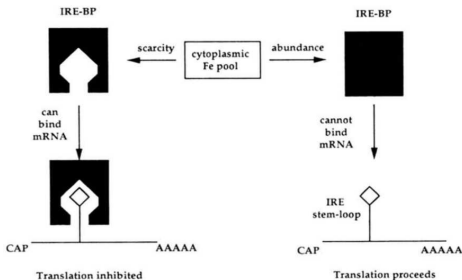


Measures to detect the effect of SNPs on RNA secondary structure

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University of Copenhagen

- ▶ Structural features are essential for the proper function of many ncRNAs and *cis*-acting regulatory elements.
- ▶ e.g. Iron responsive element (IRE)



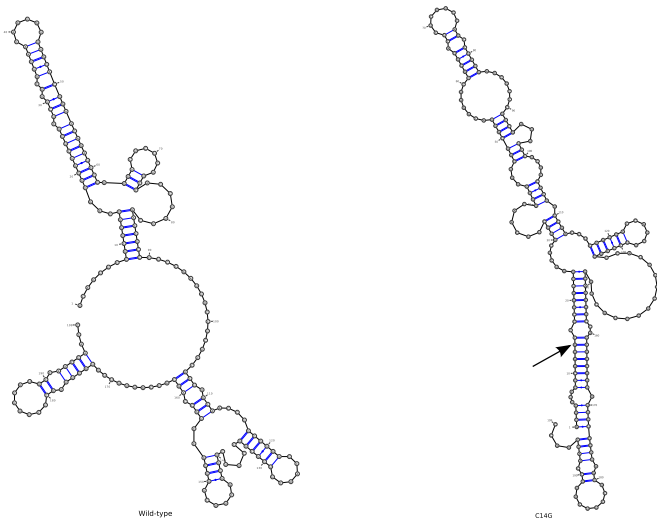
- ▶ Structural changes in IRE - aberrant FTL gene regulation - **hereditary hyperferritinemia-cataract syndrome**

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- ▶ Structural changes in tRNA - wide variety of diseases including **diabetes, cardiomyopathies**, etc.,
- ▶ Mutation tolerant RNA viruses - the RNA structural change inhibit the **replication and translation initiation processes**.

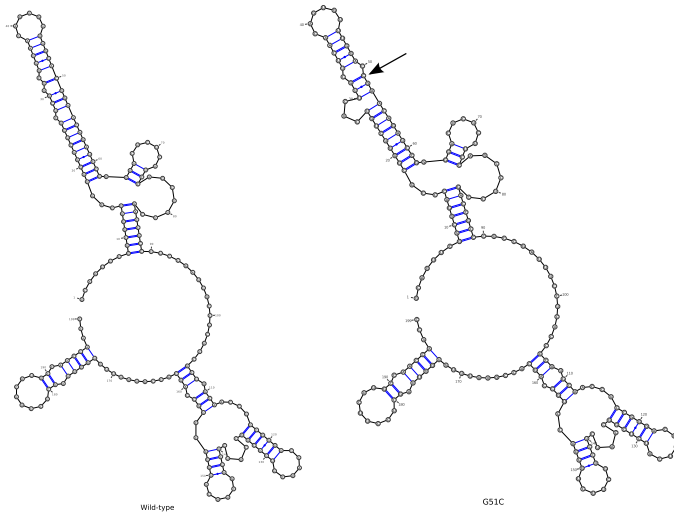
Global Structural change

Example: Structure of 5'UTR region of FTL mRNA



Local Structural change

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▶ **Resources**

- ▶ RNAmute (Churkin and Barash, 2006; 2008)
- ▶ RDMAS (Shu et al., 2006)
- ▶ RNAmutants (Waldispuhl et al., 2008; 2009)
- ▶ SNPfold (Halvorsen et al., 2010)

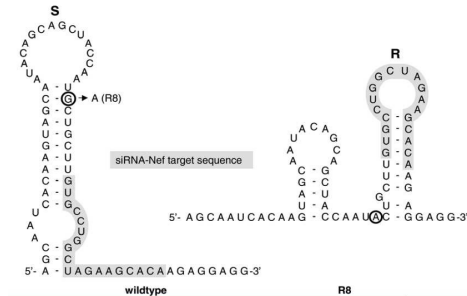
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▶ **Limitations**

- ▶ Uses the global structure prediction method
- ▶ Long-range base pairs have limited accuracy
- ▶ Less importance for local structural changes

- ▶ Local structural change in binding regions (Westerhout et al., 2005; Abbink et al., 2008; Hemert et al., 2008; Grover et al., 2011).
- ▶ e.g., structural change affects the binding of siRNA in Nef gene in human immunodeficiency virus (HIV-1) (Westerhout et al., 2005).



