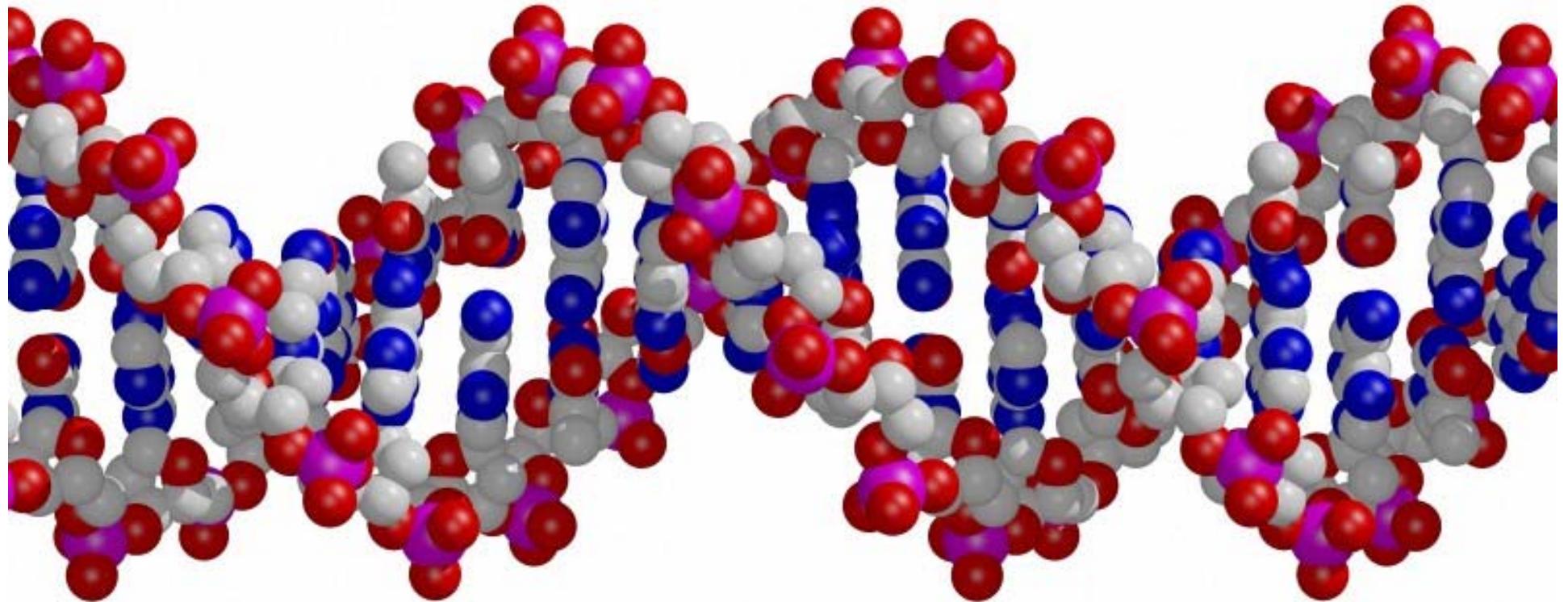


# *Evolutionary Genomics*



**Antonis Rokas**  
**Department of Biological Sciences**  
**Vanderbilt University**



*<http://as.vanderbilt.edu/rokaslab>*

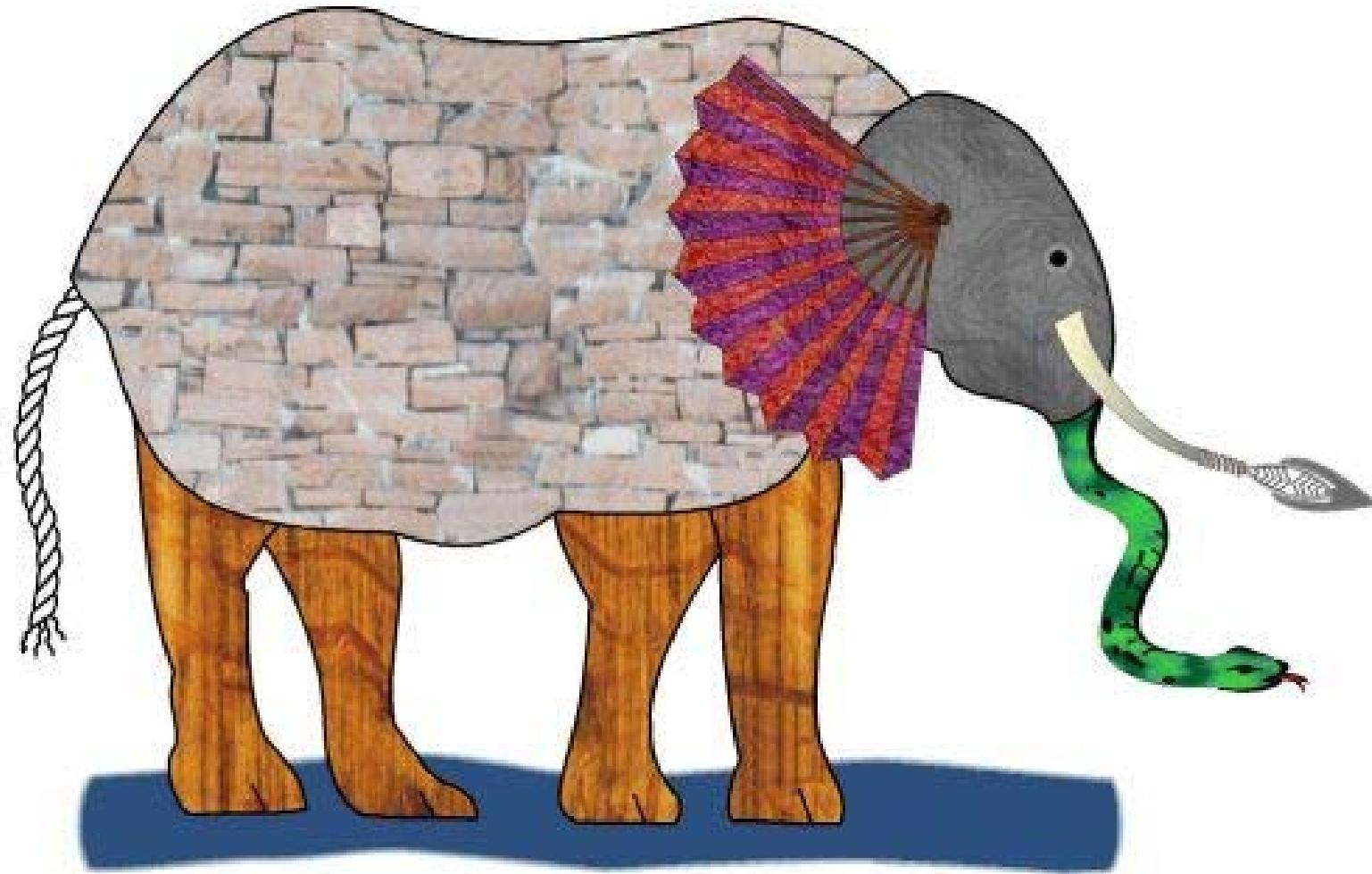
## *Lecture Outline*

- ❖ **Introduction to Evolutionary Genomics**
- ❖ **Population Genomics**

----- Coffee Break -----

- ❖ **Phylogenomics**

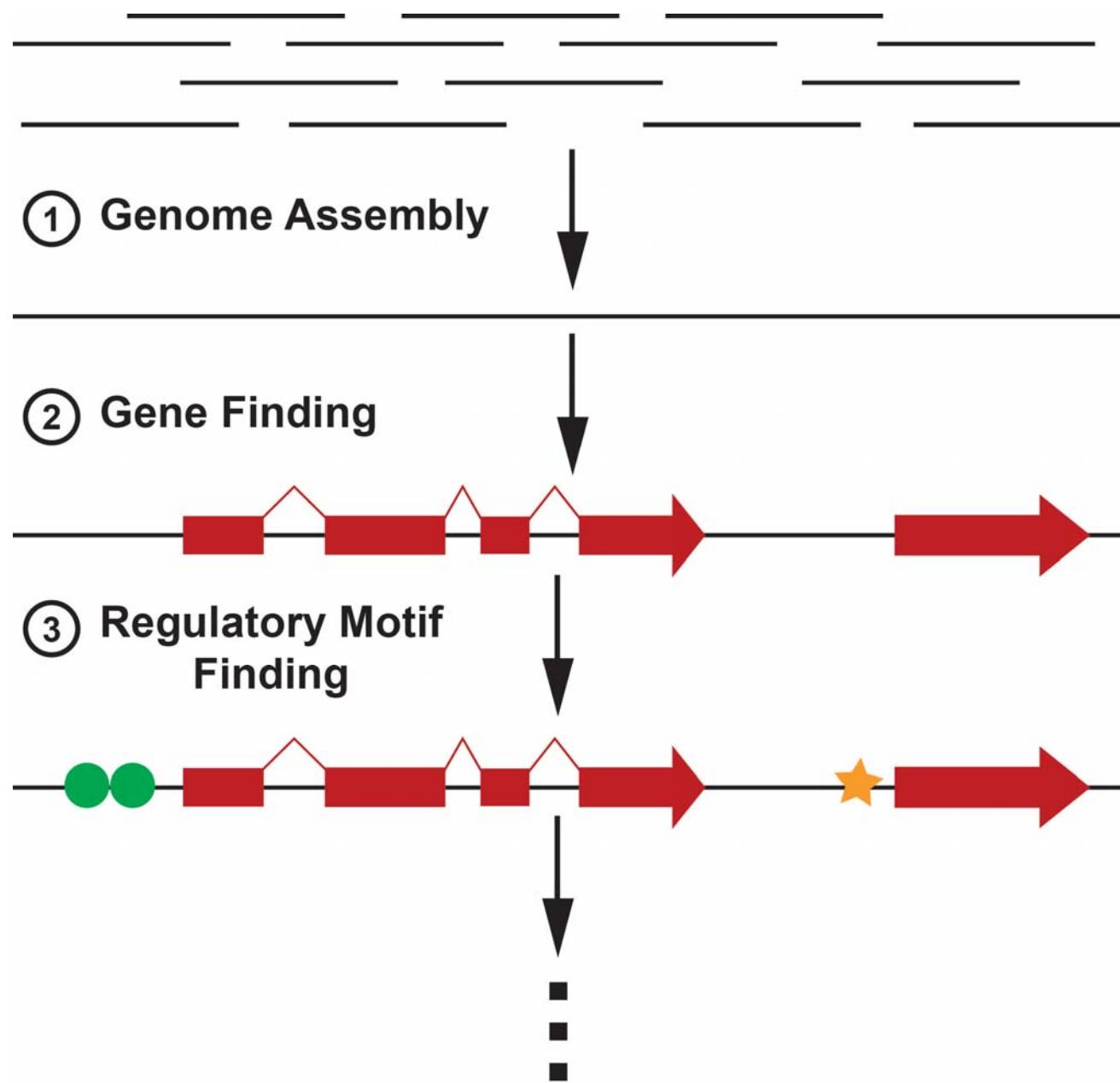
# *What is an Elephant Like?*



# *What is a Genome Like?*

ACAACCCCTCCACCTCATGTACCTGCGGACTCTCCTCCAGTCACAGCTCAGGCAGTCCACTTGCAACCCCTAAACCTCAAAACC GGTT GACGTTCTGTTAGACGAACAACATATGATATATCGACCCCGCTAAGAACGGAGCCTCTGTCAGTGCTCCAGCTGAACGTAGGCCGCCGGG CCAGCCACTCATGAAATGCCCTTCATTAGCATACTCTAGCGGCATTGATATCATCCTTACAGGAGCCATACATATATACTGACCTCA GCCGGCAAATCACAAAAAGGCACCCATCATA CGAGTGCTCTCCCCAACAGACAGCTGGCTGTAAGCGGTGACCCCGGGCTCTCAC TATGTCGGAAAAAGATGGGCATTGGGCCTCTCAGCTCCGCCCTCAGCCAATAGATCAAGATGTTCTCAGACCTTCTTACTACAG ATCCTCTCCCCTGCTGGACAATCTGATTGATAATCAACATCTATAATGCTCCAATCGGCTCAATCAGGTCAAGGTGAGGCTGAAAAGCG CTTACACTCCTGCCTGACTCCTACTTTCCCAGCCTACCGTGCTGCGCGACTTCACCTACTACATAGCAGGTGGCAGCCATCACTG