

## Structural bioinformatics

**iFoldRNA: three-dimensional RNA structure prediction and folding**

Shantanu Sharma, Feng Ding and Nikolay V. Dokholyan\*

Department of Biochemistry &amp; Biophysics, University of North Carolina at Chapel Hill, Chapel Hill, NC 27599, USA

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**ABSTRACT**

**Summary:** Three-dimensional RNA structure prediction and folding is of significant interest in the biological research community. Here, we present iFoldRNA, a novel web-based methodology for RNA structure prediction with near atomic resolution accuracy and analysis of RNA folding thermodynamics. iFoldRNA rapidly explores RNA conformations using discrete molecular dynamics simulations of input RNA sequences. Starting from simplified linear-chain conformations, RNA molecules (<50 nt) fold to native-like structures within half an hour of simulation, facilitating rapid RNA structure prediction. All-atom reconstruction of energetically stable conformations generates iFoldRNA predicted RNA structures. The predicted RNA structures are within 2–5 Å root mean square deviations (RMSDs) from corresponding experimentally derived structures. RNA folding parameters including specific heat, contact maps, simulation trajectories, gyration radii, RMSDs from native state, fraction of native-like contacts are accessible from iFoldRNA. We expect iFoldRNA will serve as a useful resource for RNA structure prediction and folding thermodynamic analyses.

**Availability:** <http://iFoldRNA.dokhlab.org>.

**Contact:** dokh@med.unc.edu

**Supplementary information:** Supplementary data are available at *Bioinformatics* online.

**1 INTRODUCTION**

The central dogma of molecular biology presented RNA as the fundamental ingredient in genetic translational machinery. However, recent discoveries of RNAi, ribozymes and aptamers have extended the scope of RNA function beyond the central dogma. We now understand that RNA molecules serve diverse structural, catalytic and regulatory function in eukaryotic cells. The tertiary structure of RNA molecules plays a crucial role in determining RNA function. However, accurate prediction of three-dimensional (3D) structure and folding kinetics of RNA presents a significant challenge in molecular biotechnology. The necessity of large quantities of pure RNA samples and technical limitations hinder the applications of X-ray crystallography, and nuclear magnetic resonance for high-throughput structure elucidation. These challenges have led to a newfound interest in computational prediction of RNA tertiary structure (Shapiro *et al.*, 2007) and investigating thermodynamics and mechanism of RNA folding.

A majority of computational methods for probing RNA structure and folding dynamics are limited to secondary structure

elucidation, while stochastic models have been used to study RNA folding kinetics. Although these computational approaches have demonstrated a significant utility in predicting the RNA secondary structure, they are largely inadequate for predicting 3D RNA structures. Recently, fragment assembly Monte Carlo (Das and Baker, 2007), nucleotide cyclic motifs (Parisien and Major, 2008) and discrete molecular dynamics (DMD) simulations (Ding *et al.*, 2008) have been proposed for 3D RNA structure prediction. Here, we present iFoldRNA (<http://iFoldRNA.dokhlab.org>), a web-resource for rapid and accurate predictions of 3D RNA structures and probing folding thermodynamics. iFoldRNA performs folding simulations using the DMD engine (Ding *et al.*, 2008; Dokholyan *et al.*, 1998) and Medusa force field (Ding and Dokholyan, 2006) to simulate RNA folding dynamics.

**2 METHODS**

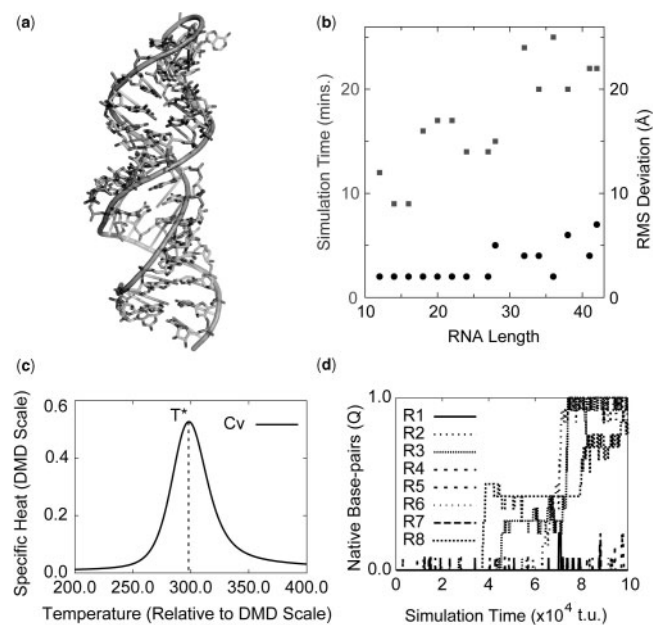
A simplified three-bead per nucleotide model of RNA and replica-exchange DMD simulation protocol with eight replicas is used to sample the RNA conformational space (Ding *et al.*, 2008). An estimate of the free energies of RNA loop regions is explicitly included in the force-field to model the entropic contributions from RNA loop formation. The simulation is followed by a reconstruction protocol to generate atomic resolution structures. 3D structures corresponding to the lowest free energy states in DMD scale are ascribed as the near-native conformations.

