# Computational prediction of efficient splice sites for *trans*-splicing ribozymes

DARIO MELUZZI,<sup>1,2</sup> KAREN E. OLSON,<sup>1</sup> GREGORY F. DOLAN,<sup>1</sup> GAURAV ARYA,<sup>2,3</sup> and ULRICH F. MÜLLER<sup>1,3</sup> <sup>1</sup>Department of Chemistry and Biochemistry, University of California, San Diego, California 92093, USA

<sup>2</sup>Department of NanoEngineering, University of California, San Diego, California 92093, USA

# ABSTRACT

Group I introns have been engineered into *trans*-splicing ribozymes capable of replacing the 3'-terminal portion of an external mRNA with their own 3'-exon. Although this design makes *trans*-splicing ribozymes potentially useful for therapeutic application, their *trans*-splicing efficiency is usually too low for medical use. One factor that strongly influences *trans*-splicing efficiency is the position of the target splice site on the mRNA substrate. Viable splice sites are currently determined using a biochemical *trans*-tagging assay. Here, we propose a rapid and inexpensive alternative approach to identify efficient splice sites. This approach involves the computation of the binding free energies between ribozyme and mRNA substrate. We found that the computed binding free energies correlate well with the *trans*-splicing efficiency experimentally determined at 18 different splice sites on the mRNA of chloramphenicol acetyl transferase. In contrast, our results from the *trans*-tagging assay correlate less well with measured *trans*-splicing efficiency. The computed free energy components suggest that splice site efficiency depends on the following secondary structure rearrangements: hybridization of the ribozyme's internal guide sequence (IGS) with mRNA substrate (most important), unfolding of substrate proximal to the splice site, and release of the IGS from the 3'-exon (least important). The proposed computational approach can also be extended to fulfill additional design requirements of efficient *trans*-splicing ribozymes, such as the optimization of 3'-exon and extended guide sequences.

Keywords: group I intron; ribozyme; trans-splicing; secondary structure; free energy

# INTRODUCTION

Group I introns are catalytic RNAs (ribozymes) that excise themselves from primary transcripts (Kruger et al. 1982). These ribozymes have been well-characterized both biochemically and structurally, with five high-resolution crystal structures solved to date (Adams et al. 2004; Guo et al. 2004; Golden et al. 2005; Lipchock and Strobel 2008). Furthermore, it has been possible to convert the *Tetrahy*mena cis-splicing group I intron into an artificial transsplicing ribozyme that can modify the sequence of an arbitrary mRNA substrate. This was achieved by removing the 5' portion of the wild-type Tetrahymena group I intron, thus exposing the intron's internal guide sequence (IGS) at the 5' terminus (Inoue et al. 1985; Sullenger and Cech 1994). The resulting ribozyme can hybridize its IGS to a complementary target site on a substrate mRNA, forming a helix equivalent to the P1 duplex in the wildtype intron (Been and Cech 1986; Waring et al. 1986). The ribozyme then catalyzes cleavage of the substrate at the target site and transfer of the ribozyme 3'-exon to the remaining 5' portion of the substrate (Zarrinkar and Sullenger 1998).

The ability to replace a portion of a substrate mRNA with the 3'-exon carried by the ribozyme has created potential roles for *trans*-splicing ribozymes in therapeutic applications (Fiskaa and Birgisdottir 2010). These ribozymes could be used to treat genetic disorders by repairing the sequence of a mutated mRNA (Sullenger and Cech 1994; Lan et al. 1998; Phylactou et al. 1998), to selectively kill cancer cells by splicing a sequence that encodes a toxic peptide into cancer-specific mRNAs (Ayre et al. 1999; Kwon et al. 2005; Lee et al. 2010), and to kill virally infected cells with the same strategy (Ayre et al. 1999; Ryu et al. 2003; Carter et al. 2010).

However, technical difficulties have so far prevented the medical use of *trans*-splicing ribozymes. One problem is the localized and efficient delivery of therapeutic RNAs to the affected tissues (Guo et al. 2010; Gao et al. 2011), though solutions involving viral vectors and modified *Salmonella* strains appear to be promising (Thomas et al. 2003; Bai et al. 2011). Another problem of *trans*-splicing ribozymes is

<sup>&</sup>lt;sup>3</sup>Corresponding authors.

E-mail ufmuller@ucsd.edu.

E-mail garya@ucsd.edu.

Article published online ahead of print. Article and publication date are at http://www.rnajournal.org/cgi/doi/10.1261/rna.029884.111.

their low efficiency in cells. Here, *trans*-splicing efficiency denotes the fraction of target mRNA that is converted to product by the ribozymes. *Trans*-splicing efficiency is typically 10% or less in cells (Fiskaa and Birgisdottir 2010). Although efficiencies of up to 50% have been reported (Byun et al. 2003), the necessary intracellular ribozyme concentrations appear too high to be acceptable in a clinical setting. Therefore, an outstanding task for the development of *trans*-splicing ribozymes is to increase their efficiency, allowing a sufficient fraction of mRNA substrate to be *trans*-spliced at low ribozyme concentrations.

The *trans*-splicing efficiency varies strongly with the location of the splice site within the mRNA substrate (Campbell and Cech 1995; Lan et al. 2000). In particular, secondary structures within the substrate can render potential target sites inaccessible to the ribozyme. The *trans*-splicing efficiency may also vary between splice sites owing to different stabilities of the P1 duplex formed between ribozyme and substrate and to different base-pairing interactions between the ribozyme IGS and the ribozyme 3'-exon. Thus, the identification of efficient splice sites, i.e., those sites that mediate a high *trans*-splicing efficiency, is a nontrivial problem in the design of *trans*-splicing ribozymes.

An elegant experimental method, known as the transtagging assay, has been developed to identify efficient splice sites (Jones et al. 1996). In this assay, the mRNA substrate is incubated in vitro with a pool of *trans*-splicing ribozymes whose IGS is randomized. This pool of ribozymes is thus able to recognize any potential splice site on the substrate. Ribozymes targeting efficient splice sites are able to transsplice at those sites. The resulting products are detected by reverse transcription, subcloning, and sequencing. The sequences from several clones are then used to deduce the positions of efficient splice sites (Jones et al. 1996; Lan et al. 1998; Einvik et al. 2004). This trans-tagging assay has been successfully applied-without explicitly reported limitations-to uncover efficient splice sites on various mRNA substrates (Lan et al. 1998; Watanabe and Sullenger 2000; Rogers et al. 2002; Park et al. 2003; Ryu and Lee 2003; Jung and Lee 2005; Fiskaa et al. 2006; Jung and Lee 2006; Kim et al. 2007).

The problem of identifying efficient splice sites for *trans*splicing ribozymes is, in concept, similar to that of finding accessible or optimal binding sites on mRNA substrates targeted by antisense DNA oligonucleotides (Chan et al. 2006), siRNAs (Shao et al. 2007a; Walton et al. 2010), and other non-protein-coding RNAs (Pichon and Felden 2008). In these cases, several computational methods have been proposed and found to be effective at predicting the relevant target sites (Ding and Lawrence 2001; Wang and Drlica 2004; Far et al. 2005; Shao et al. 2006; Tafer et al. 2008; Backofen and Hess 2010; Thomas et al. 2010). One recurring theme is the use of RNA secondary structure prediction algorithms to calculate the free energy changes,  $\Delta G_{bind}$ , associated with binding an oligonucleotide to each possible target site on the mRNA substrate. Target sites with strongly negative values of  $\Delta G_{bind}$  are then predicted to be the most accessible sites on the substrate (Mathews et al. 1999; Walton et al. 1999; Busch et al. 2008; Lu and Mathews 2008; Tafer et al. 2008).

