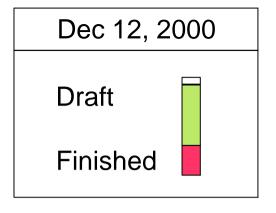
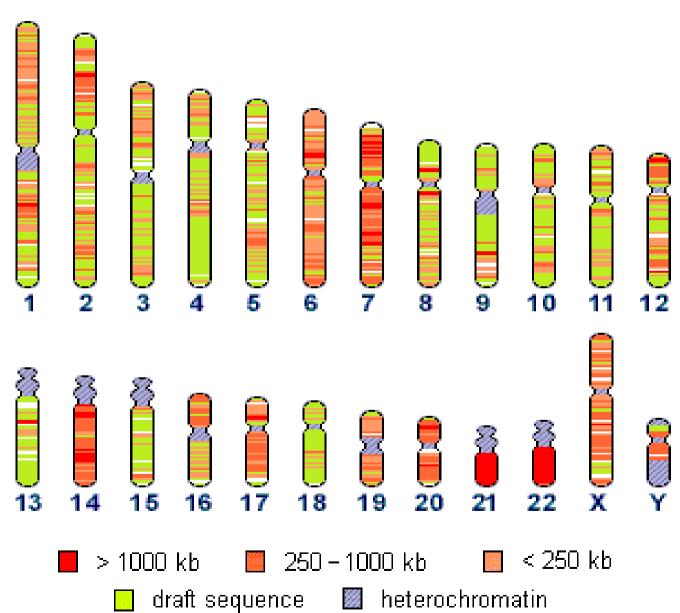
Human Genome Project: sequencing





Structure of a Human Gene (PSA)

GGTGTCTT#GGCACACTGGTCTTGGAGTGCAAAGGATCT#GGCACGTGAGGCTTTGT#ATGAAGAATCGGGGGATCGTACCCACCCCTGTTTC#TTTTTATCTTGGGCATGTCTCCCTCTGCCTTTGTCCCCC COTO ACCOTOTO COTO ACOTOG ATTOGTO AGAGGGCC ATGOTTGGGGGG ATGC AGGAGAGGAGGC AGCCCTG ACTOTO AAGCTG AGGCTCTTTCCCCC CTCARTGCCATTGCTTCCTTGGACCGTATCACTGCTCCATCTCCTGAGCCCCTCARTCCTATCACAGTCTACTGACTTTTCCCATTCAGCTGTGACTGTCCAACCCTATCCCAGAGACCTTGATGCTTGG COTOCCARTOTTGCCCTAGGATACCCAGATGCCAACCAGACACCACCTCCTTCTTCCTAGCCAGGCTATCTGGCCTGAGACAACAAATGGGTCCCTCAGTCTGGCAATGGGACTCTGAGAACTCCTCATTCC CTGRCTCTTRGCCCCRGRCTCTTCRTTCRGTGGCCCRCRTTTTCCTTRGGRARARCRTGRGCRTCCCCRGCCACARCTGCCTCTCTGRGTCCCCRARATCTGCATCCTTTTCARARCCTRARARCRAR ARGARARCRATARACAR ACCRACTORGACOAGA ACTOTTTTCTCA ACCTGGACTTCCTARACTTTCCAARACCTTCCTCTCCAGCA ACTGRACCTCGCCATARGGCACTTATCCCTGGTTCCTA GCACCCCTTATCCCCTCAGAATCCACAACTTGTACCAAGTTTCCCTTCTCCCAGTCCAAGACCCCAAATCACCACAAAGGACCCAAGACTCAAGATATGGTCTGGGCGCTCTCTTGTGTCTCCCT ACCOMENTACE OF STREET CARCITORICA CONTROL ACCOMENTACION ACCOMENTA AGGACTCCCAGCCTTGGTTCTCTGCCCCGTGTCTTTTCAAACCCACATCCTAAATCCATCTCTATCCGAGTCCCCCAGTTCCCCCTGTCAACCCCTGATTCCCCTGATCTAGCACCCCTCTGCAGGC tgeate aggargigagt aggggetggggtetggggageaggtgtetgtgteerbagaggat aacagetgggeattteceeragataacetetaaggeergeettggg GGCTCAC ACCTGT AATCCCAGC ACTTTGGGAGGCCAAGGCAGGTAGATC ACCTGAGGTCAGGATTCGAGACCTGGCCAACTGGTGAAACCCCATCTTACTAAAAATACAAAAAATTAGCCAGGC CTGCTGGCCCATGCCTGTASTCCCAGCTACTCAGGAGCTGAGGGAGGAGAATTGCATTGAACCTGGAGGTTGCAGTGAGCGGAGACCGTGCCACTGCACTCCAGCCTGGGTGACAGAGTGAGAC ARGTGGAGGATACAACCTTGGGCCTGCAGGCAGGCTACCCACTTCGGAAACCCACGCCAAAGCCGCATCTACAGCTGAGGCCTCCCCCGCCGGCGGTCCCCACTCAGGTCCAAAGT CTCTCTCCCTTTTCTCTCCCACACTTTATCATCCCCCGGGATTCCTCTACTTGGTTCTCATTCTTCACTTCTCCTTTCTCATTCTCACTTTCTCACTTTCTCCCTGGTTTTGTTCTT CCCTCTTCCTTTTCCCTTGGTTCTCTCACTCTGTATCTGCCCTTCACCCCTCTCACACTGTTTCCCAACTCGTTGTCTGTATTTTTGGCCTGAACTGTGTCTCCCAACCCTGTGTTTTCTCACTGTT ARGADAD AGGED AGGETATITE AGGITCAGORD AGCITECCAD ACCEGETETAD GATATGAGCETECTGAAGAAT CGATTCETCAGGED AGGITGAT GADECAGORD AGGITA AGGITGAT GADECAGORD AGGITGAT AGGITGAT GADECAGORD AGGITGAT A GOOG AGOTO ACGG ATGCTGTG AAGGTOATGC ACCTGCOCACCAGG AGCCAGC ACTGGGGACCACCTGCTACGCCTCAGGCTGGGGCAGCATTG AACCAGAGGACT**GTACGCT** GTGAGTCATCCCTACTCCCAAGATCTTGAGGGAAAGGTGAGTGGGACCTTAATTCTGGGCTGGGGTCTAGAAGCCAACAAGGCGTCTGCCCTGCCCTGCCCAGCTGTAGCCATGCC CCTCACCTGGGCCACAGGAGGACACTGCTTTTCCTCTGAGGATCAGGAACTGTGGATGGTGCTGGACAGAAGCAGGACAGGACAGGCCTGGCTCAGAGGCTGCGCTCTGGCCTCTATGGGATCAGA COCTCC ACTCCATTCTCC ACCTACCCACAGTGGGTCATTCTGATCACCGAACTGACCATGCCAGCCCGATGGTCCTCCATGGCTCCCTAGTGCCTGGAGAGGAGGTGTCTAGTCAGAGAGTAGTC CTGGAAGGTGGCCTCTGTGAGGAGCCACGGGGACAGCATCCTGCAGATGGTCCTGGCCCTTGTCCCACCGACCTGTCTACAAGGACTGTCCTCGTGGACCCTCTGCACAGGAGCTGGACCCTGAA GTCCCTTCCTACCGGCCAGGACTGGAGCCCTACCCCTCTGTTGGAATCCCTGCCCACCTTCTTCTGGAAGTCGGCTCTGGAGACATTTCTCTTCTTCTAAAGCTGGGAACTGCTATCTGTTATCTGC $\tt CTGTCCAGGTCTGARAGATAGGATTGCCCAGGCAGARACTGGGACTGACCTATCTCACTCTCCCTGCTTTTACCCTTAGGGTGATTCTGGGGGCCCACTTGTCTGAL$ TGAGCACCCCTATCAAGTCCCTATTG TAGTARACTTGGARCTTGGARATGACCAGGCCAAGACTCAAGCCTCCCCAGTTCTACTGACCTTTGTCCTTAGGTGTGAGGTCCAGGGTTGCTAGGAAAAGAAATCAGCAGACACAGACCACGGTTCTAGCCTTTGTCCTTAGGTGTGAGGTCCAGGGTTGCTAGGAAAAATCAGCAGACACAGACACAGGTGTAGACCAGG GATGARAGAGGGGTGGGATCCACACTGAGAGAGTGAGAGTGACATGTGCTGGACACTGTCCATGAGCACTGAGCAGGAGCACTGGAGCACACACGCACACACGCACACGCAGGATGGAGCTGAAAAC GRANT CAGCARAGGRARACAGGCATOT RAGTGGGGATGTGAAGARACAGGGARARTCTTTCAGTTGTTTTCTCCCAGTGGGTGTTTTTGACAGCACTTARATCACACAGAAGTGATGTTGTGACCTTTGTG TATGAAGTATTCCAACTAAGGAASCTCACCTGAGCCTTAGTGTCCAGAGTTCTTATTGGGGGTCTGTAGGATAGGCATGGGGTACTGAACTTAACTTCTCAGACCTGAGGTTCCCAAGAG TTCAAGCAGATACAGCATGCCTAGAGCCTCAGATGTACAAAAACAGGCATTCATCATGAATCGCACTGTTAGCATGAATCATCTTGGCACGGCCCCAAGGCCCCAGGTATACCAAGGCACTTGGGCCGAAT GTTCCRRGGGRTTRARTGTCRTCTCCCRGGRGTTRTTCRRGGGTGRGCCCTGTRCTTGGRCCGTTCRGGCTTTGRGCRGTGCRGGCTGGTGRGTCRRCCTTTTRCTGTRCRGGGGGTGRGGGGTGRGGGRRAGGG

