

Detecting non-Coding RNA in Genomic Sequences

- I. Overview of ncRNAs
- II. What's specific about RNA detection ?
- III. Looking for known RNAs
- IV. Looking for unknown RNAs

Daniel Gautheret

INSERM ERM 206 & Université de la Méditerranée

Non-coding or non-messenger RNA

★ All organisms

- rRNA 5S/5.8S 15S/18S 23S/28S (5-300 copies)
- RNase P/MRP (1 copy)
- tRNA (20 diff., 50-1000 copies)

rRNA &
RNase P:
catalytic!

★ Eukaryotes and Archaea

- snoRNAs (H/ACA and C/D: 10-100 different)

★ Eukaryotes

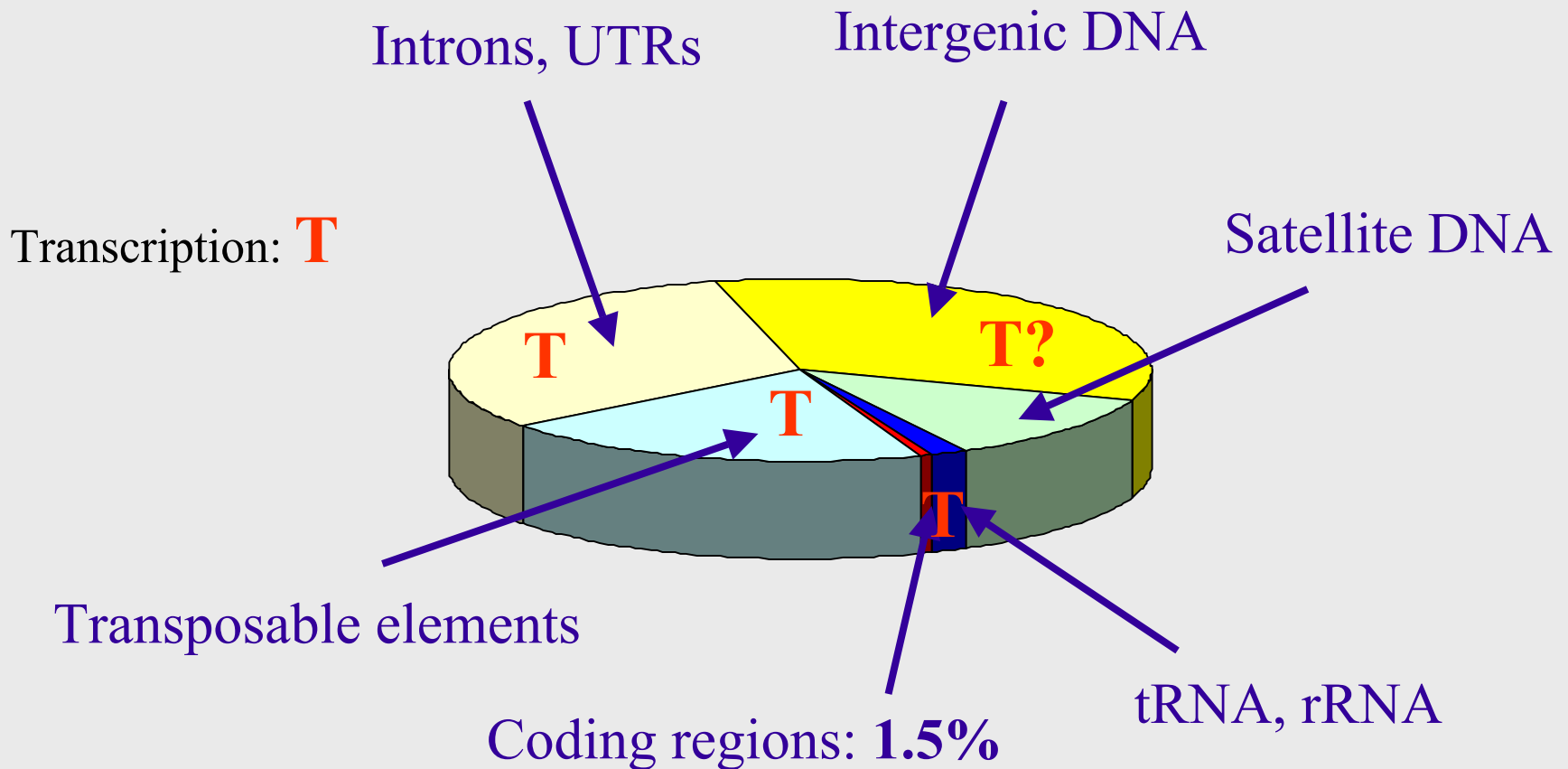
- miRNAs (100-200 diff.)
- XIST, H19, IPW (vertebrates)
- snRNAs (U1, U2, U4, U5, U6)

