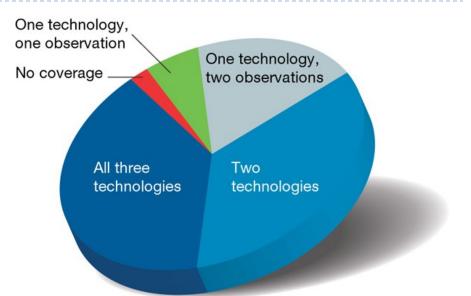


## A redundant talk... sorry!

#### Gap between analysis tools and viz. tools (M. Brudno)

#### Challenge of scale (C. Nielsen)

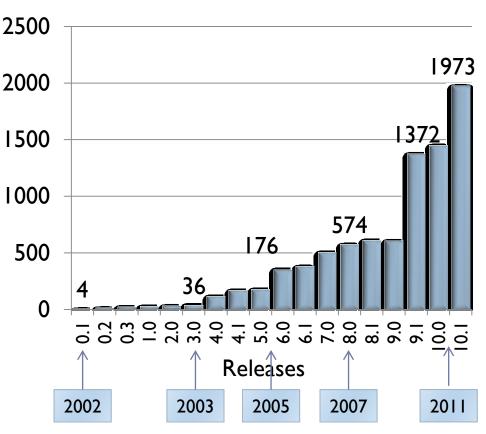
- Ubiquitous
- Pervasively expressed



The human genome is pervasively transcribed, such that the majority of its bases are associated with at least one primary transcript and many transcripts link distal regions to established protein-coding loci.

ENCODE Analysis of 1% of the human genome Nature 2007

- Ubiquitous
- Pervasively expressed
- Versatile
  - Carriers
  - Transporter
  - Enzymatic
  - Processing
  - Regulatory
  - ssRNA genomes (HIV)
  - Immune system?? (CRISPR)
  - More soon... (lincRNAs)

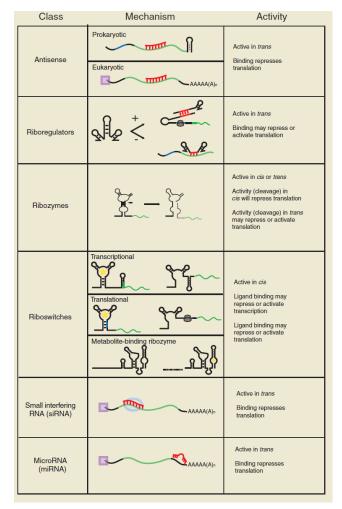


#### # **RFAM** Families

- Ubiquitous
- Pervasively expressed
- Versatile

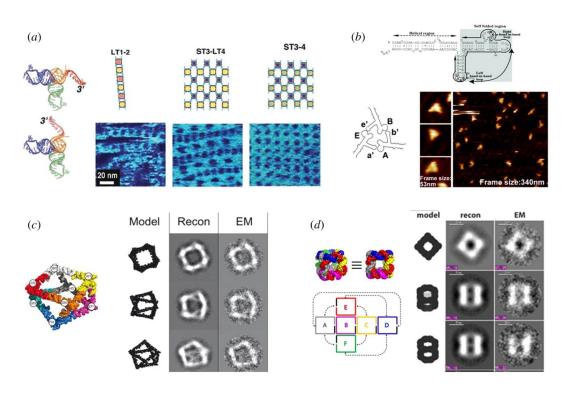
D

- Easy to handle
  - Synthetic biology



[Isaacs, F J et al. Nature Biotech. 2006]

- Ubiquitous
- Pervasively expressed
- Versatile
- Easy to handle
  - Synthetic biology
  - Nanotechs



[Li H et al, Interface Focus 2011]

- Ubiquitous
- Pervasively expressed
- Versatile
- Easy to handle
  - Synthetic biology
  - Nanotechs
  - Therapeutics (RNAi)

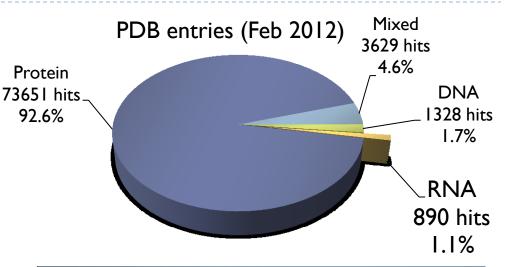
#### **RNAi : Proof of concept**

Injecting nanoparticle-vehicled siRNAs in solid-cancer patients:

- siRNA enters tumorous cells
- siRNA interacts with targeted mRNA
- siRNA regulates protein expression

[Davis M I et al, Nature 2010]

- Ubiquitous
- Pervasively expressed
- Versatile
- Easy to handle
  - Synthetic biology
  - Nanotechs
  - Therapeutics (RNAi)
  - Computationally fun (but still challenging)



(Initial) lack of structural data

Experiment-based energy models + Secondary structure

+ Efficient combinatorial algorithms

 $\Rightarrow Mature in silico prediction tools$ (Mfold, RNAfold...)



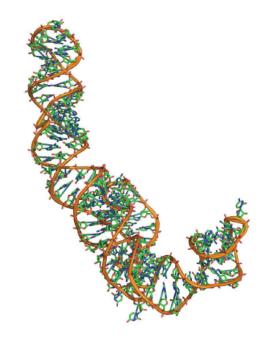
- RNA is single stranded
- Structurally diverse
- Structure more conserved than sequence
- Functionally versatile

Use structure as a proxy for function, favor mechanistic explanations.

# Three levels of RNA structure

UUAGGCGGCCACAGC GGUGGGGUUGCCUCC CGUACCCAUCCCGAA CACGGAAGAUAAGCC CACCAGCGUUCCGGG GAGUACUGGAGUGCG CGAGCCUCUGGGAAA CCCGGUUCGCCGCCA CC

Secondary structure



#### Primary structure

Tertiary structure

Source: 5s rRNA (PDBID: 1K73:B)

## Current visualization of RNA

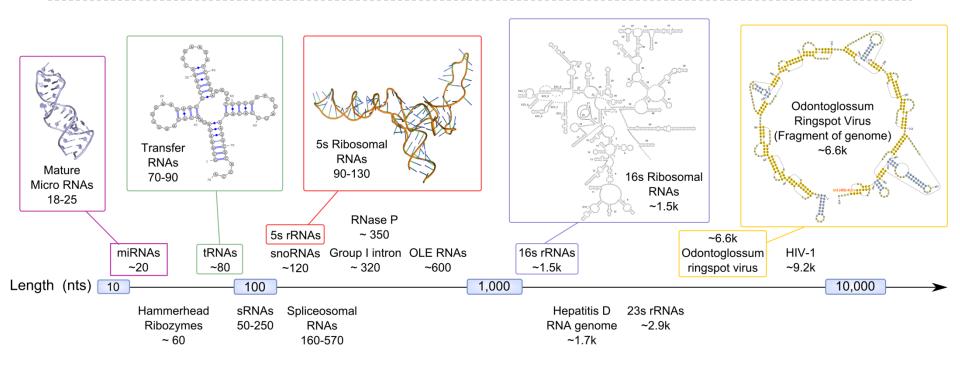
Exemplary use cases

# Visualization helps ncRNA scientists

- Refine structural model based on experimental data
- Assert reliability of predicted structures
- Detect structural homology
- Curate structure-informed alignments
- Communicate functional hypotheses

