



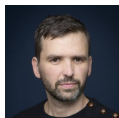
# Rational design and structure modeling of functional RNAs

Discrete algorithms for RNA Bioinformatics

**AMIBio team**  
**LIX, UMR 7161**

Yann Ponty (DR CNRS)

# The AMIBio team



**Yann Ponty**  
Research Director



**Sebastian Will**  
Full Professor



**Sarah Berkemer**  
Asst Professor



**Philippe Chassignet**  
Asst Professor



**Jean-Marc Steyaert**  
Full Prof (Aemeritus)



**H el ene Thibault**  
Admin assistant



## PhD Students

Hua-Ting Yao – 2018/??



Taher Yacoub – 2020/??



Bertrand Marchand – 2020/??



Ha Nguyen Ngoc – 2017/21



# RNA in Human biology and health: Friend **and** Foe!

## RiboNucleic Acids (RNAs)



### Encodes proteins

mRNA Vaccines

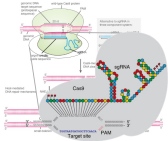
COVID-19, Malaria (Zika, CMV, Cancers?)

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## Targeting system for DNA Editing

CRISPR therapies

Sickle-cell anemia,  $\beta$ -thalassaemia, Leber congenital amaurosis (LCA), cancers...



Hendel et al, 2015; Agrotis & Ketteler, 2015

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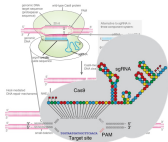
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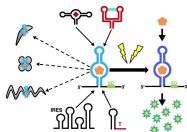
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## Sensor of metabolites

Riboswitches

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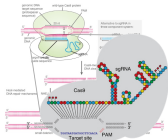
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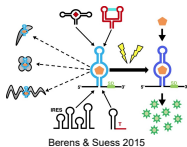
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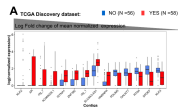
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## Quantitative expression

Transcriptomic signatures

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NGuyen et al, 2021

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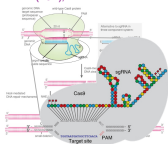
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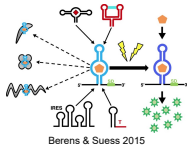
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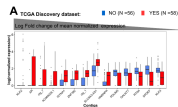
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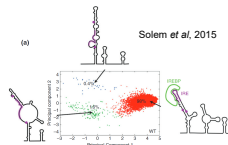
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## Non-coding mutations

lncRNAs, miRNAs, structure-associated (RiboSnitches)

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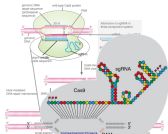
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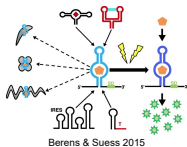
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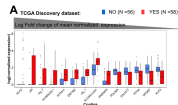


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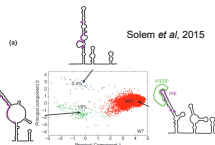
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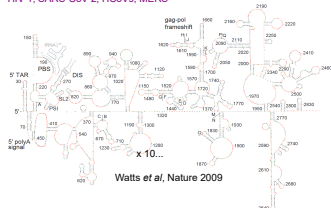
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Watts et al, Nature 2009

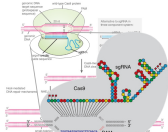


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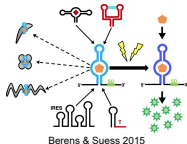
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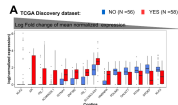
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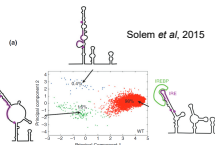
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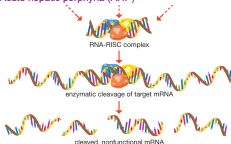
## Regulation of gene expression

RNAi therapies (FDA approved)

Primary hyperoxaluria type 1 (PH1),

Hereditary transthyretin amyloidosis (ATTRv),

Acute hepatic porphyria (AHP)



Encyclopaedia Britannica, Inc 2013



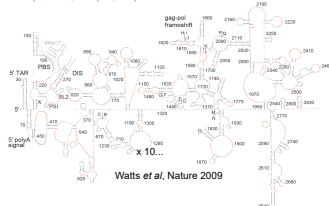
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Solem *et al.*, 2015

A TCGA Discovery dataset: NO (N=150) YES (N=150)



