

Articles

# Probing a 2-Aminobenzimidazole Library for Binding to RNA Internal Loops *via* Two-Dimensional Combinatorial Screening

Sai Pradeep Velagapudi,<sup>†,‡</sup> Alexei Pushechnikov,<sup>†</sup> Lucas P. Labuda,<sup>†</sup> Jonathan M. French,<sup>†</sup> and Matthew D. Disney<sup>\*,‡</sup>

<sup>†</sup>Department of Chemistry and the Center of Excellence in Bioinformatics and Life Sciences, The University at Buffalo, The State University of New York, 657 Natural Sciences Complex, Buffalo, New York 14260, United States

<sup>‡</sup>Department of Chemistry, The Scripps Research Institute, Scripps Florida, 130 Scripps Way #3A1, Jupiter, Florida 33458, United States

### **Supporting Information**



**ABSTRACT:** There are many potential RNA drug targets in bacterial, viral, and human transcriptomes. However, there are few small molecules that modulate RNA function. This is due, in part, to a lack of fundamental understanding about RNA–ligand interactions including the types of small molecules that bind to RNA structural elements and the RNA structural elements that bind to small molecules. In an effort to better understand RNA–ligand interactions, we diversified the 2-aminobenzimidazole core (2AB) and probed the resulting library for binding to a library of RNA internal loops. We chose the 2AB core for these studies because it is a privileged scaffold for binding RNA based on previous reports. These studies identified that *N*-methyl pyrrolidine, imidazole, and propylamine diversity elements at the R1 position increase binding to internal loops; variability at the R2 position is well tolerated. The preferred RNA loop space was also determined for five ligands using a statistical approach and identified trends that lead to selective recognition.

**R**ibonucleic acid (RNA) is involved in many cellular processes including regulation of gene expression, protein synthesis, and biocatalysis.<sup>1–3</sup> The discovery of small molecule chemical probes or lead therapeutic agents that affect RNA function has wide-ranging implications. Few small molecules modulate RNA function, with the exception of antibacterials that target the bacterial ribosome. It is difficult to identify small molecules that bind a validated RNA target with high affinity and selectivity, as evidenced by the lower hit rate for RNAs than proteins in high throughput screening campaigns. This suggests that suboptimal chemical space is being screened for binding RNAs. Thus, we have taken a bottom-up approach to develop strategies to target RNA. That is, chemical space is screened for binding to discrete RNA secondary structure (motif) libraries to uncover preferred/privileged chemical space and RNA space simultaneously.<sup>4,5</sup>

It has been previously reported that the benzimidazole scaffold (Figure 1A) is a privileged pharmacophore. NMR spectroscopy-based screening identified a benzimidazole that competes with aminoglycosides for binding the bacterial rRNA A-site. Another benzimidazole binds the Hepatitis C internal ribosomal entry site (IRES) and affects the RNA's fold. This structural change precludes the IRES from binding the human ribosome and inhibits propagation. A bis-benzimidazole binds the expanded r(CUG) repeats that cause myotonic dystrophy type 1 and improves DM1-associated defects in cellular and animal models.<sup>6</sup>

In order to identify the optimal RNA targets for benzimidazoles, we synthesized a small molecule library using a 2-aminobenzimidazole core (2AB) and probed it for binding to a library of RNA internal loops (1, Figure 2). Diversity elements (Figure 1B,C) were chosen based on their potential to stack or hydrogen bond with RNA bases. These studies uncovered diversity elements that impart affinity and specificity for binding RNA internal loops and the RNA loops that are targetable by 2AB's.

# RESULTS AND DISCUSSION

2-Aminobenzimidazole Library Design and Synthesis. The benzimidazole scaffold consists of a pharmacophore with hydrogen bond donors and acceptors combined with an

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C R2-NCS



**Figure 1.** General structure of the 2-aminobenzimidazole library and the submonomers used to construct it. (A) General structure of 2-aminobenzimidazole library members. (B) Submonomers used at the  $R_1$  position. (C) Submonomers used at the  $R_2$  position. Each compound has an invariant azido group for conjugation onto alkyne-functionalized agarose microarray surfaces.

1		2	5		7		
5'-GGGAGA <sup>G - C</sup> G	CAAGG 5'-	GGGAGA	5'- GCAA	GG 5'-GG	GAGA <sup>G - C</sup> G	GCAAGG	
G - C		3+4			G - C		
G●U					G●U		
U - A		5'-G - C			Ū-Ā		
U●G		G - C			U●G		
U●G		GeU			U●Ğ		
A - U		Ŭ-	Ă		A - U		
A - U		Ŭ	Ğ	6	Ā-U		
U - A		ü.	Ğ		U - A		
N N		A -	ŭ	5'-C - G	U-A		
N N		Ă-	ΰ	G-C	A-U		
N N		ŭ-	Â	C - G	C-G		
U-A		- ÷÷	0 A	G A	G A		
A-U		L-	9	AA	A A		
C - G		~	<u>^</u>				
G A							
AA							

Figure 2. Nucleotide  $3 \times 3$  internal loop library (1) and competitor oligonucleotides (2–6) that restrict selected interactions to the randomized region. Oligonucleotides 2 and 5 mimic the single stranded regions; 3 + 4 mimic base paired regions; and 6 mimics the GNRA hairpin. Oligonucleotide 7 is cassette into which the randomized region was inserted.