#### • ..

# A challenging diversity of scale



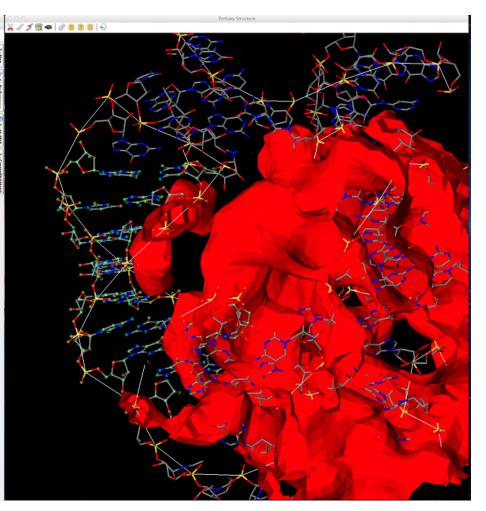
- Length of structured RNAs from 18 to over 9k nts.
- 2D schematics vs 3D objects (Top-down vs Bottom-up)
- Local vs Global

# Fitting 3D model to density maps

# Cryo-EM maps

- UCSF Chimera
  [Goddard et al, J Struct Biol 2006]
- Coot [Emsley P et al, Act Crys D 2010]
- Assemble [Jossinet et al, Bioinf. 2010]
- Semi-automated

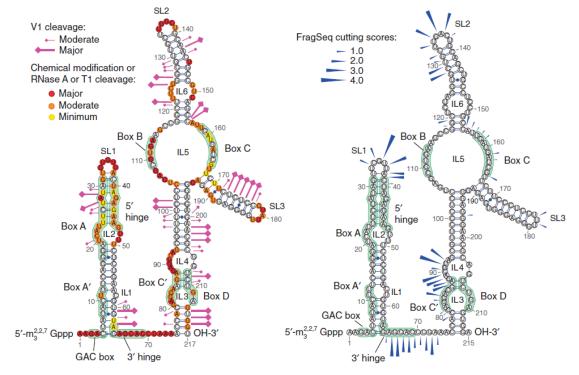
rCrane [Keating et al, PNAS 2010]



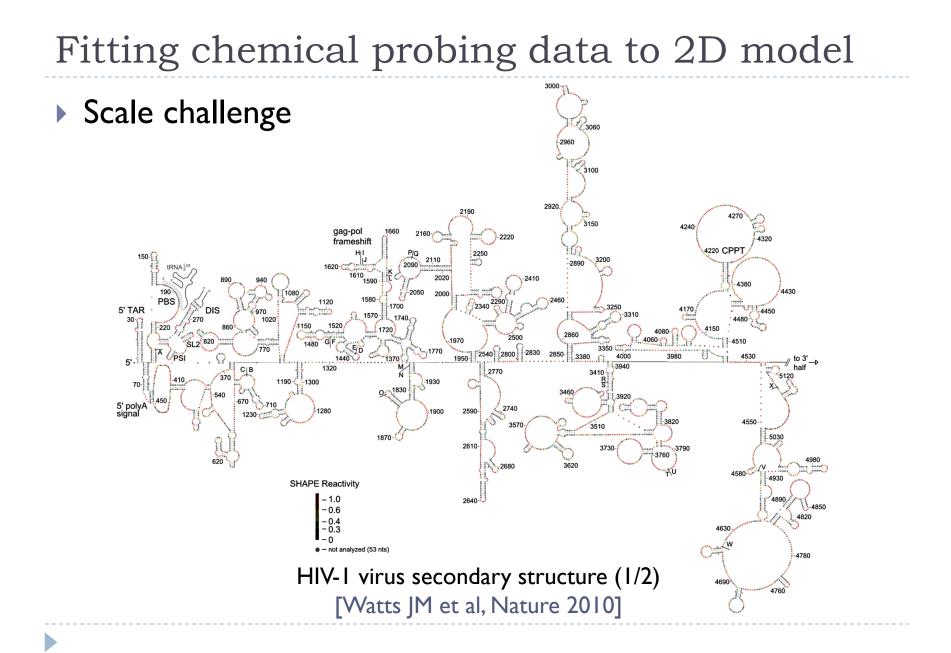
[Assemble, Jossinet et al Bioinf. 2010]

Fitting chemical probing data to 2D model

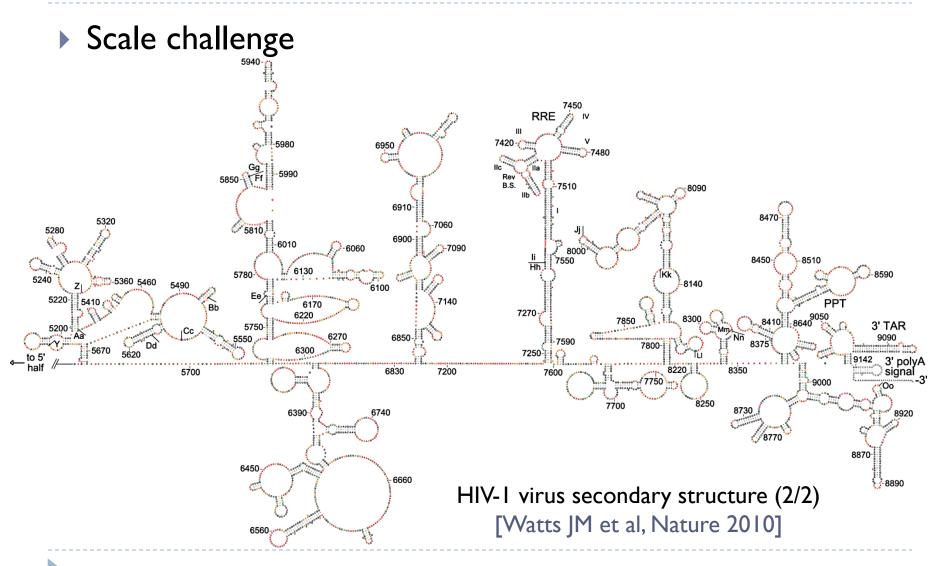
- High-throughput secondary structure determination
- Interactively visualize reactivity data within structural context



FragSeq method [Underwood *et al*, Nature Methods 2010] (Images: VARNA)



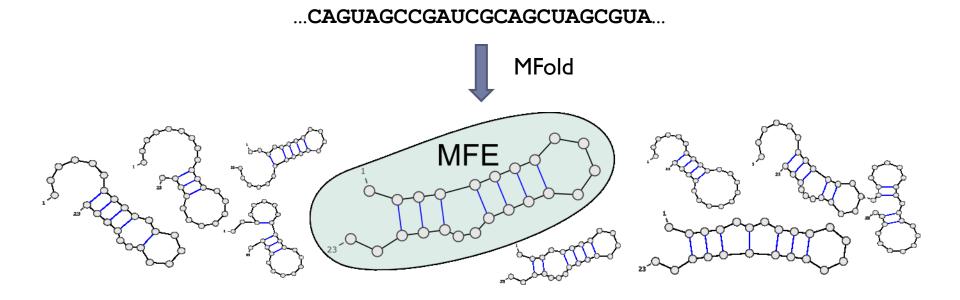
### Fitting chemical probing data to 2D model



# Ensemble approaches in RNA folding

#### RNA in silico paradigm shift:

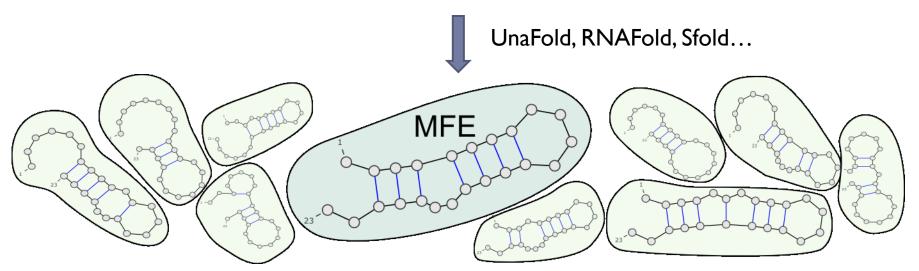
From single structure, minimal free-energy folding...