★ Prokaryotes

- rprA, csrB, oxyS,....
- tmRNA

Vertebrate Genomes: > 50% transcribed!

Vertebrate gene: 30kb (coding: 1,5kb)



How many other ncRNAs ?

★ Rnomics*

- Extract total RNA
- Isolate small RNAs (> mRNA size)
- Tag & Reverse transcribe
- Clone & Sequence

★ Success

- 80 ncRNAs identified in mouse
- Lots of new snoRNAs

★ Limitations

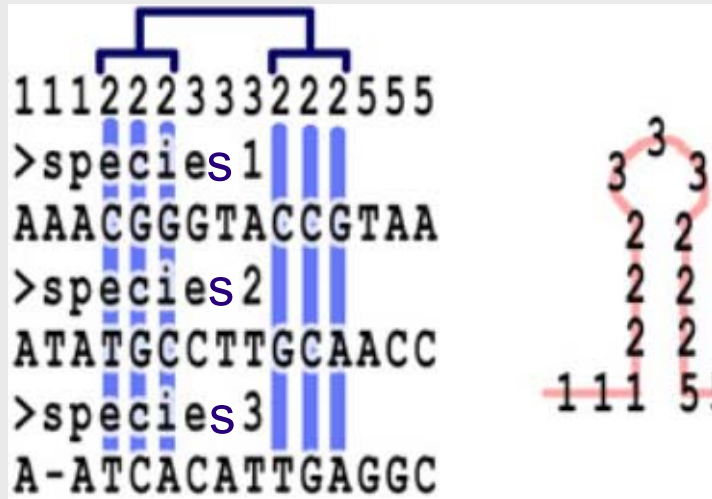
- Access to nuclear RNAs
- Tissue/time specific expression may be frequent

* Huttenhofer et al., 2001

Bioinformatics

- ★ Not sensitive to « rare » expression
- ★ Highly successful in identifying protein-coding genes
- ★ Many complete genomes available
- ★ Large computational toolbox
 - Statistics
 - Thermodynamics
 - Phylogeny

What's Special About ncRNA Detection?



- ★ No ORF
- ★ No Markov model / sequence statistics
- ★ ncRNA is defined both by primary and secondary structure
- ★ « Substitution matrices » for nucleic acids are terrible compared to aminoacids counterparts

III. Looking for known ncRNAs

- ★ How can you detect ncRNA genes from known families?

Custom RNA search programs

Based on a variety of algorithms: seek regular expressions or base pairs, weight matrices, SCFGs, etc.

- tRNA
 - trnscan (Fichant & Burks 91)
 - trnscan-SE (Eddy 94)
- C/D Box snoRNAs (Lowe & Eddy 99)
 - One type of snoRNA
- miRNA
 - Not an automated procedure

Descriptor-based programs

- RnaMot / Rnamotif (Gautheret 91, Macke '02)
- Palingol (Viari 96)
- Patscan (Overbeek '00)
- PatSearch (Pesole '01)

```
h1 s1 h1 s2 h2 s3 h2
h1 5:5 1
h2 5:5 NNNNR:YNNNN
s1 7:7 NUNNNNN
s2 4:40
s3 7:7 UUCNNNN
```

RnaMot descriptor for
anticodon+TYC domain of
tRNA

Descriptor-based programs

PROS	CONS
Draft descriptors can be quickly sketched and tested	Requires a good prior knowledge of secondary structure and sequence constraints
No alignment is required , although it is very helpful to have one	Requires basic computer skills to translate biological constraints into the descriptor language
Biologists decide what features are important or not (see also CONS!)	Biologists have the responsibility of correctly weighting each important feature