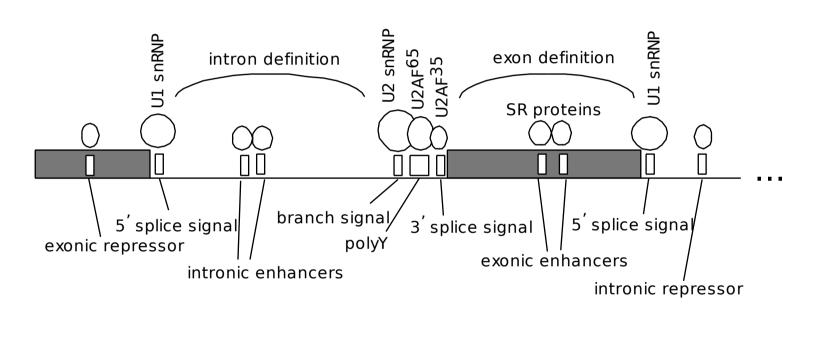
Outline

- Exon-intron structure of genes
- Models of gene grammar
 - Example: Genscan
- Models of exon-intron sequence
- Integrating intrinsic, extrinsic information
 - Example: GenomeScan
- The RNA splicing code

Central Dogma

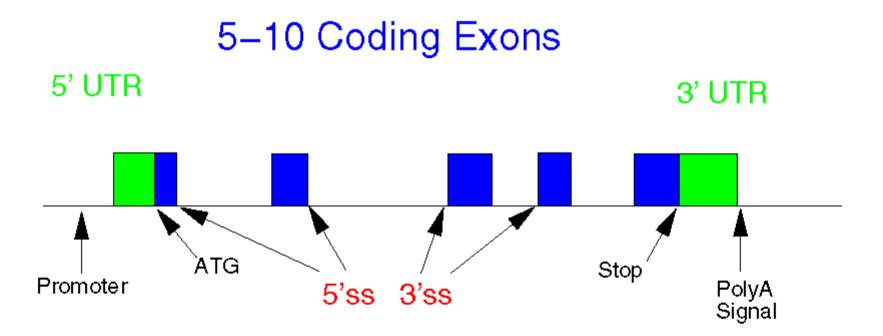
DNA 1:1 ACCGGACCGATGCGACTGCCCGAGGACTAGATAT TGGCCTGGCTACGCTGACGGGCTCCTGATCTATA RNA 1:1 GACCGAUGCGACUGCCCGAGGACUAGA R M 3:1 **Protein** MRI PFD

Pre-mRNASplicing



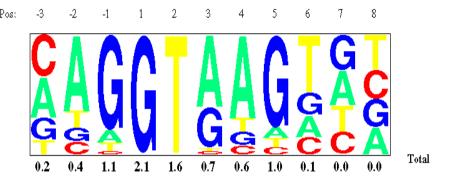
(assembly ofspliceosomecatalysis)

Structure of a Typical Human Gene



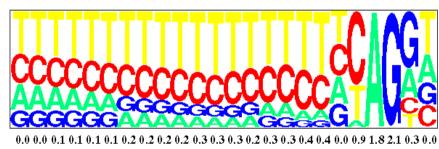
Human Splice Signal Motifs

5' splice signal



Pos: -21 -20 -19 -18 -17 -16 -15 -14 -13 -12 -11 -10 -9 -8 -7 -6 -5 -4 -3 -2 -1 1 2 3

3' splice signal



Total

Bits:

8.9

Molecular Codes

Genetic Code

mRNA Protein

Gene Finding Code

Genomic DNA — Genes

RNA Splicing Code

pre-mRNA → mRNA

GENSCAN - Basic Idea

Model of what a human gene "looks like" in terms of:

exon-intron structure sequence composition

In principle, given a sequence, assign a probability to every possible gene structure compatible w/ sequence

In practice, use a Dynamic Programming algorithm to determine the most probable gene structure(s).

