## AUTOMATED MOTIF DISCOVERING IN RNA MOLECULES

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# Automated motif discovering in RNA molecules 

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#### Abstract

We used a novel graph-based approach to identify recurrent RNA tertiary motifs embedded within secondary structure. We catalogued all the secondary structural elements of the RNA molecule and clustered them using an innovative graph similarity measure. We applied our method to three widely studied structures: H.m 50S, E.coli 50 S and T.th 16S. We identified 10 known motifs without any prior knowledge of their shapes or positions. We additionally identified four putative new motifs.


## 1 Introduction

RNA adopts complex three dimensional (3D) folds to perform biological functions in the cell. This molecular packing is the tertiary structure. Structural studies have revealed that RNA tertiary structure is modular and composed of conserved building blocks called motifs, the formation of which is sequence-dependent $[2,25,36,9,11]$. Thus, the identification and classification of RNA structural motifs based on both sequence and structure information is of value for RNA folding prediction and modelling.

A number of representations of RNA tertiary structure at different levels of detail have been generated and used to develop automated methods for identifying motifs within RNA molecules. The first basic representations were Cartesian coordinates of the atoms or backbone torsion angles found in 3D structures (X-ray or NMR) [28, 30, 10, 7, 35, 12]. Further studies used these representations to develop graph-theoretical representations [8, 1]. In 2001, a descriptive base-pairing nomenclature was proposed by Leontis and Westhof (LW) to systematically annotate and classify non-WC basepairs [20, 19, 16, 37, 14]. In a LW nomenclature-based representation, the tertiary structure is viewed as a (topological) general graph with vertices representing bases labelled by their sequence letter and residue number, and the edges are the interactions between bases labelled by their type of bond. This high-level and unambiguous representation of sequence and structure information will allow improved understanding of sequence-structure relations.

Motif recognition in structural genomics requires two problems to be addressed:

1. Given a description of a known motif, identify this motif in target structures,
2. Given a structure, identify unknown motifs within it.

Using graph theory, the problem of identifying a known pattern in a target graph reduces to (i) searching for isomorphic occurrences of the pattern. This, known as subgraph
isomorphism, is NP-complete in general graphs (i.e graphs without any restriction on any graph parameter) [34], or (ii) finding similar occurrences of the pattern. Practically, this consists of identifying a maximum common subgraph of two input graphs and calculating a score of similarity based on that common substructure. If the similarity score fulfils certain pre-set conditions, the two graphs are considered similar. However, the maximum common subgraph (MCS) problem is NP-hard, APX-hard and W[1]-hard [13] and such an approach is not feasible except for very small graphs such as those in chemoinformatics [15] in which data objects to be identified are chemical compounds described by planar graphs of small size (up to 15 nodes).

The identification of unknown motifs is made more difficult by the fact that the pattern is equally unknown. Thus, different approaches have been proposed. In particular, one study [35] used a previous work on RNA worms [7] to identify recurrent backbone conformations. However, and as pointed out by the authors, these motifs displayed no apparent secondary or primary structure signature and are thus unsuitable for prediction or modelling of RNA. Other studies used the Cartesian coordinates or a derived graph model to search for new patterns in RNA structures [8, 28]. Neither approach, however, addressed the problem of identifying occurrences with inserted bases or basepairs. Indeed, occurrences of a same motif are not always identical but rather display very similar features [22]. The variations observed may be due to natural changes induced by evolution or experimental errors in data collection.

In this paper, we propose a new method for identifying and classifying similar occurrences of a priori unknown RNA motifs using the (topological) graph of the tertiary structure. RNA structural motifs are defined as "small, recurrent, directed and ordered stacked arrays of isosteric non-WC basepairs that intersperse the secondary structural elements and fold into essentially identical three dimensional structures" [21]. Two non-canonical basepairs are said isosteric if they belong to the same geometric family and can substitute each other without distorting the fundamental three-dimensional structure of the motif [21].

In the next section, we introduce our proposal approach for discovering putative RNA motifs.

## 2 Materials and Methods

### 2.1 Data

We downloaded crystal structures from the NDB database [3]. We used the annotation program Rnaview [37] to produce the corresponding RNA graph (see details below). We considered 14 types of interactions: the phosphodiester (backbone) link, the canonical WC pairing GC and AU (to which the wobble pairing GU is commonly added) and the 12 non-WC basepairs defined in the Leontis and Westhof (LW) nomenclature [20, 19]. This classification is based on the observation that a non-canonical interaction involves three dictinct edges: the Watson-Crick edge, the Hoogsteen edge and the Sugar edge. The bases interact in either of two orientations with respect to the glycosidic bonds, cis or trans relative to the hydrogen bonds.