# Ensemble approaches in RNA folding

- RNA in silico paradigm shift:
  - From single structure, minimal free-energy folding...
  - ... to ensemble approaches.

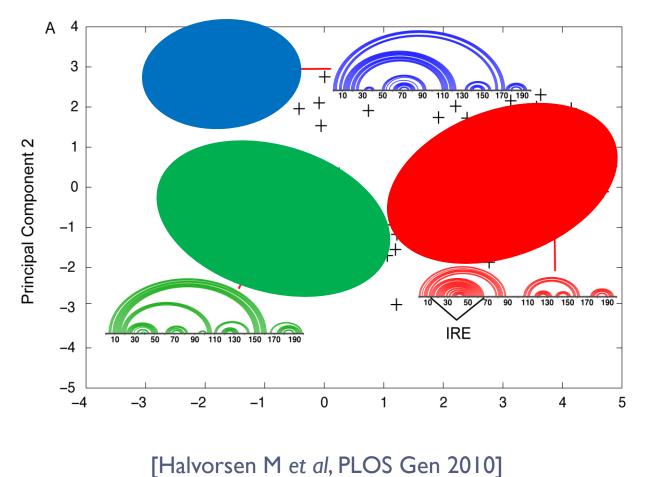
...CAGUAGCCGAUCGCAGCUAGCGUA...



Ensemble diversity? Structure likelihood? Evolutionary robustness?

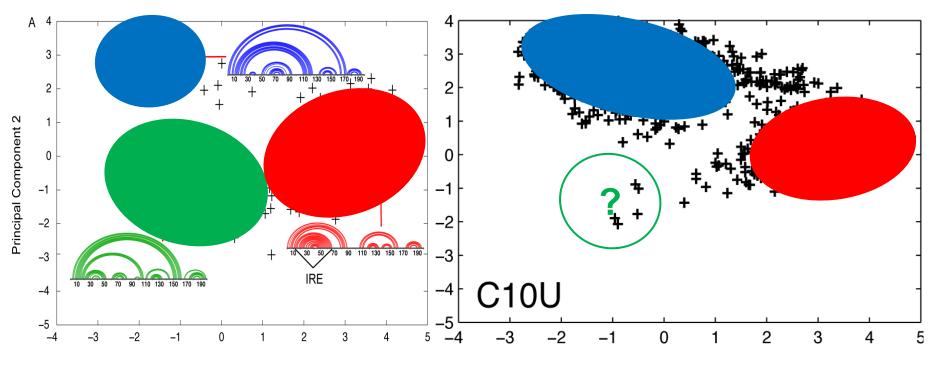
#### Sensitivity to mutations

▶ Boltzmann Sampling → PCA → Clustering

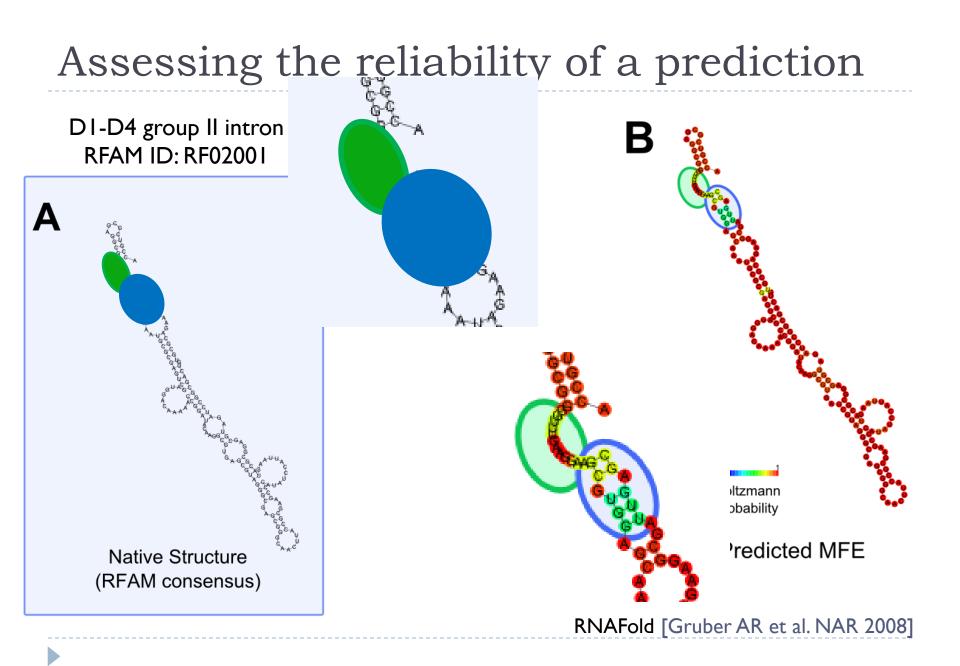


### Sensitivity to mutations

▶ Boltzmann Sampling → PCA → Clustering

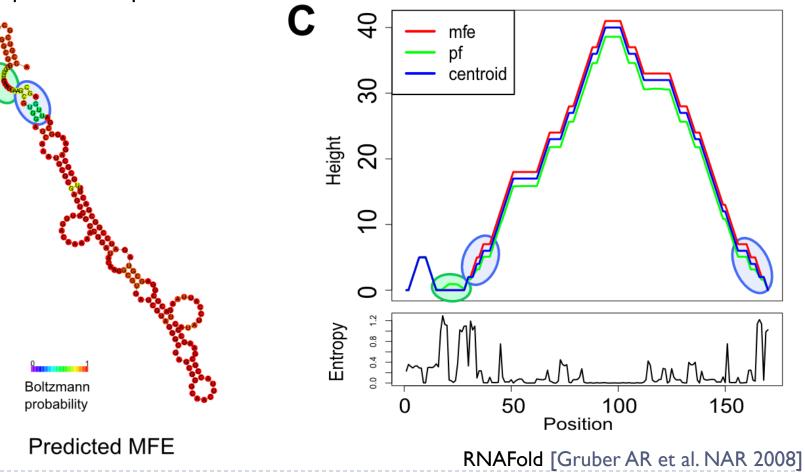


[Halvorsen M et al, PLOS Gen 2010]



# Assessing the reliability of a prediction

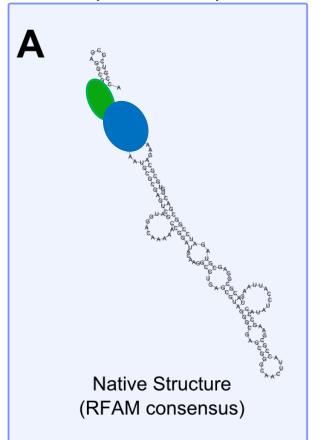
DI-D4 group II intron A. Capsulatum sequence