CATTGCAGCCCTACCACCTTGCTGAGCCATTGTTGACTGGCTTGATCGCCTAGGGCTGGTTCTTATCTCCGAGATAGACCAGCCTACAC ACGATAGAGGCAACGTTCTGACCTCACTTCGCCCTCCAGCTCCCTAGCACTGGCAGGGTCGAGTACCAAGGATAGCAAGTCATTAGAGT CAACATCAGATCATGCCACTCCTCACCACCATGCCATGGAGGCCAGAGATTCACAGAGGCAGCTCAGAAACTGAGATTGATACATTA GACCACCCCTCGCTTCCTCACTACTCAGTCCCACCTTGCTGTCAATTGAATGCTCAGCTACAACAGAAGAGGGCCTGGACAGTCTAGCT CATGGGTTAACCTAGCAACTGCTAGTGCATAAAGGCTCTGCTAGGAGCTCCTGGCGAGGGAA TAGGTCAAGCCATGGTGGAAATT GACTGCAGAAAAGCGTTGCAAGACTCCGCTTAGGTCTCTGTTCAAGAAACGACTCCGCGATAACTAGACGGTCTAAATAGCAGTTC TGGCGAGATAAAACTACCGCAGTGACACAGATCAAAGATGTCTTGACATAAGCAAGTGACATAAGTTACAGGATCTATCGAAACCCCT CCACTAAACGACCCCTTAAGGCCAAACAGCCCTCAGCAGGGCTCTGAATGAGAAACAAGACGTATTAGTCCGTAATCTCTTCAAGAAT ACTGCTGAAGCGGGTGTATTGTCATAGGCTATGGCCTGGGCTGTGGTTGTCAGCCATGCCCTCAACCATAAGAACATTCTAGAAGAACCA TCGGGAAAGAGGTTGGAACCCAGTGGAAAGTTGGAAACATGTATATAAGAAGGAGAGGGAGATGTATCTGCCTATTCTCTCCAAGTCT GCGATATTGTTAACATTACAGGATTGCCAGTTGAAAACAATACTGCCTACGCCCGTCACAGGTACTGCAGTTCCAACAAGAACAT AACGCTCGACCCGGCAATTATGGCTCAAGGTTAGACTACGTCCGTGTAGCCTGATATGCAAGATTAGTTCTGCAGTTGAATATCTAAG