aromatic ring (Figure 1A). We chose two positions to introduce diversity into the 2AB core, R1 (Figure 1B) and R2 (Figure 1C). The benzimidazole library was synthesized according to a modified version of a previously described solid-phase approach.<sup>7,8</sup> The first point of diversity (R1), installed as a peptoid submonomer adjacent to the 2-aminobenzimidazole core, can interact with RNA through stacking and hydrogen bonding (Figure 1B). Most of the submonomers used are the

same or variants of ones used in the synthesis of RNA-focused peptoids.<sup>9</sup> The second point of diversity, R2, was introduced via reaction of an isothiocyanate and an aromatic diamine, which adds an aromatic ring that could stack with RNA bases (Figure 1C). These elements have a central phenyl group surrounded by substituents that can affect the partial charges of the aromatic ring. The nomenclature used to describe these compounds is **R1-AB-R2** where AB indicates the 2-aminobenzimidazole core.

Each library member also contained an azide tag to allow for site-specific conjugation onto an alkyne-functionalized agarose microarray surface via a Huisgen dipolar cycloaddition reaction (HDCR). The HDCR reaction and the agarose microarray surface have been previously utilized.<sup>4,10–13</sup> The azide and alkyne reactive groups that are required for an HDCR are desirable because they are orthogonal to the reaction conditions that are used to construct the 2AB library. Successful synthesis was confirmed by mass spectrometry (ESI-MS). By screening arrays of quality-controlled compounds, confidence can be placed in the binding results, and structure–activity relationships can be constructed to enable the design of secondgeneration compounds that could have improved potencies and specificities.<sup>9</sup> In all, 79 diversified benzimidazoles were synthesized.

Screening of the 2-Aminobenzimidazole via Microarray. We used a previously reported library-on-library screen named Two-Dimensional Combinatorial Screening (2DCS) in order to identify privileged chemical and RNA spaces that interact simultaneously.<sup>4,5</sup> Prior to our selection experiment, the 2AB library was screened to identify the compounds that bind RNA internal loops. The library of small molecules was spatially arrayed onto agarose microarray surfaces to create small molecule microarrays.<sup>12,13</sup> All compounds (79) were arrayed at a single concentration of 4.5 mM, or 1.4 nmol (300 nL spot volume).

After conjugation, the array was hybridized with [<sup>32</sup>P]-labeled RNA library 1 (Figure 2). This library has a six nucleotide randomized region displayed in a  $3 \times 3$  nucleotide internal loop pattern. Thus, 1 has 4096 unique members. RNA library 1 was used because it displays small, discrete RNA motifs that are likely to be found as components of larger RNAs that have biological functions. The library displays  $3 \times 3$  nucleotide internal loops,  $2 \times 2$  nucleotide internal loops, and  $1 \times 1$ nucleotide loops, bulges, and base paired RNAs.<sup>4</sup> Since 4096 members of 1 were screened for binding to 79 small molecules, 323 584 interactions were probed simultaneously in this single experiment. Hybridization was completed in the presence of Torula yeast bulk RNA at three times the amount of total moles of small molecule delivered to the microarray surface. (We also synthesized RNA-focused peptoid and peptide libraries and probed them for binding 1 under the same conditions. No significant binding was observed to any of the compounds. Details can be found in the Supporting Information.)

We designated hits by comparing the radioactive signal of a compound of interest to the compound that had the highest signal, or **15-AB-21**. Hit compounds have >20% of the signal of **15-AB-21**. A total of 19 compounds were scored as hits (Figure 3B), or 24% of the 2AB library. Thus, the aminobenzimidazole scaffold alone is not sufficient for binding **1** under these conditions. That is, certain diversity elements impart binding affinity for members of **1**.



Figure 3. Microarray screening of the 2-aminobenzimidazole library for binding 1. (A) Image of the microarray with all 79 ligands after hybridization with  $^{32}P$ -labeled 1 in the presence of Torula yeast bulk RNA (competitor RNA used to increase stringency). Approximately 1.4 nmol of each compound were delivered to the slide surface. The 19 hit compounds are indicated with circles. (B) A secondary assay for the binding of the 19 hit compounds. The compounds were purified to homogeneity by HPLC and then immobilized onto alkyne-functionalized agarose microarrays as serial dilutions (1.35, 0.45, and 0.15 nmoles delivered to the surface). The arrays were then hybridized with 1 in the presence of Torula yeast bulk RNA (competitor RNA used to increase stringency). (C) Plot of the data from the experiment shown in **B**.

In order to identify the diversity elements that are important for binding 1, the hit compounds were analyzed using the Privileged Chemical Space Predictor Program (PCSP).<sup>14</sup> The program uses statistical analysis to determine the features in compounds that impart binding affinity (or some other activity) or privileged chemical space. In this case, PCSP normalized the radioactive signal from our microarray (binding value) and determined which features bias the compounds for binding 1 by comparing the proportion of a submonomer in the hit compounds to the proportion of the submonomer in the entire 2AB library. This pooled population comparison is represented as Z-scores that are converted into two-tailed pvalues. A two-tailed *p*-value represents the probability (confidence level) that the observed proportion of a specific feature could occur if in fact there is no such bias for binding. A confidence level >95% is considered statistically significant.

