

RNA Folding Algorithms with G-Quadruplexes

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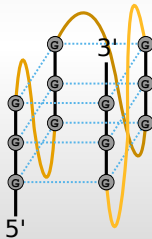
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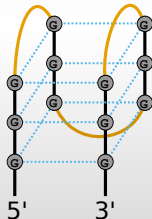
Doubice, Czech Republic, October 5, 2012

What are G-Quadruplexes

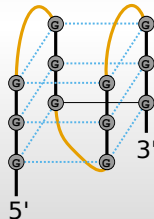
- G-rich nucleic acid sequences can form stacked arrangements of G-quartets
- Stable local structure of 4 interconnected strands
- 2-5 quartet layers connected by 3 short loops
- Sequence pattern follows $G_L N_{I_1} G_L N_{I_2} G_L N_{I_3} G_L$
- Several structure arrangements possible



parallel



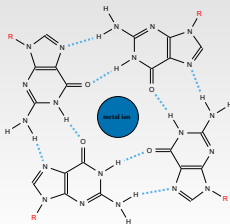
anti-parallel



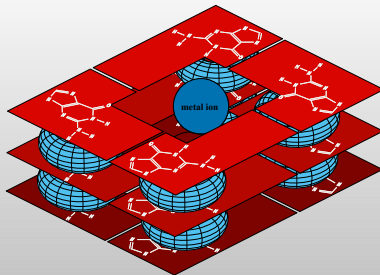
mixed

Why are G-Quadruplexes

8 Hogsteen-Watson Crick hydrogen bonds



π -orbital stacking between layers



Where are G-Quadruplexes

DNA:

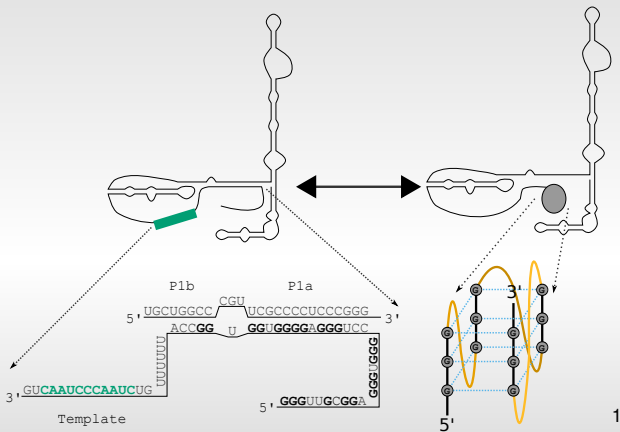
- Human Telomers: Telomerase inhibition
- Promotor Regions: Modulation of gene transcription
- Elsewhere: Interference with protein function

RNA:

- Eukaryote genomes: Translation modulation
 - 5' and 3' UTR of mRNAs: post-transcriptional control of gene expression
 - exonic regions of mRNAs: ligand for several G-quadruplex recognizing proteins
 - ncRNAs: function modulation (e.g. hTERC)
 - Elsewhere: Heterodimers in telomeric regions (TERRA)
- Viral RNA genomes: Dimerization (e.g. in HIV)
- Bacterial genomes: Control of slippage transcription

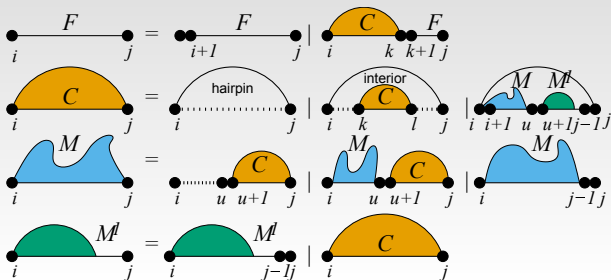
Where are RNA G-Quadruplexes

Human Telomerase RNA Component (hTERC):



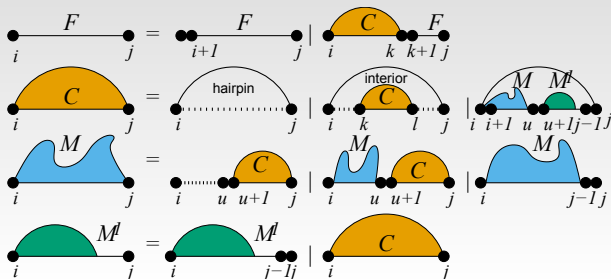
How to predict putativ stable G-quadruplexes from sequence data in silico?