AGGATCTAATGGTAAGCCCCAAGGCTGCCATGGCTTTATTGATGATTGATTTCTAGCTGACAATATGCAATTGGGACAGGGATCTGATG ATTGTCCGGTTATGCTGCTTCAAAAATGTTACGCCCTGGCGAAGAAGAGGTCAACATTAAATGAGCCCTGGGATGTTAAAGAT GGCAGCGTCAGCAGGAATACTCTACTAAATATCTCTGCCATACAGGGCGCTTAATACCAAGATTAAACAAGCGGAGGAGGATCAA GGACATGTTCTGCTAAACCATGCCAACGTATAGAGACCAGACGACAACTCCTGACATTGAGATATTACCTCTAGTCAGGAAAA GGGAACAGCACCCGCTATTGGAGAGTGCTGCCAGCGTCAGCTACCTGCCAGCCTGTAGTAGCTGACAGCACTCAAATGAAAG AAGTTATTGTAAGAGCTCTCAGAAATATGAGACAGGTTCCCTGTCTCAGTCAGTCCAGTATTGACATGGGTTCAGCCAATCATCAACAC CCCCCACTGCTGGACAGAGGACTCTAAAGGGTTCTCAAACCTAAAGTGGCTAGCCAGCCAATGCCATAGCCCAGGATCCTGCA ACAGTGTCTACTATGCCAACGAAACAACCAGCCGATCCCCAACAAATTCCGCACTCCTACAGCTCCGCTTCAACCCAAAGCAATGATACTATT ACAGCTCCCGCTGGTGAAGCTCTCCAGGAGAACAGCCAATTCGCAGCTACAGCTCCGCTTCAAGCAGCTCCGCTTCAACCCAAAGCAATGATACTATT ATCGATCCCATTGTCAGCAAGGAAGATTGGTCAAAGCTCTTCACTAAAAGCCCATTCCAAGTGCAGGGCCACCAGGAACCATGTTT CAGTCTGACAACTAAGAACGCTGGCATCAACTGCGGAAGATCGTTCTGGATCTGTTGAGACCCCTGGGCCAGCGGAAACAAGGAAA AGGGGATACAGTGGCGATTCTTACATTCAATGGGCCAGCGATTGGAACCCCTCCGCTCCGTAGATTCTGTCGGGGCAACTCTTT TGCGATAGTGTAAACGATACCCGGTTTACTTAGAAGGCTACGAATGGTATGATGTATGGTTCAATGATAAGACATTCTGTCAAGT