PCSP determined that submonomers at both the R1 and R2 positions impart binding affinity. For the R1 position, **11** (*N*-methyl pyrrolidine) and **19** (propylamine) bias the 2AB core for binding members of **1** with two-tailed *p*-values of 0.0004 and <0.0001, respectively (Figure 1B). For the R2 position, **25** (bis-trifluoromethyl-benzene) positively contributes to binding **1** (two tailed *p*-value = 0.0366), while **23** (*para*-nitrobenzene)

is deleterious to binding (selected against; two tailed p-value = 0.0050) (Figure 1C).

In order to identify the RNA loops that bind each compound, the 19 2-aminobenzimdazoles were purified by HPLC and tested in a secondary assay for binding to 1 (Figure 3B). Of these 19 compounds, 15-AB-21 (ABI), 11-AB-25 (ABII), 15-AB-25 (ABII), 19-AB-25 (ABIV), and 15-AB-26 (ABV) gave the highest signal on the array surface (Figures 3b,c). These compounds display 19 (propylamine), 15 (imidazole), or 11 (*N*-methyl pyrrolidine) side chains at the R1 position (Figure 1B) and 21 (benzene), 25 (bistrifluoromethyl-benzene), or 26 (*para*-methoxy-benzene) at the R2 position (Figure 1C).

Selection of the RNA Motifs that Bind Lead Compounds (2DCS). On the basis of the above results, the top five compounds were used in a 2DCS selection. In these experiments, <sup>32</sup>P-labeled 1 and competitor oligonucleotides 2-6 (Figure 2) were hybridized with arrays displaying serially diluted ABI-ABV. Oligonucleotides 2-6 mimic the regions in 1 that are constant to all library members (Figure 2). This ensures that the selected interactions occur between the ligand and the randomized region. The competitor oligonucleotides are each present in 3-fold excess over the amount of moles of



**Figure 4.** Selection of the RNAs in 1 that bind **ABI–ABV** via Two-Dimensional Combinatorial Screening (2DCS). (A) Structures of 2aminobenzimidazoles that were used in 2DCS selection. (B) Left, image of a microarray that displays all five compounds after hybridization with  $^{32}$ Plabeled 1. Serial dilutions of **ABI–ABV** were delivered to the slide surface (1.4, 0.7, 0.4, and 0.2 nmol) and then hybridized with 1 in the presence of competitor oligonucleotides **2–6** (each present at 3 times the number of moles of ligand spotted and at >3000 times the concentration of **1**). Circles indicate the positions where bound RNA was excised. Right, image of the array after bound RNA was excised.

ligand delivered to a microarray surface and in >3000-fold excess over 1 such that the selection conditions are highly stringent. Under these conditions, **ABI** and **ABII** had the highest signal (Figure 4B). The lowest loading spots that gave signal over the background were excised, amplified, and sequenced (Figure 4B; Tables S-1 and S-2, Supporting Information). The lowest loading spot that gave sufficient signal was used because previous studies have shown that RNAs harvested from lower ligand loadings bind with higher affinities.<sup>4</sup>

The mixtures of RNAs that bound each ligand were RT-PCR amplified and transcribed *in vitro*. The affinities of the ligands for the corresponding mixtures of selected RNAs were determined using an in-solution, fluorescence-based binding assay. The ligands were fluorescently labeled by conjugating them to fluorescein.<sup>4</sup> Saturable binding (micromolar range) was only observed for **ABI** and **ABII** when up to 1 mM RNA was added. Therefore, further analysis was only completed for **ABI** and **ABII**. The sequences selected for all ligands are available in the Supporting Information (Tables S-1–S-5).

**Informatic Analysis and Binding Studies for Members of 1 Selected to Bind ABI and ABII.** The RNA motifs that bound **ABI** and **ABII** were cloned and sequenced as previously described.<sup>15</sup> We obtained 71 sequences for **ABI** (Table S-1, Supporting Information) and 77 sequences for **ABII** (Table S-2, Supporting Information). The sequences were analyzed by using a statistical approach in order to identify features that afford high affinity binding. Analysis was completed by using the RNA Privileged Space Predictor (RNA-PSP) computer program.<sup>4,5,15–19</sup> In RNA-PSP, the rate of occurrence of a feature in the selected RNAs is compared to the rate of occurrence in the entire library **1**. The confidence that the selected feature did not occur randomly is assigned a *Z*-score and the corresponding two-tailed *p*-value. Only features that are statistically significant ( $p \leq 0.05$  or  $\geq 95\%$  confidence) are further considered. It should be noted that this analysis identifies features that contribute positively (positive Z-score) and negatively (negative Z-score) to binding. The features that have the highest confidence for binding **ABI** and **ABII** (two tailed *p*-values < 0.0001) are shown in Table 1. Table 1 reports the following information for each trend that has a two tailed *p*value < 0.0001: the number of selected RNAs that have the trend of interest (present in sequencing data), the number of RNAs in **1** that have the trend of interest, and the corresponding Z-score. Interestingly, **ABI** has only 14 features compared to 49 features for **ABII**. Thus, **ABI** is more selective in the RNA motif space that it recognizes compared to **ABII**.

