

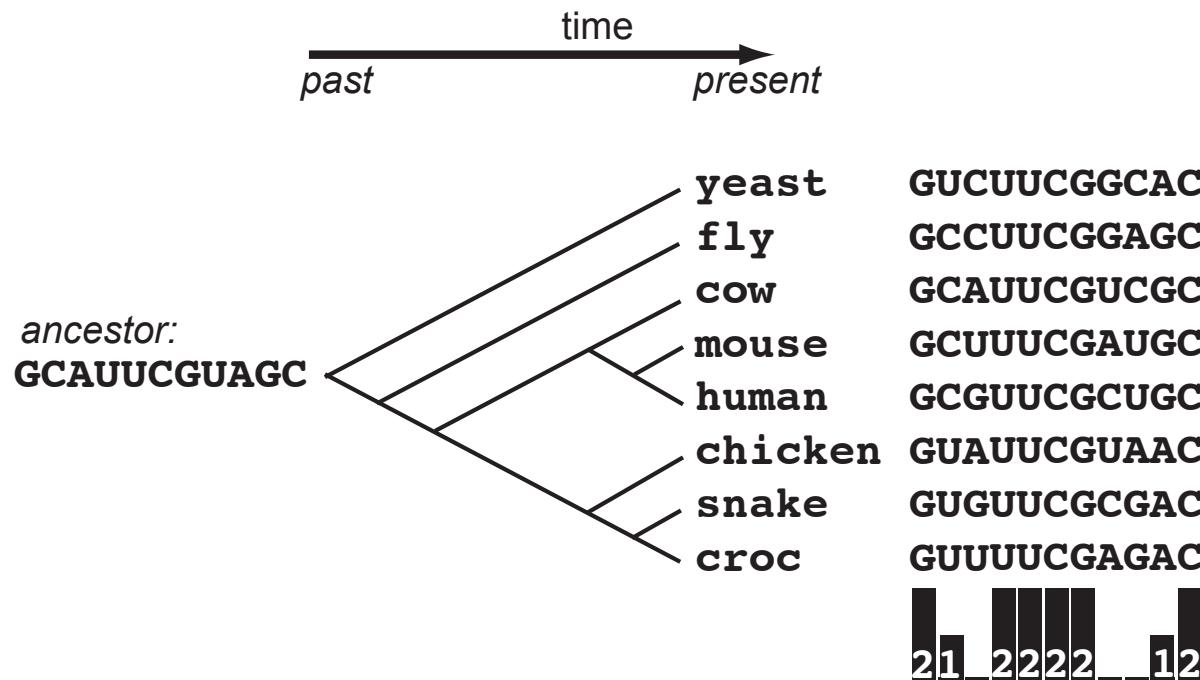
# **Discovery of Archaeal Group I Introns using Infernal**

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National Center for Biotechnology Information  
National Institutes of Health



# Sequence conservation provides information for homology searches



Each column is independent

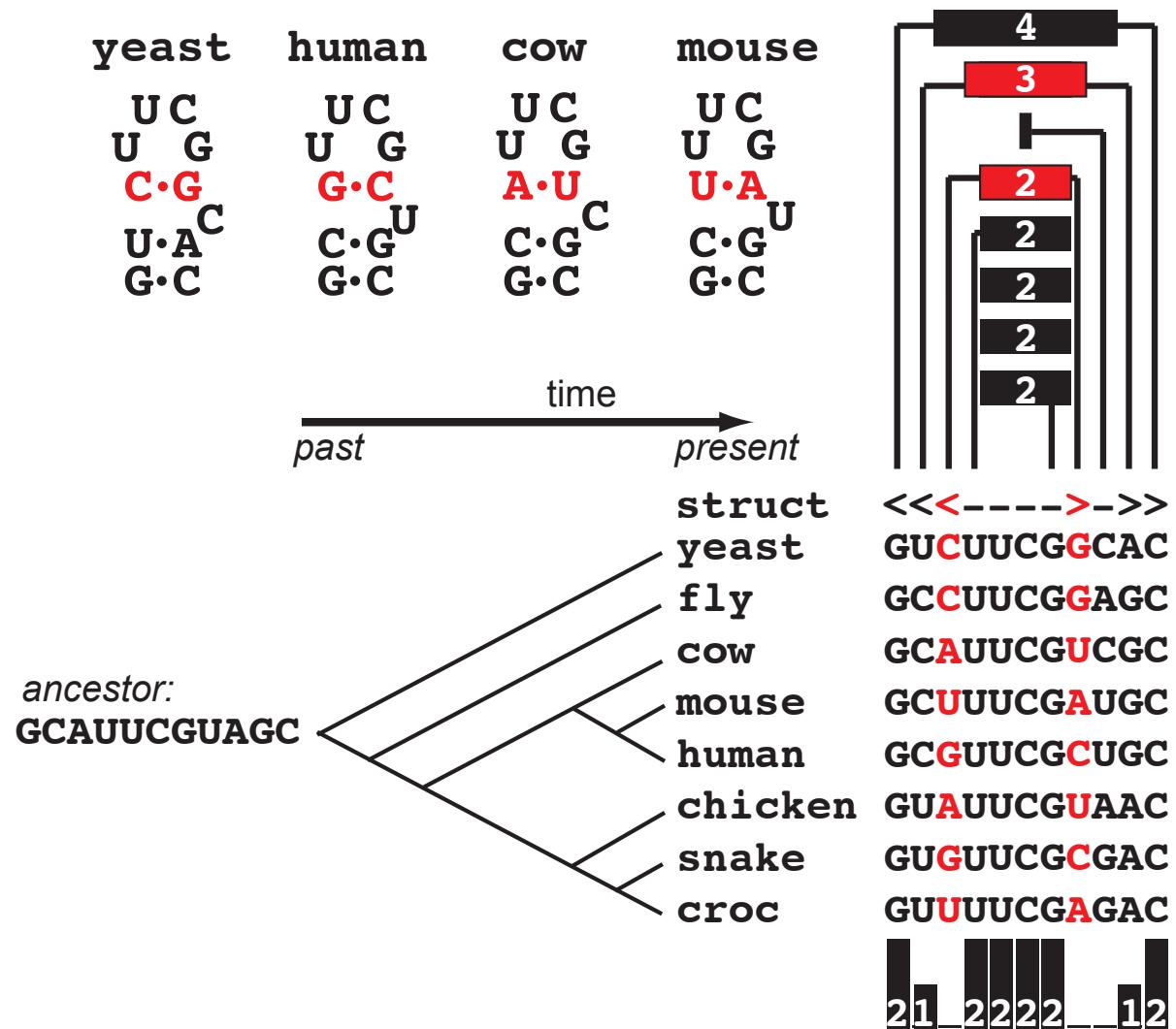
Maximum information is 2 bits per position, if column is 100% conserved.

$$\log_2 (4/1) = 2 \text{ bits}$$

sequence profile:  
14 bits

expect a match by chance: 1 in  $2^{14}$  nt  $\approx 16$  Kb

# Structure contributes additional information from covariation



sequence + **structure**  
profile: 17 bits

Base-paired columns  
are not independent

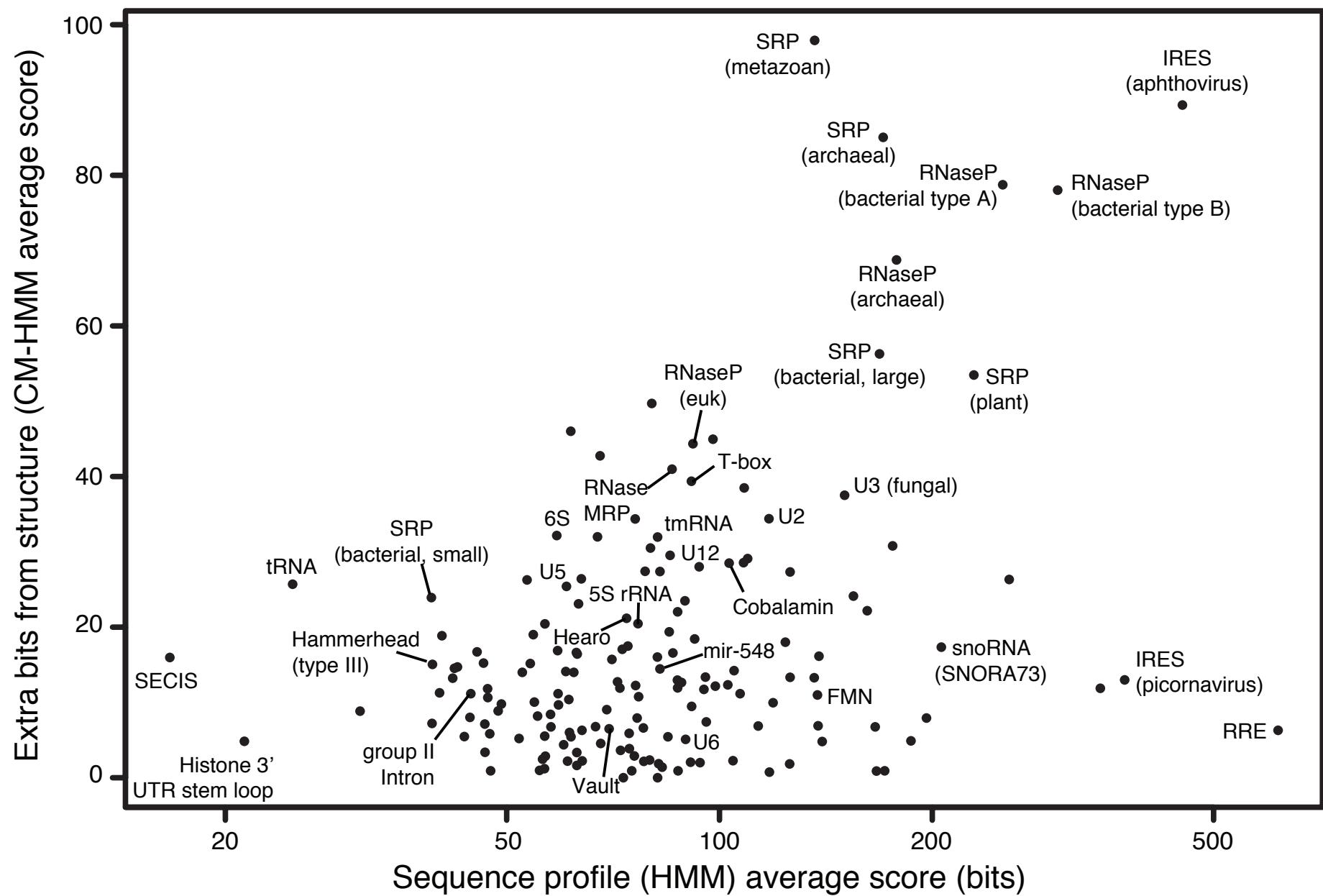
Maximum **extra** info:  
2 bits per base pair