A 520-processor Topsail Linux cluster from the University of North Carolina is used for performing replica-exchange DMD simulations of RNA folding (Ding *et al.*, 2008). The backend of iFoldRNA distributes simulation tasks from the iFoldRNA website to compute nodes of the Topsail cluster using a queue scheduler and a Java-based network communication (Sharma *et al.*, 2006). Once a DMD simulation completes, the compute node generates the putative native-like structures having least relative free energy in DMD scale and user-specified simulation thermodynamic outputs. These outputs are dispatched back to the scheduler and subsequently the user is notified of simulation results via email.

**3 RESULTS**

Multiple native-like RNA topologies and the corresponding relative free energy values are accessible from the iFoldRNA server. Our recent work has demonstrated the efficacy of the DMD conformational sampling engine in rapid simulations of RNA folding dynamics (Ding *et al.*, 2008). The iFoldRNA resource enables world-wide access to rapid tertiary structure prediction and folding thermodynamics of RNA molecules using the DMD engine. Folding parameters including inter-nucleotide contact maps, simulation trajectories, gyration radii, root mean square deviations (RMSDs) from native state, and fraction of native-like contacts

\*To whom correspondence should be addressed.



**Fig. 1.** iFoldRNA tertiary structure prediction and folding thermodynamics. (a) Superposition of iFoldRNA generated stem-loop (sticks) versus corresponding NMR structure (cartoon; Nucleic Acid DataBank: 1n8x; all-atom RMSD: 2.65 Å). (b) Scaling of iFoldRNA simulation times (grey squares) and RMSDs (black circles) with increasing RNA length. Turnover time of RNA simulations is plotted as a function of total number of nucleotides in RNA. For intermediate-length RNA sequences (<50 nt), simulation turnover times are within 30 min yielding 2–5 Å RMSD between predicted and experimental structures. (c) Graph of specific heat of the stem-loop (Nucleic Acid DataBank: 1n8x) versus temperature generated using iFoldRNA-Analysis. Weighted histogram analysis method is used to compute the 2D potential of mean force from replica-exchange DMD simulations.  $T^*$  denotes the conformational transition temperature in relative DMD units. Figure generated using iFoldRNA-Analysis. (d) Fractions of native-like base pairs ( $Q$ -values) for eight replicas (R1–R8) in the model 1n8x folding simulation. Replicas (R1, R2, R8) explore native-like conformations with  $Q$ -values  $\sim 1.0$  within  $1 \times 10^5$  time units of replica exchange DMD simulation. Graph generated by iFoldRNA using GNUPlot software.

( $Q$ -value) are accessible from the iFoldRNA server. Secondary structures generated by iFoldRNA are consistent with Mfold and ViennaRNA predictions.

Low RMSDs (2–3 Å) are observed in 3D superpositions of iFoldRNA predictions against experimental structures, demonstrating the accuracy of iFoldRNA in structure prediction (Fig. 1a and b). Typical iFoldRNA folding simulations and analyses are performed within an hour (Fig. 1b) as compared to months to years spent on conventional molecular dynamics simulations to adequately explore the conformational space. Fast conformational

sampling ability of DMD enables rapid structure prediction of putative RNA sequences using iFoldRNA. We have also developed a post-simulation analysis tool, iFoldRNA-Analysis available at the iFoldRNA website for user-specified analysis of RNA folding using the weighted histogram analysis method (<http://www.mmts.org>). Sample simulation outputs obtained from iFoldRNA and iFoldRNA-Analysis are elucidated in Fig. 1c and d. Folding transition temperatures obtained from specific heat graph (Fig. 1c) and fractions of native base pairs (Fig. 1d) can be directly compared across different RNA sequence.

Large RNA molecules having >50 nt (e.g. ribosomal RNA, NDB: 2il9, 142 nt) require significantly longer time scales to sample the exponentially increasing conformational space. This limits the accuracy of the iFoldRNA structure prediction to intermediate-length RNA molecules (<50 nt). In future, experimental constraints, e.g. using SHAPE (Wilkinson *et al.*, 2005) may be integrated with iFoldRNA to overcome such size limitations. We anticipate that the iFoldRNA server will gather significant attention in the research community interested in predicting 3D structures and probing folding mechanisms of RNA molecules. The iFoldRNA server is freely accessible at <http://iFoldRNA.dokhlab.org> for academic and non-profit users.

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**Conflict of Interest:** none declared.

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