# *Understanding the Genome Requires Tools*



# *What is a Genome Like?*

ACAACCCCTCACCATGTACCTGCGGACTCTCCTCCAGTCACAGCTCAGGCAGTCCACTTGCAACCCCTAACCTCAAAACCGGTT  
GACGTTCTGTAGACGAACAACATGATATATCGACCCCGCTAAGAACGGAGCCTCTGTCAGTGCTCAGCTGAACGTAGGCCGCGGG  
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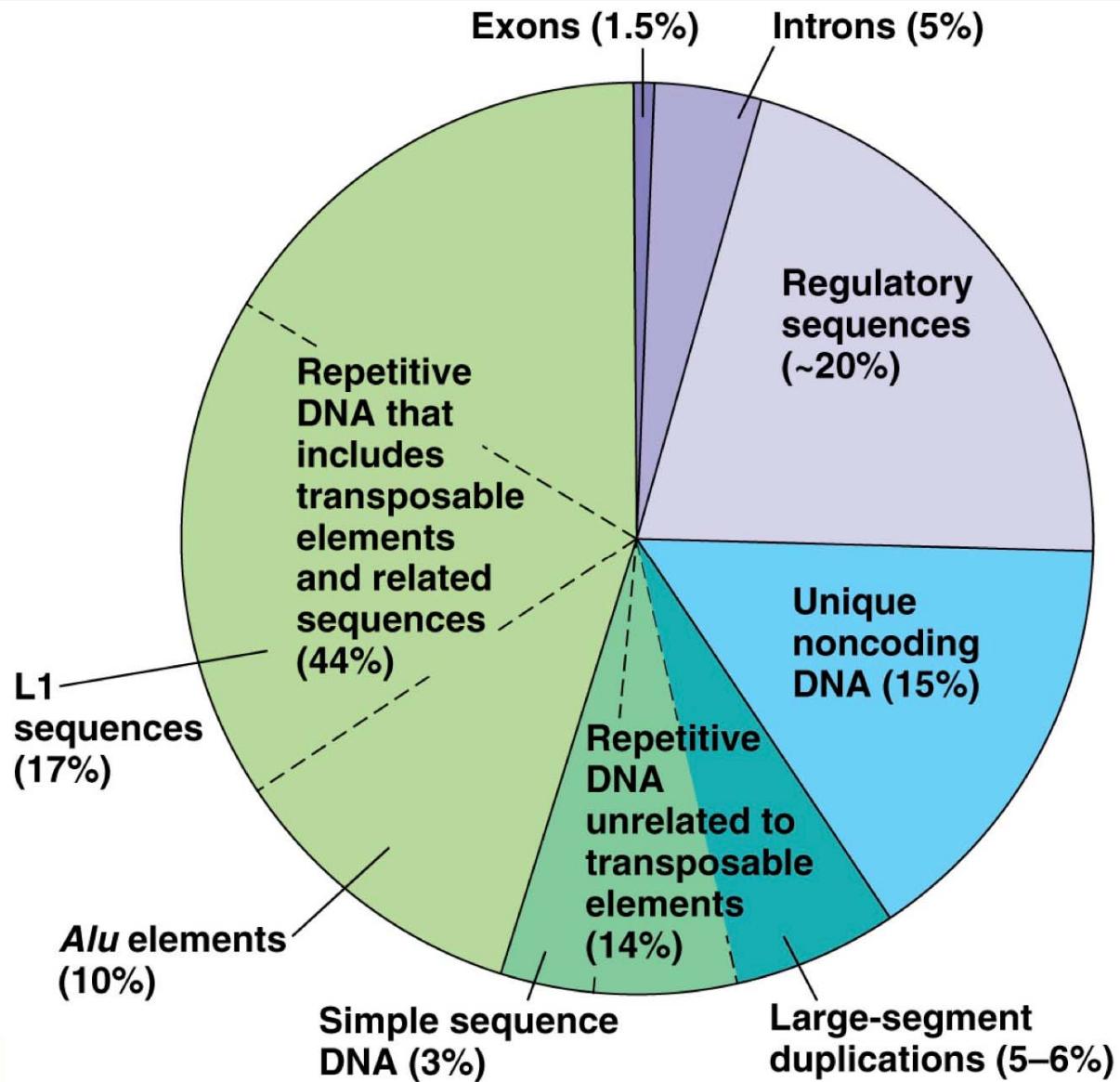
Transposon