$\log_2 (16/4) = 2$  bits

sequence profile:  
14 bits

expect a match by chance: 1 in  $2^{17}$  nt  $\approx 130$  Kb  
reducing expected false positives by  $2^3 = 8$ -fold

# Levels of sequence and structure conservation in RNA families



# Eddy lab software for profile probabilistic models (since 1994)

	sequence profiles	sequence and structure profiles
models	profile HMMs	covariance models (CMs)
software	HMMER	Infernal
main use	proteins, repetitive DNA elements	structural RNAs
databases	Pfam and Dfam (16712 and 4150 entries)	Rfam (2791 families)
performance for RNAs	faster but less accurate	slower but more accurate

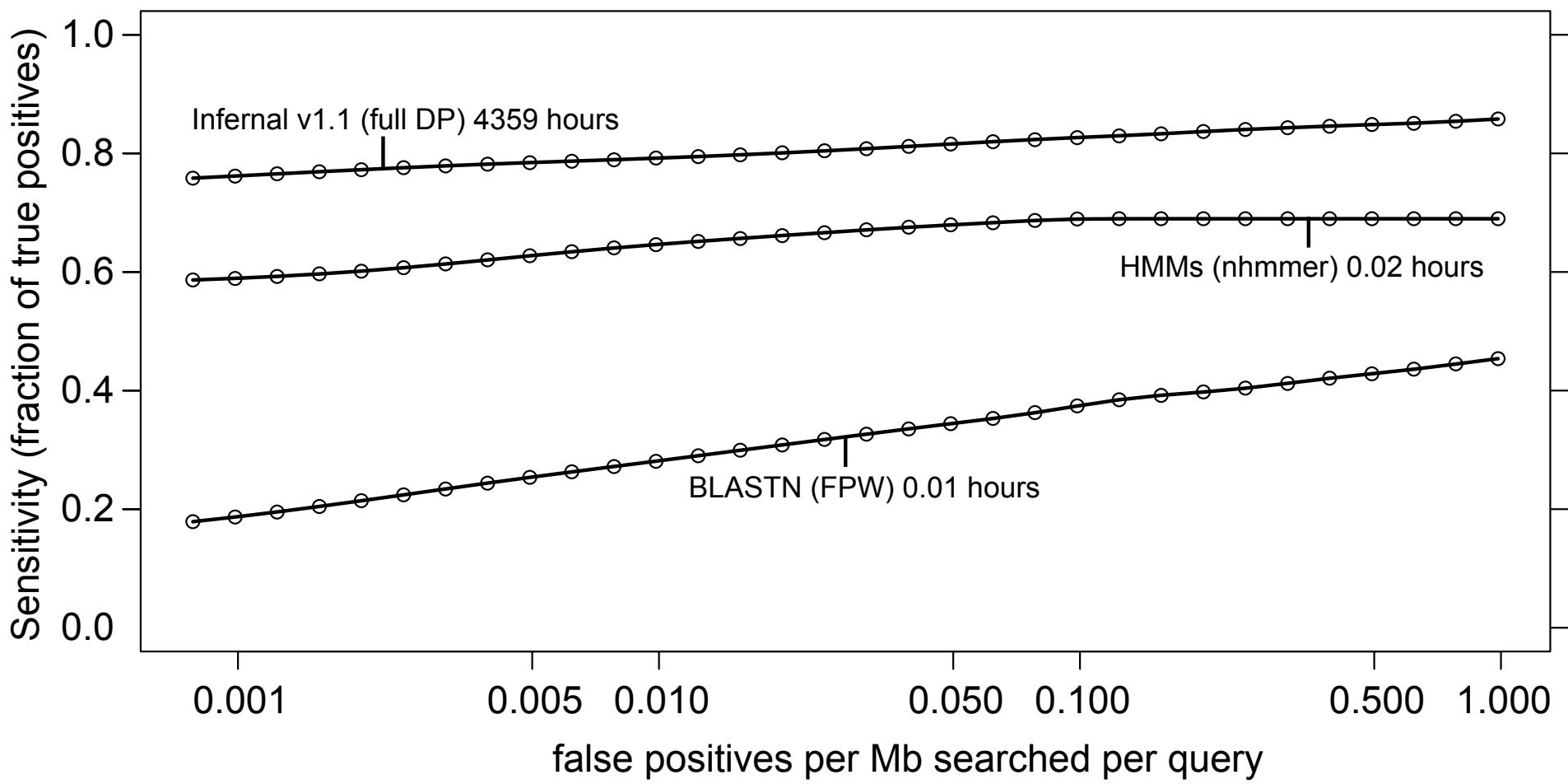


<http://hmmer.janelia.org>  
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<http://infernal.janelia.org>  
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Eddy SR, Durbin R.  
Nucleic Acids Research,  
22:2079-2088, 1994.

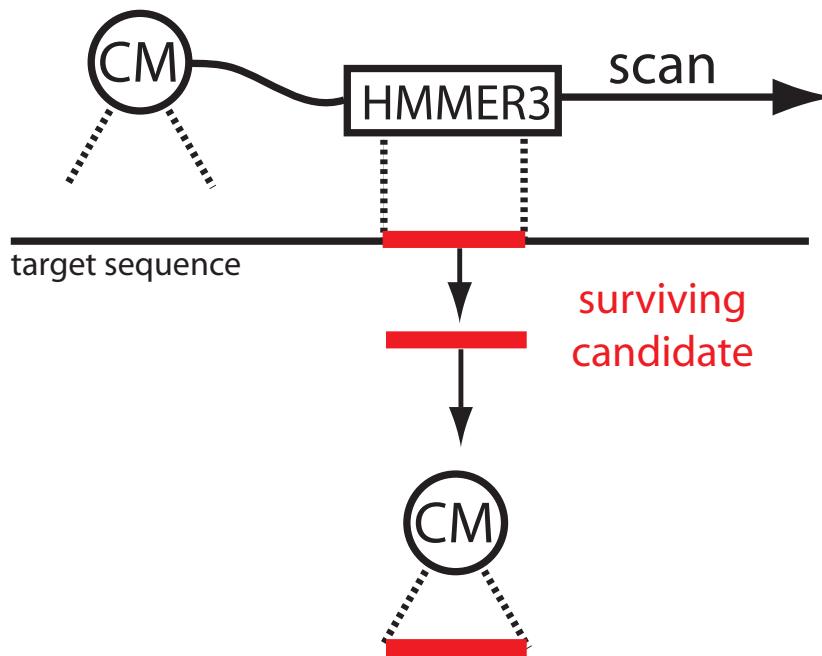
# Infernal outperforms primary-sequence based methods on our benchmark (and others\*, not shown)



Nawrocki EP, Eddy SR. Bioinformatics, 29:2487-2489, 2013.

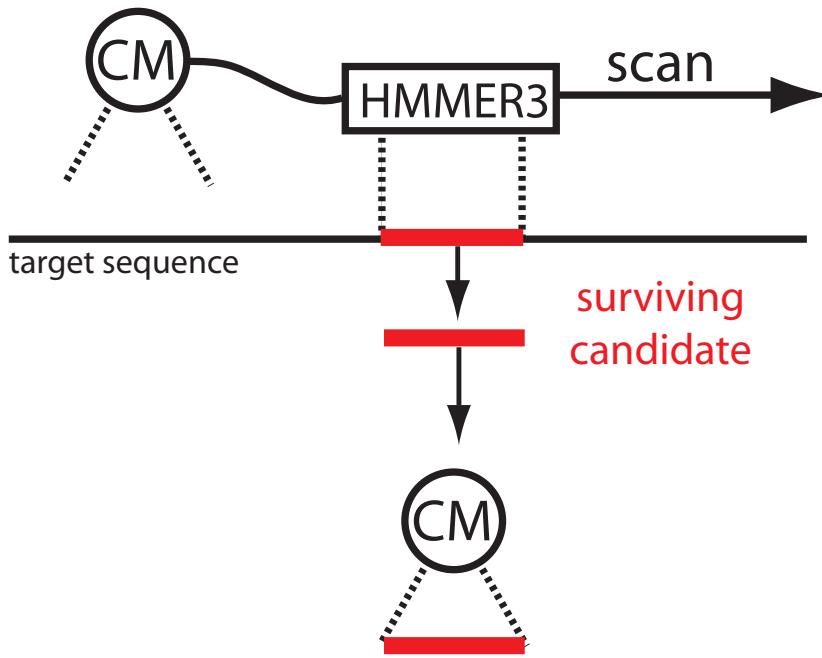
# Filter target database using profile HMMs\*

HMM filter first pass



# Filter target database using profile HMMs\*

HMM filter first pass



- Even if we filter out 99% of the database (for up to 100X acceleration), searches will still be too slow.
- CM step needs to be accelerated.