Here, we have adapted this approach of computing  $\Delta G_{\text{bind}}$  to the problem of finding efficient splice sites for trans-splicing ribozymes. The mRNA of chloramphenicol acetyl transferase (CAT) was used as a model substrate for both computations and experiments. In particular, we computed  $\Delta G_{\text{bind}}$  for all 186 splice sites on this substrate, and we experimentally determined the trans-splicing efficiency in vitro for 18 of those splice sites. Furthermore, to map the accessible splice sites on CAT mRNA, we carried out the trans-tagging assay, which differs substantially from direct measurements of trans-splicing efficiency. Surprisingly, the experimental trans-splicing efficiencies at the 18 tested splice sites were found to correlate better with the computed  $\Delta G_{\text{bind}}$  values than with the results of the *trans*tagging assay. These results suggest that the proposed calculation of  $\Delta G_{\text{bind}}$  could be used to predict efficient splice sites for *trans*-splicing ribozymes more quickly, cheaply, and accurately than with the presently used experimental methods.

# RESULTS

### Calculation of $\Delta G_{bind}$ for *trans*-splicing ribozymes

We defined  $\Delta G_{bind}$  as the free energy change associated with the binding of the ribozyme's IGS to a given splice site on the mRNA substrate. Our hypothesis was that a very negative  $\Delta G_{\text{bind}}$  corresponds to a high *trans*-splicing efficiency. To calculate  $\Delta G_{\text{bind}}$ , the binding process was modeled as consisting of three idealized molecular events that involve only local changes in RNA secondary structure: the unfolding of the target site on the substrate, the release of the IGS on the ribozyme, and the hybridization between target site and IGS to form the P1 duplex (Fig. 1A). The corresponding component free energy changes were denoted by  $\Delta G_{unfold-target}$ ,  $\Delta G_{release-IGS}$ , and  $\Delta G_{hybrid}$ , respectively. By "release" of the IGS, we mean the breaking up of any base pairs that may form between the IGS and the 3'-exon. This release is necessary to make the IGS available for binding to the target site. We thus computed  $\Delta G_{\text{bind}}$  by summing the above components, i.e.,  $\Delta G_{bind} = \Delta G_{unfold-target} + \Delta G_{release-IGS}$ +  $\Delta G_{hvbrid}$ . These components can, in turn, be computed using several available RNA folding algorithms, which predict the possible secondary structures for a given RNA sequence as well as the free energy changes of those structures relative to the unfolded state (Condon and Jabbari 2009).

To compute the components of  $\Delta G_{\text{bind}}$  for *trans*-splicing ribozymes that interact with a long mRNA substrate, we



FIGURE 1. Interactions within and between the mRNA substrate and the ribozyme, and their treatment during computation. (A) Schematic of the substrate binding step in trans-splicing. The mRNA substrate is illustrated as a hairpin structure, and the body of the ribozyme is illustrated as a gray oval. Unfolding of the target site on the mRNA (first step) and release of the internal guide sequence (IGS) (second step) allow the mRNA target site and the IGS to hybridize (third step). (B) The 3D structure of the Tetrahymena ribozyme (Lehnert et al. 1996) indicates that the AAA linker (black) is not stacked on the P1 duplex. Additionally, the 3'-exon (gray) is close enough to the IGS (black) for interactions if the mRNA (gray) is absent. (C) To facilitate computational treatment of the binding process, the body of the ribozyme was replaced by a linker sequence joining the IGS to the 3'exon. This linker does not include the natural AAA linker but consists of five unspecified nucleotides (N), which are ignored in the calculation of base-pairing and  $\pi$ -stacking interactions.

adapted the ribozyme and mRNA sequences before submission to RNA folding algorithms. The 3D model of the Tetrahymena ribozyme (Lehnert et al. 1996) suggests that, before pairing to an mRNA target site, the IGS is sterically allowed to base-pair with the 3'-exon but does not basepair with the body of the folded intron (Fig. 1B). Thus, to calculate  $\Delta G_{release-IGS}$ , we used a ribozyme sequence in which the intron portion downstream from the IGS was replaced by a 5-nt linker region (Fig. 1C). This shortened sequence allowed the IGS to interact with the 3'-exon, while permitting rapid computation of  $\Delta G_{release-IGS}$  by RNA folding algorithms. To choose an appropriate linker sequence, we noted that, in the Tetrahymena group I intron, the IGS is followed by three unpaired adenosines, and the 3'-exon is preceded by one unpaired guanosine (Cech et al. 1994). Although these nucleotides seem natural candidates for inclusion in the linker, the 3D structure of the ribozyme shows that these nucleotides are conformationally prohibited from pairing with the substrate and from engaging in  $\pi$ -stacking interactions with the IGS or

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the 3'-exon (Fig. 1B). Therefore, we chose the linker sequence to consist of five unspecified nucleotides, which are effectively ignored by RNA folding algorithms in the calculation of  $\Delta G_{\text{release-IGS}}$  and  $\Delta G_{\text{hybrid}}$ . Varying the length of the linker from four to seven unspecified nucleotides did not significantly change the computed  $\Delta G$  values (data not shown).

To predict  $\Delta G_{unfold-target}$  from the local secondary structure around each splice site on a long mRNA substrate, we directed the RNA folding algorithms to analyze subsets, or windows, of the entire substrate sequence. Thus, only the sequence within each window containing a given splice site was used to calculate  $\Delta G_{unfold-target}$  for that site. For the 678-nt sequence of our model mRNA (see below), the resulting values of  $\Delta G_{unfold-target}$  were found to vary by >1 kcal/mol over different window sizes (data not shown). This variation may be due to the somewhat arbitrary exclusion of base pairs involving nucleotides outside of a given window. To minimize the influence of window size on the predicted  $\Delta G_{bind}$ , we computed  $\Delta G_{unfold-target}$ using window sizes of 100, 200, 300, 400, 500, and 600 nt, and then we averaged the resulting values of  $\Delta G_{bind}$ .

# Splice sites chosen on a model mRNA substrate, CAT mRNA

As a model mRNA substrate for our computational and experimental investigations of *trans*-splicing efficiency, we chose the mRNA of chloramphenicol acetyl transferase. This mRNA sequence is 678 nt long and contains 186 uridines downstream from the AUG translation start codon. Each of these uridines represents a potential splice site for *trans*-splicing ribozymes (Doudna et al. 1989). We thus computed  $\Delta G_{\text{bind}}$  for each of these splice sites. Figure 2A



**FIGURE 2.** Computed values of  $\Delta G_{bind}$  for splice sites on CAT mRNA. (*A*) Plot of  $\Delta G_{bind}$  against splice site position relative to the adenosine (position 1) of the AUG transcription start codon. Only splice sites downstream from this codon were mapped by the *trans*-tagging assay in this study. Circles with or without a diamond inside indicate splice sites chosen for experimental determination of *trans*-splicing efficiency. Diamonds indicate splice sites found among 66 product sequences obtained by *trans*-tagging assay. (*B*) Distribution of the 186 splice sites (gray bars) of CAT mRNA over the computed values of  $\Delta G_{bind}$ . Black bars represent the 18 splice sites that were chosen for experimental testing. The *topmost* bar represents 61 splice sites and is shown truncated.

plots the resulting  $\Delta G_{bind}$  values as a function of splice site position relative to the adenine of the AUG start codon. These values are distributed over the range from 0 to -6.5 kcal/mol, with most values closer to 0 kcal/mol (Fig. 2B). In particular, only seven out of the 186 available splice sites had  $\Delta G_{bind} < -4.0$  kcal/mol, suggesting that this value of  $\Delta G_{bind}$ could be used as a threshold to predict efficient splice sites.