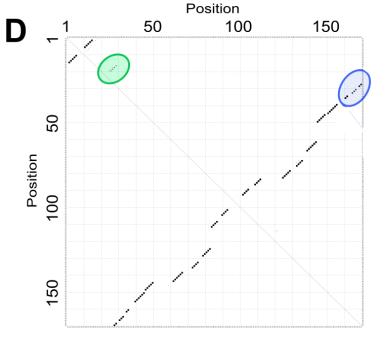


В

# Assessing the reliability of a prediction

DI-D4 group II intron A. Capsulatum sequence



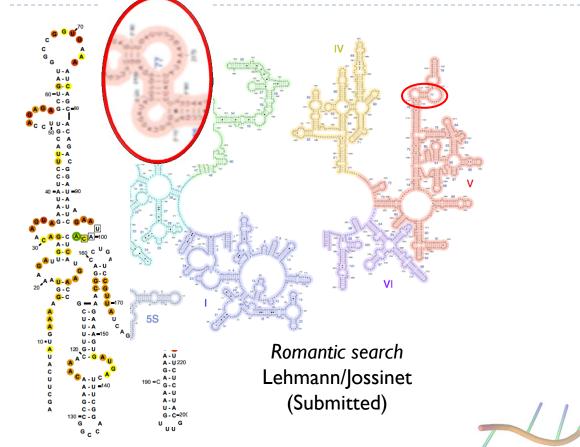


Boltzmann probability - All pairs

- Low BP probabilities indicate uncertain regions
- $\Rightarrow BP>99\% \rightarrow Avg. PPV>90\% \qquad (BP>90\% \rightarrow PPV>83\%)$
- Visualizing probs in the context of structure helps refining predicted structures.

RNAFold [Gruber AR et al. NAR 2008]

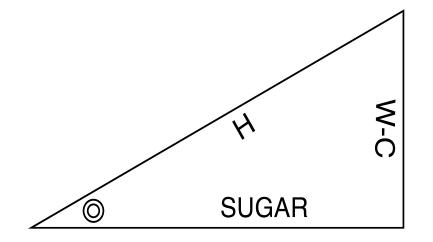
## Comparing structures visually



Fragment of *T thermophylus* tRNA-Phe vs yeast's (PDB: 4TNA & 3BBV) DARTS [Dror O et al, NAR 06] + Pymol

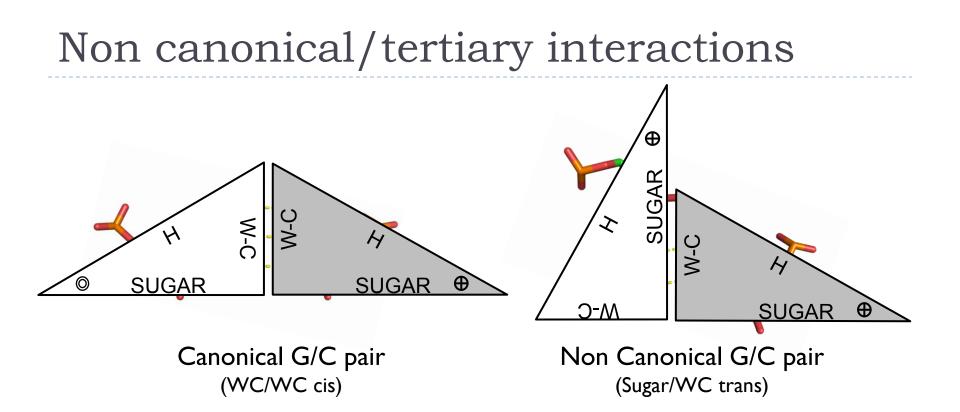
# Towards novel representations

# Non canonical/tertiary interactions



RNA nucleotides bind through edge/edge interactions.

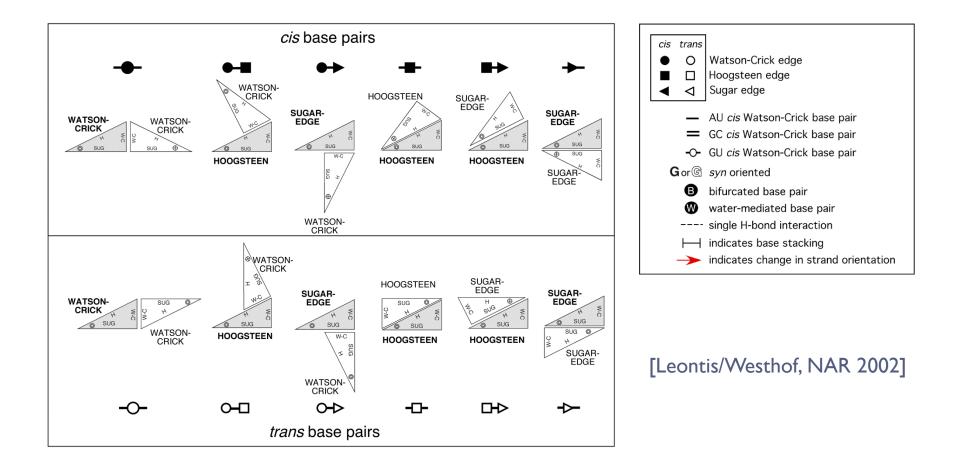
Non canonical are weaker, but cluster into modules that are structurally constrained, evolutionarily conserved, and functionally essential.



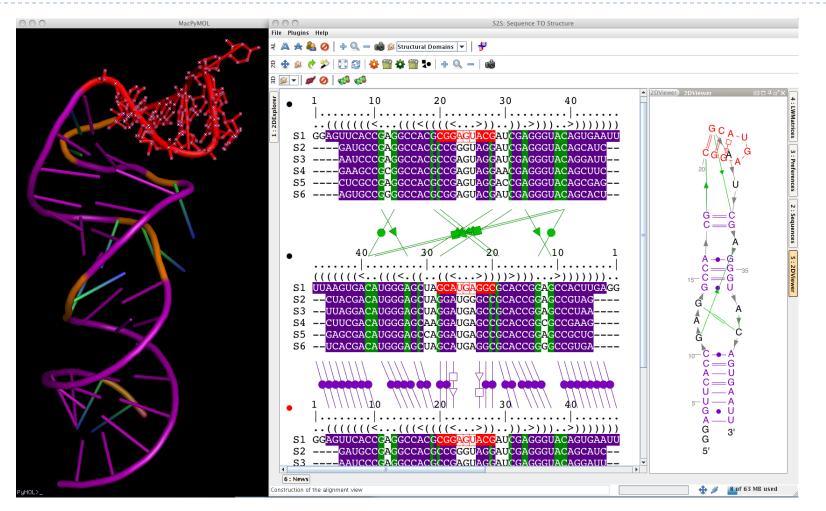
RNA nucleotides bind through edge/edge interactions.

Non canonical are weaker, but cluster into modules that are structurally constrained, evolutionarily conserved, and functionally essential.