Each RNA can have more than one statistically significant feature. Therefore, the Z-scores for each feature are summed to afford a Sum Z-score.<sup>15,16</sup> Previous studies have shown that RNA motif-ligand interactions that have the highest Sum Zscores have the highest affinity.<sup>15,16</sup> Moreover, by combining these statistical parameters with experimentally determined binding affinities, the affinity and selectivity of every RNA displayed in 1 can be predicted.<sup>15,16</sup> The selectivity of an RNA can be predicted by comparing its Sum Z-score for one ligand to its Sum Z-score for another. An RNA that has a large Sum Zscore for one ligand and a small Sum Z-score for another ligand is selective. This entire approach is called Structure-Activity Relationships Through Sequencing, or StARTS.<sup>16</sup> The Sum Zscores for all selected sequences are shown graphically in Figure 5A,B (open, red, and green circles) and summarized in Tables S-1 and S2, Supporting Information. The black circles in the plots are for the RNA loops that are represented in 1 but were not selected.

**Binding Affinities of ABI and ABII for Selected RNAs.** Next, the affinities of RNAs from our sequencing data for the corresponding ligand were measured (Figure 6). Each RNA is

# Table 1. Features in Selected Sequences That Impart Binding Affinity for ABI and ABII; Only Features with Two Tailed *p*-Values < 0.0001 Are Reported

trends for ABII with two tailed $p$ -values < 0.0001												
trend	# of selected sequences	# of sequences in 1	Z-score	trend	# of selected sequences	# of sequences in 1	Z-score					
5'ACA 3'CNN	4/78 (5.1%)	16/4096 (0.4%)	6.00	5'NAA 3'NGG	3/78 (3.8%)	16/4096 (0.4%)	4.49					
5'ACN 3'CGN	4/78 (5.1%)	16/4096 (0.4%)	6.00	5'NAU 3'NCC	3/78 (3.8%)	16/4096 (0.4%)	4.49					
5'CNG 3'NGG	4/78 (5.1%)	16/4096 (0.4%)	6.00	5'NUC 3'NCC	3/78 (3.8%)	16/4096 (0.4%)	4.49					
5'ACN 3'CNN	8/78 (10.3%)	64/4096 (1.6%)	5.84	5'NAU 3'CNC	3/78 (3.8%)	16/4096 (0.4%)	4.49					
5'CNN 3'CGN	7/78 (8.9%)	64/4096 (1.6%)	5.01	5'NAC 3'CNG	3/78 (3.8%)	16/4096 (0.4%)	4.49					
5'NNN 3'CCC	7/78 (8.9%)	64/4096 (1.6%)	5.01	5'NCU 3'CNU	3/78 (3.8%)	16/4096 (0.4%)	4.49					
5'ACA 3'NGN	3/78 (3.8%)	16/4096 (0.4%)	4.49	5'NAU 3'CCN	3/78 (3.8%)	16/4096 (0.4%)	4.49					
5'ACA 3'NNG	3/78 (3.8%)	16/4096 (0.4%)	4.49	5'NAC 3'CAN	3/78 (3.8%)	16/4096 (0.4%)	4.49					
5'CUC 3'NUN	3/78 (3.8%)	16/4096 (0.4%)	4.49	5'NCA 3'CGN	3/78 (3.8%)	16/4096 (0.4%)	4.49					
5'ACN 3'NGU	3/78 (3.8%)	16/4096 (0.4%)	4.49	5'NCG 3'CCN	3/78 (3.8%)	16/4096 (0.4%)	4.49					
5'CAN 3'NGG	3/78 (3.8%)	16/4096 (0.4%)	4.49	5'NGU 3'GCN	3/78 (3.8%)	16/4096 (0.4%)	4.49					
5'ACN 3'CNU	3/78 (3.8%)	16/4096 (0.4%)	4.49	5'NAN 3'CCC	3/78 (3.8%)	16/4096 (0.4%)	4.49					
5'ACN 3'CNG	3/78 (3.8%)	16/4096 (0.4%)	4.49	5'NCN 3'CGU	3/78 (3.8%)	16/4096 (0.4%)	4.49					
5'CAN 3'CNG	3/78 (3.8%)	16/4096 (0.4%)	4.49	5'NNA 3'CGG	3/78 (3.8%)	16/4096 (0.4%)	4.49					
5'AUN 3'GCN	3/78 (3.8%)	16/4096 (0.4%)	4.49	5'NNU 3'CCC	3/78 (3.8%)	16/4096 (0.4%)	4.49					
5'ACN 3'CCN	3/78 (3.8%)	16/4096 (0.4%)	4.49	5'NNG 3'AGG	3/78 (3.8%)	16/4096 (0.4%)	4.49					
5'CAN 3'CGN	3/78 (3.8%)	16/4096 (0.4%)	4.49	5'UNN 3'NCC	6/78 (7.7%)	64/4096 (1.6%)	4.17					
5'UNU 3'NCC	3/78 (3.8%)	16/4096 (0.4%)	4.49	5'CNN 3'NGG	6/78 (7.7%)	64/4096 (1.6%)	4.17					
5'CNC 3'NUU	3/78 (3.8%)	16/4096 (0.4%)	4.49	5'NCN 3'CCN	6/78 (7.7%)	64/4096 (1.6%)	4.17					
5'CNG 3'ANG	3/78 (3.8%)	16/4096 (0.4%)	4.49	5'NCN 3'CGN	6/78 (7.7%)	64/4096 (1.6%)	4.17					
5'CAN 3'CGN	3/78 (3.8%)	16/4096 (0.4%)	4.49	5'NNU 3'NCC	6/78 (7.7%)	64/4096 (1.6%)	4.17					
5'CNG 3'AGN	3/78 (3.8%)	16/4096 (0.4%)	4.49	5'ACN 3'NGN	6/78 (7.7%)	64/4096 (1.6%)	4.17					
5'UNN 3'CCC	3/78 (3.8%)	16/4096 (0.4%)	4.49	5'NCN 3'CNN	14/78 (17.9%)	256/4096 (6.3%)	4.16					
5'CNN 3'AGG	3/78 (3.8%)	16/4096 (0.4%)	4.49	5'NNN 3'NCC	14/78 (17.9%)	256/4096 (6.3%)	4.16					
5'CNN 3'CGG	3/78 (3.8%)	16/4096 (0.4%)	4.49									
trends for ABI with two tailed $p$ -values < 0.0001												
trend	# of selected sequences	# of sequences in 1	Z-score	trend	# of selected sequences	# of sequences in 1	Z-score					
5'GCU 3'NNC	4/71 (5.6%)	16/4096 (0.4%)	6.33	5'GNU 3'NCC	3/71 (4.2%)	16/4096 (0.4%)	4.75					
5'ANN 3'CNG	7/71 (9.9%)	64/4096 (1.6%)	5.35	5'ANG 3'CNG	3/71 (4.2%)	16/4096 (0.4%)	4.75					
5'UAU 3'NAN	3/71 (4.2%)	16/4096 (0.4%)	4.75	5'UNU 3'UAN	3/71 (4.2%)	16/4096 (0.4%)	4.75					
5'AUA 3'GNN	3/71 (4.2%)	16/4096 (0.4%)	4.75	5'ANN 3'CUG	3/71 (4.2%)	16/4096 (0.4%)	4.75					
5'UCN 3'NGG	3/71 (4.2%)	16/4096 (0.4%)	4.75	5'GNN 3'GGU	3/71 (4.2%)	16/4096 (0.4%)	4.75					
5'ACN 3'CNG	3/71 (4.2%)	16/4096 (0.4%)	4.75	5'NGA 3'CNC	3/71 (4.2%)	16/4096 (0.4%)	4.75					
5'GAN 3'ACN	3/71 (4.2%)	16/4096 (0.4%)	4.75	5'GNU 3'NNC	6/71 (8.5%)	64/4096 (1.6%)	4.47					