Gene Features Modeled by Genscan

Semi-Markov HMM Model of human gene structure and composition

Features modeled:

Hexamer composition of exons/introns

Extended 5' and 3' splice signals

Reading frame consistency of exons

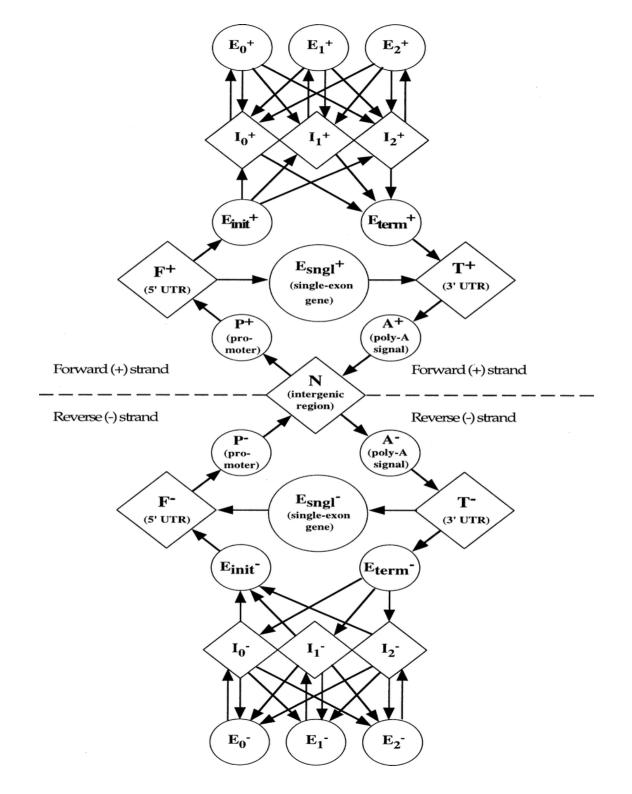
Exon/intron length distributions

Promoter and polyA signals

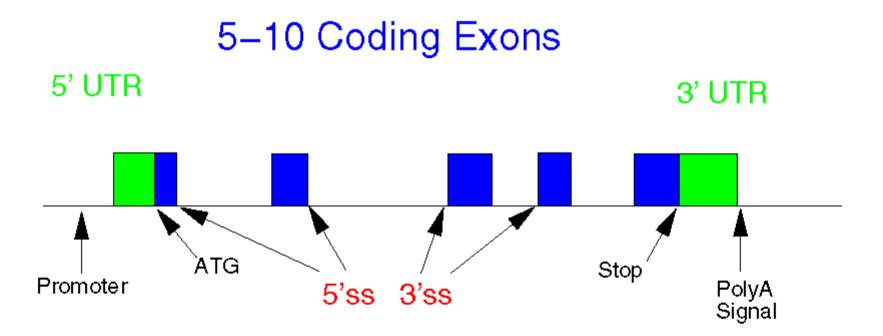
Isochore differences

C. Burge & S. Karlin, 1997, 1998

Genscan HSMM

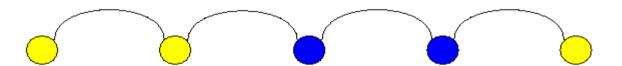


Structure of a Typical Human Gene



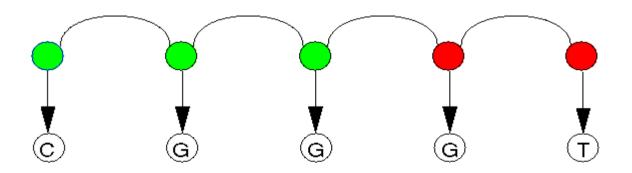
Markov and Hidden Markov Models

Markov



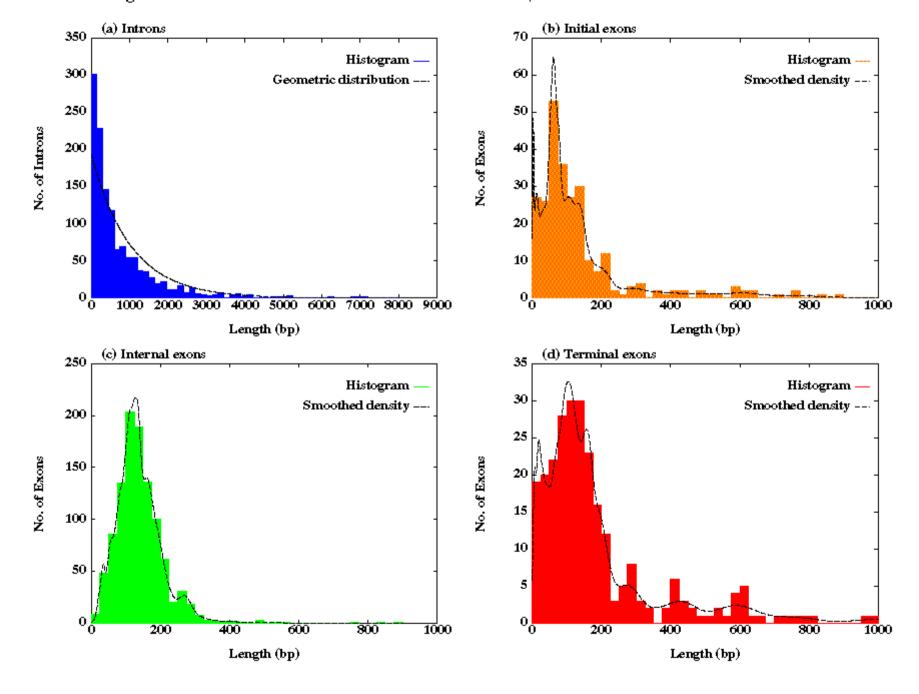
State **n+1** depends on state **n**, but not on previous states

Hidden Markov



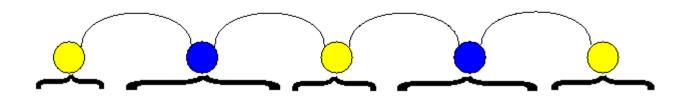
Hidden states have Markov dependence; observable states generated from hidden