### 2.2 Methods

### 2.2.1 Overview

We used a graph-based representation of the RNA tertiary structure with vertices representing the nucleotides labelled by their sequence letter (and their residue number in the sequence), and edges representing the observed interactions between the nucleotides, labelled by the type of chemical bond. These bonds are:

- phosphodiester bonds (backbone) linking nucleotides adjacent in the sequence,
- the WC or canonical pairings (GC, AU) and the wobble pairing GU forming the skeleton of the secondary structure,
- the 12 non-WC (non-canonical) basepairs defined by LW nomenclature.

We considered wobble pairings to be canonical. Backbone links are directed from $5^{\prime}$ to $3^{\prime}$ and non-canonical pairings with different interacting edges are directed according to the rule WC > Hoogsteen > Sugar-edge. The rest of the interactions are symmetrical.

We undertook the following three steps:

1. identify all secondary structural elements of the RNA tertiary structure;
2. calculate a similarity measure for each pair of structural elements;
3. cluster the structural elements according to the similarity measure.

These steps are detailed below.

## 1. Identifying secondary structural elements

A previous study [18] identifying RNA motifs described local RNA motifs as "often bracketed" by secondary structural elements. Based on these observations, we took the following approaches: we firstly only considered backbone and canonical interactions (not including pseudoknots). Then, using a classical tree representation of the secondary structure [31, 26], we extracted the structural elements corresponding to the bulges, internal, junction, and terminal loops modelled by graphs given by their vertices (the nucleotides) and their edges (the flanking canonical basepairs). Then, for each secondary structural element, and given that we were looking for local motifs, we restored all non-canonical edges between each of its vertices.

To remove pseudoknots, we used secrna, a program developed by Y. Ponty [29] which inputs an RNA pseudoknotted structure and returns its corresponding secondary structure without pseudoknots. The interested reader is referred to [32] for a survey on the related computational methods.

## 2. Computing a similarity measure between two structural elements

The similarity measure between two structural elements involves computing a largest extensible common non-canonical subgraph. The following definitions and notations will be useful to explain this notion. The size of a graph $G$ is defined by the number of its edges. The


Figure 1: Two structural elements with their LECNS (in bold) of size 2. There is a larger common non-canonical subgraph (size 3) comprising the framed basepair, but it is not extensible. Dashed backbone indicates free nucleotides.
non-canonical size of $G$, denoted $\|G\|$, is the number of its non-canonical edges. A graph containing only non-canonical edges is non-canonical. A common non-canonical subgraph of two graphs $G_{1}$ and $G_{2}$ is a non-canonical graph $H$ that occurs in both $G_{1}$ and $G_{2}$.

The completion of a non-canonical subgraph $H$ in a graph $G$ is the graph obtained by adding to H all canonical and backbone edges of $G$ with at least one end in $H$. A common non-canonical subgraph of two graphs $G_{1}$ and $G_{2}$ is extensible if its completions in $G_{1}$ and in $G_{2}$, respectively, are isomorphic. Now, the largest extensible common non-canonical subgraph (LECNS) of $G_{1}$ and $G_{2}$ is an extensible common non-canonical subgraph of $G_{1}$ and $G_{2}$ whose size is maximal. Figure 1 illustrates the notion of LECNS.

We implemented an algorithm for computing the LECNS of two given structural elements. Our algorithm makes use of Valiente's graph isomorphism algorithm [34]. To identify the sequence signature of a motif, only the labels of the edges were considered relevant for the mapping.

The similarity between two graphs $G_{1}$ and $G_{2}$, denoted $\operatorname{sim}\left(G_{1}, G_{2}\right)$, is defined by :

$$
\operatorname{sim}\left(G_{1}, G_{2}\right)= \begin{cases}\frac{\left\|\operatorname{LECNS}\left(G_{1}, G_{2}\right)\right\|}{\max \left(\left\|G_{1}\right\|,\left\|G_{2}\right\|\right)} & \text { if }\left\|\operatorname{LECNS}\left(G_{1}, G_{2}\right)\right\|>1  \tag{1}\\ 0 & \text { otherwise. }\end{cases}
$$

We considered a single common non-canonical edge not to be a relevant motif, and thus included the condition $\left\|\operatorname{LECNS}\left(G_{1}, G_{2}\right)\right\|>1$ in the formula. The following properties hold:

- $0 \leq \operatorname{sim}\left(G_{1}, G_{2}\right) \leq 1$,
- $\operatorname{sim}\left(G_{1}, G_{2}\right)=\operatorname{sim}\left(G_{2}, G_{1}\right)$,
- $\operatorname{sim}\left(G_{1}, G_{2}\right)=1 \Rightarrow$ the completions of the largest non-canonical subgraphs of $G_{1}$ and $G_{2}$ are isomorphic,
- $\operatorname{sim}\left(G_{1}, G_{2}\right)=0 \Rightarrow G_{1}$ and $G_{2}$ have no common non-canonical subgraph of size $>1$.


Figure 2: Dendrogram of hierarchical clustering of H.m 23 S RNA produced with hclust. The structural elements are numbered from 1 to 209 (see Catalogue, section 3.1). Rectangular boxes correspond to clusters obtained using the 0.6 similarity threshold. Structural elements clustered with a null similarity value are not shown. See supplementary material.