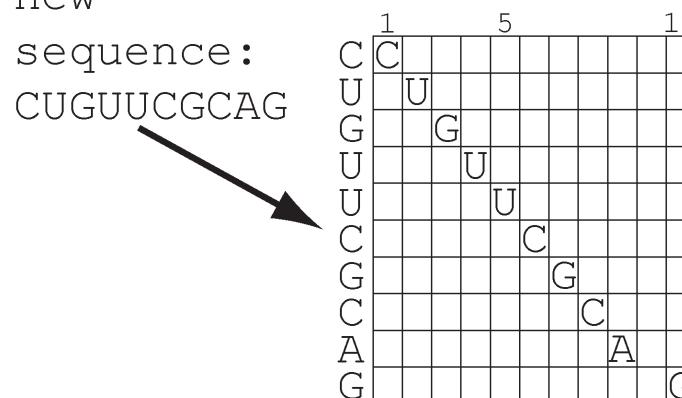
\*Weinberg, Ruzzo, RECOMB, 243-251, 2004; Weinberg, Ruzzo, Bioinformatics, 22(1) 35-39 2006.

# Accelerating CM alignment step 1: HMM posterior decoding to get confidence estimates

yeast	GUGUUCGCUAC
human	-UCUUCGGCG-
fly	AGAUU-GUACU
	1            5            11

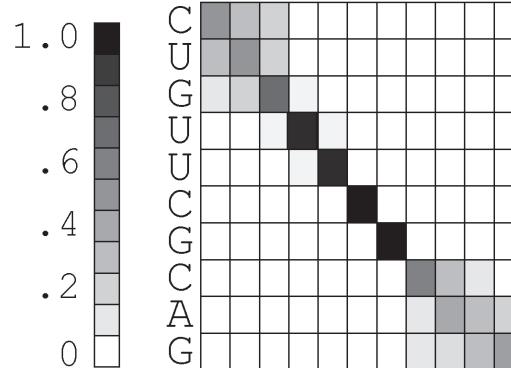
new

sequence:  
CUGUUCGGCAG



probability

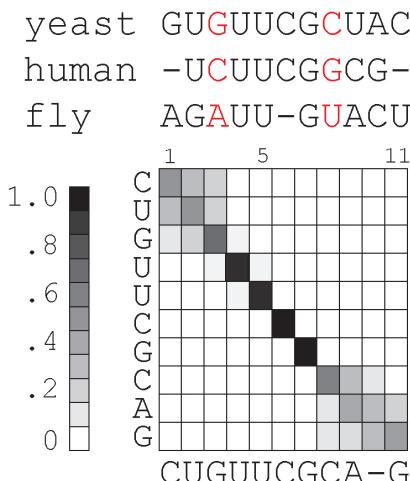
"correct":



# Accelerating CM alignment step 2: use HMM alignment confidence to constrain CM alignment\*

**HMMs -**

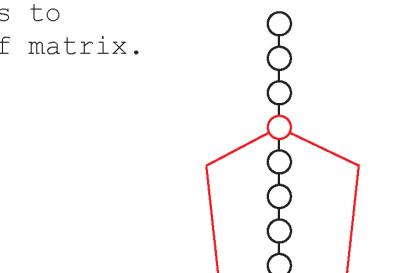
Each column of seed alignment corresponds to a column of matrix.



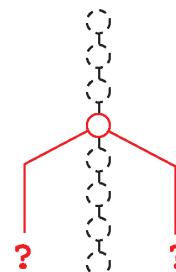
**CMs -**

Each column of seed alignment corresponds to a state.

yeast	human	fly
U C	U C	U
U G	U G	U G
<b>G•C</b>	<b>C•G</b>	<b>A•U</b>
U•A U	U•G C	G•C A
G•C		A•U



struct <<----->->  
 yeast GUGUUCG**C**UAC  
 human -UCUUCGG**G**CG-  
 fly AG**A**UU-G**U**ACU

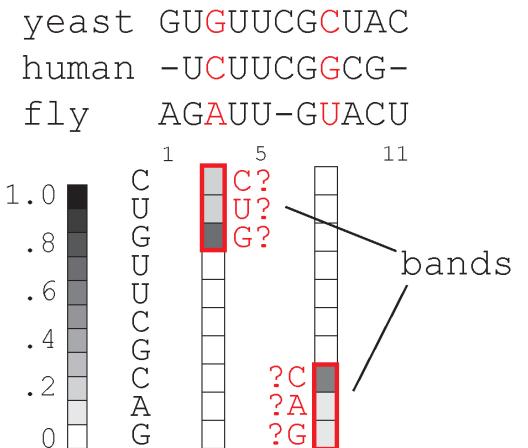


CUGUUCGCAG  
 45 possibilities

# Accelerating CM alignment step 2: use HMM alignment confidence to constrain CM alignment\*

**HMMs -**

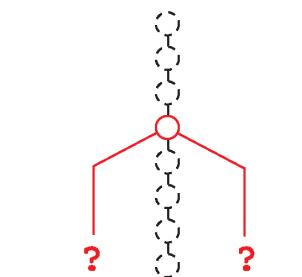
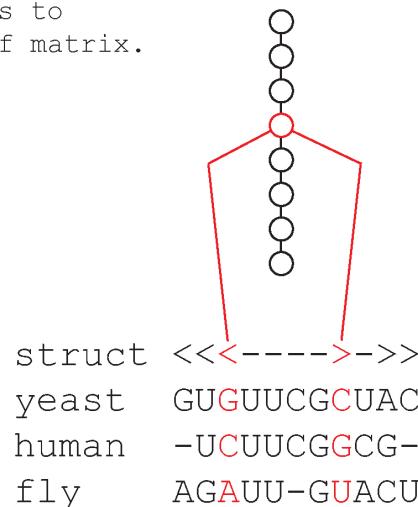
Each column of seed alignment corresponds to a column of matrix.



**CMs -**

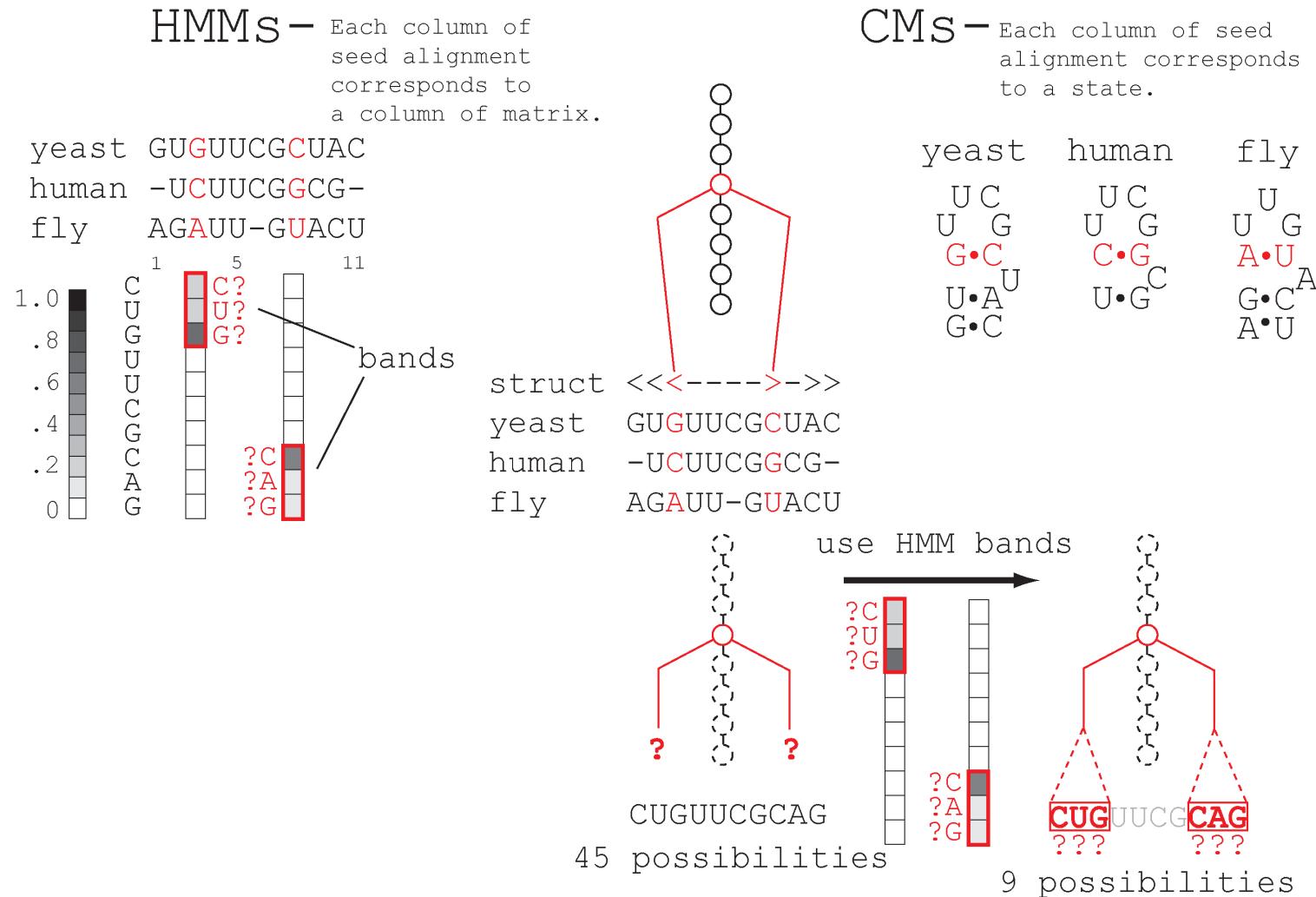
Each column of seed alignment corresponds to a state.

yeast	human	fly
U C	U C	U
U G	U G	U G
<b>G•C</b>	<b>C•G</b>	<b>A•U</b>
U•A U	U•G C	G•C A
G•C		A•U



