# Using Unassigned NMR Chemical Shifts to Model RNA **Secondary Structure**

- ribonucleic acid (RNA) plays a number of fundamental roles within all cells.
- In order to understand how it performs these vital functions, it is important that we understand the structure of RNA.
- A variety of diseases (such as cancer, lupus, and epilepsy) have RNA involved in their pathogenesis and an understanding of RNA structure will help treat such diseases.
- Current approaches to RNA structural prediction are either strongly limited by our understanding of RNA thermodynamics or require difficult-to-collect data.

Riboswitches

b HIV-1 genom

My project focused on developing an approach to predict RNA structure using only easy-to-collect experimental data.

c Pre-mRNAs

#### **The Structure and Function of RNA Chemical Shifts and NMR** • Chemical shifts are a type of experimental data collected Recent research has found that a molecule called through a method known as NMR spectroscopy. •

- Essentially, chemical shift readings help us understand the chemical environment around each atom in a molecule.
- Consequently, chemical shifts can be used to refine predictions of RNA structure.

## The Bayesian/Maximum Entropy Method

- In order to predict the structure of a given RNA molecule, • we used tools to generate a set of possible structures based on energy considerations (generally, the structures with the lowest energy are likely to be the natural structure).
- We then used a statistical method called the **Bayesian/Maximum Entropy (BME)** method to assign weights to each possible structure.
  - The weights represent the probability that the given structure will be experimentally sampled.



(Ganser et al.)

### Results

- Overall, we were able to demonstrate that our model was able to predict RNA structure with high (greater than 85%) accuracy.
- Consequently, we were able to demonstrate that the uCS-BME framework is a viable method for RNA structural prediction, both in research and in industry.
- We were able to test our model by using it to predict the secondary structure of regions of the SARS-CoV-2 (the virus that causes COVID-19) viral genome.
  - Our model was able to predict the structure with accuracy on par with or better than that of the most commonly used RNA structural prediction tool.
- In addition, our model showed high accuracy for large RNA sequences as compared with conventional RNA prediction tools whose accuracy tends to greatly decrease for long RNA segments.

- Essentially, structures with higher weights are more likely to be found in living cells.
- The BME method attempts to assign weights to maximize agreement with experimental data (chemical shifts).
- However, if we attempt to assign weights to perfectly • match the experimental data, the model would be extremely susceptible to experimental variation.
- Thus, the BME method attempts to fit the experimental data while also preventing the model from deviating too much from the initially assumed weights.

## **Applications**

- We believe that this tool can be used to help researchers • in both academia and industry to better understand the function of RNA in a variety of diseases in order to develop novel diagnostics and therapeutics for these diseases.
- Additionally, we hope that our model can help elucidate • the mechanisms through which RNA performs its various functions.
- Finally, it is our hope that models like this one can help • researchers achieve one of the ultimate goals in the biosciences: to gain a predictive understanding of the function of living systems.

#### References

Moudgal, N.; Arhin, G.; Frank, A. T. Using Unassigned NMR Chemical Shifts to Model RNA Secondary Structure. The Journal of Physical Chemistry A 2022, 126 (17), 2739-

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[Conformer 2]		







#### (Moudgal et al.)

- 2745.
- Bottaro, S.; Bengtsen, T.; Lindorff-Larsen, K. Structural Bioinformatics; Springer, 2020; pp 219–240.
- Ganser, L.R., Kelly, M.L., Herschlag, D. et al. The roles of • structural dynamics in the cellular functions of RNAs. Nat *Rev Mol Cell Biol* **20**, 474–489 (2019). https://doi.org/10.1038/s41580-019-0136-0
- Zhang, K.; Frank, A. T. Probabilistic Modeling of RNA Ensembles Using NMR Chemical Shifts. J. Phys. Chem. B 2021, 125, 9970-9978.