To determine experimentally whether the computed values of  $\Delta G_{\text{bind}}$  can be used to identify efficient splice sites, we chose a set of 18 different target splice sites on CAT mRNA. To reveal possible correlations between *trans*-splicing efficiency and  $\Delta G_{\text{bind}}$  as well as between *trans*-splicing efficiency and position on mRNA substrate, these 18 sites were chosen to cover the full range of  $\Delta G_{\text{bind}}$  values (Fig. 2B) and were distributed over the length of the CAT mRNA (Fig. 2A). Two splice sites with  $\Delta G_{\text{bind}}$  slightly below -4.0 kcal/mol were omitted in order to cover the wide range of the predicted values for  $\Delta G_{\text{bind}}$  with the available resources.

# Experimental *trans*-splicing efficiencies on CAT mRNA

To measure experimentally the trans-splicing efficiency of the 18 chosen splice sites, we generated 18 trans-splicing ribozymes that contained different IGSs but were otherwise identical. Each IGS was designed to target a particular one of the chosen splice sites (Supplemental Table S1). Each of the 18 ribozymes was incubated with 5'-radiolabeled CAT mRNA, and the reaction products were analyzed by polyacrylamide gel electrophoresis and autoradiography (Fig. 3A). As a measure of trans-splicing efficiency, we quantified the fraction of radiolabeled substrates converted to transsplicing products after 4 h of incubation. Bands consistent with the expected *trans*-splicing products were observed for nine of the 18 tested splice sites, namely for splice sites at uridines 83, 87, 97, 197, 222, 258, 350, 405, and 448. Product fractions for these splice sites ranged from 0.4% of the substrate at uridine 222 to 14.3% at uridine 258 (Supplemental Table S1). Nine of the 18 splice sites did not yield quantifiable products.

The experimental *trans*-splicing efficiencies were found to agree with the computed  $\Delta G_{\text{bind}}$  values (Fig. 3B). In particular, the efficiency of splice sites with  $\Delta G_{\text{bind}} > -4$ kcal/mol was relatively low, reaching, at most, 2.2%. On the other hand, the efficiency of splice sites with  $\Delta G_{\text{bind}} < -4$ kcal/mol increased steadily with increasingly more negative values of  $\Delta G_{\text{bind}}$ , reaching 14.3% at  $\Delta G_{\text{bind}} = -6.1$  kcal/mol. Only the five most efficient splice sites had a computed  $\Delta G_{\text{bind}} < -4.0$  kcal/mol, again suggesting that efficient splice sites could be predicted by comparing the computed  $\Delta G_{\text{bind}}$ to the empirical threshold of  $\Delta G_{\text{bind}} \approx -4.0$  kcal/mol.

To test the identity of the observed *trans*-splicing products, we reverse-transcribed, cloned, and sequenced the products of all nine reactions that had resulted in quantifiable bands on polyacrylamide gels (sequence data



FIGURE 3. Trans-splicing efficiency measured on 18 splice sites on CAT mRNA. (A) Autoradiogram of reaction products from transsplicing reactions with radiolabeled substrate. Lanes are labeled with the targeted splice sites, or with (-) where ribozyme was absent. RNA marker sizes in nucleotides are indicated. The unreacted substrate had a length of 678 nucleotides, whereas the length of reaction intermediates (i) and trans-splicing products (\*) varied with the splice sites. Note that the ribozymes targeting splice sites 405 and 448 also spliced at each other's splice site. (B) Correlation between computed binding free energies and experimental trans-splicing efficiencies. Each diamond represents a specific splice site. Splice sites 131, 240, and 369 have  $\Delta G_{bind} \ge 0$  kcal/mol and are represented by a white diamond at the origin. The data points near or over the  $\Delta G_{bind}$ -axis around the value of -3 kcal/mol correspond, from *left* to *right*, to splice sites 222, 518, 273, 346, 325, 378, and 551. The thick gray line represents a leastmean-squares exponential fit,  $y = A \exp(B x)$ , to the data points, with a coefficient of determination  $R^2 = 0.87$ . Alternatively, a linear fit (data not shown) to the same data points yields a correlation coefficient R = -0.75, with a probability p = 0.00033 that the values are not correlated. Horizontal error bars are standard deviations over three to six different window sizes (100-600 nt). Vertical error bars are standard deviations from three independent experiments.

not shown). The expected product sequences were obtained for eight of the nine tested splice sites. Product sequences for splice site 350, which did not yield the expected product, indicated that the corresponding ribozyme had spliced primarily at uridine 307. Therefore, the actual *trans*-splicing efficiency at splice site 350 may be lower than its measured *trans*-splicing efficiency (2.2%), possibly improving further the correlation between computed  $\Delta G_{bind}$  and *trans*-splicing efficiency seen in Figure 3B. In summary, the sequencing Meluzzi et al.

results confirmed all but one of the nine products observed in the *trans*-splicing reactions.

# Experimental *trans*-splicing efficiency with unstructured RNA substrates

To confirm that all of the 18 ribozymes employed in experiments with CAT mRNA were catalytically active, we measured their *trans*-splicing efficiency on short substrates that were designed to prevent formation of secondary structure. Hence, this experiment also allowed us to examine the effects of substrate secondary structure on trans-splicing efficiency. Each short substrate consisted of a 13-nt sequence containing one of the 18 splice sites already targeted on CAT mRNA. The single-stranded conformation predicted by RNA folding algorithms for these substrates effectively abolishes the hypothesized  $\Delta G_{unfold-target}$  component of  $\Delta G_{bind}$ . The reaction conditions were the same as with the CAT mRNA, except that the incubation time was 30 times shorter and the ribozyme concentration was 15 times lower. The reaction products were then analyzed by polyacrylamide gel electrophoresis and autoradiography (Fig. 4A). The *trans*-splicing product fractions ranged from 0.16  $\pm$ 0.07%, for splice site 369, to  $29 \pm 7\%$ , for splice site 240 (Supplemental Table S1), confirming that all ribozymes were, indeed, active in the absence of substrate secondary structure. Because the short substrates required considerably shorter reaction times and lower ribozyme concentrations to yield product fractions comparable to those obtained with CAT mRNA, our results reinforce the notion that substrate folding can significantly reduce trans-splicing efficiency.

For almost all ribozymes, the expected trans-splicing product of 85 nt (8 nt of cleaved substrate plus 77 nt of 3'exon) was accompanied by two other products, whose lengths were  $\sim$ 80 and 90 nt (Fig. 4A). The additional products most likely resulted from one or more of the possible side reactions in which group I intron ribozymes are known to engage (Kay and Inoue 1987; Johnson et al. 2005; Dotson et al. 2008). These side reactions depend on the same process modeled in this study, i.e., the binding of ribozyme's IGS to substrate target site. Nevertheless, because the identities of the side products were not determined experimentally and because our focus was on the correct trans-splicing product, we took the fraction of the 85-nt product alone as a measure of *trans*-splicing efficiency for splice sites on the short substrates. The ensuing qualitative correlation of computed  $\Delta G_{\text{bind}}$  with experimentally measured efficiency (see below) was not strongly affected when the sum of all three product fractions was used as a measure of *trans*-splicing efficiency (data not shown).