given a unique identifier: ABX-IL Y where ABX denotes the ligand for which the RNA was selected and IL Y indicates a unique internal loop (IL) identifier. We chose the RNAs with the highest Sum Z-scores from our statistical analysis (ABI-IL 1–ABI-IL 4 (green circles) and ABII-IL 1–ABII-IL 5 (red circles); Figure 5). On the basis of our previous studies, these RNAs are predicted to have the highest affinities.<sup>15,16</sup> As mentioned above, binding affinities were determined using a fluorescence-based assay with fluorescently labeled derivatives of the compounds, or ABI-FI and ABII-FI.<sup>4</sup>

The predicted secondary structures of the RNA loops <sup>20</sup> with the highest Sum Z-scores selected in our 2DCS experiment (i.e., in the sequencing data) and their corresponding  $K_{ds}$  ( $\mu$ M) are shown in Figure 6. The highest affinity interactions were obtained with **ABI**, with  $K_{ds}$  ranging from about 150–400  $\mu$ M (Figure 6A). Interestingly, **ABI** gave the highest signal on the array in the 2DCS experiment (Figure 5). The ligand with the second highest signal on the array (**ABII**) selected RNAs with a slightly wider range of  $K_{ds}$ , from about 200–850  $\mu$ M (Figure 6B). Both ligands bind weakly to **1** (the entire library), and the hairpin cassette in which the randomized region was inserted (7, Figure 1) ( $K_{ds} \gg 1$  mM) (Figure 6C), supporting the highly stringent nature of our selection and that selected interactions are to the randomized regions in **1**.

The StARTS method can also predict the selectivity of an RNA.<sup>15,16</sup> RNAs with large Sum Z-scores bind tightly, whereas RNAs with small Sum Z-scores bind weakly.<sup>15,16</sup> Thus, an RNA with a large Sum Z-score for **ABI** and a small Sum Z-score for **ABI** should bind **ABI** tightly and **ABII** weakly (Figure 5). **ABI-IL 2** and **ABII-IL 2** have Sum Z-scores in the ~25th percentile (small Sum Z-score) for their noncognate ligand and in the top 1% for the ligand for which it was selected (large Sum Z-score) (Figure 5). Therefore, we determined the affinities of **ABI-IL 2** for **ABII** and **ABII-IL 2** for **ABI** (noncognate pairs). In each case, no saturable binding was observed up to 1.5 mM RNA concentration. Thus, although the identified RNA–ligand partners have midmicromolar  $K_ds$ , the RNAs are specific for the ligands they were selected to bind, and selectivity can be predicted via StARTS as has been described previously.<sup>15</sup>