Protein Binding Site

Exon

Intron

# *Organization of the Human Genome*

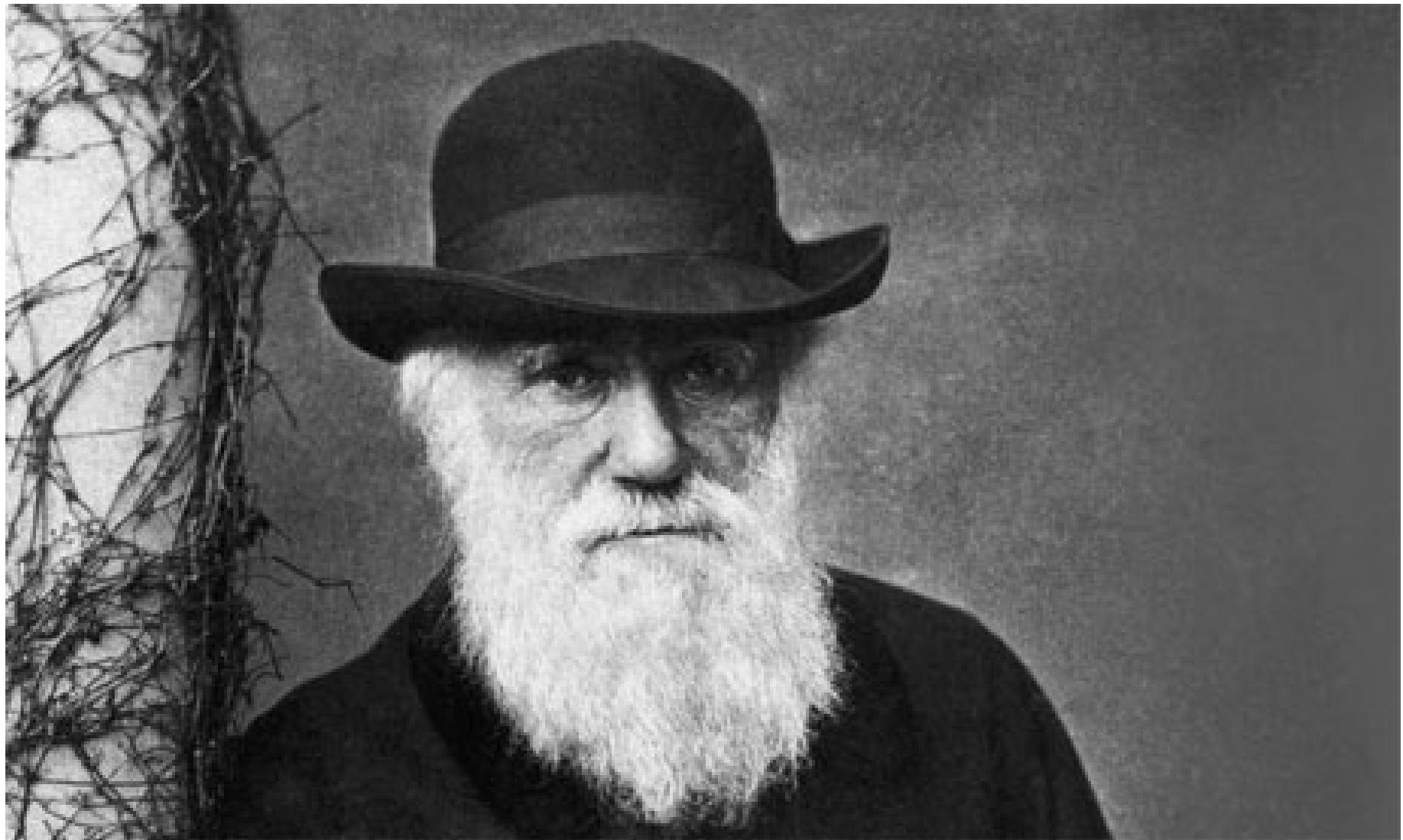


