

test

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## 1 Introduction

### 1.1 Problem formulation

Given an RNA sequence of length  $L$ , we are interested in all possible secondary structures. To represent a specific secondary structure, there are three commonly used conventions: (1) undirected graph, where each node is a base in the sequence, and each edge represents base pairing. (2) upper triangular matrix (excluding the diagonal) of size  $L \times L$  with binary values, where a value of 1 at  $(i, j)$  represents base pairing between sequence position  $i$  and  $j$ , and 0 represents no base pairing. (3) dot-bracket notation of length  $L$  where unpaired bases are denoted as dots, and paired bases are represented as left and right brackets.

As an example, for a short RNA sequence GUUGUGAAAU, one possible structure it can take on consists of a stem and a loop, as seen in Fig ??(a), represented by an undirected graph. Such structure can also be represented by a  $10 \times 10$  upper triangular matrix with all 0's, except for positions  $(1, 10)$ ,  $(2, 9)$  and  $(3, 8)$ , all being 1, as shown in Fig ??(b). This contiguous stretch of 1's along the diagonal corresponds to the stem formed by the three base pairs: G-U, U-A and U-A. The equivalent dot-bracket notation is shown in Fig ??(c), where the stem is represented by three pairs of left-right brackets.

## 1.2 Related work

# 2 Method

## 2.1 Architecture

## 2.2 Training

## 2.3 Inference

# 3 Result

## 3.1 Test set performance

## 3.2 Structures with pseudoknot

# References

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