**Comparison to Previous Studies.** Previously, the preferred RNA motifs for aminoglycosides and bis-benzimidazole small molecules were determined via 2DCS.<sup>4,5,15–17,19</sup> In general, internal loops bind to aminoglycosides with low nanomolar  $K_{d}$ s, while the more drug-like bis-benzimidazoles



Figure 5. Structure-Activity Relationships Through Sequencing (StARTs) approach to predict the affinity and selectivity of RNAligand interactions. (A) Plot of the Sum Z-score for each member of 1 and ABI. The RNAs with the largest Sum Z-scores are predicted to have the highest affinity.<sup>15,16</sup> The open circles represent RNAs from sequencing data. The red circles represent the RNAs selected for ABI for which binding affinities were measured (Figure 6). The green circles represent the RNAs selected to bind ABII that have large Sum Z-scores (see panel B). Since these RNA have small Sum Z-scores for ABI, they are predicted to bind weakly to ABI. (B) Plot of the Sum Zscore for each member of 1 and ABII. The open circles represent RNAs from sequencing data. The green circles represent the RNAs selected to bind ABII for which binding affinities were measured (Figure 6). These RNAs have large Sum Z-scores. Red circles represent the RNAs that were selected to bind ABI shown in panel A. Since these RNA have small Sum Z-scores for ABII, they are predicted to bind weakly to ABII.

bind to RNA internal loops with high nanomolar to low micromolar  $K_{ds}$ . In the present study, the 2-aminobenzimdazoles bind to single RNA motifs with midmicromolar  $K_{ds}$ ; however, these affinities are similar to that of an extensively optimized benzimidazole that binds to the HCV IRES.<sup>21</sup> Importantly, the RNAs that we selected to bind **ABI** and **ABII** are specific despite their modest affinities. The affinities and the selectivities of these RNA-binding modules can be improved using a modular assembly approach. That is, a multivalent ligand can be designed that binds multiple targetable motifs simultaneously, as has been demonstrated with repeating transcripts.<sup>22–26</sup>

Knowing the RNA secondary structural elements that bind a small molecule is both important and useful. This information can be used to (i) identify potential off-targets prior to *in vivo* testing and (ii) design more selective compounds using a medicinal chemistry approach.



Figure 6. Secondary structures of RNAs selected to bind ABI and ABII that have the highest Sum Z-scores as predicted by RNAstructure <sup>20</sup> and their corresponding dissociation constants. (A) The internal loops selected to bind ABI that have large Sum Z-scores (red circles, Figure 5A). The values below the loop identifier are the  $K_{\rm d}$ s for the RNA-ligand complex ( $\mu$ M). (B) The internal loops selected to bind ABII that have large Sum Z-scores (green circles, Figure 5B). The values below the loop identifier are the  $K_{ds}$  for the RNA-ligand complex  $(\mu M)$ . (C) Representative binding curves that show selected interactions are specific. Cognate pairs with large Sum Z-scores (ABII and ABII-IL 1) are the highest affinity. Noncognate pairs with small Sum Z-scores (ABI and ABII-IL 1) interact weakly (no saturation is observed). Importantly, the ligands bind weakly to the entire RNA library, 1, or the hairpin cassette into which it was inserted, 7 (Figure 2). (No saturable binding is observed when up to 3 mM RNA is added; the ligand concentration is 50 nM.) Selectivity is achieved in our 2DCS selection by using competitor oligonucleotides (2-6,Figure 2) that mimic regions constant to all library members in large excess over 1 and the number of moles of ligand delivered to the surface.

#### EXPERIMENTAL SECTION

**General.** *N*-Methyl-2-pyrrolidinone (NMP) was purchased from Fisher. Ultra dry dimethylformamide (DMF) was purchase from Acros, while ACS grade DMF was from EMD. Dichloromethane (DCM) was purchased from J.T. Baker. Piperidine and bromoacetic acid were purchased from Sigma-Aldrich. HPLC grade methanol and acetonitrile were purchased from Honeywell. PyBOP was purchased from Nova-Biochem. All chemicals were used without further purification. Water was obtained from a Barnstead NANOpure Diamond Water Purification System operating at 18.2 M $\Omega$ -cm.

**Instrumentation.** Preparative and analytical HPLC separations were performed on a Waters 1525 binary pump system with a Waters 2487 dual wavelength absorbance detector set to 218 and 254 nm. For preparative HPLC runs, a Waters Symmetry Prep, C18, 7  $\mu$ m, 19 × 150 mm column and a flow rate of 10 mL/min were used. For analytical HPLC separations, a Waters Symmetry, C18, 5  $\mu$ m, 4.6 × 150 mm column and a flow rate of 1 mL/min were used. The solvents were water (solvent A) and methanol (solvent B) containing 0.1% trifluoroacetic acid (TFA) (v/v). All HPLC separations were conducted at room temperature (RT).

Mass spectra were recorded on a LCQ Advantage IonTrap LC/MS equipped with a Surveyor HPLC system. NMR spectra were recorded on a Varian NMR operating at 500, 400, or 300 MHz on proton. Solid

phase synthesis was performed on an APEX 396 synthesizer unless otherwise noted.