- ▶ Develop a method to detect SNP induced structural change in local regions of an RNA structure.
- ▶ Employ different measures to compute the difference between the base-pair probabilities of wild-type and mutant structures.
- ▶ Pipeline for genome-wide analysis

RNA Folding

- ▶ Base-pair probabilities (P) of ensemble secondary structures - partition function (McCaskill, 1993) – RNAfold and RNAlfold
- ▶ P_{ij} are the probabilities of nucleotides i and j form a base pair

- ▶ Difference between wild-type (P) and mutant (P^*) can be measured by,
 - ▶ Euclidean base pairing distance,

$$d^2(P, P^*) = \sum_{i < j} (P_{ij} - P_{ij}^*)^2$$

- ▶ Pearson correlation coefficient,

$$r(P, P^*) = \text{cov}(P, P^*) / \sqrt{\text{var}(P)\text{var}(P^*)}$$

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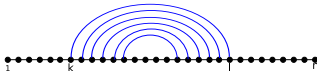
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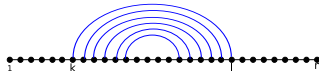
- ▶ compute the difference for all sequence intervals $[k, l]$ in the given sequence $1 \leq k \leq l \leq n$,

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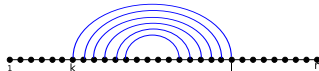
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compute $d_{[k, l]}^2(\pi, \pi^*)$ and $r_{[k, l]}(\pi, \pi^*)$

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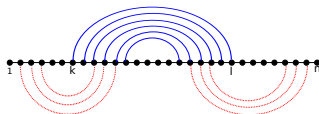


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- ▶ **Identify the potential SNPs on genome**
 - ▶ Compute the local base pairing probabilities using RNAplfold with the parameters $W=200$ and $L=120$.
 - ▶ Use the distance measure with fixed window length ($h'=200$ and $h''=20$)

$$d_{(k)}^2(P, P^*) = \sum_{i=k}^{k+h'} \sum_{j=i}^{i+h''} (P_{ij} - P_{ij}^*)^2$$

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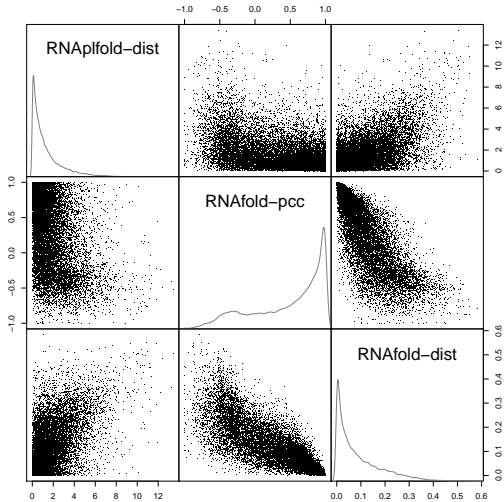
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- ▶ RNAplfold-dist score - $\max_k d_{(k)}$

▶ Identify the local structural change

- ▶ Consider the sequences flanking (+/- 200) to SNP position and compute base pairing probabilities using RNAfold
- ▶ Compute the difference using $d_{[k,l]}^2(\pi, \pi^*)$ (RNAfold-dist) and $r_{[k,l]}(\pi, \pi^*)$ (RNAfold-pcc) for all sequence intervals $[k, l]$.

Comparison of measures



- ▶ Collected a set of disease-associated SNPs (dSNPs) and predicted microRNA target sites on 3'UTRs of human genes - miRdSNP database (Bruno et al., 2012).

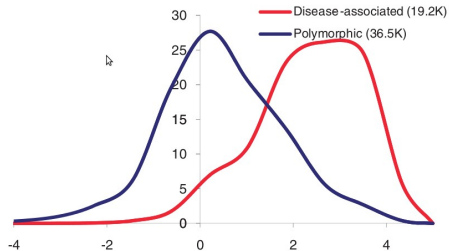
	dSNPs	polymorphic
No. of variants in 3'UTR	611 ^a	1433 ^b
No. of miRNA target sites mapped ^c	546	689
Local structural change in miRNA target sites	?	?