Length distributions of human introns and initial, internal and terminal exons



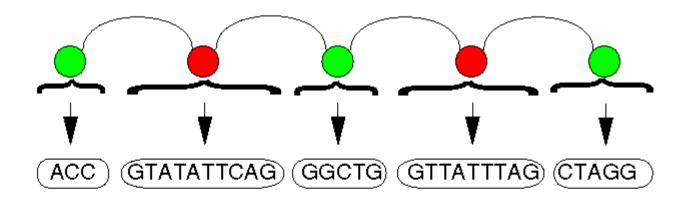
Semi-Markov and Hidden Semi-Markov

Semi-Markov



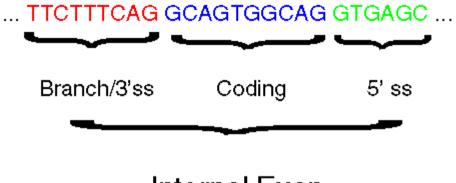
States have Markov dependence; each state has an associated length

Hidden Semi-Markov

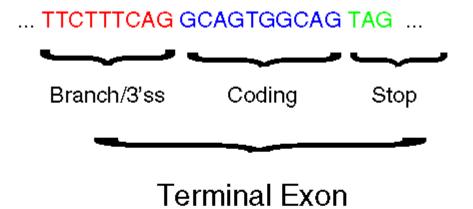


Hidden states semi–Markov; observable generated from hidden

Sample Exon Models

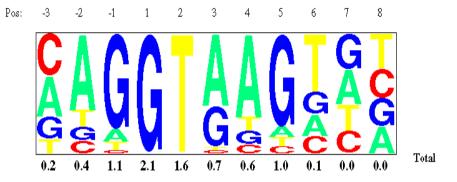


Internal Exon

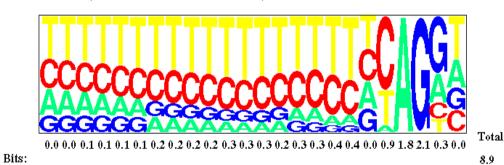


Human Splice Signal Motifs

5' splice signal



3' splice signal

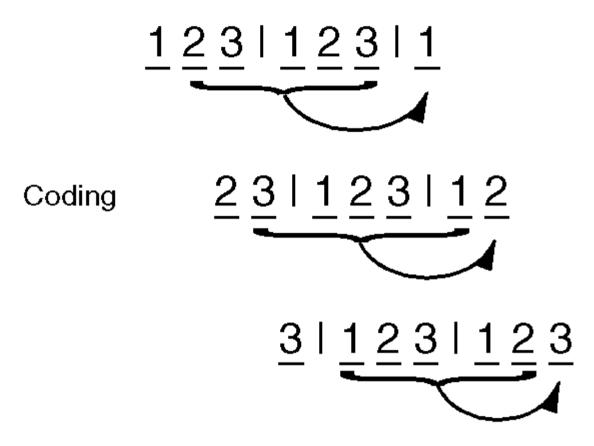


-21 -20 -19 -18 -17 -16 -15 -14 -13 -12 -11 -10 -9 -8 -7 -6 -5 -4 -3 -2 -1 1 2 3

8.9

http://genes.mit.edu/pictogram.html

Models of Coding and Non-Coding DNA



Non-coding



Viterbi Algorithm – Basic Idea

Goal: Maximize $P(\phi_i,S)$

(Find optimal 'parse' of sequence)

Approach:

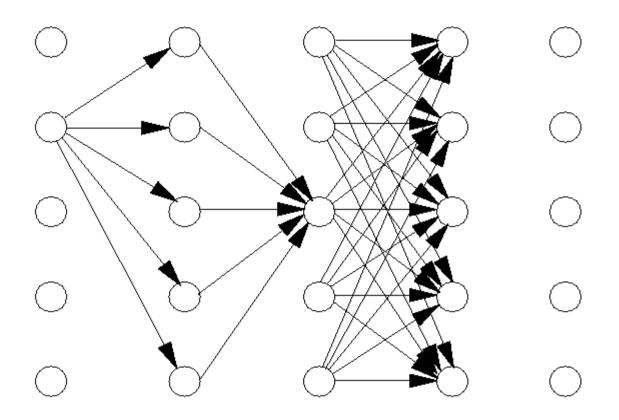
Define variables which store Pr of optimal parse of subsequence up to pos. j ending in each possible state

Solve recursively

Forward/backward algorithms are similar but calculate *sum* of Pr of all parses

Viterbi, A J (1967), Forney, G D (1973), Rabiner, R (1989).

Viterbi Algorithm in HMM Case

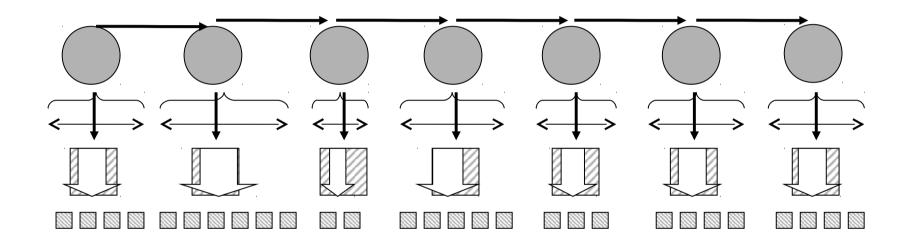


Optimal paths derivable from "single step" recursion.

For N state model, seq length $L: \ O(N^2L)$

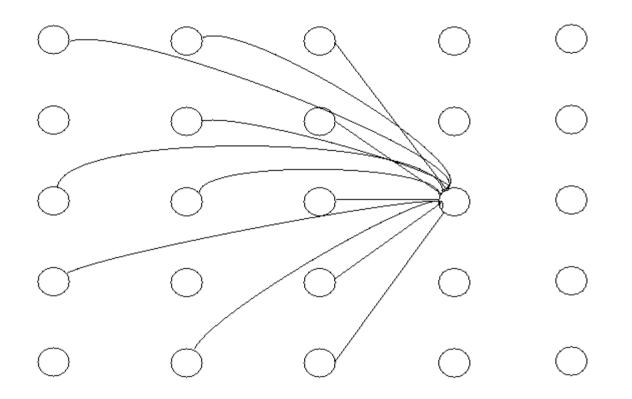
Viterbi, A J (1967), Forney, G D (1973), Rabiner, R (1989).

