SETTER - RNA SEcondary sTructure-based TERtiary Structure Similarity Algorithm

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Outline



2 SETTER Algorithm

3 Experimental Results

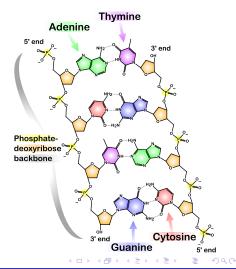
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Genetic Information (DNA)

DNA (deoxyribonucleic acid)

- DNA strand (chain) of nucleotides
 - sugar-phosphate
 - base
- bases
 - adenine (A)
 - cytosine (C)
 - guanine (G)
 - thymine (T)
- doublestranded (Watson-Crick hydrogen base pairs)
 - A + T
 - G + C



DNA Expression

Central Dogma of Molecular Biology

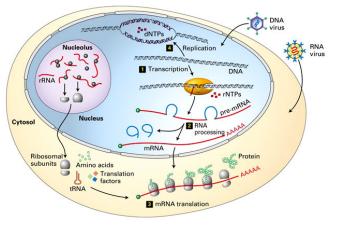
 $\mathsf{DNA} \to \mathsf{RNA} \to \mathsf{protein}$

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RNA Function

- messenger RNA
 - DNA carrier
- transfer RNA
 - amino acid carrier
- ribosomal RNA
 - ribosome building blocks
- gene expression regulation
- catalytic function
- . . .

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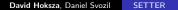
• function determined by structure

RNA structure (PDB ID 1P6V)

Primary Structure

Secondary Structure

Tertiary Structure



RNA structure (PDB ID 1P6V)

Primary Structure

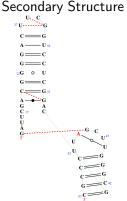
Secondary Structure

Tertiary Structure

 $\begin{array}{c} \mathbf{G} \ \mathbf{G} \\ \mathbf{A} \ \mathbf{A} \ \mathbf{A} \ \mathbf{G} \ \mathbf{G} \ \mathbf{G} \ \mathbf{A} \ \mathbf{U} \ \mathbf{U} \ \mathbf{C} \\ \mathbf{G} \ \mathbf{A} \ \mathbf{C} \ \mathbf{G} \\ \mathbf{C} \ \mathbf{U} \ \mathbf{U} \ \mathbf{C} \ \mathbf{G} \ \mathbf{G} \ \mathbf{G} \ \mathbf{U} \ \mathbf{C} \ \mathbf{C} \\ \mathbf{U} \ \mathbf{C} \ \mathbf{G} \ \mathbf{G} \ \mathbf{G} \ \mathbf{U} \ \mathbf{U} \ \mathbf{C} \\ \mathbf{G} \ \mathbf{G} \ \mathbf{U} \ \mathbf{U} \ \mathbf{C} \ \mathbf{G} \ \mathbf{G} \ \mathbf{G} \ \mathbf{U} \ \mathbf{U} \\ \mathbf{U} \ \mathbf{C} \ \mathbf{C} \ \mathbf{G} \ \mathbf{G} \ \mathbf{C} \ \mathbf{G} \ \mathbf{C} \\ \mathbf{U} \ \mathbf{U} \ \mathbf{C} \ \mathbf{C} \ \mathbf{G} \ \mathbf{G} \ \mathbf{C} \ \mathbf{C} \ \mathbf{G} \ \mathbf{C} \\ \mathbf{G} \ \mathbf{C} \ \mathbf{U} \ \mathbf{U} \ \mathbf{C} \ \mathbf{C} \ \mathbf{G} \ \mathbf{G} \ \mathbf{C} \ \mathbf{C} \ \mathbf{G} \ \mathbf{C} \\ \mathbf{C} \ \mathbf{U} \ \mathbf{C} \\ \mathbf{C} \ \mathbf{U} \ \mathbf{C} \ \mathbf{$

RNA structure (PDB ID 1P6V)

Primary Structure Second G G G G G C G G A A A G G A U U C G A C G G G G A C U U C G G U C C U C G G A C G C G G G U U C G A U U C C C G C C G C C U C C A C C A

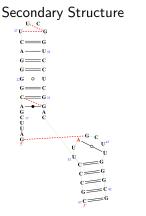


Tertiary Structure

RNA structure (PDB ID 1P6V)

Primary Structure

 $\begin{array}{cccccccc} G & G & G & G & G & C & G & G \\ A & A & A & G & G & A & U & U & C \\ G & A & C & G & G & G & G & G & A \\ C & U & U & C & G & G & U & C & C \\ U & C & G & G & A & C & G & C & G \\ G & G & U & U & C & G & A & U \\ U & C & C & C & G & C & C & G & C \\ C & U & C & C & A & C & C & A \end{array}$