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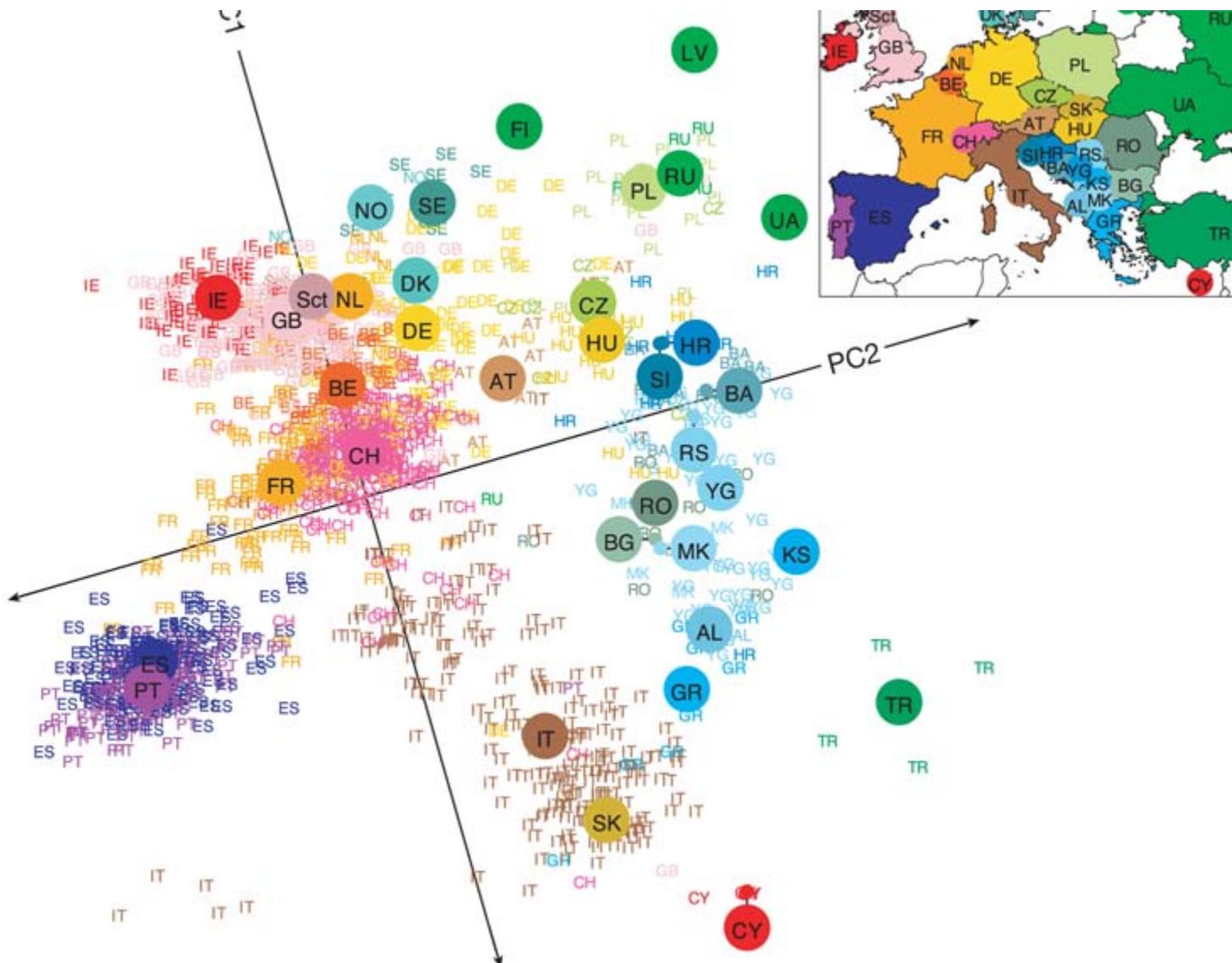