^a461 - Genes, 231 diseases

^bpresent in flanking regions(\pm 200) of dSNPs

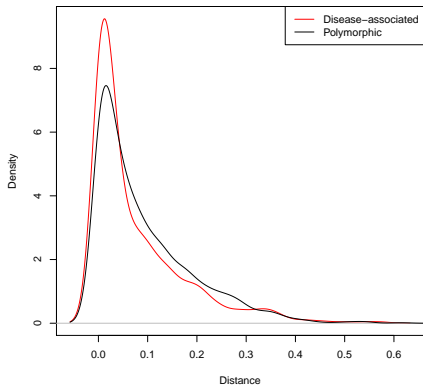
^ctarget sites are predicted using TargetScan5.0 and PicTar

dSNPs Vs polymorphic variants

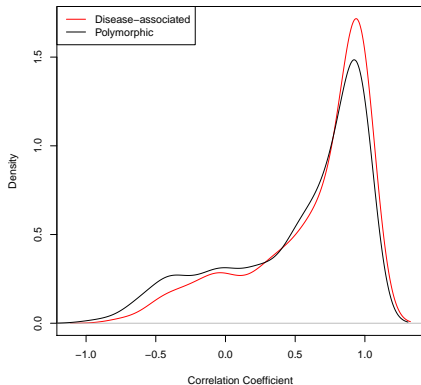


dSNPs Vs polymorphic variants

RNAfold-distance



RNAfold-PCC



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No. of variants in 3'UTR	611 ^a	1433 ^b
No. of miRNA target sites mapped ^c	546	689
Local structural change in miRNA target sites	102	159

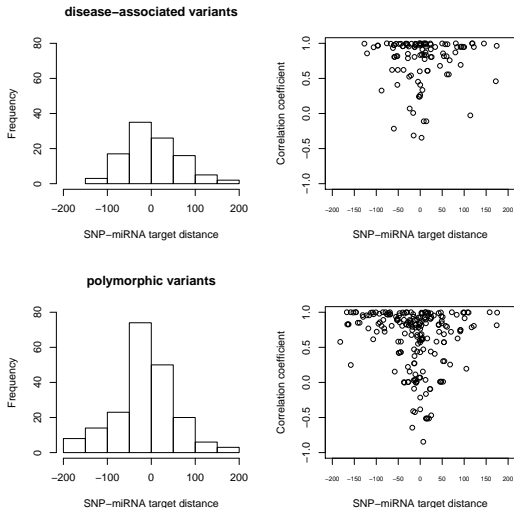
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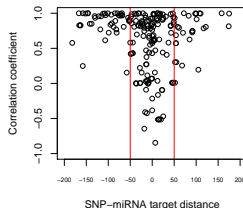
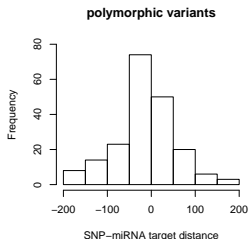
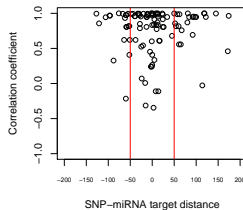
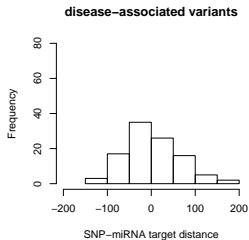
Structural changes in miRNA target sites

Distance between the SNP position and miRNA target site

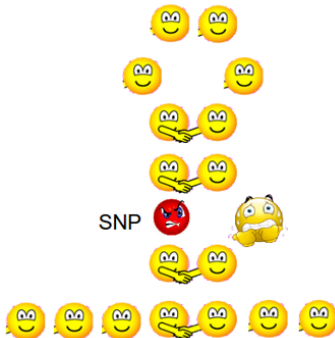
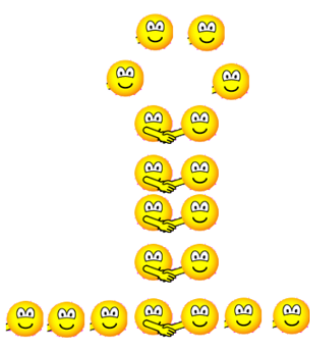


Structural changes in miRNA target sites

Distance between the SNP position and miRNA target site



- ▶ Stefan Seemann
- ▶ Hakim Tafer
- ▶ Peter F. Stadler
- ▶ Jan Gorodkin
- ▶ All colleagues of RTH



Thanks for your attention