## 3. Clustering structural elements

We clustered the structural elements in three steps:
Step 1. We performed a classical hierarchical clustering with average linkage (UPGMA algorithm) analysis based on the measure of similarity defined above. We used the hclust function of the $R$ Project for statistical computing (http://www.r-project.org/). The resulting dendrogram is presented in Figure 2. (Note that since hclust requires a dissimilarity measure, we set $\left.\operatorname{dis}\left(G_{1}, G_{2}\right)=1-\operatorname{sim}\left(G_{1}, G_{2}\right)\right)$.

A threshold value was needed to obtain distinct clusters from the tree. This involved defining the minimal similarity value required within a single cluster. Thus, we took the known motifs of H. m 23S (E-loop, Sarcin-Ricin, C-loop, K-turn) as a reference [18, 22]. The value giving optimal clustering of these motifs was 0.6 (Figure 2). In particular, it distinguished a perturbed sarcin-ricin occurrence (Helix 23S Junction G475) in H.m $23 S$ (fig. 4 of [18]) from a variant of 23 E-loop motif (23S G720) (fig. 15 of [18]). We checked that all similar members within the same cluster had the same backbone orientation. Structural elements with a different backbone orientation from the other cluster members were not retained. The structural element 2 was thereby excluded from the cluster E ( Figure 2).

This first step clustered 41 of the 209 structural elements in H. m 23S. We identified 13 clusters, nine of which corresponded to known RNA motifs. Notably, although this threshold value was set using one reference structure H. $m$ 23S, it also proved optimal for the other
structures.
Step 2. Once the clusters had been generated, we extracted a representative common subgraph, called the non-canonical core, for each cluster and used it to identify a consensus structure for the cluster. The non-canonical core of a cluster is the largest extensible noncanonical subgraph common to more than $50 \%$ of the total number of members in the cluster. We checked whether the structural environment surrounding the non-canonical core shares common features at the level of the secondary structure. Clusters $\mathrm{L}, \mathrm{M}$ and N did not have such common features. Each of these clusters contained an internal loop and a junction loop from which no consensus structure could be derived. The clustering of these structural elements based solely on graph-similarity criteria could not be explained biologically; thus, the corresponding clusters were not considered to be relevant potential motifs.

Step 3. We used the non-canonical core of clusters retained for further analysis to perform graph-based comparisons with given structural elements. Thus, structural elements not belonging to any cluster but containing this core and consistent with the consensus structure were detected and added to their "natural" cluster. Indeed, the similarity threshold value of 0.6 was a good indicator of pairwise similarity when the non-canonical edges of the motif contributed to more than $3 / 5$ of the non-canonical sizes of the two input graphs. Most structural elements (i.e. clustered at step 1) filled this criterion. Those that did not, like the sarcin-ricin element (see structural element 3 in Figure 2), had a pairwise similarity value with each member of their expected cluster below the threshold because the number of the non-canonical edges of the motif in these structural elements contributed to less than $3 / 5$ of their non-canonical size.

We thus clustered eight additional structural elements including the sarcin element S3 (see Appendix).

## 3 Results and Discussion

We validated the identified motifs in two ways:

- by verifying that the known RNA motifs (C-loops, K-turns, Sarcin-Ricins, E-loops) were correctly clustered;
- by calculating the RMSD between all members within a cluster.

To compare our results with previous findings [18, 22], we used the same ribosomal crystal structures: H. marismortui 50 S (pdb 1s72), E.coli 50S (pdb 2aw4) and T. thermophilus 16 S (pdb 1j5e).

### 3.1 The catalogue

The database is available at http://www.lri.fr/~md/RNA/CATALOGUE/catalogue.htm. We listed all secondary structural elements for each chain in each structure. We gave the following data for each structural element:

1. an identifier: a sequential number corresponding to its rank in the tree representation,
2. the set of its non-canonical labels. These are codes used for the names of the interactions between nucleotides. The correspondance between the codes and the names of the interactions are summarised in a table on the home page of the url cited above,
3. a descriptor: the detailed list of its nucleotides and all interactions between them,
4. a 2D view of its corresponding graph produced with Graphviz (http:/ /www.graphviz.org/). This layout is unclear for some structural elements; in these cases, it might be helpful to refer back to the descriptor. The colours used are black for backbone, red for WC basepairs and blue for non-canonical interactions,
5. a 3D view: a pdb file that isolates the structural element in the molecule.

### 3.2 Clustering

The clustering results are given for H.m 23S, E.coli 23S and T.th 16 S (Figure 3 and Table 1). No clusters were formed in the 5 S chain of either H.m or E.coli. Figure 3 shows the 2D diagram of the consensus structure of each motif found (ie. a structure observed in more than half the number of occurrences). For each motif, Table 1 lists the molecule it was observed in, the number of occurrences found and the reference of any corresponding known motif. Occurrences of modified known motifs that were not clustered with their expected families are mentioned in the last column of the table. Further details for each motif are given in the Appendix.