## Regulation

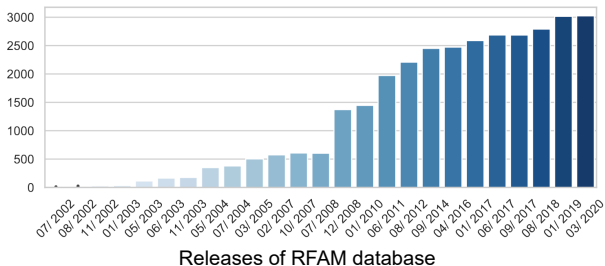
RNAi therapy

Primary hyper

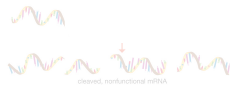
Hereditary tran

Acute hepatic

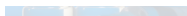
#RNA functional families (structured)



Releases of Rfam database



Encyclopaedia Britannica, Inc. 2013



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Watts *et al.*, Nature 2009



(RiboSnitches) rophy.

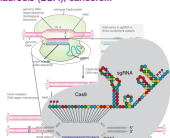


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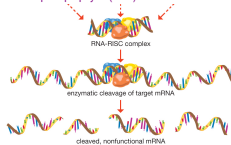
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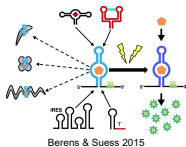
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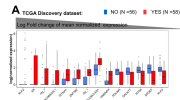


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NGuyen et al, 2021

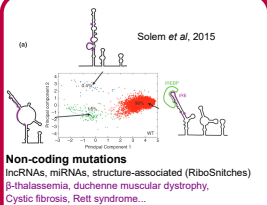
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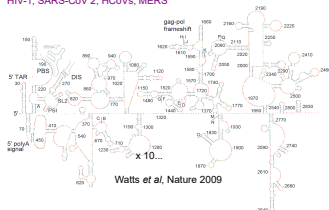
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## (2D) Structure Modeling

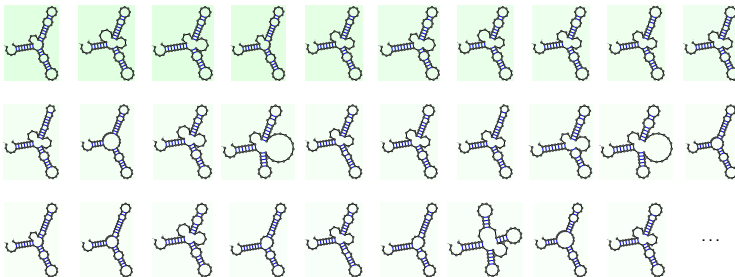
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# RNA: A combinatorial biopolymer

GCGGAUUUJAGCUCAGUUGGGAGAGCGCCAGACUGAAGAUCUGGAGGUCCUGUGUUCGAUCCACAGAAUUCGCACCA



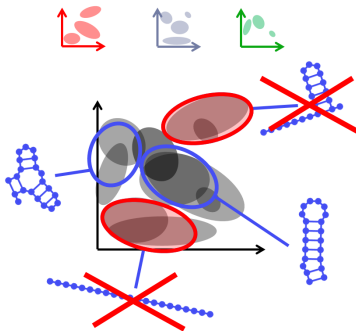
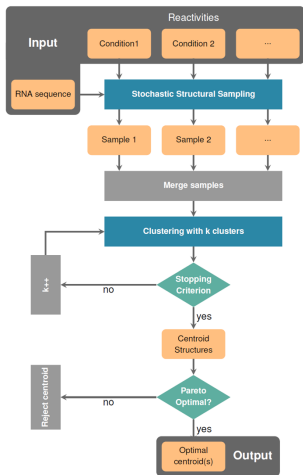
Free-energy minimization → Finding a needle in a haystack:

#2D structures  $\approx \frac{1.8^n}{n\sqrt{n}} \rightarrow 37,974,319,446,212,728$  2D structures

Yet efficient/polytime ( $\mathcal{O}(n^3)$ ) dynamic programming algorithms:

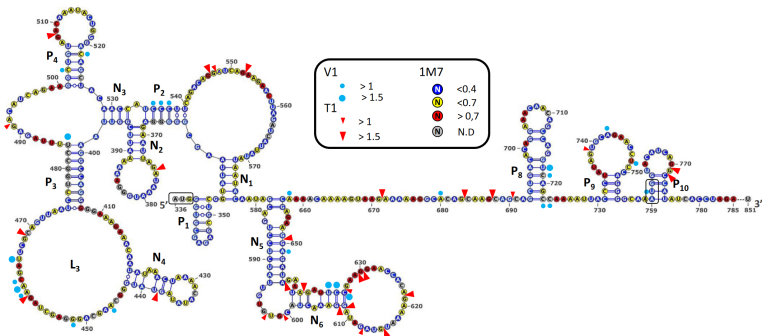
- ▶ Exact energy minimization + exp. evidences (chemical probing)
- ▶ Simultaneous folding/alignment [Will *et al*, Bioinformatics 2015]
- ▶ Perfect Boltzmann-Gibbs sampling. . .