Probabilistic ncRNA search programs

Stochastic Context Free Grammars (first adaptation of CFG to RNA: Searls 94; SCFG: Eddy & Durbin 94)

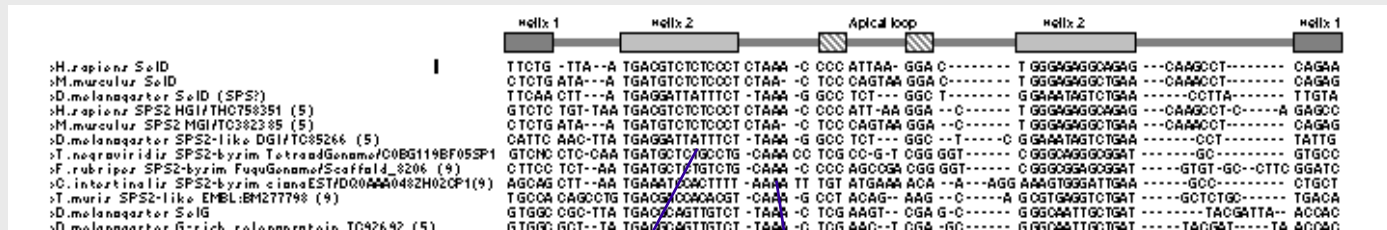


- ★ Time cost = $O(N^4)$ for sequence of length N
- ★ Not « practical » for large alignments or genome-wide searches
- ★ Pseudoknots not allowed

ERPIN: Profile-based search

Gautheret & Lambert, JMB,
2001, 313, p. 1005.

Training set



Helix profile
(16xN)

A:A			
G:A			
C:A			
U:A			
A:G			
G:G			
C:G			
U:G			
...			
U:U			

Single-strand
profile (5xN)

A			
G			
C			
U			
-			

Search algorithm combines
dynamic programming for single
strands and **profile search** for
helices

Profile-based search

PROS	CONS
All constraints in the training set are efficiently exploited , resulting in highly specific detections	Alignment and secondary structure constraints must be accurate
After alignments and secondary structures are created, no further programming is needed	Helices of variable length need to be reduced to their shortest consensus
Scoring system is defined automatically	Program will not depart from initial alignment in terms of motif size
E-values are provided for each hit	Users still have to decide on search order and masked elements

Running a successful ncRNA search

Example: the Signal Recognition Particle (SRP) RNA

- ★ 172 sequences available
- ★ All 3 kingdoms
- ★ Signature: 50-nt domain IV

Want to publish your finds? Prepare Control Procedures

Sensitivity: $SN = \frac{TP}{TP+FN}$ — Total « true » objects

Specificity : $SP = \frac{TP}{TP+FP}$ — Total predictions

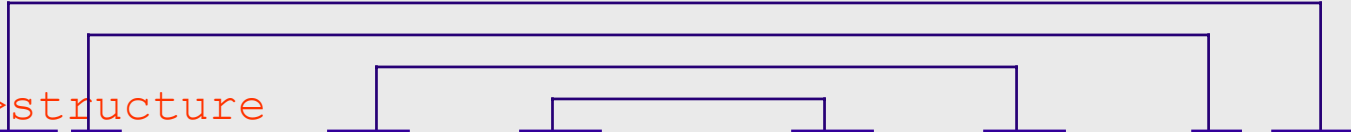
TP and **FN**: easy to obtain, using training set (*leave-one out*)

FP: harder! How do you know a hit is false?

Hint: express SP as: **FP / Mb in a random sequence**

Make it large enough and of same composition (mono & di-
nt) as search database (e.g. with the *shuffle* program)