## Known motifs

## C-loop (Family C)

Two of three occurrences of the C-loop motif (C-96 and C-50) were clustered into family (C) for H.m 23 S and E.coli 23S. The C-38 C-loop motif was not clustered into this family because the completion of its largest common non-canonical subgraph was not isomorphic to the completion of the same non-canonical subgraph in the reference C-96 motif. Moreover, the U2721-A2761 pairing in C-96 is canonical whereas its mapped basepair C963-A1005 in C-38 is a non-canonical cis WC/WC.

## K-turn (Family K)

This motif was observed in H.m 23 S and T.th 16S. In H.m 23S, KT-7 and KT-38 were grouped together in cluster (K). The trans Sugar-edge/Sugar-edge base-pairing in KT-46 and KT-58 (id 99 and 123) were not included in the annotation program output; therefore, they were not considered similar to the reference KT-7 occurrence and were clustered into family (T). KT-15 did not match the definition of a motif embedded within a secondary structural element. Indeed, a canonical pairing, A248-U265, "cuts" the internal loop into two bulges (id 23 and 24). In the latter, the reported cis Sugar-edge/Sugar-edge basepair G249-U265 was not output by Rnaview. Finally, in KT-42 (internal loop 89) two non-canonical basepairs forming the non-canonical core of a typical K-turn were not output by Rnaview, and thus this structural element was not considered similar to a typical K-turn. Composite K-turns do not correspond to any secondary structural element and thus were not identified by our method.

(C) C-loop


K-turn

(H)

Hook-turn

(A)
$A$-minor

(E)
E-loop

(F)

E-loop
(G)

E-loop Reverse-Kturn Tandem sheared

(B)

(I)
(D)

(J)

Figure 3: Recurrent motifs found in ribosomal structures. For further details on each motif, see Appendix.

| Motifs | Molecule | PDB file | Occur. | Known/Unknown |
| :---: | :---: | :---: | :---: | :---: |
| (C) | H.m23S | 1s72 | 2 | C-loop [22] |
|  | E.coli23S | 2aw4 | 2 | C-loop [22] |
| (K) | H.m23S | 1s72 | 2 | Kturns KT-7, KT-38 [22] |
| (S) | H.m23S | 1s72 | 6 | Sarcin-ricin [18] |
|  | E.coli23S | 2aw4 | 5 | Sarcin-ricin [18] |
|  | T.th16S | 1j5e | 2 | Sarcin-ricin [18] |
| (H) | H.m23S | 1s72 | 5 | Hook-turn [33] |
|  | E.coli23S | 2aw4 | 6 | Hook-turn [33] |
| (A) | H.m23S | 1 s 72 | 3 | A-minor [23] |
| (E) | H.m23S | 1s72 | 3 | 23S E-loop [18] |
|  | T.th16S | 1 j 5 e | 4 | 23S E-loop [18] |
| (F) | E.coli23S | 2aw4 | 5 | 23S E-loop comprising sarcin G2664 [18] |
|  | H.m23S | 1s72 | 5 | 23 S E-loop comprising composite sarcin G911 [18] |
| (G) | E.coli23S | 2aw4 | 2 | 23S E-loop [18] |
| (R) | H.m23S | 1s72 | 7 | Reverse-Kturn [17] |
|  | E.coli23S | 2aw4 | 6 | Reverse-Kturn [17] |
| (T) | E.coli23S | 2aw4 | 8 | Tandem sheared |
|  | H.m23S | 1s72 | 6 | Tandem sheared comprising KT-46, KT-58 [22] |
|  | T.th16S | 1j5e | 2 | Tandem sheared |
| (B) | H.m23S | 1 s72 | 2 | Unknown |
| (D) | E.coli23S | 2aw4 | 2 | Unknown |
| (I) | T.th16S | 1 j 5 e | 2 | Unknown |
| (J) | T.th16S | 1 j 5 e | 2 | Unknown |

Table 1: List of the clusters formed in H.m 23S, E.coli $23 S$ and T.th $16 S$.

In T.th 16S, neither known ocurrence, KT-11 or KT-23, were similar according to our similarity measure (Figure 1 ) and hence did not form a cluster.

## Sarcin-ricin (Family S)

In T. th 16S, both known occurrences of the sarcin-ricin motif were clustered into family (S). Six known local occurrences of this motif observed in H.m 23S, were also clustered into this family. One composite occurrence, Helix36 Junction G911, was not recognised as a sarcinricin motif. The trans Hoogsteen/Hoogsteen basepair A913-G1071, which is part of the noncanonical core of a typical sarcin was not output by Rnaview. Additionally, the discontinued backbone between residues G1071 and G1292 prevented mapping the completions of the subgraphs corresponding to the non-canonical core. This F72 occurrence was clustered with two other occurrences of sarcin-like motifs, F76 and F30, into the 23S-Eloop family (F).
Five of six occurrences observed in E. coli 23S were clustered together in family (S). G2664 was not recognised as a sarcin motif because A2654-C2666 was output by Rnaview as a trans Hoogsteen/WC and not a trans Hoogsteen/Hoogsteen, as in the sarcin core. This F199 occurrence was clustered with E-loop family (F).