**2-Aminobenzimidazole Library Synthesis.** The library with the 2-(arylamino)benzimidazole scaffold (Figure 1) was synthesized on the solid-phase as previously described.<sup>7,8</sup> The building blocks utilized are shown in Figure 1B and C. Solid-phase synthesis of the benzimidazole library was carried out in a J-Kem heating block installed on a J-Kem shaker using 4 mL glass vials. Initially, an azidopropylamine-modified resin was synthesized in a common reaction flask, and then it was split into individual vials for further modifications.

Vials were charged with the azide-modified resin (15 mg, 10  $\mu$ mol) and installed in a heating block. Solutions of corresponding amines R<sub>1</sub>NH<sub>2</sub> (0.35 mL, 1 M in NMP) were loaded into each vial and the displacement was carried out at 50 °C for 20 h (shaking speed = 75 rpm). The liquids were evacuated, and the beads were washed with DMF  $(2 \times 1 \text{ mL})$  at 28 °C for 20 min with shaking at 150 rpm  $(2 \times 1 \text{ mL})$ mL). The beads were washed ethyl acetate (1.5 mL). Next, a solution of 3,4-diaminobenzoic acid (0.8 g, 5.3 mmol), N-hydroxybenztriazole (0.85 mg, 6.3 mmol), and N,N'-diisopropylcarbodiimide (DIC; 1.9 mL, 12 mmol) in NMP (23 mL) was distributed into each vial (0.35 mL). The reaction was carried out at 37 °C for 36 h (shaking speed = 75 rpm). The liquids were evacuated, and the beads were washed with DMF ( $2 \times 1$  mL; 28 °C for 20 min with shaking at 150 rpm) and then with ethyl acetate (1.5 mL). Into each vial, NMP (0.35 mL), the corresponding isothiocyanate R<sup>2</sup>NCS (8 equiv), and N,N-diisopropylethylamine (DIPEA, 20  $\mu$ L) were added. The reaction was carried out at 37 °C for 20 h (shaking speed = 75 rpm). The liquids were evacuated, and the beads were washed with DMF ( $2 \times 1$  mL; 28 °C for 20 min with shaking at 150 rpm) and then with ethyl acetate (1.5 mL). Then, into each vial, DIC (0.5 mL, 0.5 M in NMP) was loaded, and the reaction was carried out at 37  $^{\circ}$ C for 20 h (shaking speed = 75 rpm). The liquids were evacuated, the beads were washed with DMF  $(2 \times 1 \text{ mL}; 28 \text{ °C for } 20 \text{ min with shaking at } 150 \text{ rpm})$  and ethyl acetate (1.5 mL). Finally, the beads were washed with 20% piperidine in DMF (1 mL, 1 h), DMF, and ethyl acetate. The product was cleaved from the resin with a TFA/DCM/water mixture (60:40:2) at 28 °C for 5 h (shaking speed = 75 rpm). The liquids were saved, and the beads were washed with methanol (1 mL). The combined liquids were evaporated under stream of air. The residues were dissolved in methanol (1 mL), and analyzed by MS-ESI. The samples were dried, and then dissolved in 1.2 mL of a methanol-water-glycerol (1:1:1, v/ v/v) mixture, providing approximately 5.5 mM concentration. Out of 91 reactions, 79 compounds were successfully synthesized.

**Resynthesis of 2-Aminobenzimidazole Hit Compounds.** *Preparation of the Corresponding Methyl Esters.* To a stirred solution of methyl 3,4-diaminobenzoate (0.5 g, 3 mmol) in DCM (20 mL), the corresponding phenyl isothiocyanate (3.6 mmol) was slowly added. The reaction was stirred at RT for 36 h (monitored by TLC using ethyl acetate). Then, DIC (1.4 mL) was added, and the reaction was stirred at RT for an additional 36 h (monitored by TLC using ethyl acetate). Once the reactions were complete, the mixtures were diluted with a DCM–hexane mixture (1:3, 20 mL), and precipitates of the clean products were filtered.

Saponification of Ester. The corresponding methyl esters (3 mmol) were dissolved in 10% (w/v) potassium hydroxide (KOH) in methanol. The reactions were refluxed for 2 h. The solvent was then evaporated to dryness, and 10 mL of water were added. The product was then acidified with 2 M HCl to pH 2, forming a white precipitate. The product was filtered, washed with ether ( $2 \times 10$  mL), and dried. The residues were dissolved in 60% aq. methanol, and the products were purified by HPLC using a gradient of 5% to 100% B in A over 40 min.