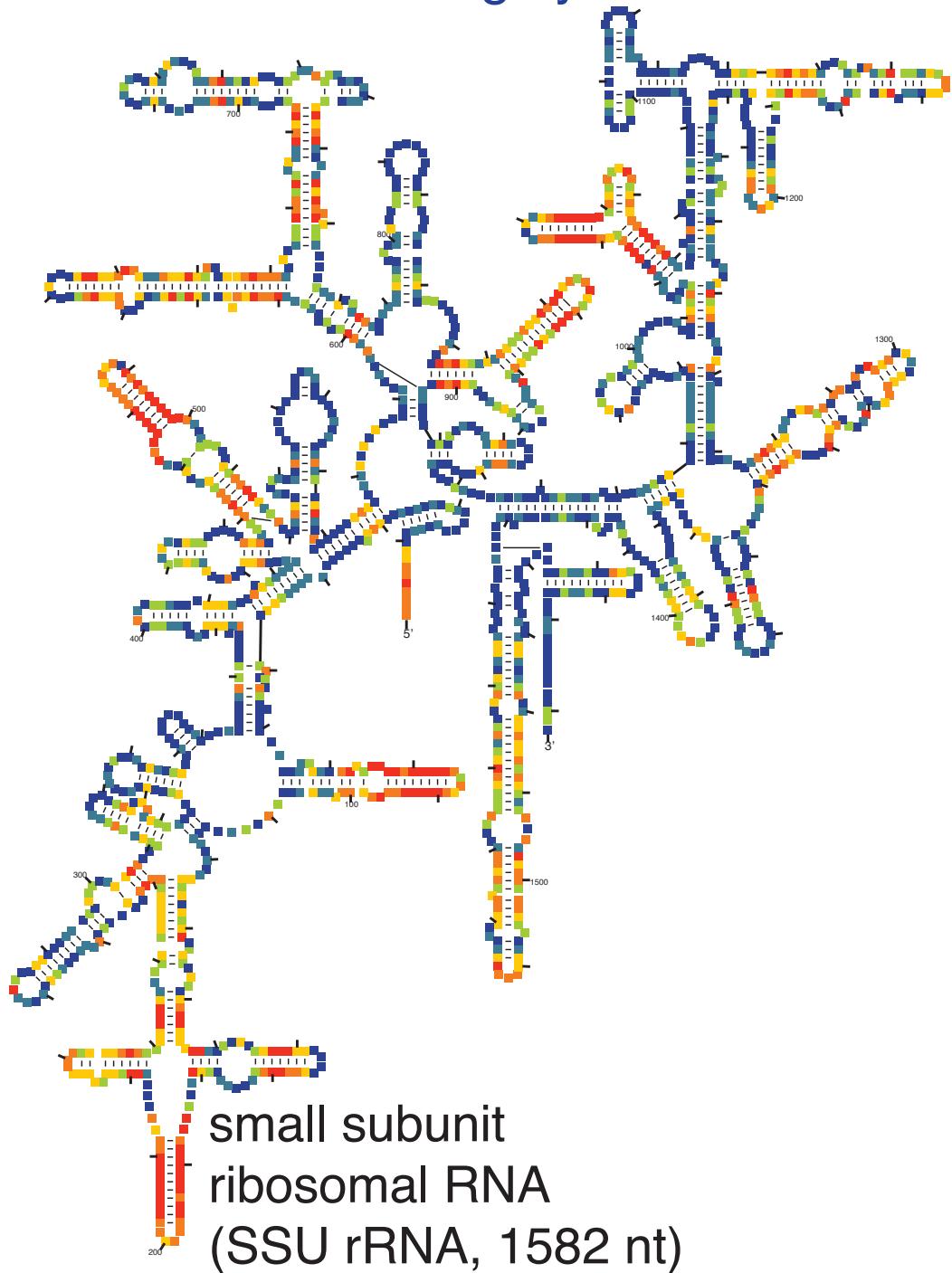
CUGUUCGCAG  
 45 possibilities

# Accelerating CM alignment step 3: use HMM alignment confidence to constrain CM alignment\*



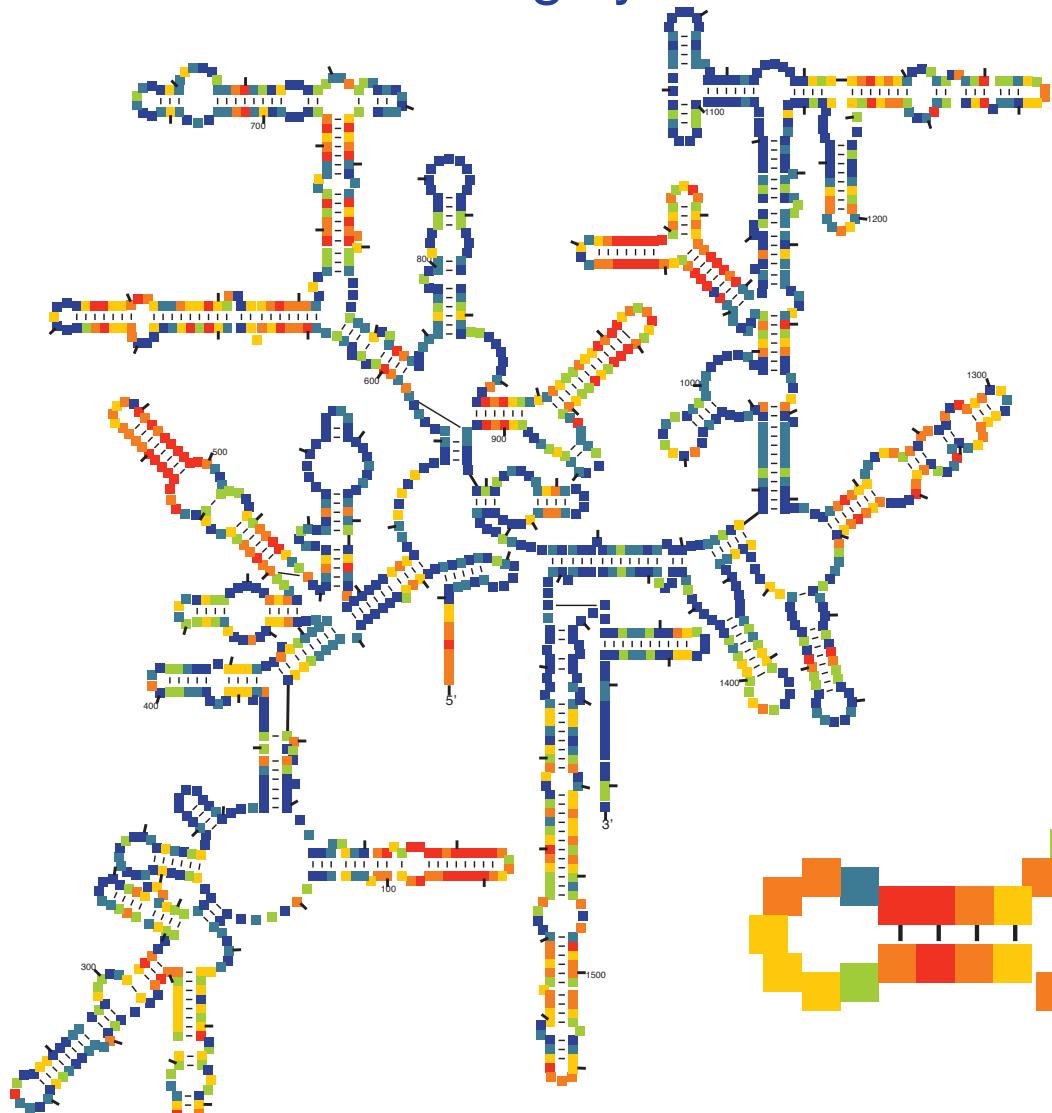
# Sequence conservation per position

blue:highly conserved ..... red: highly variable

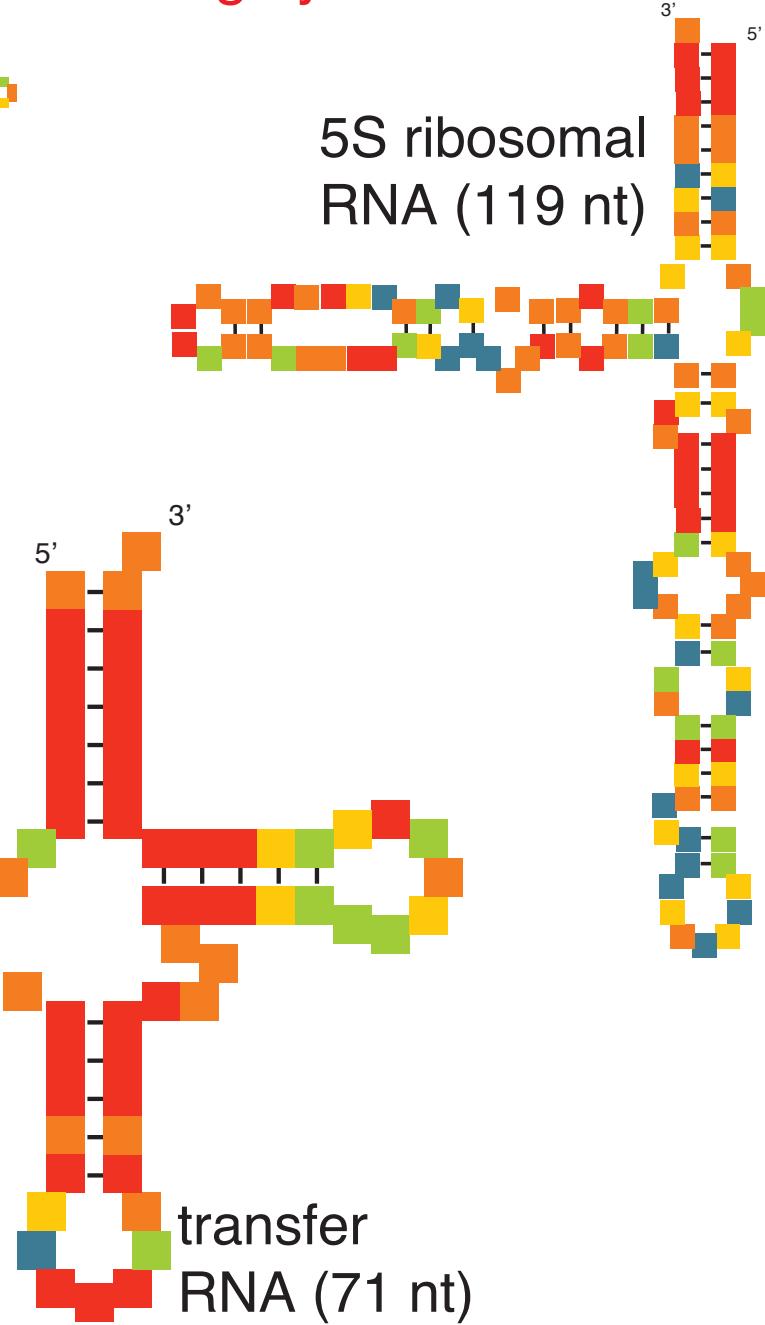


# Sequence conservation per position

blue:highly conserved ..... red: highly variable



small subunit  
ribosomal RNA  
(SSU rRNA, 1582 nt)