## Leontis/Westhof nomenclature: A *visual grammar* for tertiary motifs

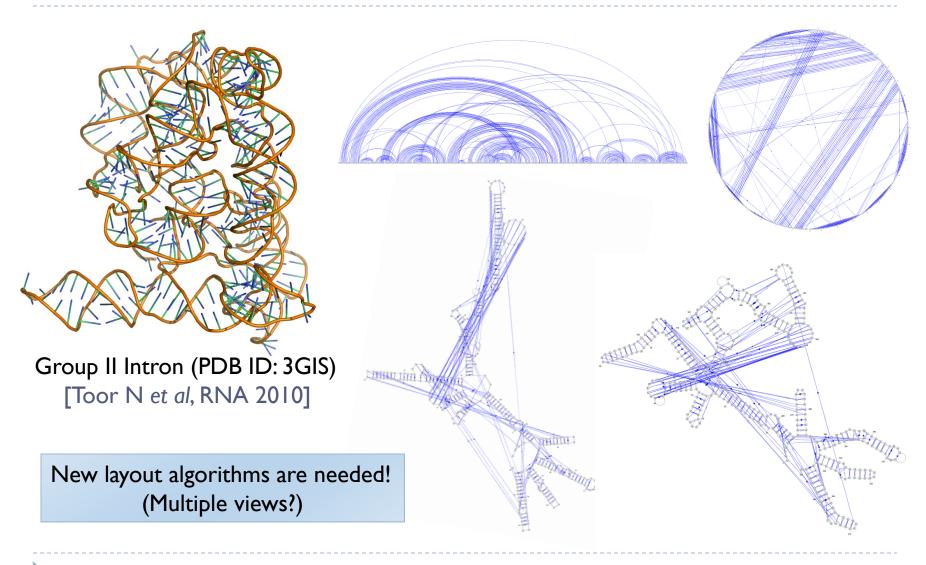


## Leontis/Westhof nomenclature: A *visual grammar* for tertiary motifs



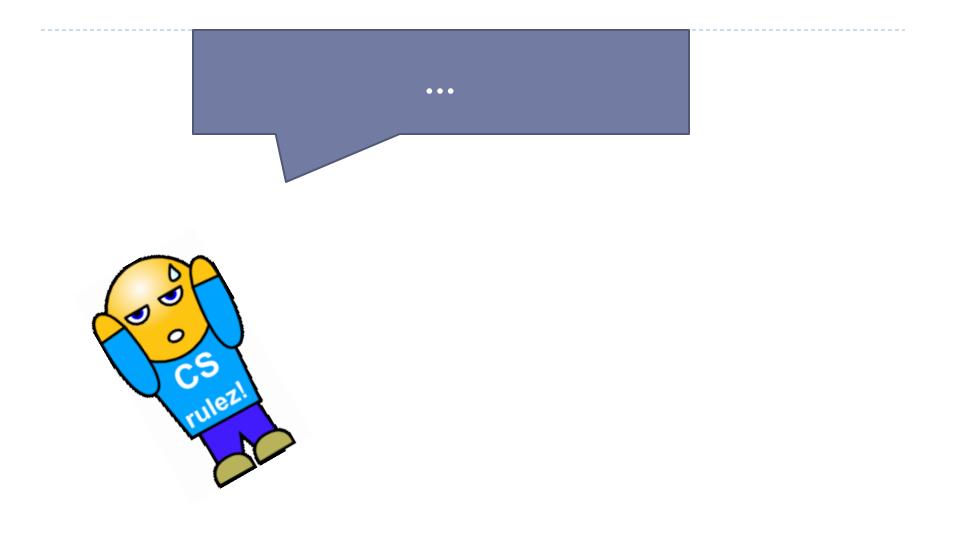
S2S software [Jossinet/Westhof, RNA 2005]

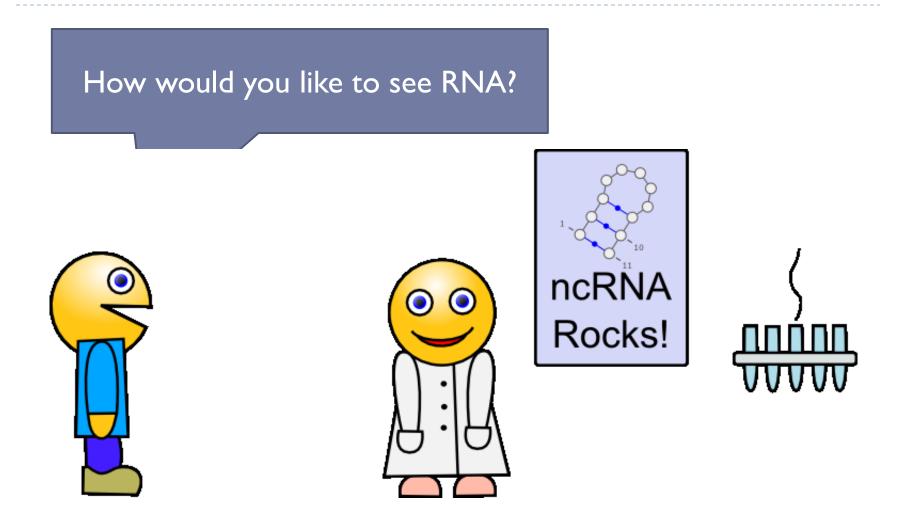
# Layout algorithms are challenged by tertiary interactions