To determine whether the two remaining energetic contributions, P1 duplex stability, modeled by  $\Delta G_{hybrid}$ , and base-pairing interactions between IGS and 3'-exon, modeled by  $\Delta G_{release-IGS}$ , were able to explain the observed variation in *trans*-splicing efficiency for splice sites on the short substrates,



FIGURE 4. Trans-splicing efficiency with short, 13-nt substrates. (A) Representative autoradiograms of products from trans-splicing reactions. Each 13-mer substrate contains one of the 18 splice sites that were targeted on CAT mRNA. Each group of lanes shows samples taken after 1, 8, 16, and 31 min of reaction and is labeled with the position of the targeted splice site. The positions of the unreacted substrate (s; 13 nt), reaction intermediate (i; 8 nt), and trans-splicing product (p; 85 nt) are indicated. The size of the product was confirmed by comparison with an 85-nt RNA marker in separate experiments (data not shown). (B) Plot of experimental trans-splicing efficiency as a function of computed  $\Delta G_{\text{bind}}$ . The thick gray line represents a least-mean-squares exponential fit to the data points, with a coefficient of determination  $R^2 = 0.27$ . Only splice site 240 (-3.9 kcal/mol; 29% reacted) results in a strong deviation from this trend. Alternatively, a linear fit (data not shown) to the same data points yields a correlation coefficient R = -0.51, with a probability p = 0.030 that the values are not correlated. Error bars are standard deviations from three independent experiments.

we plotted the *trans*-splicing efficiency measured for each splice site as a function of  $\Delta G_{\text{bind}}$  computed for that site (Fig. 4B). This plot reveals a correlation between calculations and experiments that is less tight than the correlation for the full-length CAT mRNA, suggesting that factors other than P1 duplex stability and IGS/3'-exon interactions might influence *trans*-splicing efficiency. One reason why these factors become important for unstructured substrates (Fig. 4B) but not for structured substrates (Fig. 3B) may be the faster *trans*-splicing kinetics with short substrates. Several processes may play a stronger role at faster reaction kinetics, such as the initial folding of the ribozyme (Pan et al. 1997; Shi et al. 2009) and later steps in the *trans*-splicing process (Karbstein et al. 2002; Bell et al. 2004), which are not captured by the thermodynamic model used in this study.

# Computed energetic contributions to *trans*-splicing efficiency

The good correlation observed between computed values of  $\Delta G_{bind}$  and experimental *trans*-splicing efficiencies for CAT

mRNA supports the notion that the ribozyme-substrate binding process can be approximately modeled by assuming three idealized molecular events: unfolding of target site, release of the IGS, and IGS-target site hybridization. Here, we examine the relative energetic contributions of these hypothetical molecular events to the observed efficiency of a given splice site.

The thermodynamic model (Fig. 1A) suggests that a very negative hybridization energy,  $\Delta G_{hybrid}$ , would favor trans-splicing, whereas very positive energies of substrate unfolding,  $\Delta G_{unfold-target}$ , and of IGS release,  $\Delta G_{release-IGS}$ , would disfavor *trans*-splicing. Figure 5A and Supplemental Table S2 show the three energy components of  $\Delta G_{bind}$  for each of the experimentally tested splice sites on CAT mRNA. The average of  $\Delta G_{unfold-target}$  over all splice sites is  $1.8 \pm 0.8$  kcal/mol, the average of  $\Delta G_{\text{release-IGS}}$  is 1.8  $\pm$  0.9 kcal/mol, and the average of  $\Delta G_{hvbrid}$  is  $-7.2 \pm 1.4$  kcal/mol. Thus, both the strongest energetic contribution (-7.2 kcal/mol) and the largest variation among splice sites ( $\pm 1.4$  kcal/mol) come from the hybridization of IGS with the target sites. These results indicate that the free energy of IGS-target site hybridization is more important, on average, than the free energies of target unfolding and IGS release in modulating  $\Delta G_{bind}$ .



**FIGURE 5.** Energetic contributions to the computed binding free energy on CAT mRNA, from the three molecular events described in Figure 1A. (*A*) The computed energetic contributions from target site unfolding ( $\Delta G_{unfold-target}$  gray), ribozyme IGS release ( $\Delta G_{release-IGS}$ , white), and IGS-target site hybridization ( $\Delta G_{hybrid}$ , black) are shown for each tested splice site. Three of the 18 tested splice sites were omitted (131, 240, 369) because their computed energetic values were not among the strongest 10,000 interactions reported by INTARNA. Error bars are standard deviations of the energies calculated with three to six different window sizes as in Figure 3. (*B–D*) Plots of *trans*-splicing efficiency as a function of computed  $\Delta G_{bind}$  values when the contribution of (*B*)  $\Delta G_{unfold-target}$  (*C*)  $\Delta G_{release-IGS}$  and (*D*)  $\Delta G_{hybrid}$  is omitted in turn. The thick gray lines in *B–D* represent exponential fits, as in Figures 3B and 4B, with coefficients of determination  $R^2 = 0.38$ , 0.57, and 0.076 for *B*, *C*, and *D*, respectively. For additional details, see Figure 3.

To assess the importance of the energetic components  $\Delta G_{unfold-target}$ ,  $\Delta G_{release-IGS}$ , and  $\Delta G_{hybrid}$  toward the correlation observed between experimental trans-splicing efficiency and  $\Delta G_{\text{bind}}$  (Fig. 3B), we recomputed  $\Delta G_{\text{bind}}$  by omitting each component in turn, and we calculated the coefficient of determination associated with a least-meansquares exponential fit to the experimental trans-splicing efficiency as a function of computed  $\Delta G_{bind}$ . For splice sites on CAT mRNA, omitting any of the energetic components resulted in a poorer correlation and a consequent loss of a reliable threshold bounding values of  $\Delta G_{\text{bind}}$  associated with efficient splice sites (Fig. 5B-D). In particular, omission of  $\Delta G_{hybrid}$  resulted in a nonnegative  $\Delta G_{bind}$  for all splice sites (Fig. 5D), whereas omission of either  $\Delta G_{unfold-target}$  or  $\Delta G_{release-IGS}$  resulted in the appearance of up to six falsepositives, i.e., splice sites with  $\Delta G_{bind} < -4$  kcal/mol but without any experimentally detected trans-splicing product (Fig. 5B,C). A poor correlation also ensued when omitting pairs of  $\Delta G$  components from  $\Delta G_{\text{bind}}$  (Supplemental Fig. S2; Supplemental Table S2). Comparing the coefficients of determination (Figs. 3B, 5B-D) indicates that the importance of individual energetic contributions toward the observed correlation between trans-splicing efficiency and  $\Delta G_{bind}$  follows the order  $\Delta G_{hybrid} > \Delta G_{unfold-target} >$  $\Delta G_{release-IGS}$ , but these energetic contributions are all necessary to achieve a good correlation.

When the same analysis was performed for splice sites on the short substrates, we found that omitting  $\Delta G_{unfold-target}$ made no significant difference because this component was always <0.4 kcal/mol, as expected (Supplemental Fig. S1A,B). Omitting either of the other components resulted in a worse correlation (Supplemental Fig. S1C,D). The values of  $\Delta G_{release-IGS}$  for the 13-mers were identical to the values for corresponding splice sites on CAT mRNA, which was expected because  $\Delta G_{release-IGS}$  does not depend on the substrate. Values of  $\Delta G_{hybrid}$ , however, differed by up to  $\sim$ 1 kcal/mol between corresponding splices sites on 13-mers and CAT mRNA. These small energetic differences arose from the different nucleotides flanking the target sites in the two contexts. Such nucleotides vary with splice site on CAT mRNA (Supplemental Table S1) but do not vary with splice site on the short substrates (see Materials and Methods).