Semi-Markov HMM Model



Viterbi Algorithm for

(Hidden) ''Semi-Markov'' Model



Paths involve "jumps" as well as "steps":

For N state model, seq length $L: O(N^2L^3)$

Howard, RA (1971) "Dynamic Probabilistic Systems Volume II: Semi-Markov and Decision Processes." See also Rabiner (1989).

How Well did Genscan Work on Chromosome 22?

Annotated genes:

94% predicted at least partially: ~6% of genes missed

Annotated exons:

84% predicted at least partially: ~16% of exons missed

Predicted exons:

Approx 30% more than annotated

How many of these are real?

Statistics from I. Dunham et al. Nature 402, 489-95, 1999

Genes on Human Chromosome 22

Class No. of Genes

Known 247

Related 150 545

EST-supported 148

Predicted novel 325 } 100

134

Estimated ~45K genes in genome

Dunham, I. et al. Nature 1999

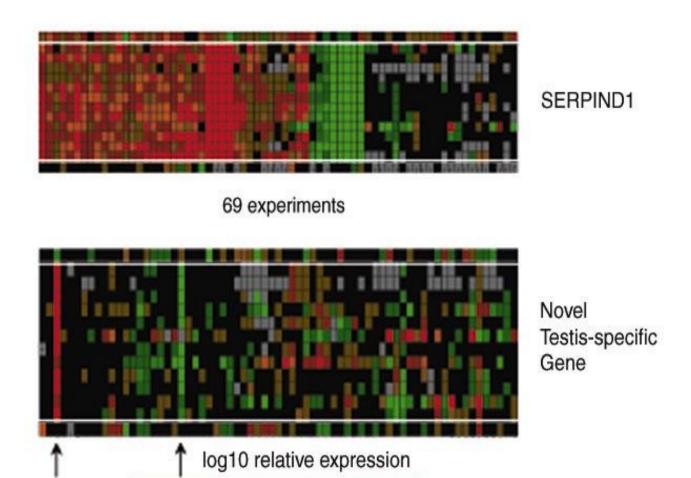
Pseudo

Genome Scale Gene Finding Strategies

Strategy	Based on	Examples
Ab initio prediction	Models of gene structure/comp	Genscan, GRAIL GenLang, hmmgene
Microarray	Hybridization	Exon-scanning array
Gene inference	Homology	GenomeScan
Genomic:genomic	Homology	ExoFish
alignment		GLASS/Rosetta
DNA:protein alignment	Homology	GeneWise
cDNA sequencing	Sequencing	RIKEN

C. Burge Nature Genet. 27, 5-7, 2001

EXON-SCANNING ARRAYS



D. Shoemaker et al. Nature 409, 922-7, 2001(C. Burge Nature Genet. 27, 5-7, 2001)

ExoFish







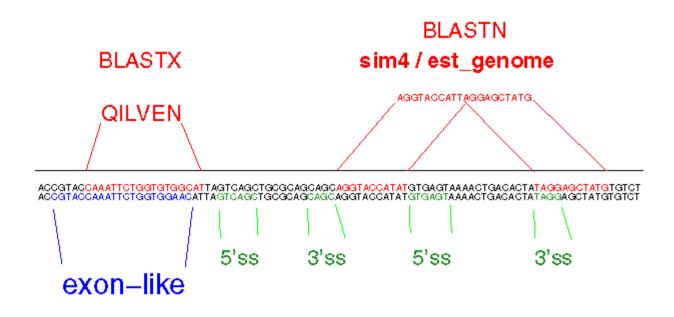
Homo sapiens

Tetraodon nigroviridis

Roest Crollius et al., Nature Genet., 2000

Extrinsic & Intrinsic Information about Gene Locations

Extrinisic



Intrinsic

GenomeScan Objectives

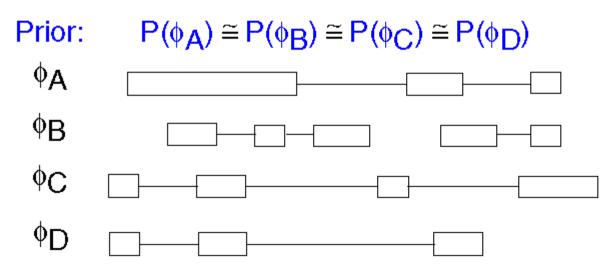
Combine probabilistic 'extrinsic' information (BLAST hits)

with a probabilistic model of gene

- Makectnethcomplisition and reliable enough to run on an entire vertebrate genome without human supervision
- Focus on 'typical case' when homologous but not identical proteins are available.

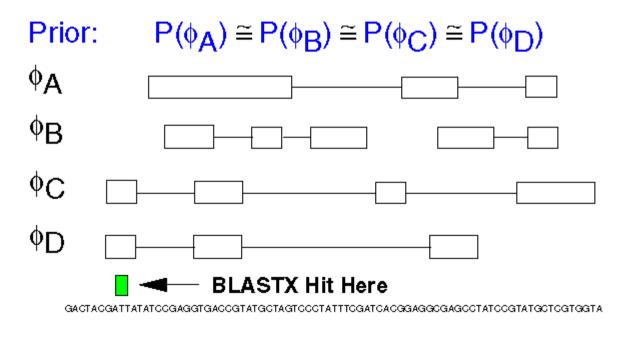
Genscan:

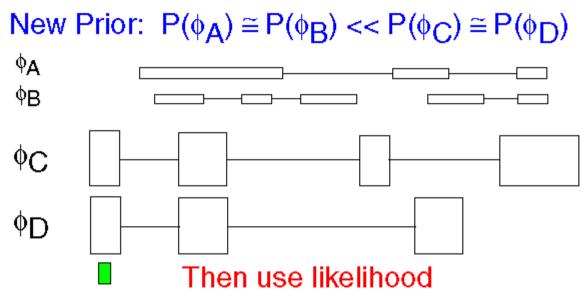
use likelihood to choose among possible gene structures



GACTACGATTATATCCGAGGTGACCGTATGCTAGTCCCTATTTCGATCACGGAGGCGAGCCTATCCGTATGCTCGTGGTA

Using similarity information in GenomeScan





When Good Alignments Go Bad...