Using the ERPIN program



```
>structure
00000000000000000000000000000000000000000001111001000
222443333333666555588877777788899996661111443222
>AQU.AEO.
AGGGUGAACU-CCCCCAGGCCCGAA--AGGGAGCAAGGGUAAGC-CCG
>THE.THE.
GGCGUGAACC-GGGUCAGGUCCGGA--AGGAAGCAGCCCUAAGC-GCC
```

erpin srp.epn sequence.fasta -8,8 -nomask

erpin srp.epn sequence.fasta -2,2 -nomask

erpin srp.epn sequence.fasta -2,2 -umask 5 9 -nomask

```
gautheret@obelix.tagc.luminy: /obelix/gautheret/Erpin/training/SRP
[gautheret@obelix SRP]$ erpin srp.epn rnd.fasta -8,8 -nomask

Training set:  "srp.epn":
               172 sequences of length 48
Database:      "rnd.fasta"
               991 nucleotides to be processed in 1 sequence
               ATGC ratios: 0.261 0.219 0.262 0.258
Cutoff:        5.32

E-value at current cutoff for 991b double strand data: 6.74e+00

> Seq1 size: 1000
FW 1 52..61 6.20 4.99e+00
ACG.GGA--A.TGG
FW 2 521..531 5.97 5.42e+00
GGG.GAA-CA.CCA
FW 3 987..996 5.51 6.34e+00
ATT.GGA--C.AAT
> Seq1 size: 1000
RC 1 129..138 9.52 1.03e+00
GTA.GGT--A.TAC
RC 2 352..361 8.33 2.00e+00
ACC.GTT--A.GGG
RC 3 439..448 12.77 7.24e-02
CTC.GAA--A.GAG
RC 4 763..772 6.67 4.18e+00
TTT.GCA--A.GGA

----- at level 1 -----
1982 bases processed
cutoff: 5.32
3 config. per site
7 hits
7 independent hits

[gautheret@obelix SRP]$
```

ERPIN results

Score: based on profile values

E-value: How many hits expected at this score or higher?

No need for random sequence tests!

erpin project - Netscape

File Edit View Go Bookmarks Tools Window Help

http://tagc.univ-mrs.fr/erpin/

Home Local Institutions Journaux Mot/Annu Cours/Guides MolBio 1 RNA FP6-ATD trad

erpin Home Online search Doc & tutorial Download Training sets TAGC

Online RNA Motif Search

1. Select RNA Motif

RNA genes

- tRNA, generic nuclear
- tRNA, type I
- tRNA, type II
- 5S rRNA, bacterial
- 5S rRNA, eukaryotic
- 5S rRNA, archaeal
- 23S/28S rRNA Sarcin-Ricin loop
- SRP RNA domain IV
- C/D box snoRNA, archaeal
- C/D box snoRNA, yeast
- C/D box snoRNA, human and mouse
- miRNA, let7 family
- miRNA, lin4 family
- miRNA, mir1 family
- miRNA, mir9 family
- miRNA, mir15, 16 and 195 family
- miRNA, mir30 family
- miRNA, mir106 family
- miRNA, mir182_183_228_263 family
- miRNA, mir156 plant family
- miRNA, mir160 plant family
- miRNA, mir166 plant family

RNA elements

- SECIS
- IRE, uptake
- IRE, storage
- Polyadenylation site
- Tbox
- Rho-independent Terminator
- Hammerhead, form I
- Hammerhead, form III

2. Select Database

Paste database sequence (Fasta)

Or choose fasta file

Browse...

Run Erpin Reset both strands plus strand minus strand

RNA Information

Polyadenylation site	
trainingset	polya_signal.epn
command	erpin polya_signal.epn < database > 11,7 -umask 11 -umask 11 4 5 6 7 -cutoff 70% 73% -fwd -unifstat
description	Human polyadenylation site. Training set is an alignment of 2328 human polyA sites obtained from the EMBL database. Sequences are 206 nt long, centered on the polyA signal. The search region is limited to the polyA signal + 46 nt 3' region. Score cutoff were set so that about 70% of known polyA sites are identified, at the price of a high false positive rate of 4 to 40 FPs per 100kb, as discussed in [Legendre M. Gautheret D. BMC genomics, 4, 7, 2003]
specificity	At cutoff score: about 4.62e+02 hits / 100 Mb of uniform random sequence
author	M. Legendre

The ERPIN Server

<http://tagc.univ-mrs.fr/erpin/>

All searches parameterized to scan a bacterial genome in less than 5 minutes

>gb|U39685|U39685

strand- pos = 5883..5967 score = 82.90 E = 5.63e-19
 draw save GGGAGCG. TA. CTCA. ACT--GCTT-A. ACAG. G. ACACC. CTGCTAA. GCTGT. TA. GAT. C---GTT-CTACC. GTG. --C. GTGGG. TTCGAAT. CCCAC. CGCTTC