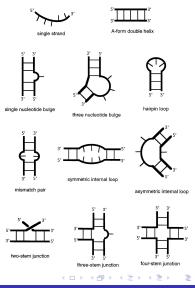


Tertiary Structure



Secondary Structure Motifs

- double helices combined with various types of loop structures
 - hairpin loop
 - internal loop
 - bulge loop
 - junction loop





RNA Databases

- Sequence Databases
 - Genbank
- Structure Databases
 - NDB Nucleic Acid Database (5220 structures)
 - PDB Protein Data Bank (2000 structures)
- Function Databases / Classification
 - SCOR Structural Classification of RNA

RNA similarity

• pairwise sequence and structure similarity utilization:

- RNA structure prediction
- RNA function discovery
- RNA design
- RNA modeling

Outline

Biological Background



3 Experimental Results

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SETTER's Outline and Motivation

Outline:

- Two RNA structures
- Each structure is divided into *generalized secondary structure units* (GSSUs)
- Each pair of GSSUs (one from each of the structures) is superposed
- Optimal pair P of the GSSUs is identified
- Based on *P*, whole RNA structures are superposed and their distance is computed

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Motivation:

- Secondary structure represents clue to superposition
- Basic SSEs are too small and not enough robust

Generalized Secondary Structure Unit — GSSU

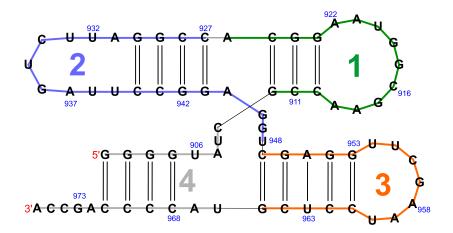
Definition

Let \mathcal{R} be an RNA structure with nucleotide sequence $\{n_i\}_{i=1}^n$ and let $\mathcal{WC} \subset \mathcal{R}$ denote set of n_i participating in a Watson-Crick base pair. By **generalized secondary structure unit (GSSU)** \mathcal{G} , we understand a pair of substrings of \mathcal{R} , $\{n_i\}_{i=i_1}^{i_2}$ and $\{n_i\}_{i=j_1}^{j_2}$ of maximum lengths such that each nucleotide n_x :

- $i_1 \le x \le i_2$: $n_x \notin \mathcal{WC}$ or n_x is paired with n_y where $j_1 \le y \le j_2$
- $j_1 \le x \le j_2$: $n_x \notin \mathcal{WC}$ or n_x is paired with n_y where $i_1 \le y \le i_2$

Let i_{max} and j_{min} be highest indices of the Watson-Crick paired bases. We define **loop** as $\mathcal{L} = \{n_i\}_{i=i_{max}+1}^{j_{min}-1} \subset \mathcal{R}$ and **stem** as $\mathcal{R} \setminus \mathcal{L}$ and **neck** as the pair $\{n_{i_{max}}, n_{j_{min}}\}$.

Generalized Secondary Structure Unit — GSSU

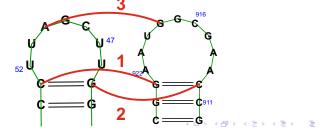


General Structure Similarity by Superposition

- given two sets of 3D coordinates / structures superpose them to optimize given distance/similarity measure
 - pairing
 - superposition (translation + rotation)
 - distance computation
 - root mean square deviation (RMSD)
 - TM-score
 - Ad-hoc measure

Single GSSU RNA Comparison

- Identify candidate set of alignments of triplet pairs (two nucleotides from neck, one from loop).
- Compute RMSD superpositions (i.e. set of rotation matrices and translations vectors) for each of the alignments.
- For each rotation matrix and translation vector superpose the structures.
- For each superposition identify nearest neighbors, sum the distances to get δ and normalize it to obtain the final distance Δ .



SETTER Algorithm Experimental Results

Single GSSU RNA Comparison

$$\begin{split} & \textit{NN}_{\zeta}(x,\mathcal{G}) = \begin{cases} \min_{1 \leq i \leq |\mathcal{G}|} \{ \textit{d}_{nt}(x,\mathcal{G}_i) \} \times \zeta & \text{if } x = \mathcal{G}_i \\ \min_{1 \leq i \leq |\mathcal{G}|} \{ \textit{d}_{nt}(x,\mathcal{G}_i) \} & \text{otherwise} \end{cases} \\ & \gamma(\mathcal{G}^{\mathcal{A}},\mathcal{G}^{\mathcal{B}}) = \sum_{i=1}^{|\mathcal{G}^{\mathcal{A}}|} \begin{cases} 1 & \text{if } \textit{NN}_1(\mathcal{G}^{\mathcal{A}}_i,\mathcal{G}^{\mathcal{B}}) \leq \epsilon \\ 0 & \text{otherwise} \end{cases} \end{split}$$