## E-loop (Families E, F, G)

The bacterial E-loop motif consists of two isosteric submotifs related by $180^{\circ}$ rotation [18],:

- trans Hoogsteen/Sugar-edge,
- trans WC/Hoogsteen or trans Sugar-edge/Hoogsteen,
- cis bifurcated or trans Sugar-edge/Hoogsteen.

Some examples of 23S rRNA E-loops were also shown (see fig. 15 of [18] ). Family (E) is similar to a 23 S rRNA E-loop variant, which has a trans WC/Hoogsteen rather than a trans Sugar-edge/Hoogsteen at the second basepair of the submotif. E22 and E35 motifs(see Appendix), together with families $(\mathrm{F})$ and $(\mathrm{G})$, despite lacking one sheared basepair, still qualify as another variant of the 23S E-loop (see fig. 15 of [18] ). Sarcin-like motifs F72, F76 and F30 may also be classified as bulged-G motifs [5] .

## Hook-turn (Family H)

The H161 motif of family (H) was identified as a hook-turn (see fig. 5 of [33] ). In addition to the significant number of occurrences observed in both H.m 23 S and E.coli 23S, this family is conspicuous in that the sequence signature of the non-canonical core is strikingly conserved (see Appendix). Furthermore, all occurrences of this motif seem to occur at corresponding positions in both structures.

## A-minor (Family A)

A close examination of the three family (A) occurrences revealed that A60 is an A-minor motif, similar to that previously reported in [23] .
This motif is termed A-minor because it involves the insertion of the smooth minor groove edges of adenine residues into the minor groove of neighbouring helices, preferentially at CG basepairs. This motif plays an important role in stabilising the tertiary structure of RNA [27].

Reverse-Kturn (Family R)
Family (R) was identified as a reverse-Kturn (see fig. 2 of [17]). Of note, R 175 did not superimpose well with other occurrences of this motif (RMSD $>4 \AA$ ).

## Tandem sheared (Familiy T)

Family (T) is the well known tandem sheared GA motif. Three occurrences of this motif, T53, T131 and T3, in E. coli 23S and two, T65 and T1, in H.m $23 S$ may also be 23S E-loops. The clustering of these occurrences with tandem sheared motifs is not inconsistent since both families share a common non-canonical core.

## Putative new motifs

These clusters (B, D, I, J) do not contain, as far as we know, known motifs. B170 was identified as a three-way junction belonging to family B (see fig. 7 of [24]).

## 4 Conclusion

The present work describes the first automated method for cataloguing all secondary structural elements of an RNA molecule and extracting similar occurrences of structural motifs on the basis of a graph of the tertiary structure. Using an innovative graph similarity measure, we identified numerous occurrences of structural motifs despite the presence of base and basepair insertions in some of these motifs. Such information regarding variation in basepairing and position of insertions and deletions will allow the analysis and prediction of the 3D structure of RNA motifs based on sequence signature in homologous RNA molecules and the structure-based alignment of homologous sequences.

Our method relies on the LECNS algorithm, which identifies the largest common noncanonical subgraph of any two graphs, and hence determines the non-canonical core of an RNA motif. The results showed that this algorithm successfully detects theoretical structural similarities within the graph model of the tertiary structure. However, the detection of composite occurrences made of discontinuous strands is still limited even at this high level of representation. A large proportion of the motifs found correspond to known structural motifs. Further expert examination of the putative new motifs will be required to confirm whether they represent real structural motifs.

With an expected increase in the number of available crystal structures, such an automated method which accelerates the identification and classification of recurrent RNA motifs will be useful in assessing their abundance in an RNA structure or in compiled databases such as the RNAJunction database [4]. We believe this will advance our understanding of the mechanism by which these motifs mediate the folding process of RNA and perform their biological roles in the cell.

## Supplementary material

Dendrograms of hiearchical clustering of T. th 16s, H. m 23 S and E. coli 23 S are available at http://www.lri.fr/~md/RNA/Dendrograms/dendrogram.htm.

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## Appendix: Clusters of structural elements.

Further details on the motifs described in Figure 3 and Table 1 are provided. For each occurrence of a motif, we give:

- the 2D diagram of its consensus structure. The variable length of the single strands is indicated between square brackets. Observed basepair insertions are framed in dashed boxes;
- its sequence. Indicated in bold are conserved bases, but not their corresponding pairing, as represented in the consensus structure;
- the catalogued secondary structural element in which the occurrence was observed,
- the RMSD value calculated with Pymol [6] by aligning the non-canonial core with that of a reference occurrence. For known motifs, the (known) reference occurrence was used; otherwise, the reference occurrence was chosen to minimise the sum of the pairwise RMSDs,
- if the occurrence corresponds to a previously reported motif, its name is also given (between brackets).