>gb|U39701|U39701

strand+ pos = 6687..6774 score = 74.96 E = 4.19e-17
 draw save GGAGACT. TA. CCCA. AGC--GCCTGA. AGGG. T. TCGGT. CTTGAAA. ACCGA. GA. GGT. C--CTTTATAAGC. ACG. --C. GAGGG. TTCGAAT. CCCTC. AGTCTCC

>gb|U39708|U39708

strand- pos = 2023..2104 score = 83.38 E = 4.28e-19
 draw save GCCCAAG. TG. CGGG. AAT--GCTA-G. ACGC. A. TGGGA. TTTAAGA. TCCCA. C-. GCC. ---AGTAA----T. GGT. G-T. GCCGG. TTCAGT. CCGGC. TTTGGGC

strand- pos = 2309..2391 score = 85.36 E = 1.34e-19
 draw save GGACAGG. TA. CGGA. AGT--GCCTAA. ACGC. T. TCTGA. CTGTAGA. TCAGA. C-. ACC. ----TTTA----T. GGT. TTC. GGGAG. TTCGAAT. CTCTC. CCTGTCC

>gb|U39713|U39713

strand+ pos = 1013..1099 score = 71.59
 draw save GGATACT. TA. CCCA. AGT--GCCTGA. AGGG. G. TAGCC. TTGAAA. GCTTA. TA. GAT. C--GGTAA-

strand+ pos = 1105..1189 score = 83.60
 draw save GGAGATT. TA. CCCA. AGT--GCCTGA. AGGG. G. CGCCT. CTCGAAA. ACGCT. TA. GGT. C---GTTA-

>gb|U39713|U39713

strand- pos = 4283..4363 score = 88.45
 draw save GCACCTCG. TG. CGGG. AAT--GCTA-G. ACGC. G. CTAGA. CTTAGGA. TCTAG. T-. TTC. ---ATCTA-

>gb|U39716|U39716

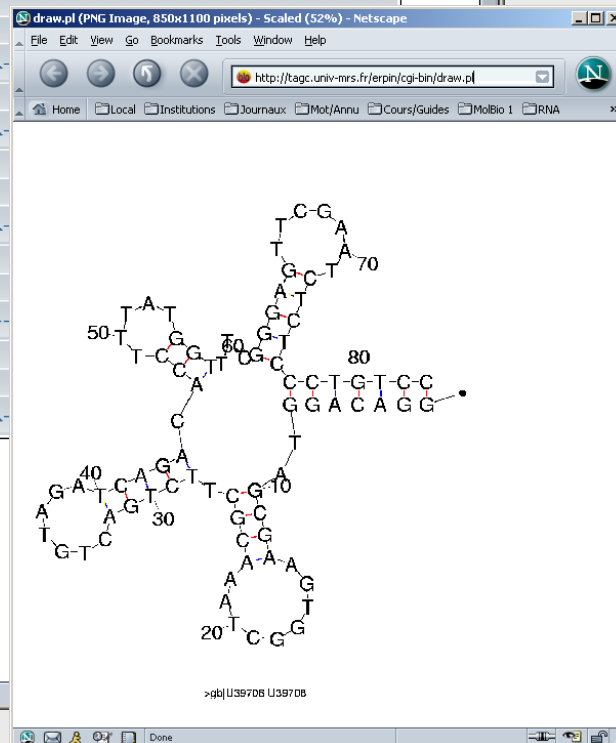
strand+ pos = 10104..10181 score = 51.91
 draw save CCTGGAG. TG. CGGG. AAT--GCTA-G. ACGC. G. CTGGA. CTCAAAA. CCCAC. T-. AGG. -----AA--

>gb|U39716|U39716

strand- pos = 7503..7586 score = 84.08
 draw save GTCGGAG. TG. CTGG. AAT--GCTA-G. ACAC. G. CAAGC. TTGAGT. GCTTG. T-. GGT. C---GTTA-

Statistics:

info	value
ratios	ATGC ratios: 0.346 0.339 0.158 0.157
level1	cutoff: 8.89 1 config. per site 33 hits
hits	7



IV. *De novo* ncRNA finding

- ★ How can we detect ncRNA genes when no prior sequence/structure data is available?