#### Trans-tagging assay on CAT mRNA

To determine whether the results of the *trans*-tagging assay also generate a good

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correlation with the experimentally determined *trans*-splicing efficiencies, we performed this assay using CAT mRNA as the substrate. The output of the trans-tagging assay is the number of times a given splice site is identified in a set of product sequences obtained from in vitro trans-splicing reactions with randomized IGSs (Jones et al. 1996). We obtained a total of 66 product sequences which were consistent with trans-splicing at 25 different uridines among the 186 uridines that follow the start codon in the CAT mRNA sequence (Table 1). The splice sites detected most frequently were at uridines 97 and 33, with 14 and 12 occurrences, respectively. On the other hand, 15 of the 25 detected splice sites were found only once. The splice sites detected by the trans-tagging assay are represented by diamonds in Figure 2A.

When the experimentally determined trans-splicing efficiencies were plotted as a function of the splice site counts in the *trans*-tagging assay, no correlation was evident (Fig. 6). More strikingly, the assay did not find splice sites 258 and 405, even though these splice sites were more efficient than splice site 97, which was detected 14 times by the trans-splicing assay. Similarly, the assay found each of the splice sites 448 and 197 only once in 66 product sequences, even though these splice sites were two of the five most efficient ones among the 18 tested splice sites. Therefore, the number of times that a given splice site is found by the trans-tagging assay does not necessarily reflect the transsplicing efficiency measured for that splice site.

# Possible biases of the trans-tagging assay

Why did the trans-tagging results only partially reflect the measured splice site efficiency? One possible explanation is that the PCR step in the assay disfavors long RT-PCR products, a well-known phenomenon in quantitative PCR (Bustin 2000). In our trans-tagging experiments, this phenomenon may have caused the pattern seen in Figure 2A. Here, the forward PCR primer was designed to identify splice sites between positions 14 and 643 on CAT mRNA, but only four out of the 25 identified splice sites were found

<b>TABLE 1.</b> Results of the trans-tagging assay	
Count <sup>a</sup>	Position of the splice site <sup>b</sup>
14	97
12	33
8	54
4	99
3	32
2	18, 83, 87, 166, 177
1	14, 65, 73, 84, 110, 131, 153, 175,
	179, 180, 197, 356, 448, 499, 573

<sup>a</sup>Number of times that a splice site was identified among 66 product sequences. <sup>b</sup>Position of a uridine relative to the adenine of the start codon in

CAT mRNA.

596



FIGURE 6. Comparison between trans-splicing efficiency and transtagging results. The measured trans-splicing efficiency for each splice site is plotted against the number of times that the splice site was found in 66 product sequences obtained with the trans-tagging assay (filled diamonds). Open diamonds denote splice sites that were not found by the trans-tagging assay. Note that eight of the 18 sequences are clustered at the origin of the plot.

at positions beyond uridine 197 (Table 1). In contrast, the five most efficient splice sites (also with  $\Delta G_{bind}$  below the threshold of -4 kcal/mol) were more evenly distributed over the CAT mRNA (positions 97, 197, 258, 405, and 448). We reasoned that if the PCR step, indeed, caused more splice sites to be identified near the forward PCR primer than elsewhere, then moving this primer farther downstream from the mRNA 5' terminus should reveal a different pattern of detected splice sites, now crowded near the new position of the forward primer. Therefore, we repeated the trans-tagging experiment on CAT mRNA, this time using a forward primer designed to identify only splice sites at positions 207 to 643. The resulting nine product sequences yielded eight new splice sites, those at uridines 248, 271, 273, 321, 350, 378, 384, and 405 (data not shown in Fig. 2A). None of these splice sites had been found among the previous set of 66 trans-tagging product sequences. The new splice sites were again crowded near the forward primer. These results suggest that the PCR step may cause the trans-tagging assay to miss efficient splice sites located 200 nt or more downstream from the forward PCR primer.

A second possible explanation for a bias in the transtagging assay lies in the different rates at which ribozymes with different IGSs are transcribed by T7 RNA polymerase in vitro. The assay employs a pool of trans-splicing ribozymes whose IGS differs between ribozymes. Because the IGS represents the 5' terminus of the transcript and because the transcription efficiency of T7 RNA polymerase is strongly dependent on the sequence of the first 6 nt in the transcript (Milligan et al. 1987; Milligan and Uhlenbeck 1989) we hypothesized that the difference in transcription efficiency achieved for different ribozymes may bias the results of the trans-tagging assay.

To test this second hypothesis, we measured the transcription efficiency for the 18 studied ribozymes. Specifically, the ribozymes were individually transcribed in the presence of  $\alpha$ -[<sup>32</sup>P]-GTP, the transcription products were separated by denaturing polyacrylamide gel electrophoresis, and the transcription efficiency was measured by quantitating the relevant bands on autoradiograms. The measured transcription efficiency varied eightfold among the different ribozymes (Fig. 7; Supplemental Table S1). Notably, ribozyme 97 had the highest transcription efficiency, fivefold higher than that of ribozyme 258. These measured differences in ribozyme amounts represent lower bounds for the actual differences affecting the trans-tagging assay. Specifically, in the individual transcription reactions, partial saturation may have been reached for the more efficient transcriptions but not for the less efficient ones. This partial saturation would have reduced the observed difference between efficient and less efficient transcriptions. On the other hand, in the trans-tagging assay, all ribozymes were transcribed together from equimolar amounts of templates under the same reaction conditions, leading to equal extents of product saturation for all ribozymes. Hence, the difference in the amounts of ribozymes 97 and 258 was likely greater than fivefold in the trans-tagging assay. Therefore, the observed bias in transcription efficiency for ribozymes with different IGSs could explain why splice site 97 was found most frequently in the trans-tagging assay, while splice site 258, which was the most efficient in *trans*-splicing experiments with CAT mRNA, was absent in all 75 product sequences that we obtained with the trans-tagging assay.

A third potential source of bias for the outcome of the *trans*-tagging assay is the tendency of group I intron variants to lose their 3'-exon via side reactions known as 3'-specific hydrolysis and G-exchange (Inoue et al. 1986; Thompson and Herrin 1991; van der Horst and Inoue 1993; Haugen et al. 2004). Indeed, a significant loss of 3'-exons was revealed during the separation of in vitro transcribed ribozymes on denaturing polyacrylamide gels (above). Specifically, for each band of a full-length ribozyme, we detected a faster migrating band, which corresponded in size to ribozymes that had lost their 3'-exon. If the loss of 3'-exons during transcription and during *trans*-splicing depends on the



**FIGURE 7.** Transcription efficiencies of ribozymes analyzed in this study. All values are relative to the transcription efficiency of the ribozyme targeting splice site 97. Transcription efficiencies were determined from band intensities of internally [<sup>32</sup>P]-labeled ribozymes, which had been transcribed in vitro and separated by denaturing polyacrylamide gel electrophoresis. The targeted splice site is indicated at the *bottom* of each bar. Error bars are standard deviations from seven independent transcriptions.

IGS, then the pool of transcribed ribozymes used in the *trans*-tagging assay will be biased against specific splice sites.