Output of BLASTX:

Score = 129 bits (321), Expect = 2e-29

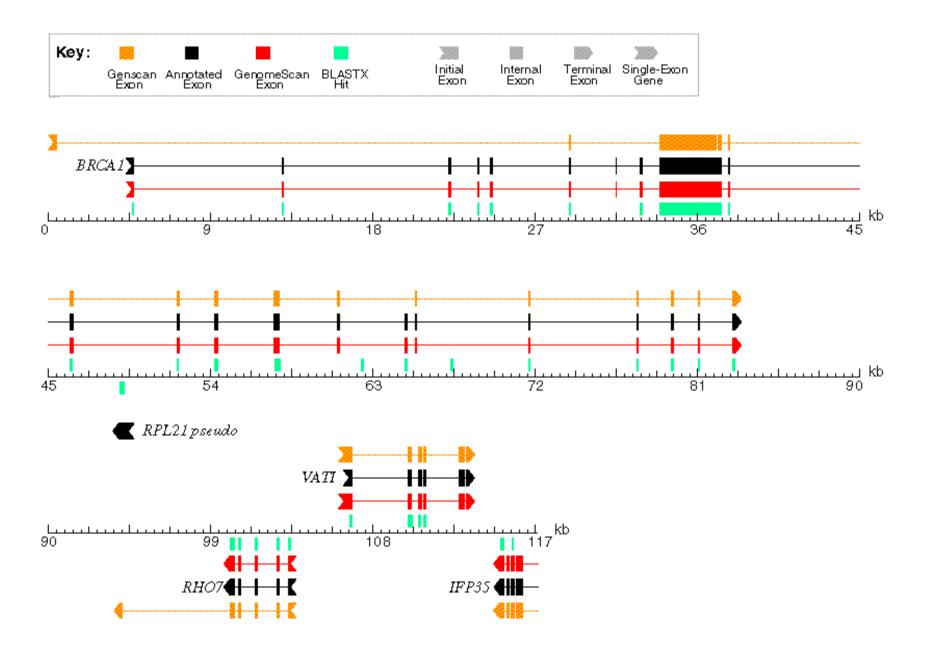
DGGWGWIVLFGCFVITGFSYAFPKAVSVYFKELMKDFHVGYSDTA DGGWGW VLFGCF+ITGFSYAFPKAVSV+FKELM +F +GYSDTA DGGWGWAVLFGCFTTTGFSYAFPKAVSVFFKELMHEFGTGYSDTA

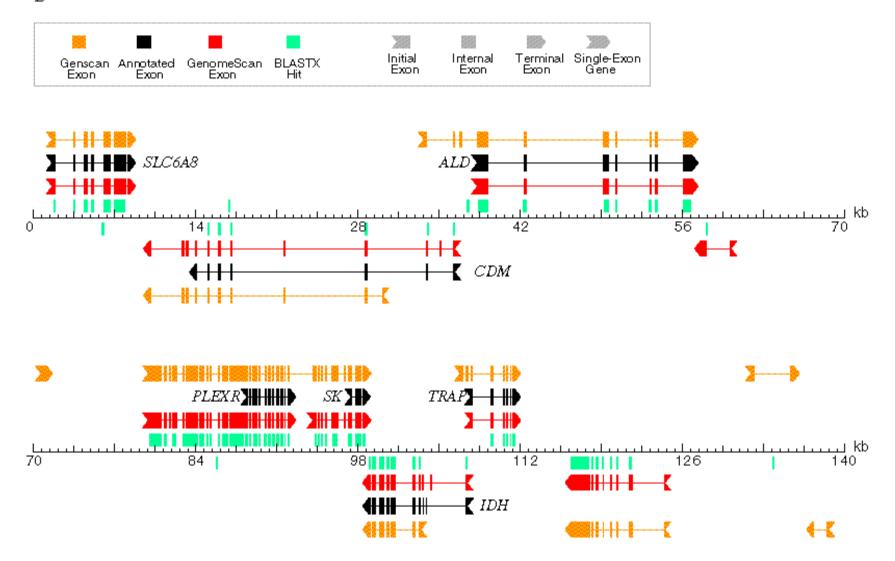
WISSIMLAMLYGTGDAWIYFPLPNPCLPCPARVPNRVPVGMLNGL WISSI+LAMLYGTG PL C C R R PV ++ GL WISSILLAMLYGTG-----PL---CSMCVNRFGCR-PVMLVGGL

Questionable Region

Solution

Post-process BLAST hits w/ steepest slope heuristic







This server provides access to the program GenomeScan for predicting the locations and exon-intron structures of genes in genomic sequences from a variety of organisms.

Genome Scan incorporates protein homology information when predicting genes. This server allows you to input proteins suspected to be similar to regions of your DNA sequence. You can find such proteins by doing a BLASTX comparison of your sequence to all known proteins, or by running GENSCAN and then comparing the results to known proteins using BLASTP. Please input the proteins in FastA format; the file may contain multiple proteins so long as each is separated by a header on its own line. Files should contain less than one million bases.

If you would like to test the program, feel free to use this DNA testfile and the corresponding protein file.

The Banbury Cross site provides benchmark sequences for comparison of genefinding programs. Here are the results from running GenomeScan on the benchmark sequences:

- 12p13, 223 kb; Genbank Acc #U47924: text output, PDF image
- 13q, 773 kb; BRCA2 region on human chromosome 13q: text output, PDF image
- 5q31, 253 kb; Interleukin-4 region on chromosome 5q31: text output, PDF image

You may also wish to use or read about the GENSCAN server, GenomeScan's predecessor.

More information on GenomeScan: GenomeScan documentation

Run GenomeScan:

Organism:

Vertebrate:

http://genes.mit.edu/genomescan

Sequence name (optional):

Print options:

Predicted peptides only

Current Human Gene Annotation Efforts

Ensembl [http://www.ensembl.org]

```
Genscan (ab initio) + BLAST (homology) + GeneWise (protein:DNA alignment)
```

NCBI [http://ncbi.nlm.nih.org]

```
acembly (cDNA,EST alignments)
```

Burge lab [http://genes.mit.edu/genomescan]

```
GenomeScan (ab initio + protein sequence homology)
```

Neomorphic/Affymetrix

```
Genie (ab initio + EST)
```

Celera

```
Otto (???)
```

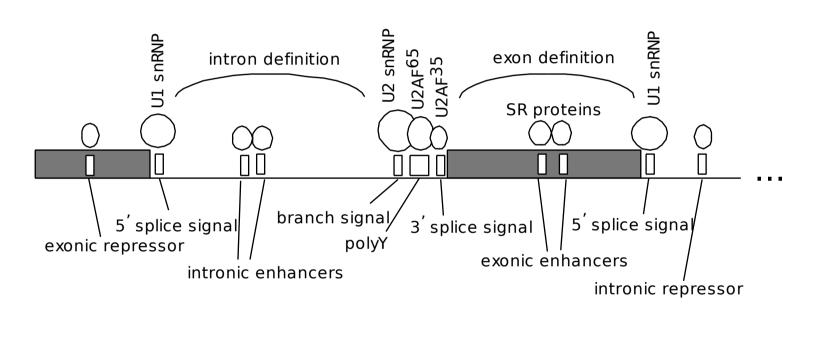
IGI (International Gene Index) / IPI (EBI)