RNA secondary structure prediction



Efficient DP algorithm with asymptotic time complexity of $\mathcal{O}(n^3)$

RNA secondary structure prediction



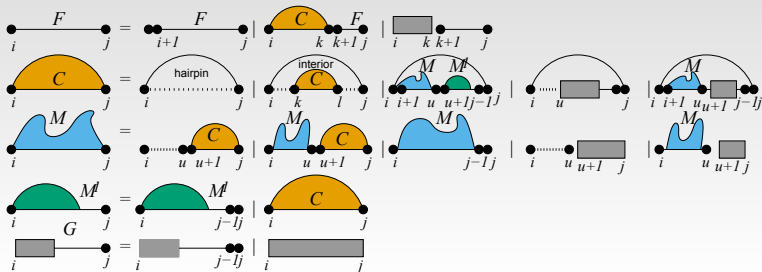
Efficient DP algorithm with asymptotic time complexity of $\mathcal{O}(n^3)$

Well parameterized tools available²

	Sensitivity	Specificity	MCC	F-measure
RNAfold 2.0	0.739	0.792	0.763	0.761
RNAfold 1.8.5	0.711	0.773	0.740	0.737
UNAFold	0.692	0.766	0.727	0.724
RNAStructure	0.715	0.781	0.745	0.742

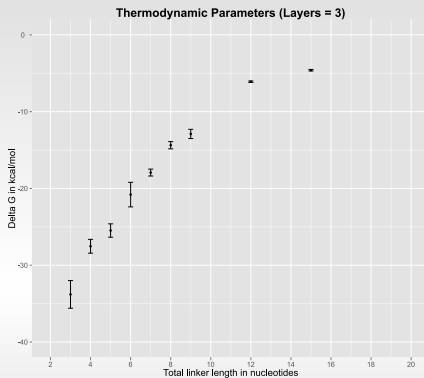
²ViennaRNA Package 2.0, Lorenz et al. 2011

RNA secondary structure prediction with G-Quadruplexes



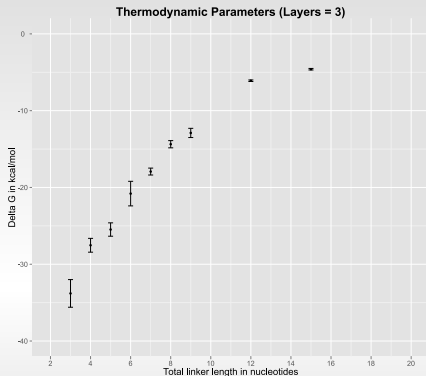
- G-quads are local closed structures
- can be treated like other substructures
- *potential* G-quads can be searched for in linear time
- energy contributions computed via pre-processing step

RNA secondary structure prediction with G-Quadruplexes



Data taken from Zhang et al., Biochemistry 2011

RNA secondary structure prediction with G-Quadruplexes

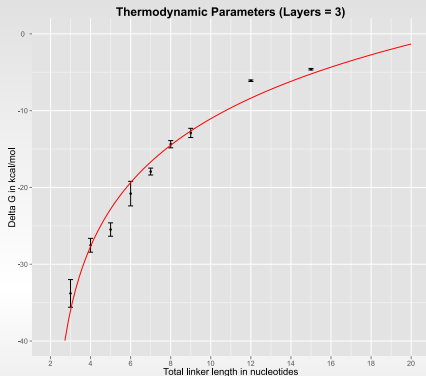


Data taken from Zhang et al., Biochemistry 2011

- Energy \propto number of layers - 1
- Energy \propto total linker length
- No effect of linker asymmetry or sequence composition

$$E(L, l) = a(L - 1)g_0 + b \ln(l - 2)$$

RNA secondary structure prediction with G-Quadruplexes



Data taken from Zhang et al., Biochemistry 2011

- Energy \propto number of layers - 1
- Energy \propto total linker length
- No effect of linker asymmetry or sequence composition

$$E(L, l) = a(L - 1)g_0 + b \ln(l - 2) \quad a = -18.00, b = 12.00$$

Integration into the ViennaRNA Package

RNAfold	MFE-, Centroid- and MEA-Structure, Base Pair Probabilities, Partition Function for Single Sequences
RNAalifold	MFE-, Centroid- and MEA-Structure, Base Pair Probabilities, Partition Function for Sequence Alignment
RNAcofold	MFE-Structure, Concentration Dependent Base Pair Probabilities, Partition Function for Dimers
RNAfold	Locally Stable Structure Prediction
RNAplfold	Locally Stable Structure Base Pair Probabilities, Probability for being unpaired (<i>in progress</i>)
RNAsubopt	Suboptimal Structure Prediction for Single Sequences and Sequence Dimers (<i>in progress</i>)

RNA secondary structure prediction with G-Quadruplexes

```
$ RNAfold -p
```

```
Input string (upper or lower case); @ to quit
```

```
.....1.....2.....3.....4.....5.....6.....7.....8
```

```
GGCUGGUGAUUGGAAGGGAGGGAGGUGGCCAGCC
```

```
length = 34
```

```
GGCUGGUGAUUGGAAGGGAGGGAGGUGGCCAGCC
```

```
(((((.....++..++..++..))))))
```