To determine whether the loss of 3'-exons varied with IGS under in vitro transcription conditions, we quantitated the relevant bands on the same autoradiograms that were used to measure transcription efficiency. The resulting fractions of lost 3'-exons varied from  $12 \pm 4\%$  to  $39 \pm 4\%$ , with an average of  $28 \pm 7\%$  over all 18 ribozymes (Supplemental Table S1). This means that, among the studied ribozymes, between 88% and 61% of the transcribed ribozymes retained their 3'-exon, generating only a 1.4-fold bias for the *trans*-tagging assay. Therefore, 3'-exon loss during transcription was not a major contributor to the large bias observed in the *trans*-tagging assay.

The loss of 3'-exons could also have taken place during the *trans*-splicing reaction. Because these conditions were different from the transcription conditions, we also measured the loss of 3'-exons under trans-splicing conditions. Internally radiolabeled ribozymes with a 3'-exon were sizepurified by denaturing PAGE, then incubated under transsplicing conditions, and the fraction of ribozymes that lost their 3'-exon was determined by a second denaturing PAGE and quantitation by phosphorimaging. The fraction of 3'exons lost after four hours varied from  $22 \pm 4\%$  to  $65 \pm 7\%$ with an average of 40  $\pm$  10% over all ribozymes (Supplemental Table S1). Therefore, we estimate that, during the 1-h incubation under *trans*-tagging conditions, between  $\sim 80\%$ and  $\sim$ 95% of the ribozymes retained their 3'-exon, suggesting that the small proportion of ribozymes that lost their 3'exon should not constitute a major bias in the trans-tagging assay.

In summary, we found that the results of the *trans*-tagging assay were skewed by experimental biases. The strongest influences appeared to originate from a product-size bias in the PCR step and from different efficiencies in the transcription of ribozymes, whereas a smaller influence came from the loss of 3'-exons by ribozymes during transcription and *trans*-splicing.

# DISCUSSION

We have developed and experimentally tested a computational approach to identify efficient splice sites for *trans*-splicing ribozymes. This approach is based on the computation of the free energy change,  $\Delta G_{\text{bind}}$ , for the hybridization and secondary structure rearrangements accompanying the first step of *trans*-splicing, i.e., the binding of IGS to substrate. The computed values of  $\Delta G_{\text{bind}}$  were found to correlate well with experimentally determined *trans*-splicing efficiencies at 18 different splice sites on CAT mRNA. The correlation was significantly better than the correlation of experimental *trans*-splicing efficiencies with the results of the *trans*-tagging assay, suggesting that the proposed computational approach could provide an alternative solution to the identification of efficient splice sites for *trans*-splicing ribozymes.

In particular, our results suggest that a set of candidate efficient splice sites for *trans*-splicing ribozymes could be determined by selecting those sites with  $\Delta G_{bind} < -4$  kcal/mol. Although other mRNAs may show different values for  $\Delta G_{bind}$  that better discriminate between efficient and inefficient splice sites, a threshold of  $\Delta G_{bind} < -4$  kcal/mol may provide a rough guideline for choosing candidate splice sites on other mRNA substrates. Our results also suggest that the unfolding of substrate mRNA at the target site, the hybridization of the substrate to the ribozyme, and the release of IGS from its secondary interactions with the 3'-exon all contribute toward the efficiency of a given splice site on long mRNAs, albeit to varying degrees.

The above results may seem unsurprising at first because computations similar to ours have already been applied to identify target sites for different types of RNA-binding molecules. For example, a thermodynamic cycle equivalent to our calculation of  $\Delta G_{bind}$  predicted antisense oligonucleotides with high binding affinity for rabbit B-globin and mouse tumor necrosis factor-a mRNAs, achieving 60% accuracy and a significant correlation with experimental data (Walton et al. 1999). Analogous calculations included the concentration-dependent effects of oligonucleotide dimerization, predicting oligonucleotide-target affinities consistent with results from an RNase-H mapping assay on the AT<sub>1</sub> receptor mRNA and from a *trans*-tagging assay on sickle β-globin mRNA (Mathews et al. 1999). More recently, a target site accessibility measure provided by the program RNAPLFOLD and related to our  $\Delta G_{unfold-target}$  was used to improve the prediction of effective siRNAs (Tafer et al. 2008). A similar calculation also improved and simplified the prediction of effective microRNA targets in Drosophila melanogaster tissue culture cells (Kertesz et al. 2007). Another study used a statistical sampling technique to calculate  $\Delta G$  values analogous to our  $\Delta G_{bind}$  (Shao et al. 2007b). These values were found to correlate significantly with experimentally measured trans-cleavage activities of 15 hammerhead ribozymes targeting transcripts of human breast cancer resistance protein. Contrary to our results, this study found that  $\Delta G_{unfold-target}$  contributes more than  $\Delta G_{hybrid}$  toward the observed correlation, underscoring the structural and mechanistic differences between trans-cleaving and trans-splicing ribozymes (Scott 2007). Lastly, the program INTARNA, which we used to calculate  $\Delta G_{\text{bind}}$ , was more effective than other software in predicting 18 targets of small bacterial regulatory RNAs (Busch et al. 2008).

Despite the previous achievements by similar methods, it was not obvious at the outset whether our proposed computations of  $\Delta G_{bind}$  would correlate well with the efficiency of *trans*-splicing ribozymes, because these molecules are more complex than those investigated in most of the previous reports. Although Mathews et al. (1999) found some agreement between their  $\Delta G_{bind}$  calculations and the counts of accessible splice sites reported by Lan et al. (1998), this comparison considered only a short 70-nt region of the mRNA substrate and did not directly measure *trans*-splicing efficiency. In contrast, our study individually tested the *trans*-splicing efficiency on 18 different splice sites, distributed over the full length of the CAT mRNA, and compared the experimental results to the computed values of  $\Delta G_{\text{bind}}$ . Our study also included the ribozyme 3'-exon into the calculations. The good correlation we observed between experiments and computation confirms that a calculation of  $\Delta G_{\text{bind}}$  based on established RNA folding algorithms can be used to identify efficient splice sites for *trans*-splicing ribozymes.

The scope of the present study was intentionally limited to providing a first assessment of the proposed calculation of  $\Delta G_{\text{bind}}$  as a tool for predicting efficient splice sites. Therefore, we carried out experiments using a single model mRNA substrate, and we targeted a subset of the possible splice sites on this substrate. On the other hand, the trans-tagging assay has already been successfully applied to map efficient splice sites on at least eight different mRNA substrates (Lan et al. 1998; Watanabe and Sullenger 2000; Rogers et al. 2002; Park et al. 2003; Ryu and Lee 2003; Jung and Lee 2005; Fiskaa et al. 2006; Kim et al. 2007). Moreover, the proposed calculation of  $\Delta G_{\text{bind}}$  relies on secondary structure prediction algorithms that are very fast but not always accurate because they do not take into account all possible RNA interactions and they are sensitive to errors in experimental energy parameters (Layton and Bundschuh 2005; Condon and Jabbari 2009). Thus, future experimental studies on additional mRNA substrates will show whether calculations of  $\Delta G_{\text{bind}}$  provide a reliable means of predicting efficient splice sites.

The proposed method is attractive because the calculations of  $\Delta G_{\text{bind}}$  do not require bench-work and can be performed in one afternoon. In contrast, the experimental assay, from the preparation of ribozymes and substrate mRNA to the analysis of trans-splicing product sequences, requires at least one week of work. Thus a computational approach, once proven reliable, will likely be cheaper and quicker than the experimental route. Moreover, the computational approach can be developed further to satisfy additional design requirements. For example, if the aim of the ribozymes is to repair a mutated mRNA sequence, then the sequence of the 3'-exon must be adjusted according to the targeted splice site (Long and Sullenger 1999). This adjustment, which is likely important based on our analysis of energetic contributions toward trans-splicing efficiency, would be difficult to achieve with the trans-tagging assay, whose pool of ribozymes presently carries the same 3'-exon sequence for all targeted splice sites. On the other hand, the proposed computational approach can easily be modified to adjust the 3'-exon sequence in accordance with the splice site.

