario, Canada

- 1. We have included a paragraph describing Figure 5 (p. 12, right panel).
- 2. We have included a numerical reference at the end of each sentence that contains a cited reference in the text.
- 3. Tables that contain the entry "P" in the "Concordance" column has been altered. The column header "Concordance (Y/N/P)*" is described by the key, "Y: Yes; N: No; P: Partial," in the legend.

Competing Interests: No competing interests were disclosed.

Discuss this Article

Version 2

Author Response 25 Nov 2015

Peter Rogan, University of Western Ontario, Canada

The Splicing Mutation Calculator web software associated with this publication has been migrated to the MutationForecaster system (http://mutationforecaster.com).

Competing Interests: MutationForecaster is a subscription-based software product offered by Cytognomix Inc.

Reader Comment 08 Apr 2015

Peter Rogan, University of Western Ontario, Canada

Video tutorials are now available describing how to use and interpret results from the MutationForecaster system. (Credits: Ben Shirley, Shannon Brown).

http://mutationforecaster.com/videos.php

Competing Interests: MutationForecaster has been developed by Cytognomix Inc. As indicated in the article, I am one of the founders of the company.

Version 1

Reader Comment 26 Jan 2015

Roberto Miniero, UMG-Catanzaro-Italy, Italy

The paper is very interesting and well written.

Competing Interests: No competing interests were disclosed.