Synthesis of ABI-FI and ABII-FI. N-(2-Propynyl) 5-fluoresceincarboxamide (FI) was synthesized according to a previously published method.<sup>15</sup> A 100 nmol sample of FI in methanol was added to a solution containing 300 nmol of the corresponding 2-aminobenzimidazole, 1  $\mu$ mol of CuSO<sub>4</sub>, 5  $\mu$ mol of freshly prepared solution of ascorbic acid in water, and 60 nmol of tris(benzyltriazolylmethyl) amine (TBTA; dissolved in DMSO). The final volume was brought to 1 mL with methanol. The reaction mixture was added to a microwave reaction vessel, which was placed in an Emrys microwave system (Biotage). The reaction was maintained at 110 °C for 4 h with stirring. The product was purified by preparative HPLC, and characterized by ESI-MS and analytical HPLC as described above. **ABI-FI**: HR-MS calculated mass, 971.3583 (M + H); observed mass, 971.3591;  $t_R = 29$  min; 30% yield as determined by absorbance at 496 nm in 1X PBS, pH 7.4 using an extinction coefficient of 45 000 M<sup>-1</sup> cm<sup>-1.27</sup> **ABII-FI**: HR-MS calculated mass, 1110.3691 (M + H); observed mass, 1110.3688;  $t_R = 38$  min; 25% yield as determined by absorbance at 496 nm in 1X PBS, pH 7.4 using an extinction coefficient of 45 000 M<sup>-1</sup> cm<sup>-1.27</sup>

**Construction of Small Molecule Microarrays.** Alkyne-functionalized microarrays were prepared as previously described.<sup>5,28</sup> Ligands were spotted onto alkyne-functionalized slides in 1X Spotting Solution (10 mM Tris-HCl (pH 8.5), 100  $\mu$ M ascorbic acid, 100  $\mu$ M TBTA (dissolved in 4:1 2-butanol/dimethyl sulfoxide), 1 mM CuSO<sub>4</sub>, and 10% glycerol). The slides were placed in a humidity chamber for 3 h and then washed with NANOpure water. Arrays were allowed to dry on the benchtop.

Initial Small Molecule Library Screen. Internally <sup>32</sup>P-labeled 1 (0.4 nmol) and Torula yeast bulk RNA (1.15  $\mu$ mol; 3-fold excess of ligand spotted) were folded separately in 1X Hybridization Buffer (HB1; 20 mM (4-(2-hydroxyethyl)-1-piperazine ethanesulfonic acid (Hepes), pH 7.5, 150 mM NaCl, and 5 mM KCl) at 60 °C for 5 min and allowed to cool slowly to RT. MgCl<sub>2</sub> was then added to a final concentration of 1 mM. The folded RNAs were mixed together and then carefully pipetted onto a microarray. (Microarrays are preequilibrated with HB1 supplemented with 1 mM MgCl<sub>2</sub> and 40  $\mu$ g/ mL bovine serum albumin (BSA) (HB2) prior to hybridization). The solution was evenly spread across the slide surface with a piece of parafilm, and the slides were hybridized at RT for 45 min. The hybridization solution was removed, and the slides were washed by submerging them in HB2 for 5 min and then in NANOpure water three times for 5 min each. The arrays were exposed to a phosphorimager screen and imaged using a BioRad FX phosphorimager.

Secondary Microarray Screening of Lead Ligands. The slides were hybridized as described above with 80 pmol of internally  $^{32}$ P-labeled 1 and 117 nmol of yeast bulk RNA (3-fold excess of ligand spotted).

**RNA Selection** *via* **2DCS.** Serial dilutions of **ABI–ABV** were delivered to the slide surface and immobilized as described above. The ligand loadings were 1.4, 0.7, 0.4, and 0.2 nmol. The arrays were then hybridized as described above with 20 pmol of internally <sup>32</sup>P-labeled **1** and 79 nmol of each competitor oligonucleotide **2–6** (3-fold excess of the moles of ligand spotted).

**Cloning and Sequencing.** The RT-PCR products were cloned into pUC-19 via double digestion with EcoR1 and BamH1 restriction enzymes. Plasmids were sequenced at Functional Biosciences, Inc.

**Binding Affinity Measurements.** Dissociation constants for the binding of RNAs to ABI-FI and ABII-FI were determined using an in solution, fluorescence-based assay. A selected RNA was folded in 20 mM HEPES, 150 mM NaCl, 5 mM KCl, and 40  $\mu$ g/mL BSA at 60 °C for 5 min and allowed to slowly cool to RT. MgCl<sub>2</sub> was then added to a final concentration of 1 mM. The RNA solution was then titrated into a well of a 96-well plate containing 50 nm of the corresponding ligand in 50  $\mu$ L of HB2. Fluorescence intensity was measured on a Bio-Tek FLX-800 plate reader. The change in fluorescence intensity as a function of RNA concentration was fit to the following equation:<sup>5</sup>

$$I = I_0 + 0.5\Delta\varepsilon(([FL]_0 + [RNA]_0 + K_t) - (([FL]_0 + [RNA]_0 + K_t)^2 - 4[FL]_0[RNA]_0)^{0.5})$$

where *I* and  $I_0$  are the observed fluorescence intensity in the presence and absence of RNA, respectively,  $\Delta \varepsilon$  is the difference between the fluorescence intensity in the absence of RNA and in the presence of infinite RNA concentration, [FL]<sub>0</sub> and [RNA]<sub>0</sub> are the concentrations of **ABI-FI** or **ABII-FI** and RNA, respectively, and  $K_t$  is the dissociation constant. All measurements were performed in duplicate. ASSOCIATED CONTENT

#### **S** Supporting Information

Synthetic procedures, small molecule screening, and computational analysis. This material is available free of charge via the Internet at http://pubs.acs.org.

## AUTHOR INFORMATION

#### **Corresponding Author**

\*E-mail: disney@scripps.edu.

#### Notes

The authors declare no competing financial interest.

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