Genomie sequence Detect, remove repeats

Identify Identify Homologs **Homologs** Protein Hits CDNA Hits Align Align Check consistency Identify alternative of alignments gene isoforms Infer locations of genes Genes

E. Birney & C. Burge

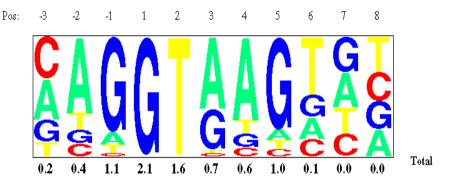
Pre-mRNASplicing



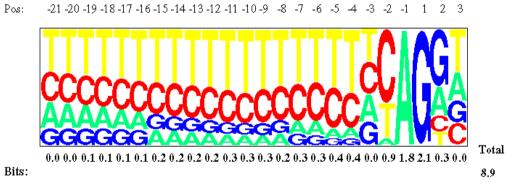
(assembly ofspliceosomecatalysis)

Human Splice Signal Motifs

5' splice signal



3' splice signal



Splice Signal Models I

Sequence
$$S = S_1S_2S_3 ... S_n$$

Weight Matrix Model (WMM)

$$P(S|+) = P_1(S_1)P_2(S_2)P_3(S_3) ... P_n(S_n)$$

Assumes independence between positions

Weight Array (Markov) Model (WAM)

$$P(S|+) = P_1(S_1)P_2(S_2|S_1)P_3(S_3|S_2) ... P_n(S_n|S_{n-1})$$

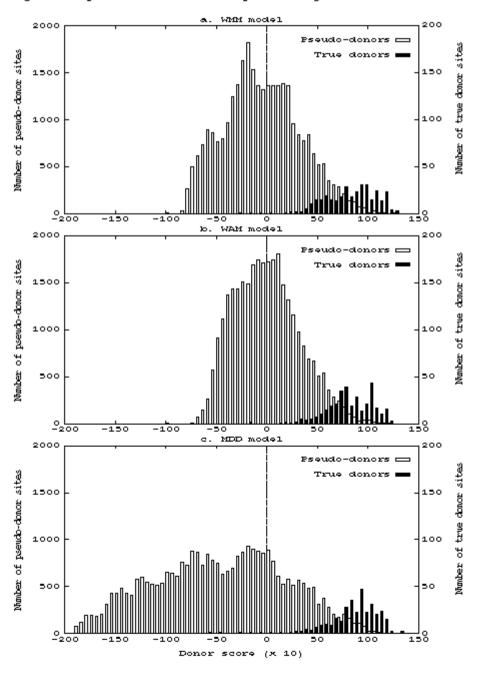
Allows for nearest–neighbor dependence

In either case, discriminate based on score:

$$s(S) = log_2(P(S|+)/P(S|-))$$

5' Splice Signal Scores

Fig. 6. Comparison of donor splice signal models



Comparison of Human

5' Splice Signal Models

Sensitivity =

% of true sites above score cutoff

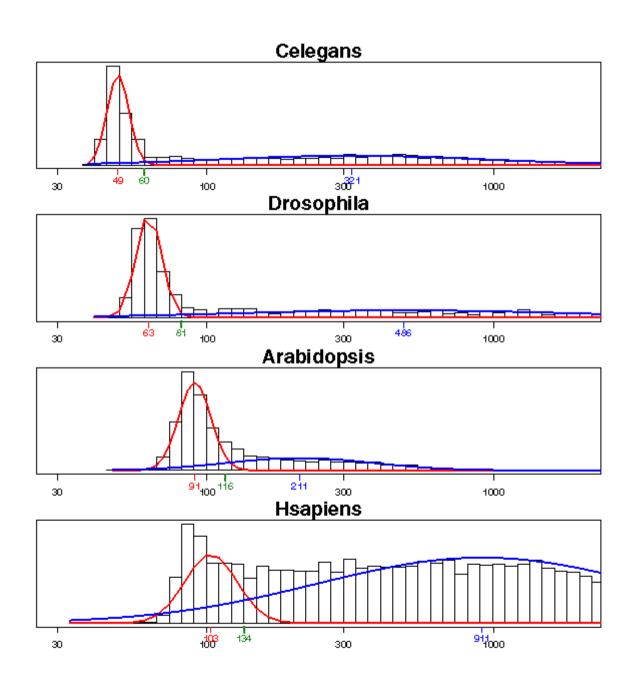
Specificity =

% of sites above cutoff which are true

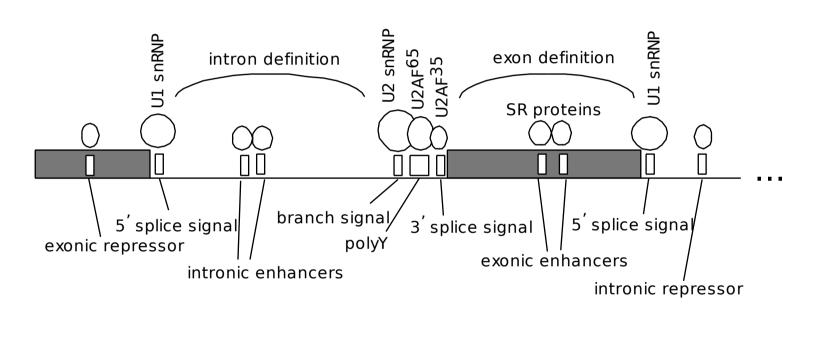
	Sensitivity Level			
<u>Model</u>	<u>20%</u>	<u>50%</u>	90%	
WMM	50%	32%	7%	
WAM	50%	33%	7%	
MDD	54%	36%	9%	

Data from Burge, 1998 "Comp. Methods in Mol. Biology"

Intron Length Distributions



Pre-mRNASplicing



(assembly ofspliceosomecatalysis)

