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## **RNAKINETICS: A WEB SERVER THAT MODELS** SECONDARY STRUCTURE KINETICS OF AN ELONGATING RNA

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The RNAKinetics server (http://www.ig-msk.ru/RNA/kinetics) is a web interface for the newly developed RNAKinetics software. The software models the dynamics of RNA secondary structure by the means of kinetic analysis of folding transitions of a growing RNA molecule. The result of the modeling is a kinetic ensemble, i.e. a collection of RNA structures that are endowed with probabilities, which depend on time. This approach gives comprehensive probabilistic description of RNA folding pathways, revealing important kinetic details that are not captured by the traditional structure prediction methods. The access to the RNAK inetics server is free.

Keywords: RNA secondary structure; kinetics; dynamics; RNA folding.

#### 1. Introduction

RNA secondary structure prediction is a classic bioinformatics task, and there are several common approaches to its solution. The most popular method is free energy minimization, which is often implemented using dynamic programming.<sup>1–3</sup> It allows one to find suboptimal structures along with the optimal one. Monte-Carlo methods<sup>4,5</sup> and genetic algorithms<sup>6,7</sup> are also used for prediction of optimal RNA secondary structures. However, biologically relevant structures can be very different from the ones that are stable from the thermodynamic viewpoint. An alternative approach is based on the idea that biologically important secondary structures are the ones that are evolutionary conservative. These structures can be inferred from multiple sequence alignments.<sup>8,9</sup> The structure of the large sub-unit of ribosomal RNA and several other important structures, e.g. riboswitches,<sup>10</sup> were correctly predicted based on evolutionary conservation. Although the conservative segment quest depends on the physical parameters much less than the energy minimization does, it still requires rather large set of correctly aligned RNA sequences.

The current opinion on RNA structures is directed towards the idea that RNA secondary structures are variable in time rather than static.<sup>11,12</sup> Indeed, the secondary structure of an RNA molecule can and often does change while the molecule is being synthesized. A striking example of a biological process where such changes are functionally important is attenuation of aminoacid operons. The model of attenuation was first supposed by Yanovsky;<sup>13</sup> later it was confirmed for several operons experimentally<sup>14</sup> and by genome analysis.<sup>15</sup> Another class of systems that significantly depend on the formation of RNA secondary structure during transcription is riboswitches, i.e. specific regulatory RNA structures that directly bind to the ligand.<sup>16,17</sup>

In this paper we focus on the description of RNA folding process which takes into account the rate of the transcription. Calculation of the optimal secondary structure for every initial segment of the RNA would not help to describe the folding pathway because it implicitly makes an assumption that the structure relaxation time is much smaller than the time needed for chain elongation. This assumption is not evident and may be even wrong. Here, we follow different methodology, which is based on kinetic analysis of structural rearrangements. It largely relies on the procedure that was developed previously;<sup>18</sup> in this paper we present one of its implementations, the *RNAKinetics* web server.

Modeling of RNA folding kinetics can be done at different levels, which differ by the amount of molecular details they take into account and, consequently, by the choice of elementary step of RNA structure dynamics. The most detailed and accurate (but the least efficient) method is molecular dynamics, which takes into account the movement of every atom.<sup>19</sup> The timescale of this method is about  $10^{-9}$  sec. The next level of analysis considers the opening or closing of a single base pair as an elementary step.<sup>20</sup> It has a timescale of milliseconds. Here we use a higher-level approach, in which the elementary step is formation or disruption of the entire helix. It allows timescales up to 10 sec.

### 2. The Model

#### 2.1. Definitions

A candidate helix is a non-extendable pair of complementary RNA sequence segments, which forms a helix. By helix we mean a double-stranded fragment of the RNA molecule, which decays cooperatively from the closing base pairs. The two segments are assumed to be fully complementary without insertions or deletions. At each instance of time, the molecule has certain length. A secondary structure (current fold) is a set of non-contradicting helices, which are present in the molecule at the given instance of time. A structural rearrangement is a spontaneous decay or formation of a helix. A kinetic ensemble is a set of secondary structures endowed with probabilities that depend on time.

### 2.2. Basic model

The set of helices in the secondary stucture undergoes two kinds of transformations that occur spontaneously due to thermal fluctuations. A helix can decay or a new helix can form. The spontaneous decay kinetic constant depends on the energy of the helix and on its length.<sup>21</sup>

$$k_{\rm dis} = \kappa_c \cdot N_h \cdot \exp\left(\frac{\Delta G_{\rm helix}}{kT}\right). \tag{1}$$

Here  $\kappa$  is the kinetic constant of one marginal complementary pair locking,  $\kappa = 10^6 \cdots 10^8 \,\mathrm{s}^{-1}$ ,  $N_h$  is the number of staking interactions in the helix (i.e. the length of the helix in base pairs minus one), and  $\Delta G_{\text{helix}}$  is the helix energy, which includes energies of stacking interactions and hydrogen bonds. The helix formation kinetic constant depends on the difference of energies of loops that was caused by the formation of the helix.

$$k_{\rm form} = \kappa_c \cdot N_h \cdot \exp\left(-\frac{\Delta G_{\rm loops}}{kT}\right). \tag{2}$$

These two equations obey the local balance between the states with and without the helix for the equilibrium.

The basic model is simulated as follows. On the initial step, all candidate helices, whose decay constants are less than a critical value (typically,  $10^3 \text{ s}^{-1}$ ), are identified in the given RNA sequence. Denote their number by M. Before simulation starts, the time t and the length of the molecule l are set to 0.