<http://todd.jackman.villanova.edu/HumanGenome.jpg>

## *Understanding the Genome Requires a Theory*



# *Human Genes Mirror Geography*



*Novembre et al. (2008) Nature*

# Recent Positive Selection in Human Populations

in the Asian Population, involved  
in hair follicle development

## The twenty-two strongest candidates for natural selection

Chr:position (MB, HG17)	Selected population	Long Haplotype Test	Size (Mb)	Total SNPs with Long Haplotype Signal	Subset of SNPs that fulfil criteria 1	Subset of SNPs that fulfil criteria 1 and 2	Subset of SNPs that fulfil criteria 1, 2 and 3	Genes at or near SNPs that fulfil all three criteria
chr1:166	CHB + JPT	LRH, iHS	0.4	92	39	30	2	BLZF1, SLC19A2
chr2:72.6	CHB + JPT	XP-EHH	0.8	732	250	0	0	
chr2:108.7	CHB + JPT	LRH, iHS, XP-EHH	1.0	972	265	7	1	
chr2:136.1	CEU	LRH, iHS, XP-EHH	2.4	1,213	282	24	3	
chr2:177.9	CEU, CHB + JPT	LRH, iHS, XP-EHH	1.2	1,388	399	79	9	RAB3GAP1, R3HDM1, LCT PDE11A
chr4:33.9	CEU, YRI, CHB + JPT	LRH, iHS	1.7	413	161	33	0	
chr4:42	CHB + JPT	LRH, iHS, XP-EHH	0.3	249	94	65	6	SLC30A9
chr4:159	CHB + JPT	LRH, iHS, XP-EHH	0.3	233	67	34	1	
chr10:3	CEU	LRH, iHS, XP-EHH	0.3	179	63	16	1	
chr10:22.7	CEU, CHB + JPT	XP-EHH	0.3	254	93	0	0	
chr10:55.7	CHB + JPT	LRH, iHS, XP-EHH	0.4	735	221	5	2	PCDH15
chr12:78.3	YRI	LRH, iHS	0.8	151	91	25	0	
chr15:46.4	CEU	XP-EHH	0.6	867	233	5	1	
chr15:61.8	CHB + JPT	XP-EHH	0.2	252	73	40	6	
chr16:64.3	CHB + JPT	XP-EHH	0.4	484	137	2	0	
chr16:74.3	CHB + JPT, YRI	LRH, iHS	0.6	55	35	28	3	CHST5, ADAT1, KARS
chr17:53.3	CHB + JPT	XP-EHH	0.2	143	41	0	0	
chr17:56.4	CEU	XP-EHH	0.4	290	98	26	3	BCAS3
chr19:43.5	YRI	LRH, iHS, XP-EHH	0.3	83	30	0	0	
chr22:32.5	YRI	LRH	0.4	318	188	35	3	
chr23:35.1	YRI	LRH, iHS	0.6	50	35	25	0	
chr23:63.5	YRI	LRH, iHS	3.5	13	3	1	0	
Total SNPs			16.74	9,166	2,898	480	41	LARGE

In the European population,  
involved in skin pigmentation

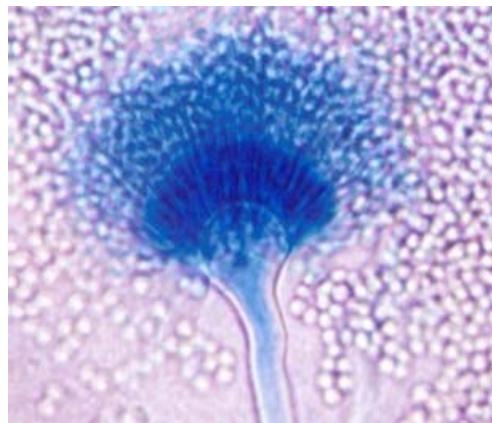
In the West African population,  
related to Lassa virus infection



Sabeti et al. (2007) Nature

# Genomes Provide a Common Yardstick for Comparison

## Average proteome sequence similarity



Morphologically  
very similar!

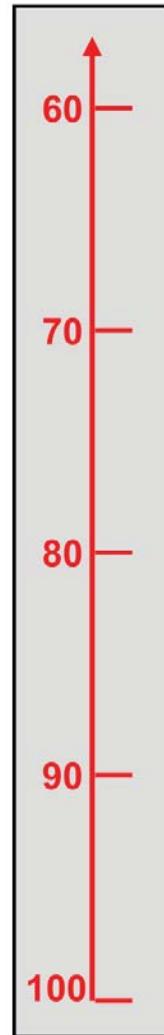


*A. nidulans/niger*  
*A. oryzae/terreus*

*A. clavatus*

*N. fischeri*

*A. fumigatus*



*Kluyveromyces lactis*

*Candida glabrata*

fish

*S. uvarum*

birds

They Interbreed!