(C)

| PDB | Inst. | $(1)$ | $(2)$ | $(3)$ | $(4)$ | $(5)$ | $(6)$ | $(7)$ | $(8)$ | Catalogue | RMSD (ref. C197) |
| :--- | :--- | :--- | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1s72 | C197 | 2721_U | 2720_C | 2719_A | 2718_C | 2717_C | 2763_G | 2762_C | 2761_A | Internal L. (197) | 0.00 (C-96) |
|  | C108 | 1429_U | 1428_C | $1427 \_A$ | $1426 \_C$ | $1425 \_G$ | $1439 \_C$ | $1438 \_G$ | 1437_A | Internal L. (108) | 0.54 (C-50) |
|  |  |  |  |  |  |  |  |  |  |  |  |
| 2aw4 | C98 | 1323_C | 1322_A | $1321 \_A$ | $1320 \_C$ | $1319 \_C$ | 1333_G | 1332_G | 1331_G | Internal L. (98) | 0.68 |
|  | C201 | 2684_U | 2683_C | 2682_A | 2681_C | 2680_U | 2727_A | 2726_A | 2725_A | Internal L. (201) | 0.62 |


(K)

| PDB | Inst. | $(1)$ | $(2)$ | $(3)$ | $(4)$ | $(5)$ | $(6)$ | $(7)$ | Catalogue | RMSD (ref. K10) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :--- |
| 1s72 | K10 | 79_G | 80_A | 81_G | 93_C | $94 \_G$ | $97 \_G$ | $98 \_A$ | Internal L.(10) | 0.00 (KT-7) |
|  | K74 | $938 \_G$ | $939 \_A$ | $940 \_G$ | 1026_C | 1027_G | 1031_G | 1032_A | Internal L.(74) | 0.85 (KT-38) |


(S)

|  | PDB | Inst. | (1) | (2) | (3) | (4) | (5) | (6) | (7) | (8) | (9) | Catalogue | RMSD (ref.S195) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | 1s72 | S195 | 2690_U | 2691_A | 2692_G | 2693_U | 2694_A | 2701_G | 2702_A | 2703_A | 2704_C | Internal L.(195) | 0.00 (G2701) |
|  |  | S101 | 1368_U | 1369_A | 1370_G | 1371_U | 1372_A | 2053_G | 2054_A | 2055_A | 2056_C | Internal L.(101) | 0.27 (G2053) |
|  |  | S19 | 211_U | 212_A | 213_G | 214_U | 215_A | 225_G | 226_A | 227_A | 228_C | Internal L.(19) | 0.43 (G225) |
|  |  | S16 | 173_C | 174_A | 175_G | 176_U | 177_A | 159_G | 160_A | 161_A | 162_C | Internal L.(16) | 0.45 (G159) |
|  |  | S21 |  | 380_A | 381_G | 382_U | 383_A | 406_G | 407_A | 408_A |  | Junction L.(21) | 0.44 (G406) |
|  |  | S3 |  | 463_A | 464_G | 465_U | 466_A | 475_G | 476_A | 477_A |  | Junction L.(3) | 0.55 (G475) |
| $\infty$ | 2aw4 | S91 | 1264_A | 1265_A | 1266_G | 1267_U | 1268_A | 2012_G | 2013_A | 2014_A | 2015_A | Internal L.(91) | 0.41 (G2012) |
|  |  | S21 | 240_C | 241_A | 242_G | 243_U | 244_A | 254_G | 255_A | 256_A | 257.C | Internal L.(21) | 0.43 (G254) |
|  |  | S18 | 203_A | 204_A | 205_G | 206_U | 207_A | 189_G | 190_A | 191_A | 192_C | Internal L.(18) | 0.56 (G189) |
|  |  | S23 |  | 371_A | 372_G | 373_U | 374_A | 400_G | 401_A | 402_A |  | Junction L.(23) | 0.58 (G400) |
|  |  | S5 |  | 457_A | 458_G | 459_U | 460_A | 469_G | 470_A | 471_A |  | Junction L.(5) | 0.57 (G469) |
|  | 1j5e | S63 | 888_G | 889_A | 890_G | 891_U | 892_A | 906_G | 907_A | 908_A | 909_A | Internal L.(63) | 0.34 (G906) |
|  |  | S68 | 1345_U | 1346_A | 1347_G | 1348_U | 1349_A | 1373_G | 1374_A | 1375_A | 1376_U | Junction L.(68) | 0.55 (G1373) |