# Integrating multiple sources of probing data



IPANEMAP Method  
[Saaidi *et al*, Nucleic Acids Research 2020]

# Integrating multiple sources of probing data



## Structure modeling of HIV-1 Gag-IRES

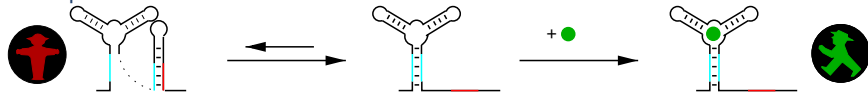
→ Discovery of new recruitment sites for 40S ribosome  
[Deforges *et al*, Nucleic Acids Research 2017]

Similar algorithms to predict RNA-RNA interactions

→ Discovery of alternative template switching mechanisms in SARS-CoV 2  
[Wang *et al*, Molecular Cell 2021]

# Multiple flavors of RNA Design

Example: *Riboswitch* for translation control



Multiple target structures  $\rightarrow$  *Multiple design of RNAs*

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

Associated algorithmic problems much harder (NP-hard, #P-hard)!

Parameterized complexity algorithms  
+ Efficient implementations

[Hammer *et al*, BMC Bioinfo 2019]  
(RNARedprint, InfraRed)

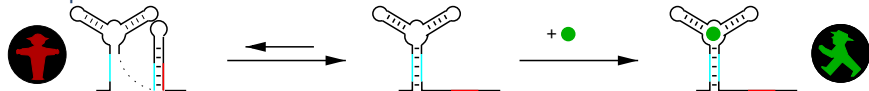
Amenable to efficient negative design

[Yao *et al*, RECOMB 2021]

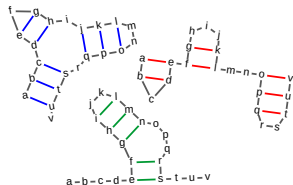
Towards a fully declarative, highly flexible and efficient framework for RNA design

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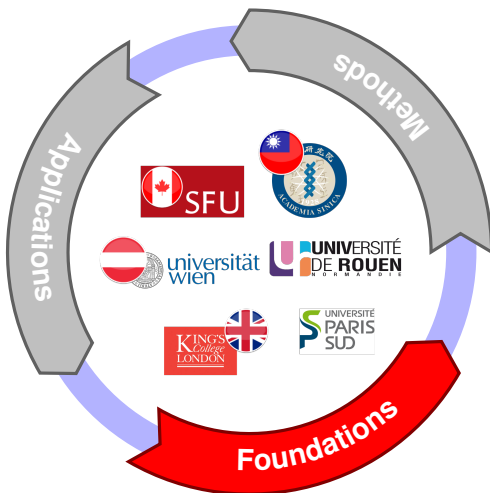
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# Algorithmic Methods for (RNA) Bioinformatics



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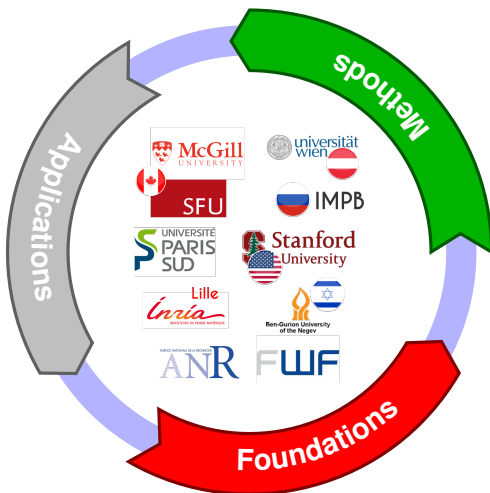
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- ▶ Enumerative/Analytic Combinatorics
- ▶ Discrete Algorithms (FPT, approx)
- ▶ (Algebraic) Dynamic Programming
- ▶ Machine Learning

## (Exact) Methods for Molecular Biology

- ▶ Structure modeling
- ▶ Rational design
- ▶ Predicting interactions
- ▶ Visualization

## Applications

- ▶ Structure modeling for RNA viruses
- ▶ Cancer transcriptomics
- ▶ Aptamer/drug design (Alzheimer)
- ▶ Evolution



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