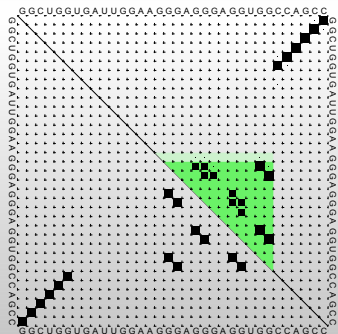
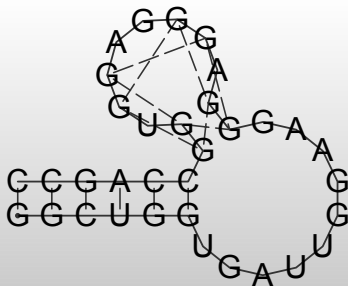
```
minimum free energy = -21.39 kcal/mol
```

```
(((((.....(.....))))))
```

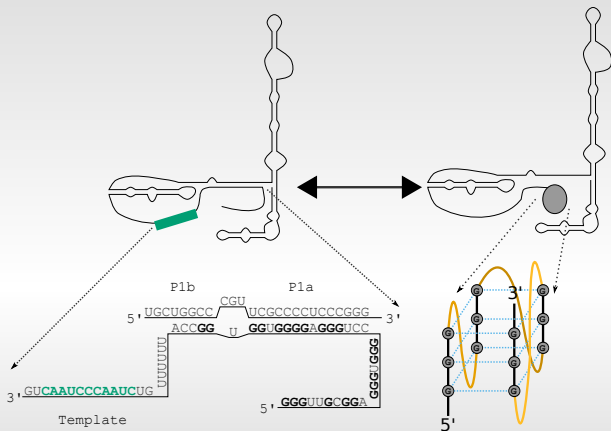
```
free energy of ensemble = -28.59 kcal/mol
```

```
(((((.....++..++..++..)))))) {-22.29 d=0.09}
```

```
frequency of mfe structure in ensemble 8.38749e-06; ensemble diversity 0.17
```



human Telomerase RNA Component (hTERC)

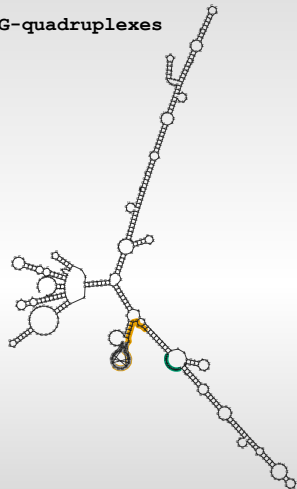


human Telomerase RNA Component (hTERC)

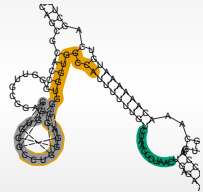
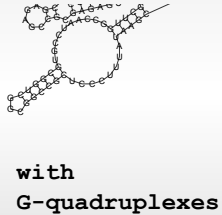
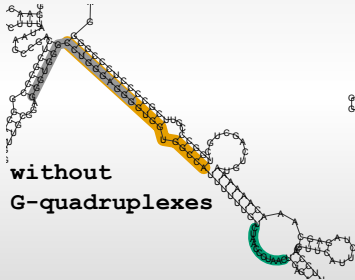
without G-quadruplexes



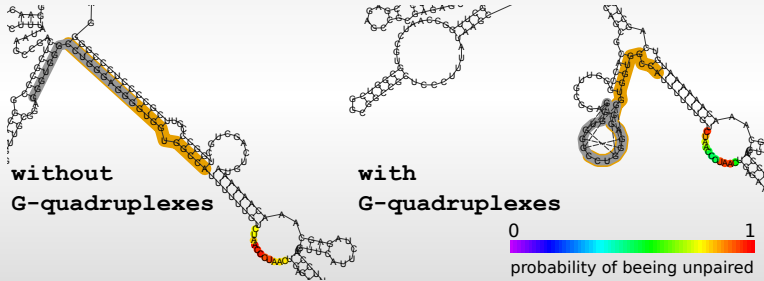
with G-quadruplexes



human Telomerase RNA Component (hTERC)

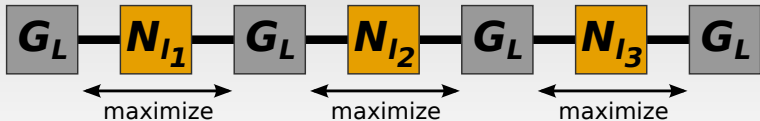


human Telomerase RNA Component (hTERC)