(H)

| PDB | Inst. | (1) | (2) | (3) | (4) | (5) | (6) | (7) | Catalogue | RMSD (ref.H83) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1s72 | H83 | 1096_U | 1097_A | 1098_A | 1099_G | 1257_C | 1258_G | 1259_A | Internal L.(83) | 0.00 |
|  | H111 | 1457.U | 1458_A | 1459_A | 1460_G | 1483_C | 1484_G | 1485_A | Internal L.(111) | 0.76 |
|  | H201 | 2774_U | 2775_A | 2776_A | 2777_G | 2797_C | 2798_G | 2799_A | Internal L.(201) | 0.33 |
|  | H161 | 2242_U | 2243_C | 2244_A | 2245_C | 2256_G | 2257_G | 2258_A | Junction L.(161) | 1.61 |
|  | H193 | 2673_U | 2674_G | 2675_A | 2676_C | 2809_G | 2810_G | 2811_A | Internal L.(193) | 1.61 |
| 2aw4 | H73 | 999_U | 1000_A | 1001_A | 1002_G | 1153_C | 1154_G | 1155_A | Internal L.(73) | 0.42 |
|  | H101 | 1352_U | 1353_A | 1354_A | 1355_G | 1376_C | 1377_G | 1378_A | Internal L.(101) | 0.69 |
|  | H106 | 1578_U | 1579_A | 1580_A | 1581_G | 1417_C | 1418_G | 1419_A | Internal L.(106) | 0.31 |
|  | H205 | 2739_U | 2740_A | 2741_A | 2742_G | 2762_C | 2763_G | 2764_A | Internal L.(205) | 0.52 |
|  | H161bis | 2197_U | 2198_A | 2199_A | 2200_C | 2223_G | 2224_G | 2225_A | Junction L. (161) | 1.60 |
|  | H196 | 2637_U | 2638_G | 2639_A | 2640_G | 2774_C | 2775_G | 2776_A | Internal L.(196) | 1.66 |


|  |  |  |  |  |  | (A) |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| PDB | Inst. | (1) | (2) | (3) | (4) | (5) | (6) | Catalogue | RMSD (ref. A202) |
| 1s72 | A60 | 766_A | 767_A | 769_C | 892_G | 895_A | 896_C | Internal L.(60) | 0.74 |
|  | A168 | 2429_A | 2430_A | 2432_C | 2459_G | 2460_A | 2461_U | Junction L.(168) | 1.09 |
|  | A202 | 2783_A | 2784_A |  |  | 2788_A | 2789_U | Terminal L. (202) | 0.00 |



|  | PDB | Inst. | (1) | (2) | (3) | (4) | (5) | (6) | (7) | (8) | (9) | (10) | Catalogue | RMSD (ref. E43) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | 1s72 | E55 | 705_C | 706_G | 707_C | 708_A | 709_G | 719_C | 720_G | 721_A | 722_G | 723_G | Internal L.(55) | 0.62 |
|  |  | E117 | 1542_G | 1543_G | 1544_U | 1545_C | 1546_G | 1639_U | 1640_C | 1641_A | 1642_A | 1643_C | Internal L.(117) | 0.78 |
|  |  | E22 | 267_G | 269_G | 270_U |  |  |  |  | 241_A | 242_A | 244_C | Junction L.(22) | - |
| $\stackrel{N}{\sim}$ | 1j5e | E43 | 580_U | 581_G | 582_U | 583_A | 584_G | 757_U | 758_G | 759_A | 760_G | 761_G | Internal L.(43) | 0.00 |
|  |  | E58 | 799_G | 800_G | 801_U | 802_A | 803_G | 779_C | 780_A | 781_A | 782_A | 783_C | Internal L.(58) | 0.53 |
|  |  | E35 | 483_C | 484_G | 486_U | 487_A | 488_C | 446_G | 447_G | 448_A |  | 450_G | Internal L.(35) | - |
|  |  | E54 | 683_G | 685_G | 686_U | 687_A |  |  | 703_G | 704_A | 705_G | 707_C | Internal L.(54) | 1.69 |


(F)

| PDB | Inst. | $(1)$ | $(2)$ | $(3)$ | $(4)$ | $(5)$ | $(6)$ | Catalogue | RMSD (ref. F199) |
| :--- | :--- | :---: | :---: | :---: | :---: | :---: | :---: | :--- | :--- |
| 2aw4 | F145 | 1865_U | 1866_A | 1867_G | 1874_C | 1875_G | 1876_A | Internal L.(145) | 0.92 |
|  | F65 | 860_U | 861_A | 862_G | 915_C | 916_G | 917_A | Internal L.(65) | 0.32 |
|  | F130 | 1716_U | 1717_A | 1718_G | 1742_C | 1743_G | 1744_A | Internal L.(130) | 0.54 |
|  | F199 | 2656_U | 2657_A | 2658_C | 2663_G | 2664_G | 2665_A | Internal L.(199) | 0.00 (sarcin G2664) |
|  | F59 | 1188_U | 1189_A | 1190_G | 817_C | 818_G | 819_A | Junction L.(59) | 0.35 |
|  |  |  |  |  |  |  |  |  |  |
| 1s72 | F46 | 589_U | 590_A | 591_A | 567_U | 568_G | 569_A | Internal L.(46) | 0.30 |
|  | F76 | 954_U | 955_A | 956_G | 1011_C | 1012_A | 1013_A | Internal L.(76) | 0.43 |
|  | F30 | 359_U | 360_A | 362_G | 290_C | 292_G | 293_A | Internal L.(30) | 0.37 |
|  | F72 | 1293_U | 1294_A | 1295_G | 910_C | 911_G | 912_A | Junction L.(72) | 0.33 (composite sarcin G911) |
|  | F143 | 1972_U | 1973_A | 1974_G | 2008_U | 2009_G | 2010_A | Junction L.(143) | 0.54 |