Exciting times for comparative genomics

Numerous potentially functional but non-genic conserved sequences on human chromosome 21

Emmanouil T. Dermitzakis*, Alexandre Reymond*, Robert I. Nathalie Scamuffa*, Catherine Ucla*, Samuel Deutsch*, Brian J. Stevenson†‡, Volker Flegel†‡, Philipp Bucher†\$, C. Victor Jongeneel†‡ & Stylianos E. Antonarakis*

Research Update

TRENDS in Genetics Vol.17 No.7 July 2001

373

Selective constraint in intergenic regions of human and mouse genomes

Svetlana A. Shabalina, Aleksey Yu. Ogurtsov, Vasily A. Kondrashov and Alexey S. Kondrashov

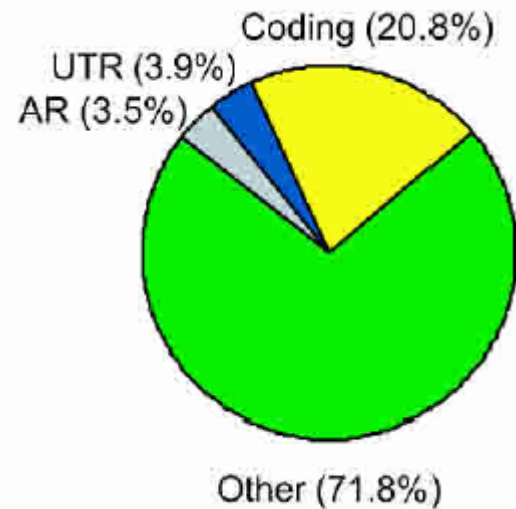
- ★ 5-6% of mammalian genome under selection vs 1.5% coding
- ★ 3 times as much as in nematodes!
- ★ « *Intergenic regions might hold the key to the complexity of mammals* »

Functional assignment of conserved regions

- ★ Coding exons
- ★ Regulatory non coding exons and introns
- ★ Promoters
- ★ ncRNA
- ★ Ancestral repeats
- ★ Others (matrix attachment, etc.)

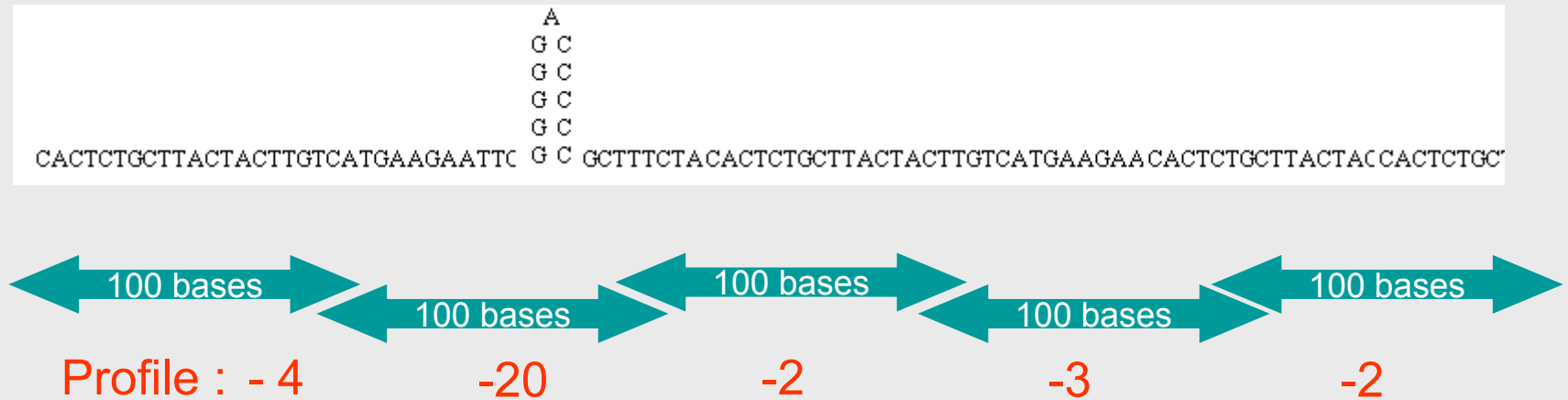
Detect this!