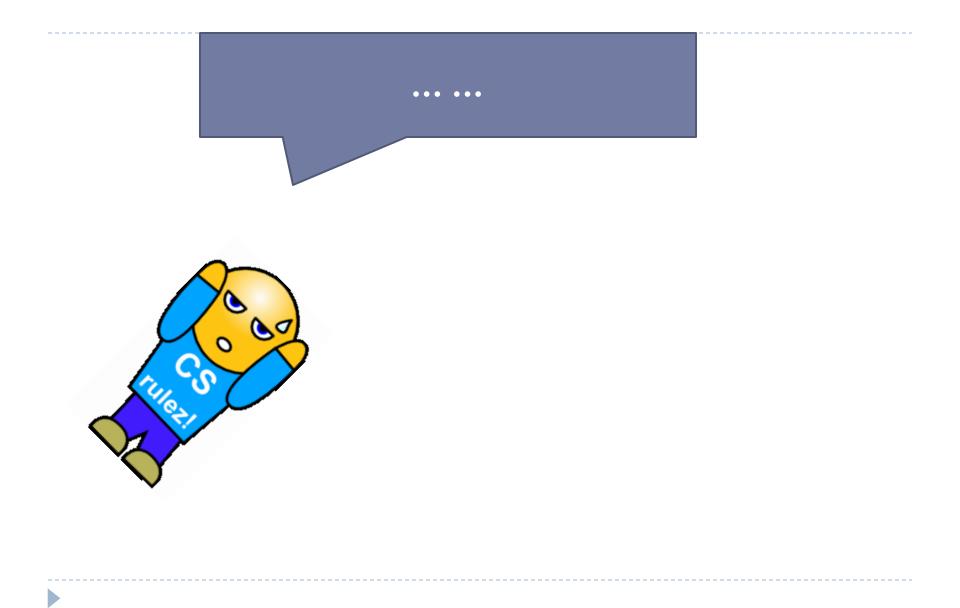


#### I can draw graphs, why not draw RNA 2<sup>ary</sup> structures?







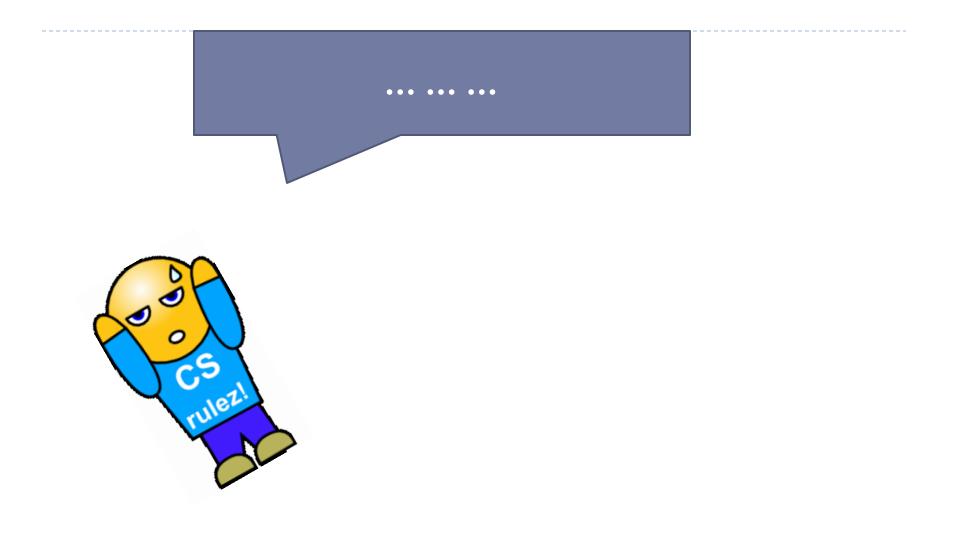


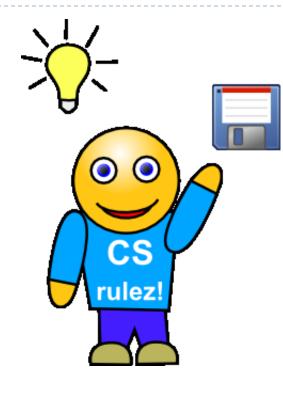


Common sense rules:

- Layout should be non overlapping
- Inner loops = Circular support
- Helices = Straight lines
- Consecutive bases = Equally distant

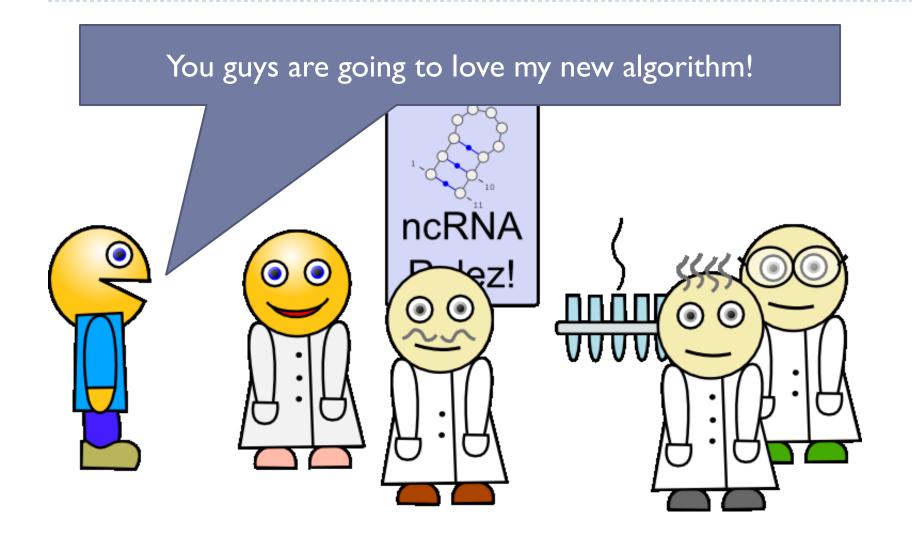
Satisfying these rules makes the problem NP-Hard, but we can still decently approximate it, assuming that ... ... APX ... greedy ... dynamic programming ... P=NP(?)...