(R)

| PDB | Inst. | $(1)$ | $(2)$ | $(3)$ | $(4)$ | $(5)$ | $(6)$ | Catalogue | RMSD (ref. R138) |
| :--- | :--- | :---: | :---: | :---: | :---: | :---: | :---: | :--- | :---: |
| 1s72 | R87 | 1132_A | 1133_A | 1134_G | 1228_C | 1229_C | 1230_A | Internal L.(87) | 0.45 |
|  | R115 | 1527_A | 1528_A | 1529_G | 1662_C | 1663_G | 1664_A | Internal L.(115) | 0.60 |
|  | R116 | 1658_A | 1659_A | 1660_G | 1531_U | 1532_G | 1533_A | Junctionl L.(116) | 0.37 |
|  | R175 | 2397_G | 2398_A | 2399_G | 2389_U | 2390_U | 2391_C | Terminal L.(175) | 4.45 |
|  | R167 | 2307_A | 2308_U | 2310_G | 2298_C | 2299_G | 2300_A | Terminal L.(167) | 0.49 |
|  | R120 | 1572_A | 1573_A | 1574_C | 1622_G | 1623_C | 1624_A | Internal L.(120) | 0.44 |
|  | R134 | 1767_A | 1768_C | 1769_C | 1774_G | 1775_A | 1776_A | Internal L.(134) | 0.63 |
|  |  |  |  |  |  |  |  |  |  |
| 2aw4 | R113 | 1469_A | 1470_A | 1471_G | 1520_U | 1521_G | 1522_A | Internal L.(113) | 0.37 |
|  | R128 | 1689_A | 1690_A | 1691_C | 1696_G | 1697_G | 1698_A | Internal L.(128) | 0.76 |
|  | R59 | 820_A | 821_A | 946_C | 971_G | 972_A | 973_A | Junction L.(59) | 0.69 |
|  | R77 | 1028_A | 1029_A | 1030_C | 1124_G | 1125_G | 1126_A | Internal L.(77) | 0.53 |
|  | R138 | 1802_A | 1803_A | 1804_C | 1813_G | 1814_G | 1815_A | Internal L.(138) | 0.00 |
|  | R107 | 1571_A | 1572_A | 1574_C | 1424_G | 1426_G | 1427_A | Junction L.(107) | 0.60 |


(T)



| PDB | Inst. | $(1)$ | $(2)$ | $(3)$ | Catalogue | RMSD (ref.B105) |
| :--- | :--- | :---: | :---: | :---: | :---: | :---: |
| 1s72 | B170 | 2369_A | 2356_A | 2330_U | Junction L.(170) | 0.89 |
|  | B105 | 1682_A | 1414_A | 1696_U | Junction L.(105) | 0.00 |


(D)

| PDB | Inst. | $(1)$ | $(2)$ | $(3)$ | $(4)$ | $(5)$ | $(6)$ | Catalogue | RMSD (ref. D46) |
| :--- | :--- | :---: | :---: | :---: | :---: | :---: | :---: | :--- | :--- |
| 2aw4 | D43 | 618_G | 619_G | 621_A | 607_U | 609_A | 610_C | Internal L.(43) | 0.00 |
|  | D16 | 158_U | 159_G | 161_A | 165_A | 167_A | 168_G | Terminal L.(16) | 1.57 |



| PDB | Inst. | $(1)$ | $(2)$ | $(3)$ | $(4)$ | $(5)$ | $(6)$ | $(7)$ | $(8)$ | Catalogue |
| :--- | :--- | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1j5e | I99 | 1303_C | $1304 \_G$ | $1307 \_U$ | $1308 \_U$ | $1329 \_A$ | $1330 \_U$ | 1333_A | 1334_G | Internal L.(99) |
|  | I47 | 605_U | 606_G | 611_A | 612_C | 628_G | $629 \_G$ | 632_A | 633_G | Internal L.(47) |


(J)

| PDB | Inst. | $(1)$ | $(2)$ | $(3)$ | $(4)$ | $(5)$ | $(6)$ | $(7)$ | (8) | Catalogue | RMSD (ref. J51) |
| :--- | :--- | :--- | :--- | :--- | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1j5e | J51 | 662_G | 663_A | 664_G | 666_G | 740_U | 741_G | 742_G | 743_U | Internal L.(51) | 0.00 |
|  | J53 | 673_G | 675_A | 676_A | 677_U | 713_G | 714_G | 715_A | 717_C | Internal L.(53) | 0.79 |