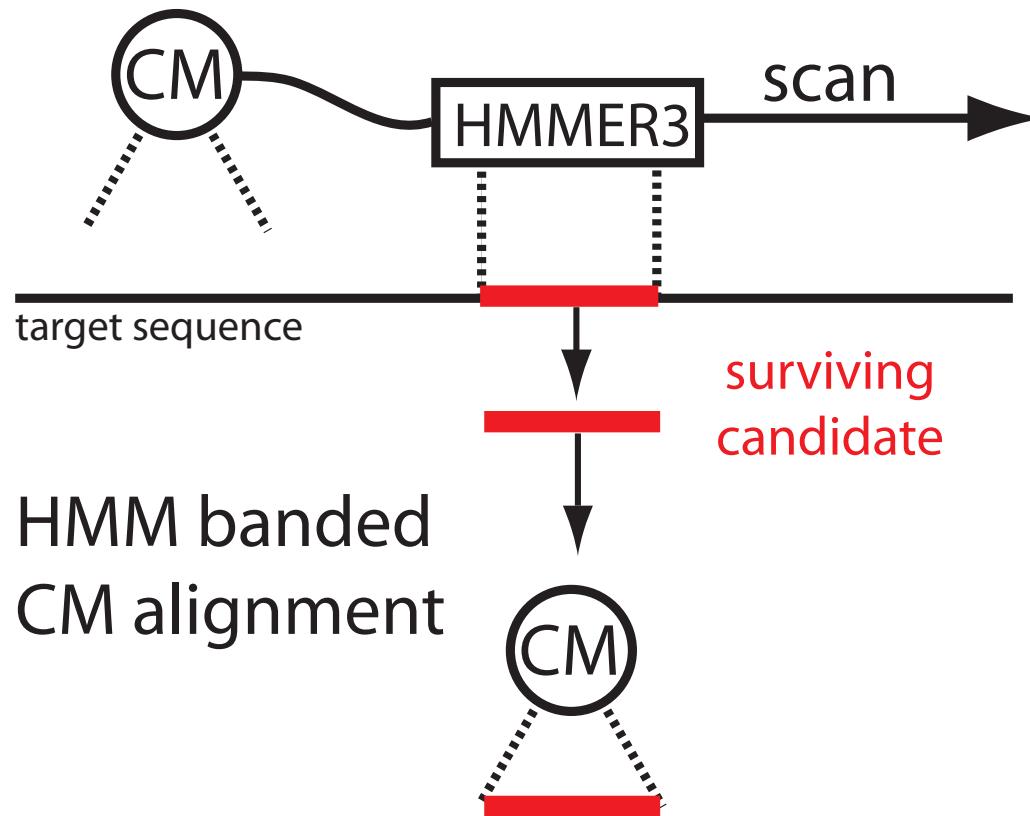


5S ribosomal  
RNA (119 nt)

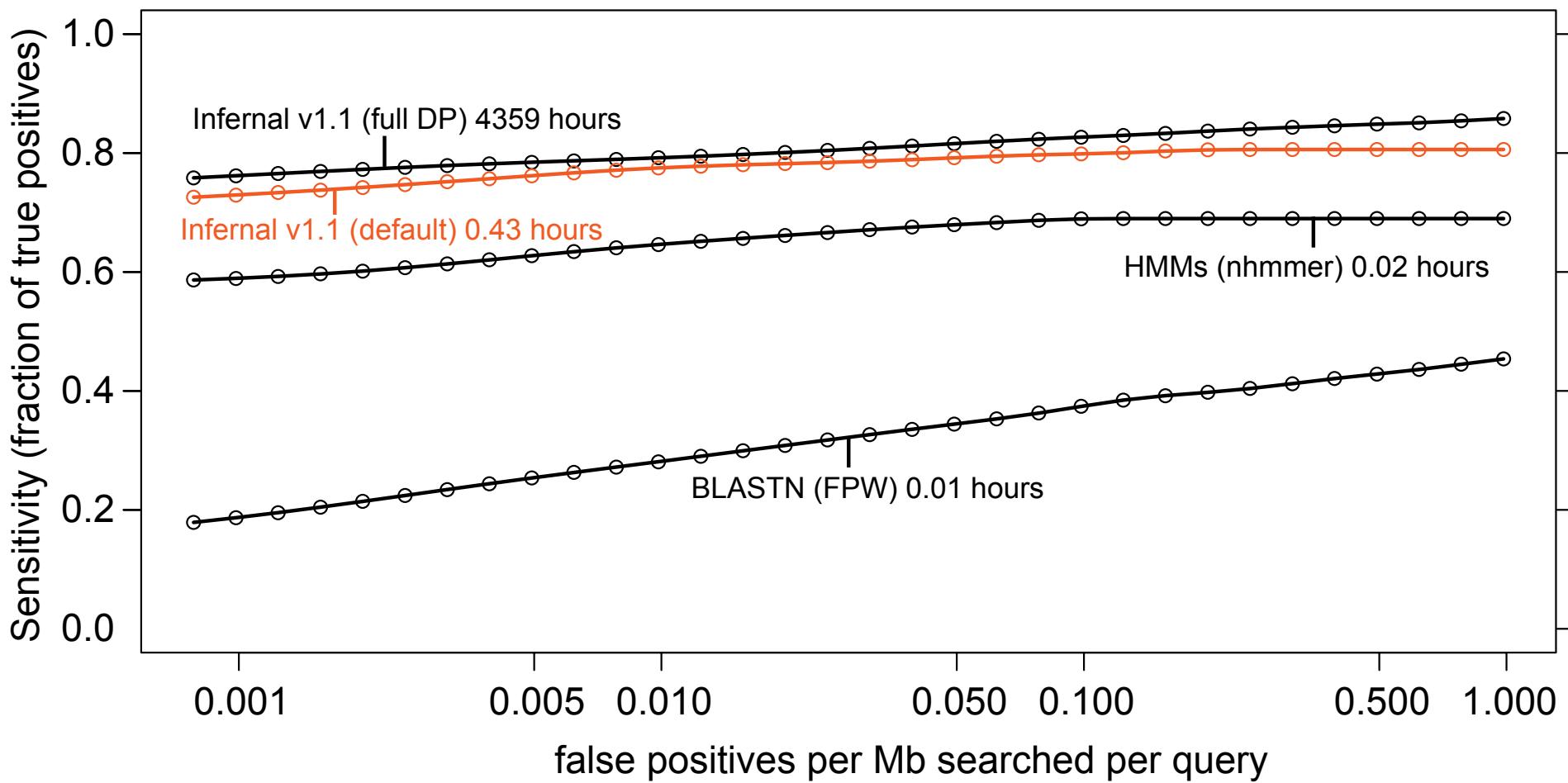
transfer  
RNA (71 nt)

# Use HMMs as filters and to constrain CM alignment

## HMM filter first pass



# HMM-based acceleration makes Infernal 10,000 times faster



Nawrocki EP, Eddy SR. Bioinformatics, 29:2487-2489, 2013.

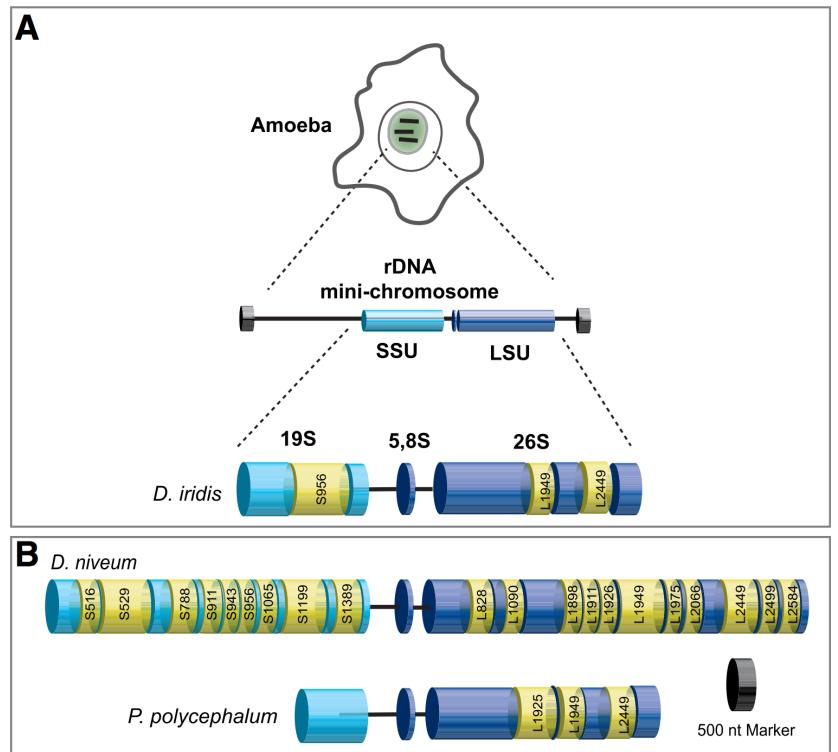
# Infernal 1.1 finds 11,000 new group I intron candidates