Genome wide G-Quadruplex Analysis

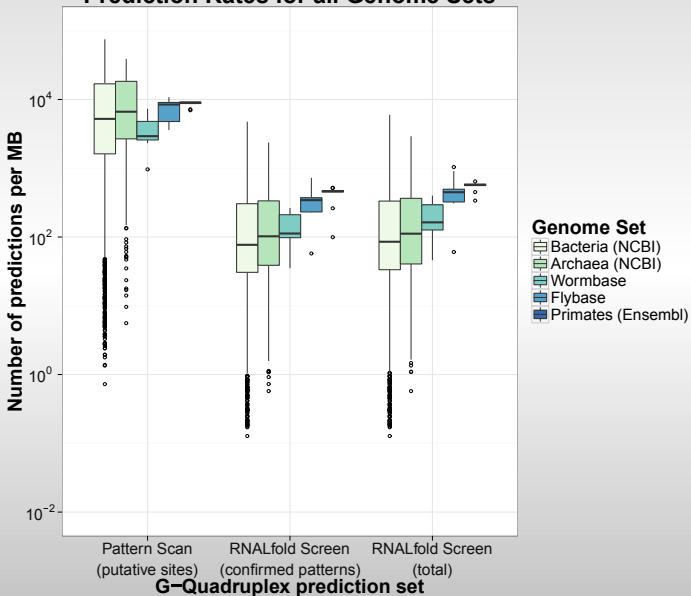
- Get putative G-Quadraplex sites (PGS) by scanning for



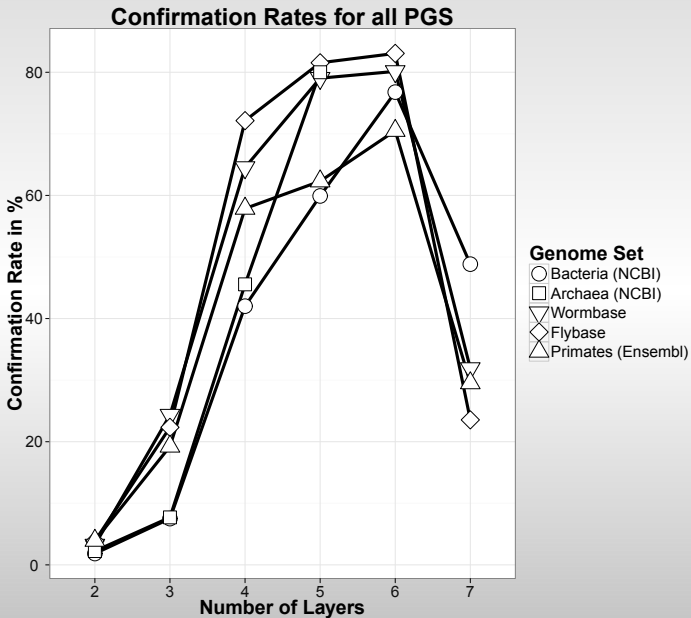
- Add 5' and 3' flanking region to each PGS
- Use these sequences to predict locally stable structures (RNALfold)
- Count how many putative sites are confirmed
- Count all unique stable G-Quadruplexes

Genome wide G-Quadruplex Analysis

Prediction Rates for all Genome Sets

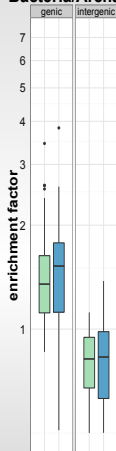


Genome wide G-Quadruplex Analysis

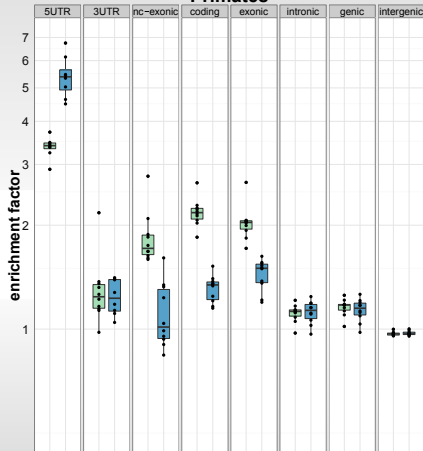


Enrichment Analysis

Bacteria/Archaea



Primates



Search Type
■ Pattern Scan
■ RNALfold Screen

Conclusion and Outlook

- G-quadruplexes are important elements in gene regulation and cell life cycle
- Straight forward integration of G-tetrads into RNA folding DP recursions
- Implementation readily available and soon in main release of ViennaRNA Package (<http://www.tbi.univie.ac.at/RNA>)
- Genome wide scans for putative stable G-quadruplexes
- Only a very small amount ($\approx 2\%$) of PGS lead to thermodynamically stable G-quadruplexes
- Intersection with annotation data and enrichment analysis
- Cation (Na^+ , K^+ , Mg^{2+}) concentration dependency
- RNA/RNA G-quadruplex Duplex structure prediction
- DNA G-quadruplex prediction
- RNA/DNA heterodimer G-quadruplexes

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Need for more (better) energy parameters

Thanks to