Fraction of conserved sequences in..
(AR=ancestral repeats)



Margulies et al, 2003

Thermodynamic Profiling (Le *et al.* 88)



$$Z\text{-score} = \frac{\text{window free energy} - \text{mean (energy of rnd seq.)}}{\sqrt{\text{Var(energy of rnd seq.)}}}$$

→ New software by Hofacker *et al.*: (RNALfold)

The problem with thermodynamics

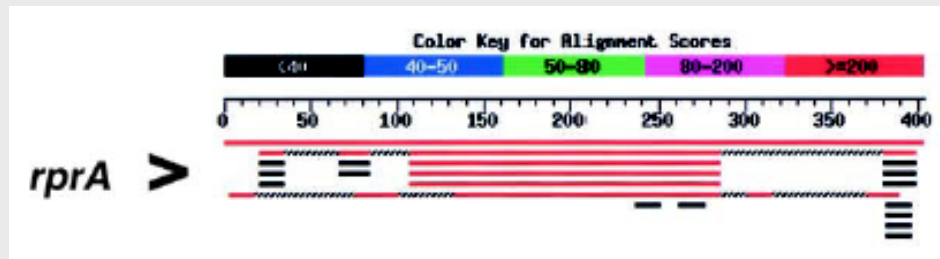
- ★ OK for strong local structures (some success in viral genomes)
- ★ However: true ncRNA (tRNA, rRNA) do not display higher folding energy than random sequences of same composition (di-nt: Rivas & Eddy 2000)

G+C content

- ★ G+C content alone is a better ncRNA predictor than free energy
 - ★ In high A+T background (thermophilic archaeobacteria), ncRNA stand out clearly.
 - ★ Combining (G+C)% and CpG% provides the best discriminant (Schattner '02).
 - ★ Does not work in genomes with « normal » G+C contents, except as a complement to other methods (thermodynamics, etc.)
- See software RNAGenie (Carter, Dubchak & Holbrook, 2001).
- Combines energy and G+C contents

Comparative Genomics + experiments

Bacteria: microarray + Northern in different growth conditions



From Wassarman et al. '01
Seq: Escherichia, Salmonella, Klebsiella

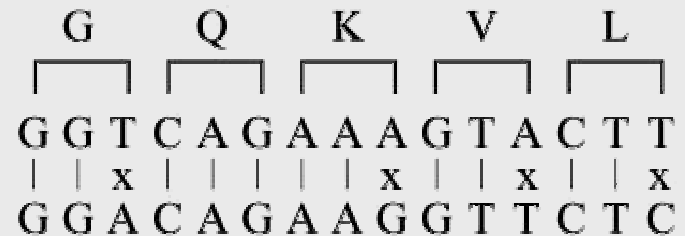
Wassarman *et. al.* '01: 60 ncRNA predicted, 23 confirmed

★ Argaman et al. '01: 24 predicted, 14 confirmed

Q-RNA (Rivas & Eddy 2001)

★ Analysis of Blast alignment (SCFG based)

- Model for protein coding gene



$P(\text{GGT-GGA}) * P(\text{CAG-CAG}) * \dots$

Synonymous mutations

- Model for ncRNA
(also include loop probabilities obtained from training set of real ncRNA)



$P(\text{T-T}) * P(\text{T-T}) * P(\text{GC-GC}) * P(\text{TA-AT}) * \dots$

Compensatory mutations

Q-RNA results

★ Limited range for similarity (65%-85%)

- Too dissimilar: incorrect Blast alignments
- Too similar: no covariation

→ Problem: Human/mouse/rat ncRNAs not in this range!