**Table 1.** Comparison of the old Rfam 11.0 BLAST and Infernal 1.0 search strategy versus the new Rfam 12.0 Infernal 1.1 search strategy for 15 of 200 randomly chosen families

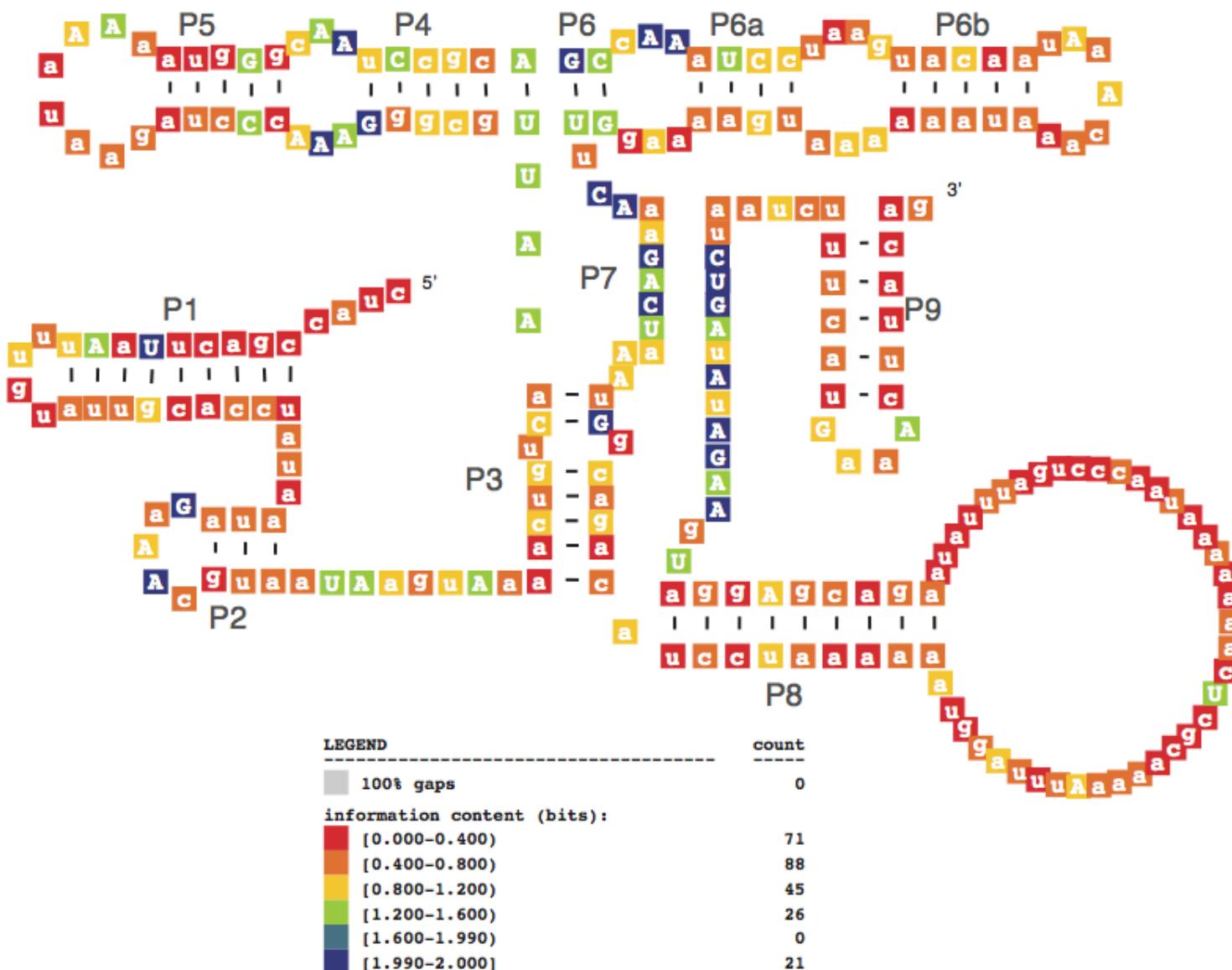
Accession	Family ID	Length (nt)	#of seed seqs	Time new (h)	Time old (h)	Time (old/new)	New total hits	Old total hits	New unique hits	Old unique hits
Top five families										
RF00028	Intron-gpI	251	12	125.0	357.2	2.8	71 433	60 264	11 175	1
RF00026	U6	104	188	31.2	181.1	5.8	66 517	62 174	4367	14
RF00003	U1	166	100	11.6	64.0	5.5	15 770	14 867	904	1
RF00162	SAM	108	433	8.3	590.0	70.8	4905	4797	108	0
RF00050	FMN	140	144	17.1	169.9	23.9	4381	4306	76	1

# Group I catalytic introns

- self splicing ribozymes found in lower eukaryotes, higher plants, bacteria and bacteriophages
- often have ORFs (homing endonucleases) inserted in loop regions
- genes they are found in:
  - bacteria and mitochondria and chloroplast of lower euks: rRNA, mRNA, and tRNAs
  - higher plants mitochondria and chloroplast: a few tRNA and mRNA genes
  - nuclear lower eukaryotic genomes: only rRNA

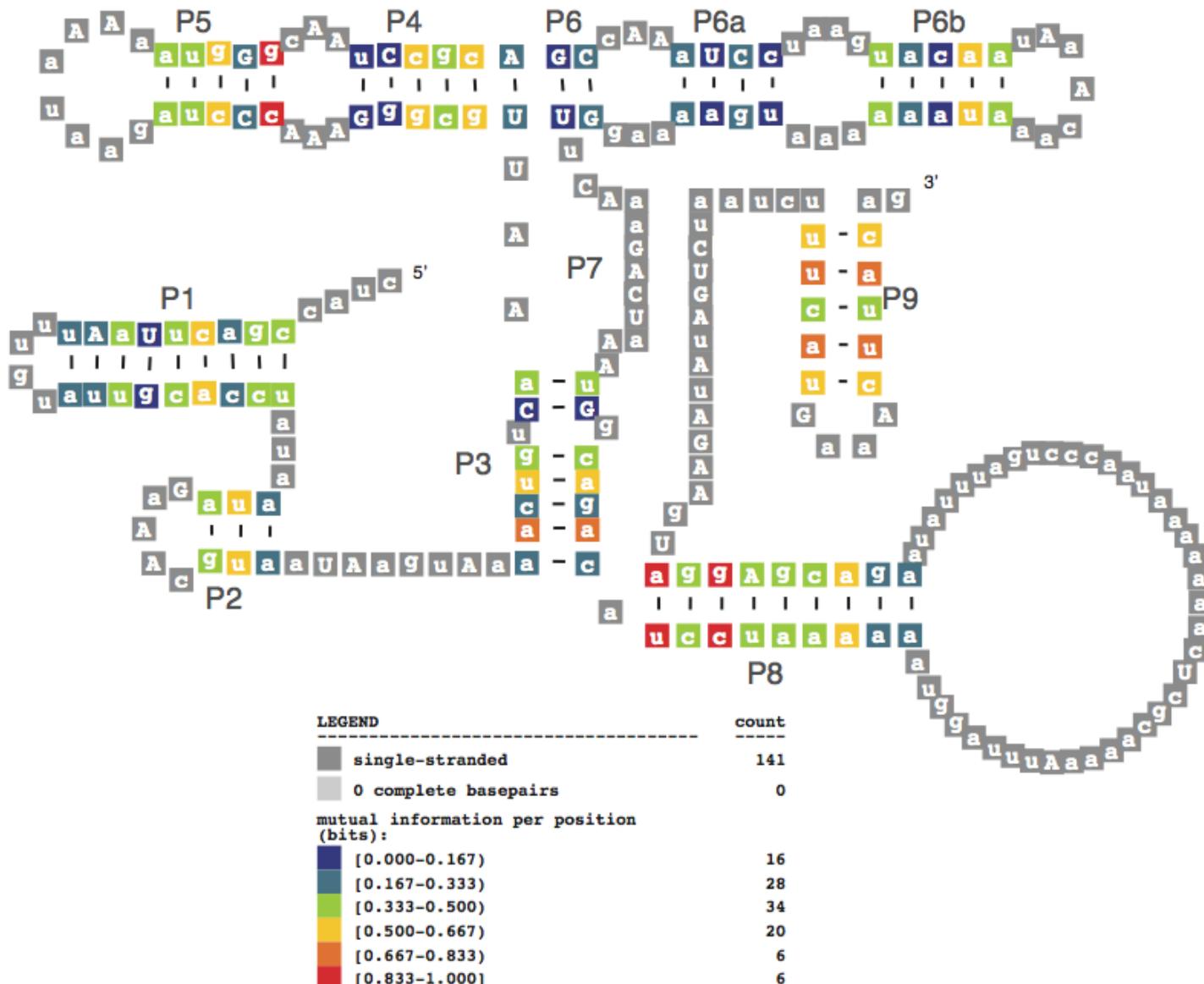


model	#pos	#bps	#seqs	description
Group I Intron	251	55	12	information content per position



Consensus nucleotides (nt) are displayed, defined as the most frequent nt at each position.  
Capitalized nts occur in  $\geq 0.75$  fraction of sequences that do not have a gap at the position.

model	#pos	#bps	#seqs	description		
Group	I	Intron	251	55	12	mutual information per basepaired position



Consensus nucleotides (nt) are displayed, defined as the most frequent nt at each position.  
Capitalized nts occur in >= 0.75 fraction of sequences that do not have a gap at the position.

