# Theoretical and practical metagenomic approaches to viral discovery

Practical Session: LRIscan for viral long-range RNA-RNA Interactions

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European Virus Bioinformatics Center



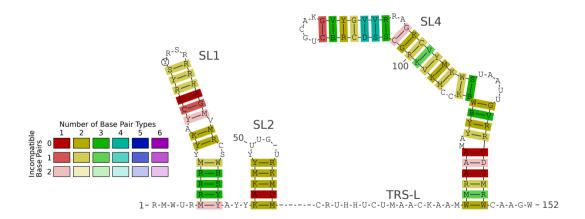
LRIscan

Results

# Alignments and compensatory mutations



# UNCONSERVED SEQUENCE, CONSERVED STRUCTURE





# Unconserved sequence, conserved structure

HCoV-229E HCoV-NL63 SARS-CoV

HCoV-229E HCoV-NL63 SARS-CoV BCoV

HCoV-229E HCoV-NL63 SARS-CoV BCoV

```
)..))))))))))....))))))))))....
GGAGUCGUAGUGUAAUUGAAAUUCCAUU---U 135
A--GUCCUAGUGUAAUUGAAAUUUCGUCAAGU 135
U---GCACCUAC-----GCAGUAUAAACAAUA 135
GAUUUUUCAUAG------UGG-UGUCUA----- 135
```



# COMPENSATORY MUTATIONS IN SECONDARY STRUCTURES

### Importance of such mutations

Compensatory mutations underline the importance of a specific secondary structure.



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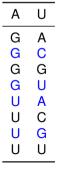
### Importance of such mutations

Compensatory mutations underline the importance of a specific secondary structure.

### But be careful!

If we're assuming a uniform mutation rate, every third pair of mutations is a compensatory mutation.

Α	U
Α	Α
Α	С
Α	G
С	Α
С	С
С	G
С	U







Results

# WHY LRIS?

- Interaction spans distances between a few hundred and several thousands of nucleotides
- few are described in positive stranded RNA viruses
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# WHY LRIS?

- Interaction spans distances between a few hundred and several thousands of nucleotides
- few are described in positive stranded RNA viruses
- ▶ often located in loop regions (bulges, hairpins, ...)
  ⇒ pseudo-knots!
- LRIs may play a very important role in viral replication



# How to calculate LRIs

# Approach I

- RNAduplex
- RNAplex
- RNAhybrid



# HOW TO CALCULATE LRIS

# Approach I

### Approach II

- RNAduplex
- RNAplex
- RNAhybrid

RNAcofold



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### Approach III

- RNAup
- IntaRNA



# How to calculate LRIs

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### Approach IV

- inteRNA
- ▶ inRNAs

# Approach II

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# HOW TO CALCULATE LRIS

# Approach I

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### Approach V

- PETcofold
- PETCOIOIO
- RNAaliduplex



# LRISCAN

Prediction of conserved long-range RNA-RNA interactions in full viral genomes, 2016. M. Fricke, M. Marz



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⇒ LRIscan



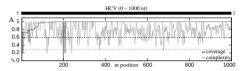
LRIscan

How does LRIscan work and how do I use it?



Results

# WORKFLOW OF LRISCAN





### COVERAGE AND COMPLEXITY

# Coverage of an alignment

Relative number of sequences that do not have a gap on a specific position.



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### Complexity of the alignment

LRIscan

$$C_i = \frac{1}{m} \sum_{k=1}^{m} \frac{|\delta(a_{i...i+s-1}^k)|}{|(a_{i...i+s-1}^k)|}$$



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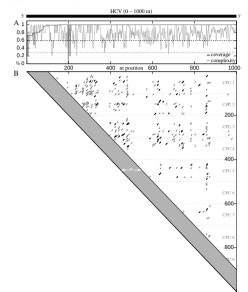
### Complexity of the alignment

$$C_{i} = \frac{1}{m} \sum_{k=1}^{m} \frac{|\delta(a_{i...i+s-1}^{k})|}{|(a_{i...i+s-1}^{k})|}$$

$$\delta(CCUUUGGAAA) = CUGA$$



# Workflow of LRISCAN - STEP 2





# FINDING SEEDS

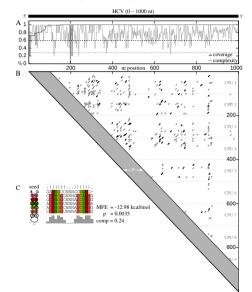
$$S_{i,j} = (S_{i-1,j+1} + 1) \cdot \Pi_{ii} \cdot \Phi_{ij}$$

LRIscan

- $ightharpoonup \Pi_{ij}$ : do at least *t* percent of the input sequence form the basepair (i, j)?
- $ightharpoonup \Phi_{ii}$ : do both alignment columns  $A_i$  and  $A_i$  meet the coverage threshold?



# WORKFLOW OF LRISCAN - STEP 3





### SEED SCORING

- z-Score analysis for each seed to measure reliability
- ightharpoonup compensatory score au

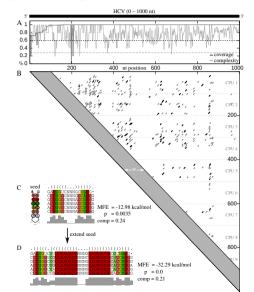
$$\tau = \frac{\sum_{b}(u \cdot h)}{6 \cdot |b| \cdot k}$$

#### with:

- u: number of different base-pair types
- ▶ *h*: number of incompatible base-pairs



# WORKFLOW OF LRISCAN - STEP 4





### SEED EXTENSION

- each seed is extended 10 nts at the 5' (and 3' respectively)
- calculate MFE with RNAalifold.
  - hard constraints for seed region
  - soft constraints for extension, such that intermolecular interactions are formed





Results

# LRISCAN USAGE

Alignment Recap

```
1 $> ./LRIscan.rb -c 2 -f <ALIGNMENT> -o <OUTPUT>
```

- tabular output in .tsv format
- table and figures in .html
- all figures are also stored in the ps/ directory



### LRISCAN HANDS-ON

### Exercise:

Go to https://www.rna.uni-jena.de/supplements/lriscan/

- Download the MSA of the Flaviviruses.
- 2. Apply LRIscan
- 3. Do not look at the results on the webpage (yet)



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If you have your own dataset, roughly of the same size as the Flavivirus MSA, feel free to use it.



# COFFEE BREAK