★ *E.coli* vs *Salmonella typhi*: analysis of ~5000 Blast hits

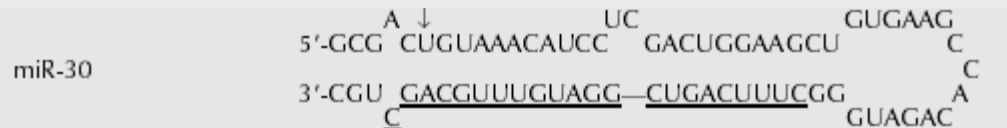
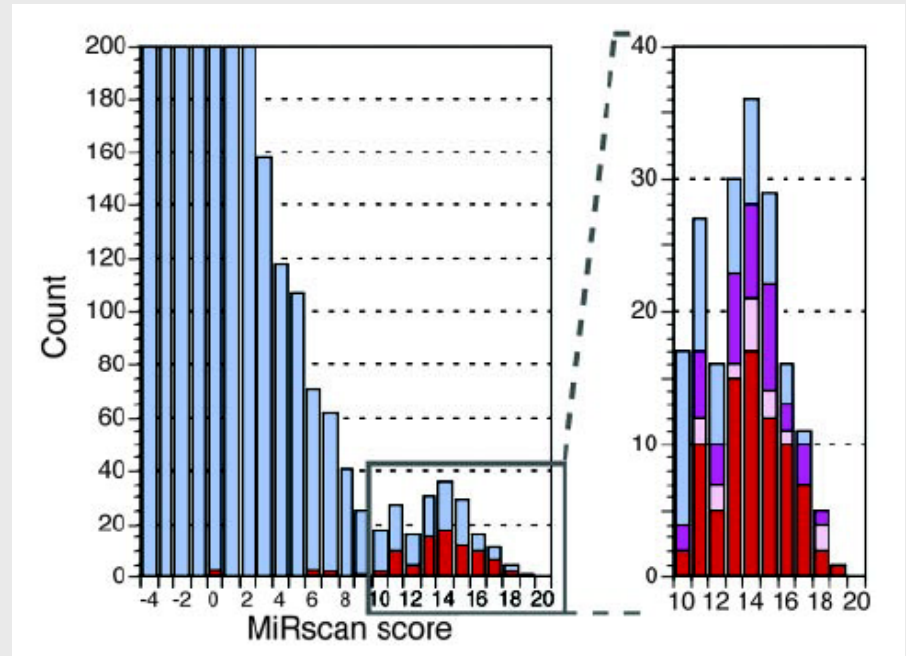
- 115 true ncRNAs
- 33 with Blastn alignments in the 65%-85% range
- 33 detected as ncRNA
- 440 other candidates (half of them known elements: terminators, palindromic repetitive elements, etc.)

Comparative Genomics & miRNA

Lim et al. Science 2003

★ Criteria:

- Loose conservation human/mouse/fugu
- Fall outside of protein coding gene
- Predicted to form stem-loop
 - 15000 hits
- Score based on resemblance to 21mer miRNA
- 107 potential new miRNAs



The right species for ncRNA detection?

- Human/mouse ncRNA: ~98-100% id
- 18S fugu/xenopus/human: 95% id! Still too close
- Obvious interest for older animals

```
gautheret@obelix.tagc.luminy: /obelix/gautheret/Actigenics
File Edit Options Buffers Tools Help

>chr1.trna67-AspGTC (184163445-184163374)  Asp (GTC) 72 bp  Sc: 72.92
    Length = 72

    Plus Strand HSPs:

Score = 360 (60.1 bits), Expect = 1.5e-13, P = 1.5e-13
Identities = 72/72 (100%), Positives = 72/72 (100%), Strand = Plus / Plus

Query:      1 TCCTCGTTAGTATAGTGGTGAGTATCCCCGCCTGTCACGCGGGAGACCGGGGTTTCGATTC 60
             |||
Sbjct:      1 TCCTCGTTAGTATAGTGGTGAGTATCCCCGCCTGTCACGCGGGAGACCGGGGTTTCGATTC 60

Query:      61 CCCGACGGGGAG 72
             |||
Sbjct:      61 CCCGACGGGGAG 72

WARNING: HSPs involving 56 database sequences were not reported due to the
limiting value of parameter B = 1.

--1:---F1 toto2 (Text Fill)--L323-- 6%
```

Human/mouse Asp tRNAs

Multiple species is the key

- ★ Multiple alignments will enable covariation detection
- ★ Covariation + GC-content + energy will provide enough evidence for ncRNA status