# GISSD\*: Group I Intron Sequence and Structure Database



# GISSD

Group I Intron Sequence and  
Structure Database **Wuhan University, China**

Home Search Sequence **Structure** Alignment Distribution gIRfam Submission Help

#						R- scape		bits
#								-----
#	idx	name	nseq	avlen	%id	nbp	nsig	HMM CM-HMM
#	-----	-----	-----	-----	-----	-----	-----	-----
1		RF00028	12	364.8	34	61	8	62.6 41.7
2		IA1	76	583.6	45	82	51	166.5 38.0
3		IA2	15	276.8	38	67	24	58.0 47.5
4		IA3	56	282.3	46	81	50	122.4 39.1
5		IB1	42	298.0	72	87	9	320.4 51.8
6		IB2	18	242.2	39	65	27	57.1 39.3
7		IB3	7	277.7	52	72	10	98.5 60.3
8		IB4	89	282.3	44	72	43	108.3 33.2
9		IC1	837	436.0	39	103	84	130.3 40.3
10		IC2	32	320.2	66	86	27	298.1 51.7
11		IC3	328	255.8	67	58	16	244.1 13.2
12		ID	17	242.5	53	66	16	122.8 45.5
13		IE1	38	362.2	60	95	19	268.0 44.8
14		IE2	56	399.9	55	112	38	250.9 47.4
15		IE3	110	405.9	57	119	51	293.4 45.7

## Searching Rfamseq with GISSD models

type	# RF00028 seed seqs	# hits total	# hits common	# hits unique
IA1	3	814	385	425
IA2	1	1722	823	899
IA3		958	401	557
IB1		3949	1033	2916
IB2		1861	467	1394
IB3		479	136	343
IB4	1	5717	2400	3317
IC1	3	8475	5385	3090
IC2		4870	3858	1012
IC3	4	72692	66033	6659
ID		572	0	572
IE1		1305	10	1295
IE2		1377	8	1369
IE3		1379	1	1378
total	12	106170*	80940*	16842
RF00028	-	71421	71421	-

\* contains overlaps

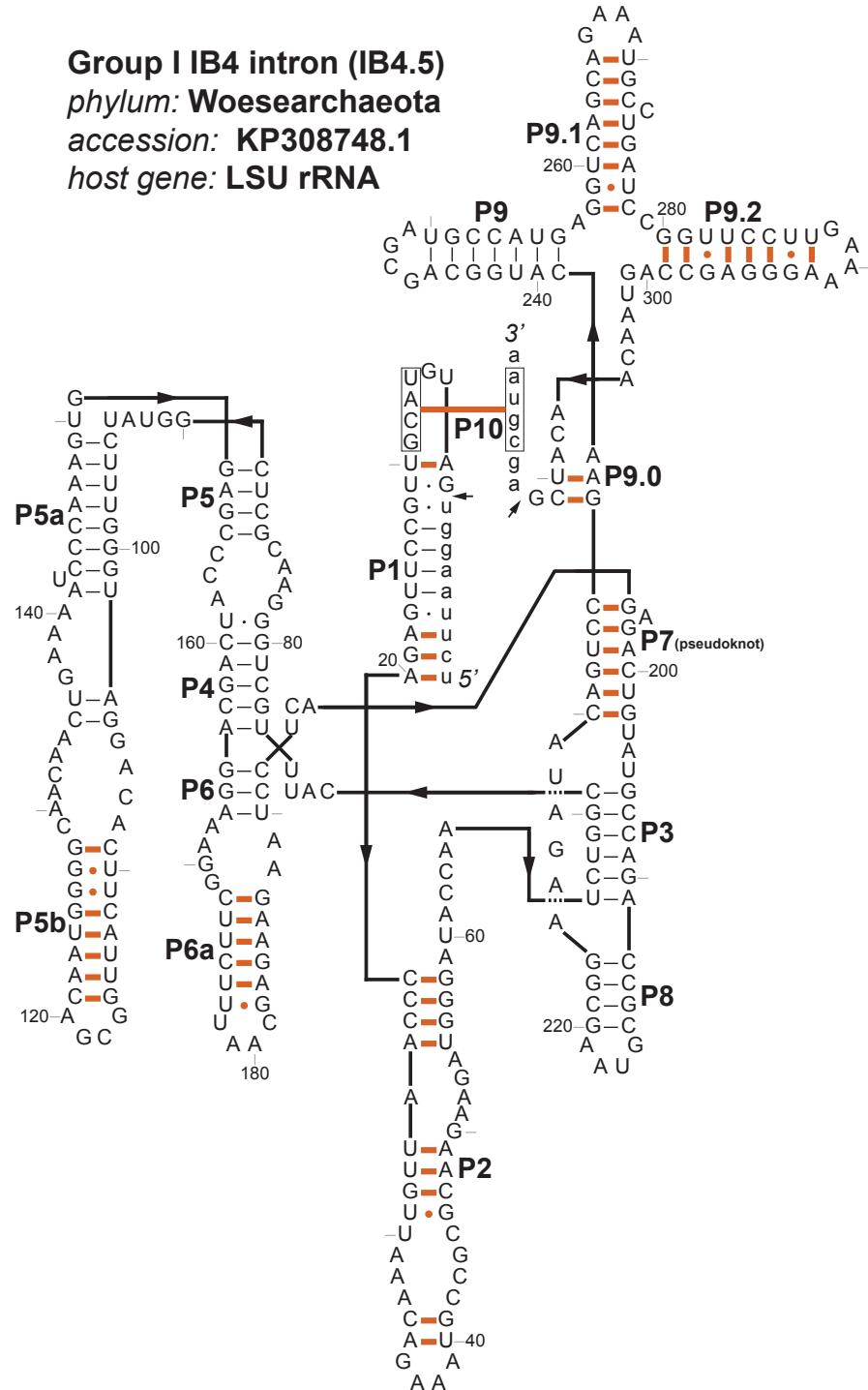
Group I Introns?		
	previously known	Infernal v1.1 predictions
<b>EUKARYOTA</b>	insects	- +
	flatworms	- +
	vertebrates	- +
	jellyfish	+ +
	Choanoflagellata	- +
	fungi	+ +
	plants	+ +
	ciliates	+ +
<b>ARCHAEA</b>	Euryarchaeota	- -
	Crenarchaeota	- +
	Thaumarchaeaota	- +
<b>BACTERIA</b>	Proteobacteria	+ +
	Cyanobacteria	+ +
	Aquifex	- +
	Bacteriodetes	- +
	Firmicutes	+ +
	Actinobacteria	- +

## Homology searches for group I introns in Archaea

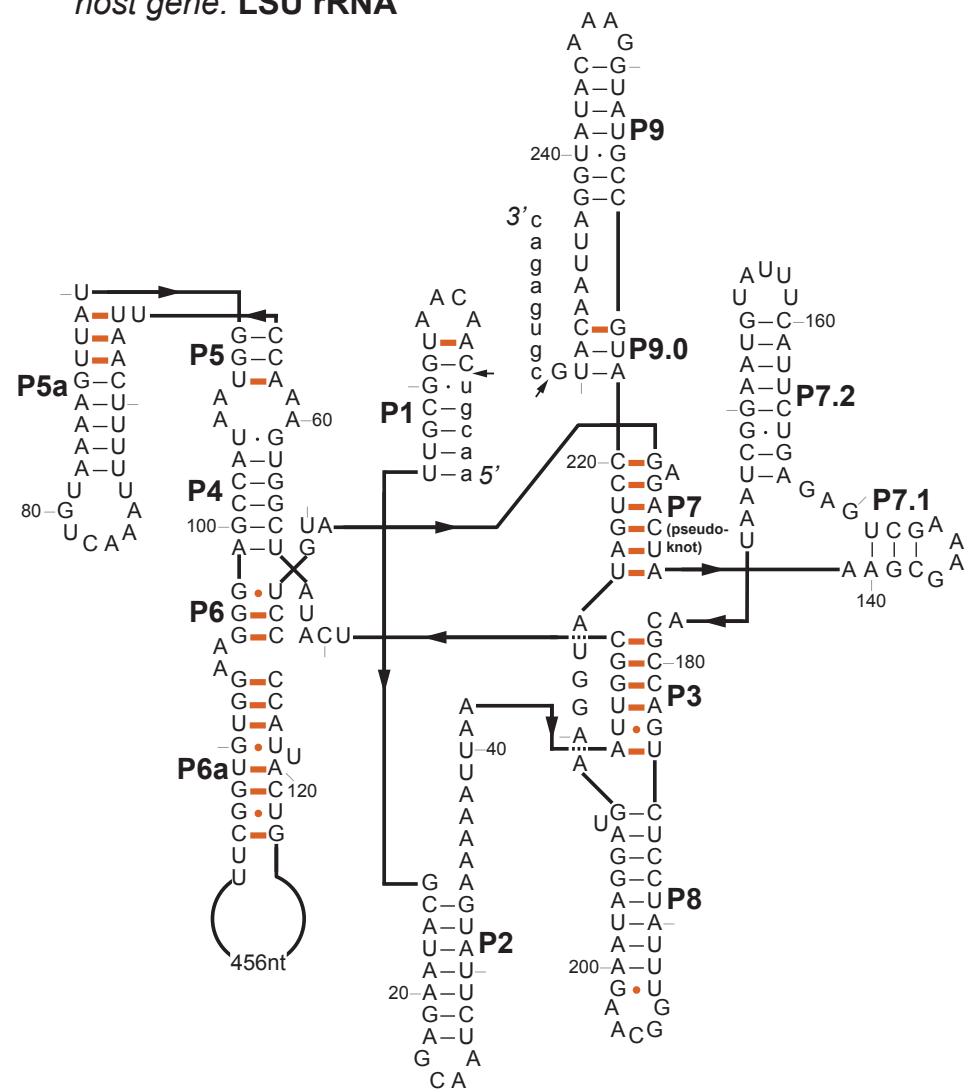
- downloaded all archaeal sequences in GenBank (6.7Gb as of Sept 2017)
- searched archaeal sequences with all GISSD models + RF00028 with default cmsearch parameters and with --anytrunc
- 95 non-overlapping hits with  $E < 0.01$  corresponding\* to 39 group I intron candidates (12 IA3 and 27 IB4)
- 30/39 introns have at least one hit with  $E < 10^{-10}$
- 36 within LSU rRNA, 3 within SSU rRNA
- All IA3s are in one of two LSU insertion positions:
  - LSU/2593 (N=10)
  - LSU/2500 (N=2)
- All IB4s are in one of two LSU insertion positions and one SSU position:
  - LSU/1931 (N=15)
  - LSU/1923 (N=9)
  - SSU/1498 (N=3)