Another design requirement might be to avoid *trans*-splicing ribozymes that react at multiple splice sites. This

behavior was observed in the present study for ribozymes targeting splice sites 405 and 448 (Fig. 3A). Such cross-reactivity was likely caused by the similarity of the corresponding IGSs, which differ in only one out of 6 nt (GGGGAA for splice site 405 versus GGGGAU for splice site 448). A computational approach can easily overcome this problem, as a simple comparison of the predicted IGSs suffices to detect and discard potentially cross-reactive ribozymes.

The computational approach could also accommodate the design of 5'-extended guide sequences (EGSs), which have been shown to strongly increase *trans*-splicing efficiency (Kohler et al. 1999; Fiskaa and Birgisdottir 2010). The design of these EGSs depends critically on the mRNA sequence immediately downstream from the splice site. If the *trans*-tagging assay were to be used for the simultaneous optimization of IGSs and EGSs, then the sequence of the EGSs would have to covary with the randomized IGS. This would be a very laborious task because each sequence would have to be synthesized individually. Therefore, EGS optimization cannot be easily achieved with the *trans*-tagging assay. In contrast, our computational approach can be modified to include a splice site-specific EGS optimization, which would allow one not only to identify efficient splice sites on a given mRNA but also to maximize their efficiency.

In conclusion, the proposed computational approach, together with future algorithmic extensions aimed at optimizing 3'-exon and EGS, could facilitate the development of efficient *trans*-splicing ribozymes while elucidating the interactions between *trans*-splicing ribozymes and their mRNA substrates.

#### MATERIALS AND METHODS

# Prediction of $\Delta G_{bind}$

The values of the binding free energy change,  $\Delta G_{\text{bind}}$ , and its components were initially computed using the Vienna RNA package (Hofacker et al. 1994). Specifically, we used RNAEVAL to calculate  $\Delta G_{hvbrid}$ , and RNAFOLD to calculate  $\Delta G_{unfold-target}$  and  $\Delta G_{release-IGS}$ , using the partition function approach, which yields an ensemble average of  $\Delta G$  values associated with all possible pseudo knot-free secondary structures achievable with a given RNA sequence (McCaskill 1990). We then found that the same calculations can be carried out more conveniently using the INTARNA software ((Busch et al. 2008); http://rna.informatik.uni-freiburg.de:8080/ IntaRNA.jsp), which was developed to find putative target sites for bacterial small regulatory RNAs (sRNAs, typically 50-250 nt in length) on long mRNA sequences. This software takes as input two sequences: a short sRNA and a long target mRNA. The software outputs a list of possible base-pairing interactions between the two RNAs, together with the corresponding  $\Delta G_{bind} = \Delta G_{hybrid} +$  $\Delta G_{unfold-mRNA} + \Delta G_{unfold-sRNA}$ , where  $\Delta G_{hybrid}$  is the hybridization free energy component of the interaction, and  $\Delta G_{unfold-mRNA/sRNA}$ is the cost in free energy for locally unfolding the region of mRNA/ sRNA involved in the base-pairing interaction. To calculate  $\Delta G_{bind}$  for the possible splice sites on CAT mRNA, the 678-nt

sequence of this substrate was specified as the input mRNA sequence, and the shortened ribozyme sequence GXXXXXNNNNNA CGCACGTCAATTGGCCGCTGGATGGGGGCCCCTGTGAAGTG TTGCTGAGCAACGCGCTGGCGCGCGCGCTCAGAGGCTTC was specified as the input sRNA sequence, where GXXXXX denotes a specific IGS, NNNNN is a linker replacing the body of the ribozyme, and the rest of the sequence is the 77-nt 3'-exon used for the *trans*-tagging and *trans*-splicing experiments in this study. To calculate  $\Delta G_{\text{bind}}$  for the short 13-mer substrates, the input sRNA sequence was the shortened ribozyme sequence shown above, and the input mRNA sequence was the 13-mer substrate sequence GGYYYYYUAAAAA, where YYYYY is the reverse complement of the five IGS bases XXXXX. For all calculations, the maximum length of the hybridized region was seven, the upper energy threshold was 10 kcal/mol, the exact number of seed base pairs was three, the maximum number of reported suboptimal interactions was 10,000, while all other parameters of the software had default values. Requesting 10,000 suboptimal interactions was necessary to obtain  $\Delta G_{\text{bind}}$  values for as many as possible of the least efficient splice sites tested in this study. However, requesting 40 suboptimal interactions was sufficient to predict the five most efficient of the tested splice sites. Only interactions involving each IGS and the corresponding target site on the substrate were extracted from the program's output. The above procedure was automated using a short Perl script, which is available from G.A. upon request. Values of  $\Delta G_{bind}$  for CAT mRNA were computed using window sizes of 100, 200, 300, 400, 500, and 600 nt, which cover uniformly the length of the substrate. Because each window size produced different outliers in the plot of experimental transsplicing efficiency versus  $\Delta G_{\text{bind}}$  (data not shown), we averaged  $\Delta G_{\text{bind}}$  over all six window sizes, thus obtaining a more consistent trend (Fig. 3B). Error bars of  $\Delta G_{bind}$  in Figure 3B are standard deviations over the six window sizes. Splice sites whose  $\Delta G_{\text{bind}}$ value was reported for less than three window sizes were not assessed for energetic contributions and are not shown in Figure 3B. When no  $\Delta G_{\text{bind}}$  values were returned for specific combinations of window size and splice site, the value zero was used for  $\Delta G_{\text{bind}}$  in Figure 2. All calculations for the 13-mer substrates were done with a window size of 13 nt.

#### Ribozymes

To prepare DNA templates for transcription of trans-splicing ribozymes with specific IGSs (Supplemental Table S1), a DNA fragment for each such ribozyme was amplified by PCR, using forward primer GCGTAATACGACTCACTATAGXXXXAAAAG TTATCAGGCATGCACC and reverse primer GAAGCCTCTG AGCCGCGCCAG (PR1), from a plasmid containing the Tetrahymena ribozyme gene linked to a 77-nt segment of the alphamannosidase gene as the 3'-exon (Einvik et al. 2004). The above forward primer contains the promoter for T7 RNA polymerase, the desired IGS nucleotides GXXXXX, and the first 21 nucleotides downstream from the IGS in the Tetrahymena ribozyme sequence. All PCR products were cloned into the EcoRI / BamHI sites of pUC19 using appropriate PCR primers, and the ribozyme sequences were confirmed by sequencing. DNA templates for ribozyme transcription were obtained from these ribozyme-encoding plasmids by PCR amplification using forward primer GCGTAAT ACGACTCACTATAG and reverse primer PR1. To minimize the loss of 3'-exons, ribozyme transcriptions were carried out at 30°C for

20–30 min. The transcripts were purified by denaturing polyacrylamide gel electrophoresis (PAGE) and eluted from gel slices. Ribozyme concentrations were determined from absorbance measurements at 260 nm using an extinction coefficient of  $4.0 \ \mu M^{-1} cm^{-1}$ .