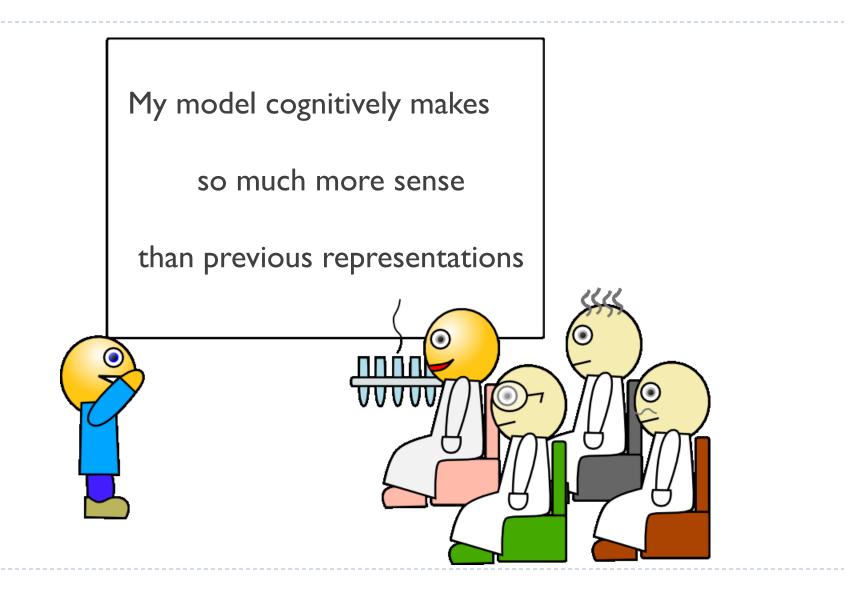


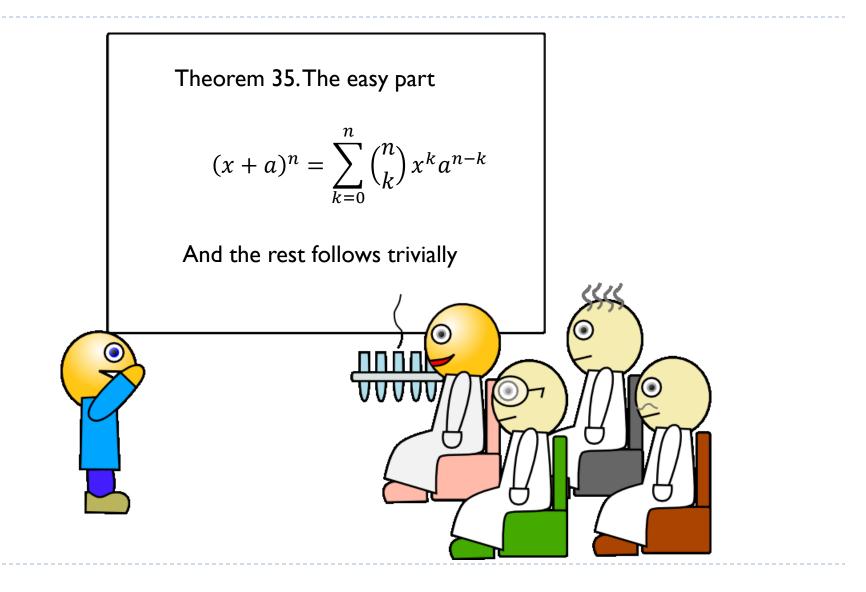


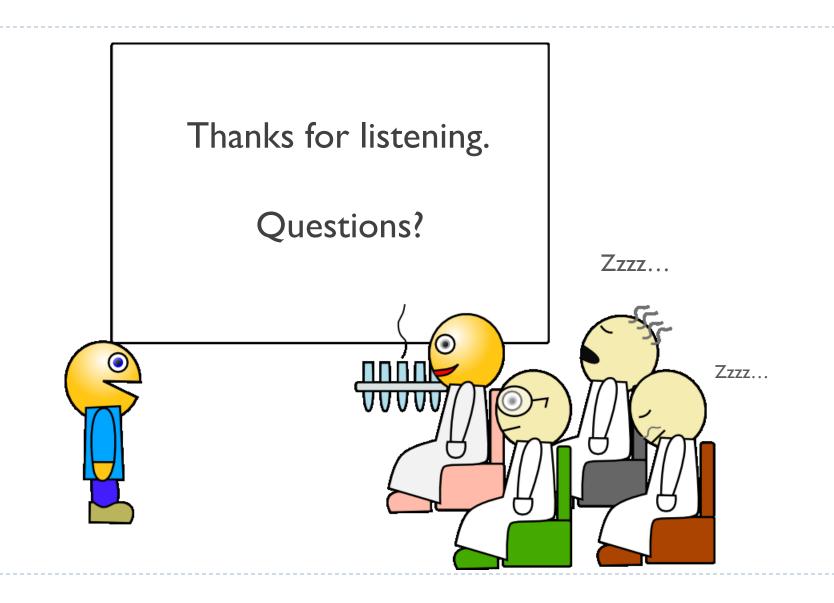
Common sense rules:

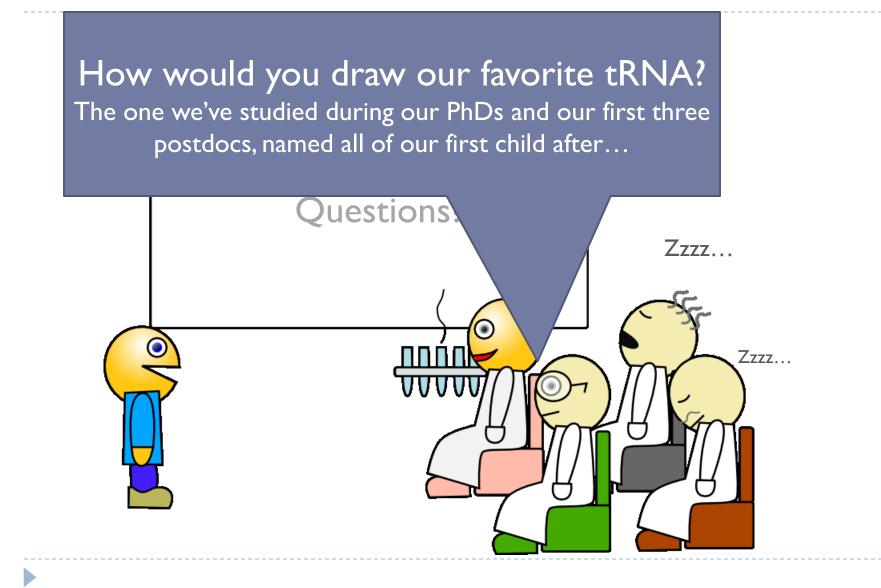
- Layout should be non overlapping
- Inner loops = Circular support
- Helices = Straight lines
- Consecutive bases = Equally distant
- + Ninja algorithmic skills
- + Hard work
- = Pretty decent algorithm