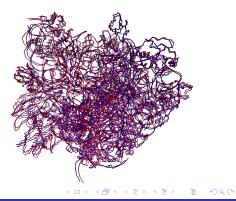
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$$\delta(\mathcal{G}^{\mathcal{A}}, \mathcal{G}^{\mathcal{B}}) = \min_{t \in T} \left\{ \sum_{i=1}^{|\mathcal{G}^{\mathcal{A}}|} \mathsf{NN}_{\alpha}(\mathcal{G}^{\mathcal{A}}_{i}, \tau(\mathcal{G}^{\mathcal{B}}, t)) \right\}$$
$$\Delta(\mathcal{R}^{\mathcal{A}}, \mathcal{R}^{\mathcal{B}}) = \Delta(\mathcal{G}^{\mathcal{A}}, \mathcal{G}^{\mathcal{B}}) = \frac{\frac{\delta(\mathcal{G}^{\mathcal{A}}, \mathcal{G}^{\mathcal{B}})}{\min\{|\mathcal{G}^{\mathcal{A}}|, |\mathcal{G}^{\mathcal{B}}|\}} \times (1 + \frac{||\mathcal{G}^{\mathcal{A}}| - |\mathcal{G}^{\mathcal{A}}||}{\min\{|\mathcal{G}^{\mathcal{A}}|, |\mathcal{G}^{\mathcal{B}}|\}})}{\gamma(\mathcal{G}^{\mathcal{A}}, \tau(\mathcal{G}^{\mathcal{B}}, t_{opt}))}$$
$$(1)$$

Multiple GSSU Matching

$$\Delta(\mathcal{R}^{\mathcal{A}}, \mathcal{R}^{\mathcal{B}}) = \min_{\substack{1 \le i \le n_{\mathcal{A}} \\ 1 \le j \le n_{\mathcal{B}}}} \left\{ \mathcal{G}_{i}^{\mathcal{A}}, \mathcal{G}_{j}^{\mathcal{B}} \right\} \times \left(1 + |n_{\mathcal{A}} - n_{\mathcal{B}}|\right) \times \beta$$
(2)

In the experimental dataset, 44% of structures contain more than one GSSU.



Speed Optimization

Motivation

- NN search has $O(n^2)$ time complexity with respect to GSSU length
- NN search has to be done for each candidate triplet alignment
- Speed-up
 - decrease number of NN searches
 - skip NN search for triplets whose Δ is higher then best distance found so far
 - $\mathcal{T}^{\mathcal{A}} \subset \mathcal{G}^{\mathcal{A}}, \ \mathcal{T}^{\mathcal{B}} \subset \mathcal{G}^{\mathcal{B}} \text{ and } \Delta(\mathcal{G}^{\mathcal{A}}, \mathcal{G}^{\mathcal{B}}) = \chi \implies \text{if} \\ \Delta(\mathcal{T}^{\mathcal{A}}, \mathcal{T}^{\mathcal{B}}) \times \lambda > \chi \text{ then NN search can be skipped}$

Outline



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Experimental Results — Classification

Datasets

- FSCOR 420 structures from SCOR with unique classification
- R-FSCOR structurally dissimilar subset of the FSCOR
- T-FSCOR FSCOR \setminus R-FSCOR

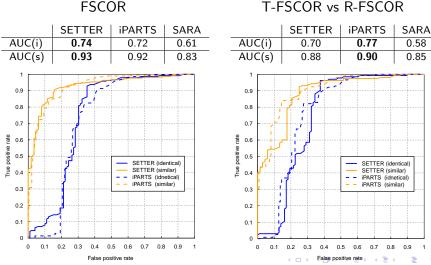
Testing

- leave-one-out on FSCOR
- T-FSCOR vs R-FSCOR
- exact classification
- approximate classification

Qualitative measures

- ROC curves
- AUC (area under the curve)

Experimental Results — Classification



FSCOR

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Experimental Results — Runtime

Runtime comparison of iPARTS, SARA and SETTER. The *tRNA* set contains structures 1EHZ:A, 1H3E:B, 1I9V:A, 2TRA:A and 1YFG:A structures (average length 76 nucleotides), *Ribozyme P4-P6 domain* contains 1GID:A, 1HR2:A and 1L8V:A (average length 157 nucleotides), *Domain V of 23S rRNA* contains 1FFZ:A and 1FG0:A (average length 496 nucleotides) and *16S rRNA* contains 1J5E:A and 2AVY:A (average length 1522 nucleotides).

data set	iPARTS	SARA	SETTER
tRNA	1.1 s	1.7 s	0 .1 s
Ribozyme P4-P6 domain	2.6 s	9.2 s	1 . 8 s
Domain V of 23S rRNA	17.0 s	?	2 . 1 s
16S rRNA	2.8 min	?	8 .1 s

Conclusion and Future Work

Conclusion

- Proposal of a new RNA structure similarity method
- GSSU introduction
- Single GSSU and multiple GSSU structure comparison
- Speedup by early termination
- Promising experimental results
- Future Work
 - Introduction of significance computation into the classification process
 - More sophisticated multiple GSSU comparison
 - Web server

• Thank you. Questions?

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