\*as determined via manual sequence analysis by Tom Jones

**Group I IB4 intron (IB4.5)**  
**phylum: Woesearchaeota**  
**accession: KP308748.1**  
**host gene: LSU rRNA**



**Group I IA3 intron (IA3.1)**  
**phylum: Woesearchaeota**  
**accession: CP010426.1**  
**host gene: LSU rRNA**



\*

# Could archaeal group I introns have evolved into BHB introns?

## Evolution of introns in the archaeal world

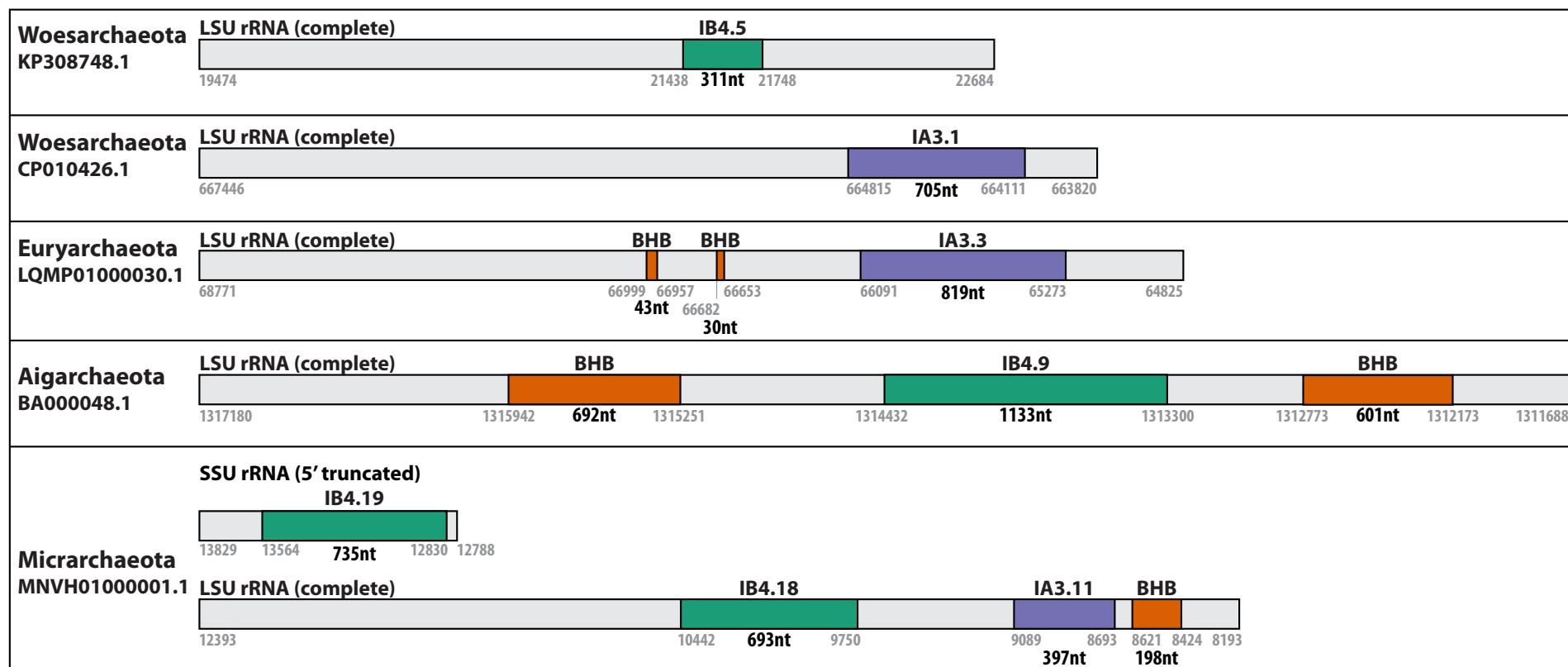
Giuseppe D. Tocchini-Valentini, Paolo Fruscoloni, and Glaucio P. Tocchini-Valentini<sup>1</sup>

Istituto di Biologia Cellulare, Consiglio Nazionale delle Ricerche, Campus A, Buzzati-Traverso, Via Ramarini 32, Monterotondo Scalo, 00016 Rome, Italy

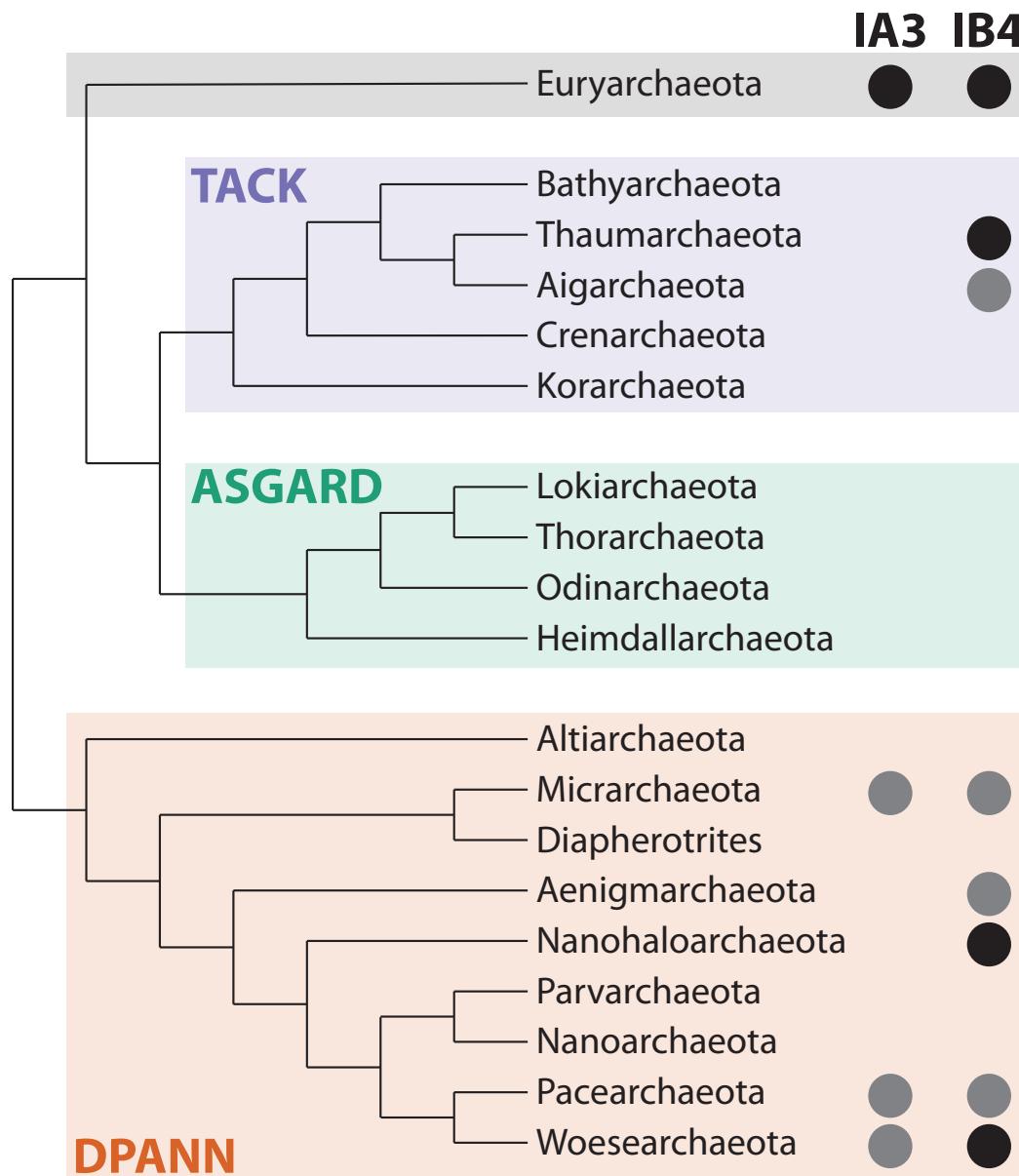
Contributed by Glaucio P. Tocchini-Valentini, January 24, 2011 (sent for review December 1, 2010)

\*

## Archaeal group I introns can occur in same host gene as BHB introns



# Group I introns are widespread in Archaea



# Acknowledgements

## **Harvard/Janelia**

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Diana Kolbe  
Travis Wheeler  
Elena Rivas  
Michael Farrar

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David Landsman  
Jim Ostell  
David Lipman

---

## **GISSD**

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Chen Lu  
Qi-Jia Wu  
Yu Wang  
Zhi-Tao Sun  
Jia-Cong Deng  
Yi Zhang

## **David Haussler's group**

Yasu Sakakibara  
(CM-like models in 1994)

A scenic mountain landscape featuring a clear, rocky river flowing through a lush green valley. The background consists of majestic mountains covered in dense forests under a bright blue sky dotted with large, white cumulus clouds.

Thank you  
Elena and Eric!