# **Substrates**

The template for run-off transcription of CAT mRNA was amplified by PCR from plasmid pLysS (Novagen), in two consecutive PCRs. The first PCR used forward primer CAGGAGCTAAGG AAGCTAAAATG and reverse primer CGCCCCGCCCTGCCACTC ATC; the second PCR used forward primer GCGTAATACGACTC ACTATAGCAGGAGCTAAGGAAGCTAAAATG and the same reverse primer. After transcription, the full-length CAT mRNA was purified on Micro Bio-Spin 6 columns (Bio-Rad), dephosphorylated with Antarctic phosphatase (NEB), and radiolabeled at the 5' terminus using  $\gamma$ -[<sup>32</sup>P]-ATP (Perkin Elmer) and polynucleotide kinase (NEB). The radiolabeled substrate was purified by denaturing 5% PAGE and eluted from gel slices using RNA elution solution (20- 50 mM MOPS/NaOH pH 7.0, 0.2% SDS, 300 mM NaCl). The 13-mer substrates were prepared as described previously (Milligan and Uhlenbeck 1989) to obtain the sequences GGYYYY YUAAAAA, where YYYYY is the reverse complement of the five IGS bases XXXXX adjacent to the 5'-terminal G of the ribozyme. Templates for transcription were obtained by annealing the sense oligonucleotide GCTAATACGACTCACTATAG, which contains a T7 RNA polymerase promoter, with antisense DNA oligonucleotides TTTTTAXXXXXCCTATAGTGAGTCGTATTAGC. In vitro transcription was carried out at 37°C for 1 h in the presence of  $\alpha$ -[<sup>32</sup>P]-UTP (Perkin Elmer), using 500 nM DNA template and  $\sim$ 1 unit/µL of T7 RNA polymerase. The radiolabeled transcripts were purified by denaturing 20% PAGE.

# Trans-splicing reactions

Ribozymes and substrates were mixed in a buffer containing 1 mM MgCl<sub>2</sub>, 135 mM KCl, 50 mM MOPS/NaOH pH 7.0, 20 µM GTP, and 2 mM spermidine and incubated at 37°C. Before mixing with the substrate, the ribozymes were preincubated for 10 min at 37°C in the absence of magnesium. In reactions with CAT mRNA substrate, ribozyme concentrations were 1.5 µM, substrate concentration was  $\sim$ 50 nM, and the incubation time was 4 h. This reaction time was chosen as a measure for *trans*-splicing efficiency because, after this time, the signal for the most efficient splice site (258) began saturating, while the signals for most other splice sites were relatively weak or absent. In reactions with 13-mer substrates, ribozyme concentrations were 100 nM, substrate concentrations were  ${\sim}10$  nM, and the incubation time was 8 min. At this time, none of the reaction products appeared saturated, and all ribozymesubstrate pairs yielded bands sufficiently strong for quantitation. The samples were separated by denaturing 20% PAGE and visualized by phosphorimaging (Bio-Rad PMI). Band intensities in the resulting digital images were quantified using custom computer software that employs previously described curve-fitting procedures (Shadle et al. 1997; Mitov et al. 2009). Trans-splicing efficiencies were calculated using the formula (trans-splicing efficiency) = (trans-splicing product) / (trans-splicing product + 5'-cleavage product + unreacted substrate), where the amount of each species was assumed proportional to the corresponding

band intensity. Error bars were calculated as standard deviations over three independent experiments.

# Confirmation of specific trans-splicing products

Samples from *trans*-splicing reactions that yielded visible bands on autoradiograms of polyacrylamide gels were reverse-transcribed using AMV reverse transcriptase (NEB) with reverse primer PR2. The RT products were amplified by PCR using the nested reverse primer PR3 and one of the forward primers PF1, CGGAATTCG ATATGGGATAGTGTTCACCC, CGGAATTCCCGTTGATATAT CCCAATGGC, CGGAATTCTGGCCTATTTCCCTAAAGGG, and GCCTTTATTCACATTCTTGCC, which anneal at different positions on the CAT mRNA sequence. The PCR products were cloned into the plasmid pUC19 and sequenced.

# Trans-tagging assay

The trans-tagging assay was carried out essentially as described (Einvik et al. 2004). All ribozymes were synthesized by run-off in vitro transcription using T7 RNA polymerase, from DNA templates that were generated by PCR. Preparation of the ribozyme pool was as described above for ribozymes with specific IGSs, except that here the forward primer encoding the T7 promoter contained five randomized nucleotides at the positions denoted with X. The trans-tagging reactions contained 100 nM substrate, 10 nM ribozyme, 0.2 mM GTP, 5 mM MgCl<sub>2</sub>, 50 mM MOPS/ KOH pH 7.0, 135 mM KCl, and 2 mM spermidine. After the substrate and the ribozyme were preincubated in separate tubes in the absence of MgCl<sub>2</sub> for 10 min at 37°C, all reagents were mixed and incubated for 1 h at 37°C. Reaction products were reverse transcribed with AMV reverse transcriptase (NEB) using primer GAAGCCTCTGAGCCGCG (PR2). The template RNA was hydrolyzed by incubation in 200 mM NaOH at 90°C for 10 min. RT products were amplified by PCR using nested reverse primer GC GGATCCTGCTCAGCAACACTTCACAGG (PR3) and forward primers CGAATTCCAGGAGCTAAGGAAGCTAAAATG (PF1) or CGGAATTCCATTCTTGCCCGCCTGATGAATGC, cloned into pUC19, and sequenced. The resulting sequences were compared with the ribozyme 3'-exon sequence and the CAT mRNA sequence to determine the positions of the splice sites on CAT mRNA.

### Ribozyme transcription efficiency and 3'-exon loss

Ribozymes with specific IGSs (Supplemental Table S1) were individually transcribed by T7 RNA polymerase in 20-µL reactions containing  $\alpha$ -[<sup>32</sup>P]-GTP (Perkin Elmer) from DNA templates that were prepared as described above. The reactions were carried out at 30°C for 20 min and were stopped by the addition of formamide loading buffer. The ribozymes were heat-denatured at 80°C for 2 min and separated by denaturing 5% PAGE. The resulting gels were analyzed as described above for the trans-splicing reactions. A total of seven independent reactions per ribozyme were carried out. To calculate the relative transcription efficiencies, the absolute intensity of the band corresponding to each intact ribozyme was divided by the absolute intensity of the band corresponding to ribozyme 97. Error bars are standard deviations of the relative transcription efficiencies. To calculate the fraction of 3'-exons lost during transcription for each ribozyme, the quantitated intensity of the faster migrating band was divided by the sum of the intensities of this

band and of the band for the intact ribozyme. Error bars are standard deviations of these fractions. Ribozymes were eluted from the gel slices and individually incubated without substrate under the same *trans*-splicing conditions described above. Samples taken at times 0 and 4 h reaction time were analyzed by denaturing 5% PAGE and autoradiography as described above for *trans*-splicing reaction products. No loss of 3'-exon was seen at time 0. Fractions of lost 3'-exon were calculated as for the transcription reactions.

### SUPPLEMENTAL MATERIAL

Supplemental material is available for this article.

# ACKNOWLEDGMENTS

This work was supported by the National Institutes of Health (T32DK007233 to K.E.O.; Hemoglobin and Blood Protein Chemistry training grant to E. Komives); the ARCS Foundation, San Diego Chapter (Scholarship to D.M.); and U.C. San Diego (to G.A.). We thank the reviewers for their constructive comments, which resulted in several improvements to the manuscript.

Received August 11, 2011; accepted December 2, 2011.

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