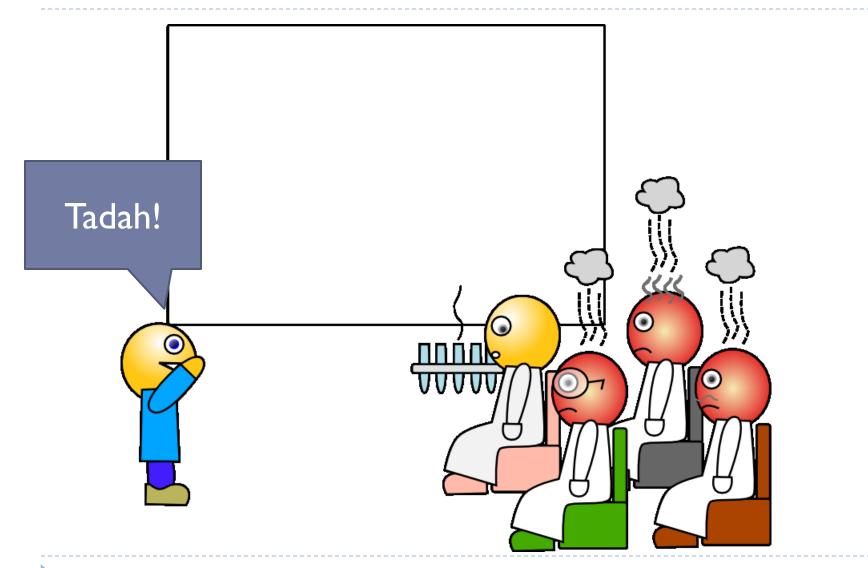


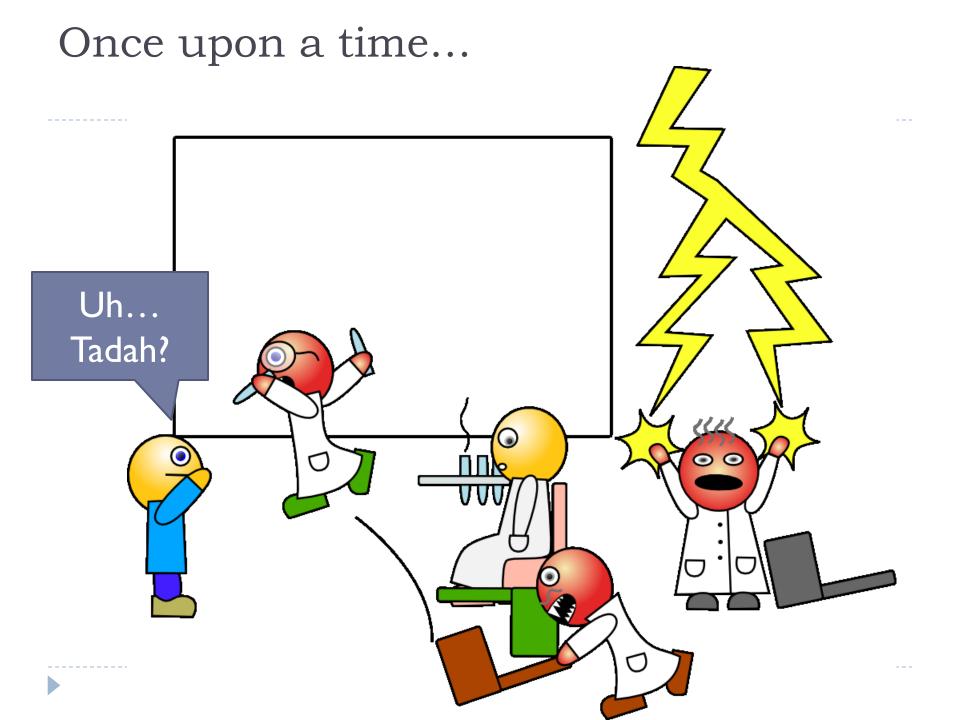


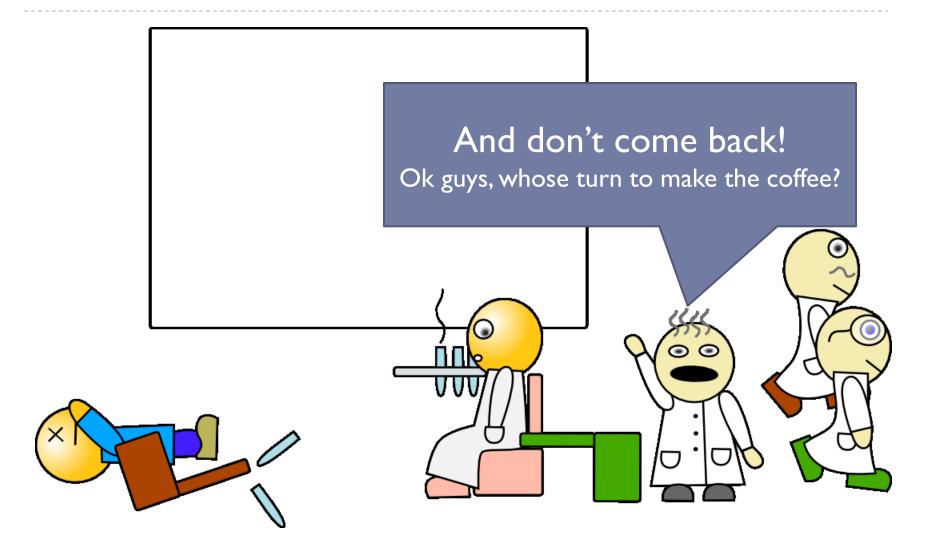


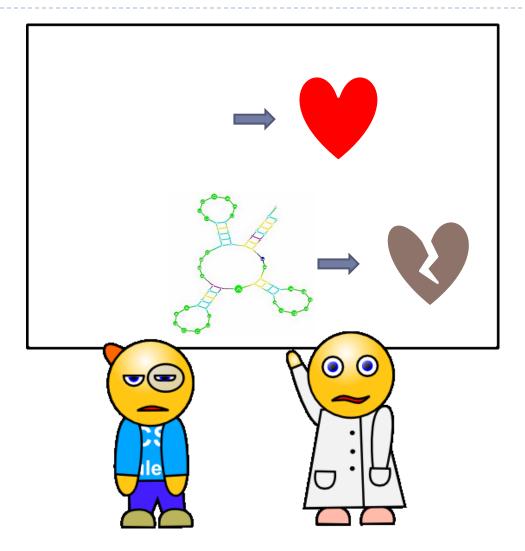


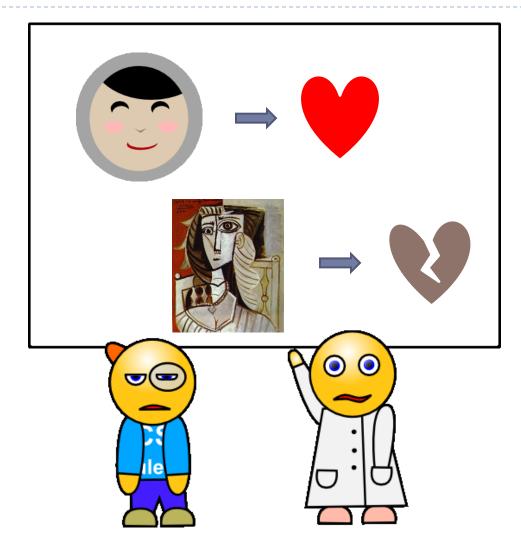












# What I learned

Don't mess with the RNA biologists:

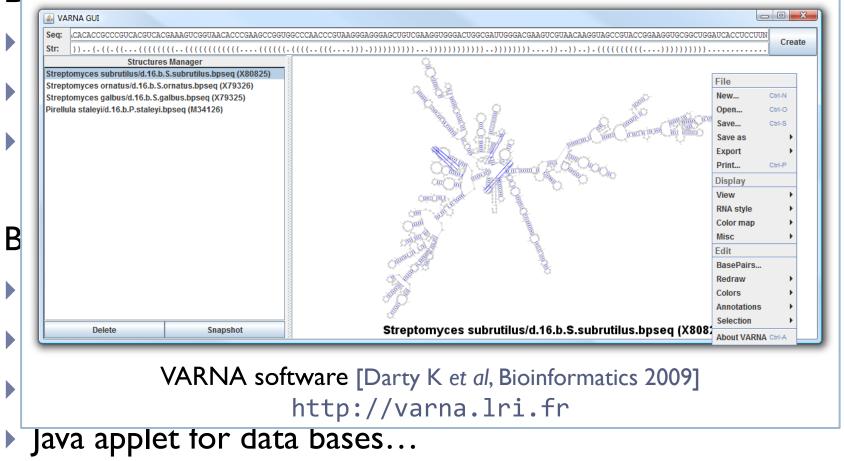
- Offer as many algorithms as humanly possible
- Interactive editing gestures for "historical" layouts
- Templating mechanisms

But indulge your inner geek:

- Cross-platform
- Open source
- Generic component within third-party tool
- Java applet for data bases...

# What I learned

#### Don't mass with the RNIA higherists.



## Conclusion

# Conclusion

Increasing need for visualization:

- More and bigger structural models
- Emerging need for interactive methods:
  - Identification of functional modules
  - Model fitting to probing data

Integrated RNA-specific visualization methods/tools needed for:

- RNA/RNA Interactions
- Automated layout of tertiary motifs (modules)
- Visualization of structure ensembles (Qualitative vs Quantitative)
- Kinetics, folding pathways
- Structure/sequence evolution

# Acknowledgements

VARNA crew

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- Valérie Fritsch (Uni Strasbourg)
- Tanja Gesell (Uni Vienna)
- Fabrice Jossinet (Uni Strasbourg)
- Gerhard Steger (Uni Düsseldorf)
- Eric Westhof (Uni Strasbourg)

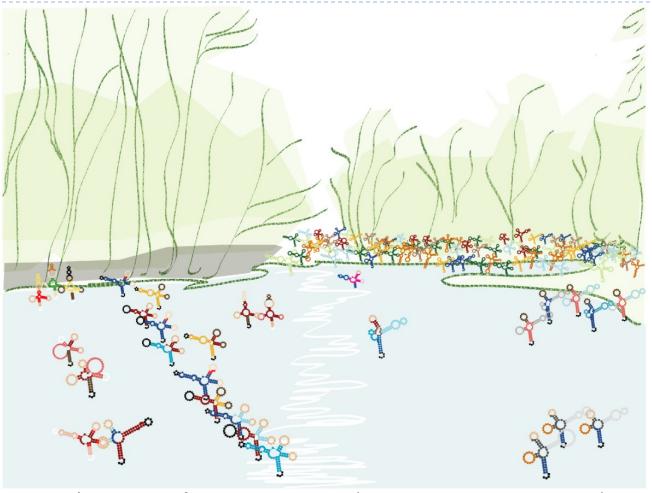
### VIZBI conference

- Jim Procter (+JalView)
- Sean O'Donoghue

#### Every VARNA user out there...



# Questions?



tRNA cloverleaf shape members (skating on a winter pond) RNArt by S. Konermann *in* Voss B *et al*, BCM Biology 2006