Characterizing the sources of information used for splicing

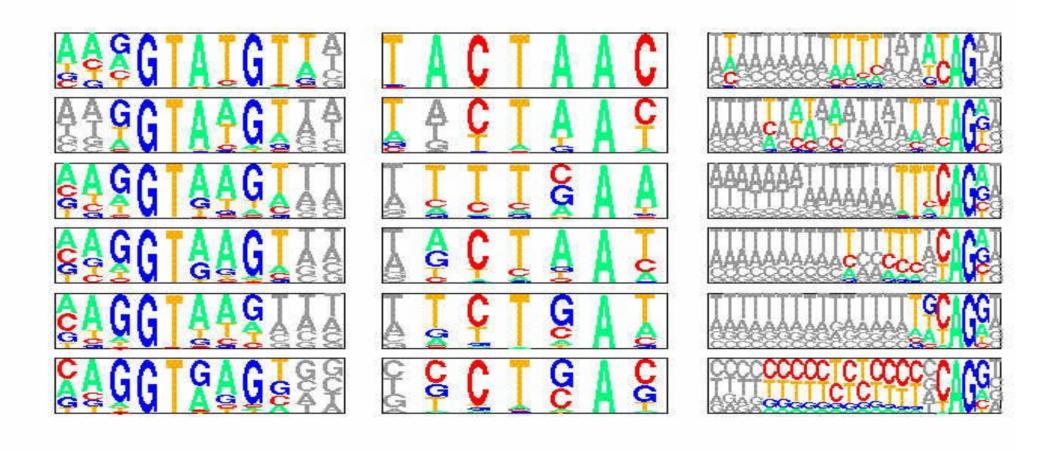
- 5' splice signal (.AG/GTRAGt)
- 3' splice signal (...YYYYYYYAG/)
- Branch signal (...CTGAC..)
- Intron length preference
- Intron composition

Splicing-verified Transcripts

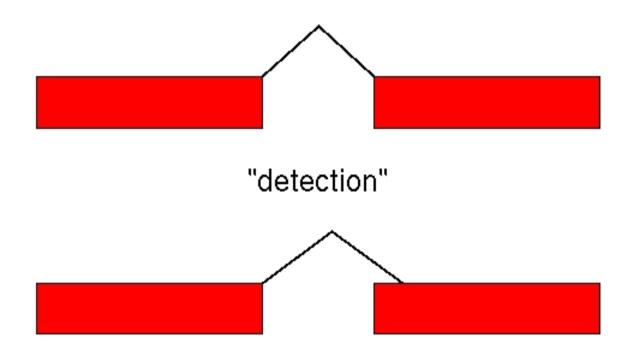
Org		i-Tx	Intron	Int/iTx	%Short
	MBp		S		
Yeast	12	152	152	~ 1	~50
Worm	100	691	3,577	~ 7	46
Fly	140	1,310	3,737	~ 4	54
Arab	125	1,121	5,265	~ 5	63
Human	3,000+	8,165	33,666	~ 9	10

Data from Sep, 2000 GenBank release

Splice Signal Sequences



"exact prediction"

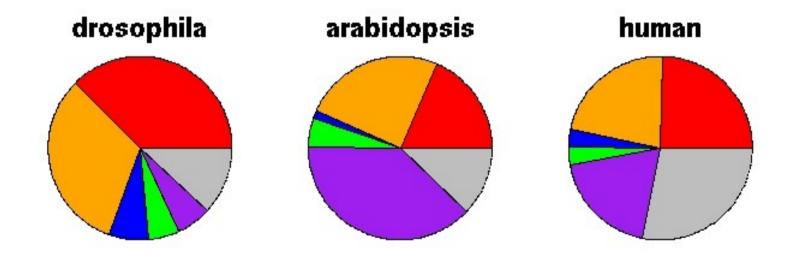


IntronScan Accuracy

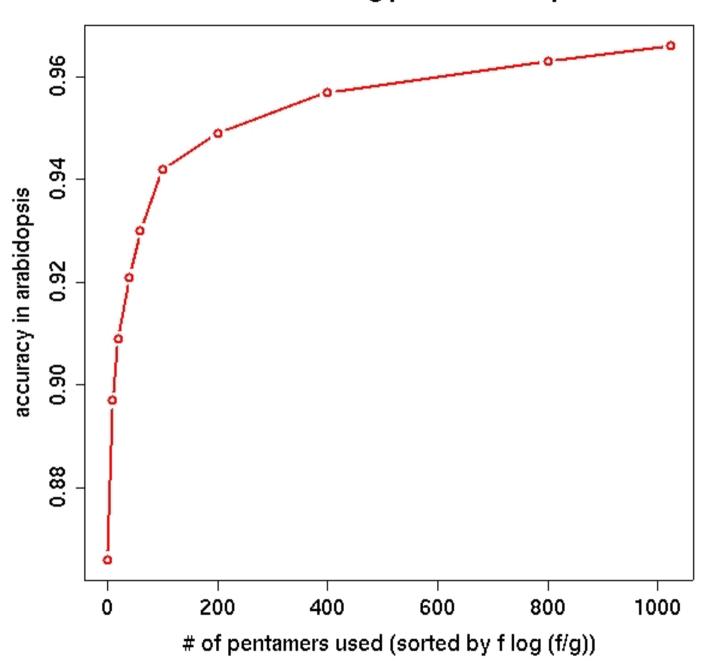
	5'ss and 3'ss only		Complete model	
Organism	Detect	Exact	Detect	Exact
Yeast	90	43	98	86
Elegans	95	92	97	95
Fly	92	88	96	94
Arabidopsis	82	68	96	92
Human	76	65	88	85

Fivefold cross-validated





intron detection using pentamer composition



Top Ten Intronic Pentamers

Arabidopsis	Drosophila	Human
TCTCT	ATATA	GTGGG
TTTTT	AAATA	CTGGG
TTTGT	TATAT	GAGGG
TCTTT	TGATT	CAGGG
TGTTT	ACTTA	TGGGG
TCTGT	ACATA	GCAGG
TTCTT	TTTGT	GGTGG
TGTGT	CATTT	GGAGG
CTTTT	TTAAA	GCGGG
TTTCT	TCATT	GCTGG

Top Ten Exonic Pentamers

Arabidopsis	Drosophila	Human
TGAAG	GGCGG	GATGA
CAAAG	CGAGG	CAGAA
AGAAG	CGCTG	GAAGA
TGCTG	AGGAG	CAGCA
TCTGA	TGGCC	CACCA
TGCAG	AGCTG	CTGAA
TGGAG	TGCTG	GTGGA
GGAAG	AGCAG	CAGGA
CGAAG	AGAAG	GAGGA
GAAGG	TGCAG	CTGGA

Summary

- Genes have a grammatical structure
 probabilistic models of this structure are interesting and useful
- Computational methods interact with experimental methods in modern biology
- Introns also have a grammatical structure sequence analysis may help us to deduce aspects of this structure
- There are many interesting related problems:
 - Finding RNA genes, identifying regulatory elements,
 - Understanding transcription, regulatory networks, etc.