On each step of the simulation, we have current time t, molecule's current length l, and its current fold. The current length determines the accessible part of the sequence at time t. The current fold contains all helices that are present in the molecule at time t. The possible structural rearrangements are (1) decay of a helix that belongs to the current fold, and (2) formation of a helix that is not present in the current fold, but belongs to the accessible part of the sequence. The kinetic constants  $k_i$ , i = 1, ..., M for each of these transitions are calculated according to Eqs. (1) and (2). We put the chain elongation constant  $k_{M+1}$  equal to  $k_E$ , if the chain is not completed yet, or equal to zero, otherwise, where  $k_E$  is the chain's growth rate. The number of transition is chosen randomly according to the set of kinetic constants  $k_i$ , i = 1, ..., M + 1. The increment of time,  $\Delta t$ , is drawn randomly from the exponential distribution with parameter  $K = \Sigma k_i$ . The current parameters (current time, current length and current fold) are updated accordingly.

Multiple runs of this algorithm yield the kinetic ensemble, i.e. distribution of RNA structures with frequencies, which depend on time. This model reflects more adequately the physics of RNA folding than the Kavasaki algorithm<sup>20</sup> and is more "ideal" in the sense of Ref. 22.

#### 2.3. Advanced model

In the basic model, the helices are consistent with each other, i.e. the helices that belong to the current fold do not have common nucleotides. The advanced model allows helices to overlap. Here we assume that either of the overlapping helices may exist, and the transition between them is very fast. The transition constants are replaced by effective transition constants, which take into account all preliminary events that lead to a helix formation, such as partial or complete decay of one of the overlapping helices, if it prevents formation of a new helix.<sup>23</sup>

The mutual arrangements of the candidate helices can be classified as follows. Assume that helix A already exists, and we want to determine the kinetic constant of helix B formation, which depends on how A and B are positioned with respect to each other.

- The two helices are completely compatible. Then the kinetic constants for helices formation are given by Eq. (2).
- The helices partially overlap; the B helix formation can be freely initiated. Here, the helix formation kinetic constant is given by Eq. (2), where  $N_k$  is the number of free complementary base pairs. After the initiation, the resulting fold contains both helices connected by "sliding loop", or the new helix consumes the old one.
- Free initiation of the new helix is impossible, i.e. the old helix must decay partially or completely in order to start the formation. The formation constant is calculated as

$$\frac{1}{k_{\rm form}} = \frac{1}{k_{\rm dis}} + \frac{1}{k_{\rm ini}}.$$

Here  $k_{\text{dis}}$  is the kinetic constant of the decay of the base pairs, which prevent the initiation; it is given by Eq. (1) with  $\Delta G_{\text{helix}}$  and  $N_k$  that correspond to the dissociating base pairs only. The initiation constant,  $k_{\text{im}}$  is given by Eq. (2) with  $N_k = 1$ .

## 3. The RNAKinetics Server

The server is based on the Java program that impements the algorithm described above (http://www.bioinf.fbb.msu.ru/RNA/kinetics). The program uses the RNA folding energy parameters from Ref. 24. The following input data are required:

- RNA sequence;
- chain elongation constant  $k_E$ ;
- nucleation constant  $\kappa$ ;
- final time of the simulation T;
- number of runs of the simulation  $N_{\rm runs}$ .

When started, the model runs until the experiment time t reaches the final time T. This procedure is repeated  $N_{\rm runs}$  times to accumulate some statistics. The server accepts FASTA sequence format or plain test sequence. DNA sequences are translated to the RNA alphabet.

The output page contains:

- list of candidate helices (with helix energy, helix length,  $k_{dis}$ , and the plot of the probability of the given helix versus time);
- list of secondary structures sorted by their lifetimes (with structure energy and the plot of the probability of the given structure versus time);
- comparative probability-versus-time plots for helices;
- analogous plot for secondary structures;
- plot of nucleotide availability, i.e. probability of the nucleotide at the given position to be paired versus position number.

The secondary structures were drawn using NAView software<sup>25</sup> implemented as a part of Vienna RNA package.<sup>25</sup> Gnupot software<sup>26</sup> was used to draw the probability plots. The postscript files were converted to image format using GSview (GhostView).

The running time of the RNAK inetics server depends on sequence length, number of runs, and also on the number of candidate helices and their stabilities. The current version of the server takes sequences up to 250 nucleotides long. Folding of a typical tRNA with  $N_{\rm runs} = 100$  takes approximately 10 s.

## 3.1. Example

As an example, we now discuss the folding of tRNA<sup>ile</sup> (gene ileV) from *Escherichia coli*. The sequence

# ggcuuguagcucaggugguuagagcgcaccccugauaagggugaggucg gugguucaguccacucaggccuacca

The full output is available on the server's web page ("example" page). The short summary is following. As the sequence grew, the new candidate helices were the most probable (see Figs. 1(a)-(d)) and finally, when it was completed, the classic

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Fig. 1. The sample RNAKinetics server run results digest. The non-trivial RNA structures that were obtained as the most probable for the time ranges of approximately (a) 0.5-0.7, (b) 0.7-1, (c) 1-1.6 and (d) 1.6-3 seconds after an experimental run starts. The non-folded strand was the most probable for the first 0.1 seconds and it is not shown on the figure. The BLUE rectangles show the helices, which are identified by numbers. The RED DOTS plots on (d) show a "sliding loop", i.e. the "A" letter can be contained in A–U pair terminating the 11th helix or in that terminating the 15th one.

"clover leave" tRNA structure (Fig. 1(d)) has become the best. The figure shows the most probale structures on different time intervals, but there are many minor intermediate structures that appears and disappears during folding.

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