*S. paradoxus*

*S. cerevisiae*

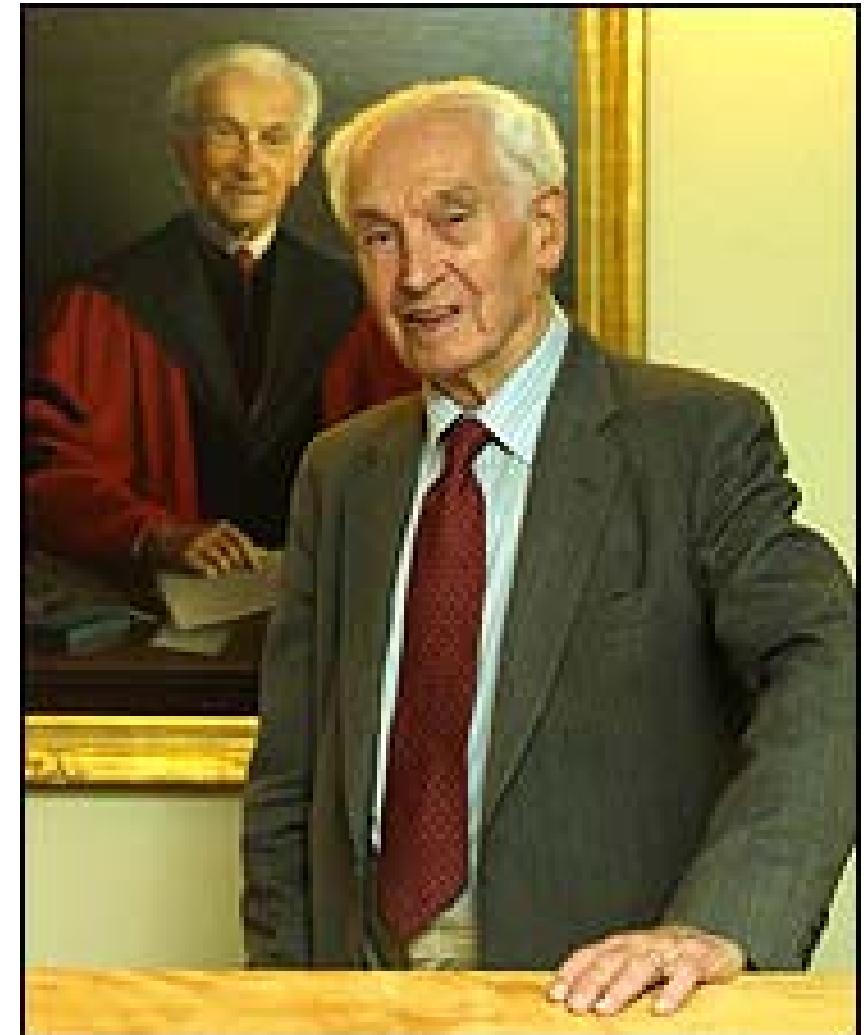
mice

humans



**“...the search for homologous genes is quite futile except in very close relatives”**

**Ernst Mayr, 1963**



# What Makes Us Sick Is the Stuff of Life

## F W Y Cancer

+			ABL1
+			Acute Myeloid Leukemia-DEK
+			Adenomat. Polyposis Coli-APC
+		+	AKT2
+			Ataxia Telangiectasia-ATM
-			BRCA1
-			BRCA2
+			Basal Cell Nevus-PTC
+			B-Cell Lymphoma 2-BCL2
-			B-Cell Lymphoma 3-BCL3
+			Bloom-BLM
+			Burkitt's Lymphoma-MYC
-			CDKN2C
-			CSF1R/C-Fms
+			Chk2 Protein Kinase
-			PDGFB
+			CML-BCR
+			Cyclin D1-CCND1
+			Cyclin Dep. Kinase 4-CDK4
+			EGFR
+			ERBB2
-			ETS
+			E-Cadherin-CDH1
+			Ewing Sarcoma-FLI-1
-			FGF3
-			Fanconi's Anemia A-FANCA
-			Fanconi's Anemia C-FANCC
-			Fanconi's Anemia G-FANCG
+			HNPCC*-MSH2
+			HNPCC*-MSH3
+			HNPCC*-MSH6
+			HNPCC*-MLH1
+			HNPCC*-PMS2
-			KIT

## F W Y Neurological

+			Adrenoleukodystrophy-ABCD1
+			Alzheimer-PS1
+			Alzheimer-APP
+			Amyotrophic Lat. Sclero.-SOD1
+			Angelman-UBE3A
+			Aniridia-PAX6
+			Best Macular Dystrophy-VMD2
+			Ceroid-Lipofuscinosis-PPT
+			Ceroid-Lipofuscinosis-CLN3
-			Ceroid-Lipofuscinosis-CLN2
-			Charcot-Marie-Tooth 1A-PMP22
-			Charcot-Marie-Tooth 1B-MPZ
+			Choroideremia-CHM
-			Creutzfeldt-Jakob-PRNP
+			Deafness, Hereditary-MYO15
+			Deafness, X-Linked-TIMM8A
+			Diaphanous 1-DIAPH1
+			Dementia, Multi-Infarct-NOTCH3
+			Duchenne MD <sup>+</sup> -DMD
-			Emery-Dreifuss MD <sup>+</sup> -EMD
-			Emery-Dreifuss MD <sup>+</sup> -LMNA
+			Familial Encephalopathy-PI12
+			Fragile-X-FRAXA
+			Friedreich Ataxia-FRDA
+			Frontotemporal Dement.-TAU
-			Fukuyama MD <sup>+</sup> -FCMD
-			Huntington-HD
+			Limb Girdle MD <sup>+</sup> 2A-CAPN3
+			Limb Girdle MD <sup>+</sup> 2B-YSF
-			Limb Girdle MD <sup>+</sup> 2E-BSG
+			Lissencephaly, X-Linked-DCX
+			Lowe Oculocerebroren.-OCRL
-			Machado-Joseph-MJD1
+			Miller-Dieker Lissen.-PAF

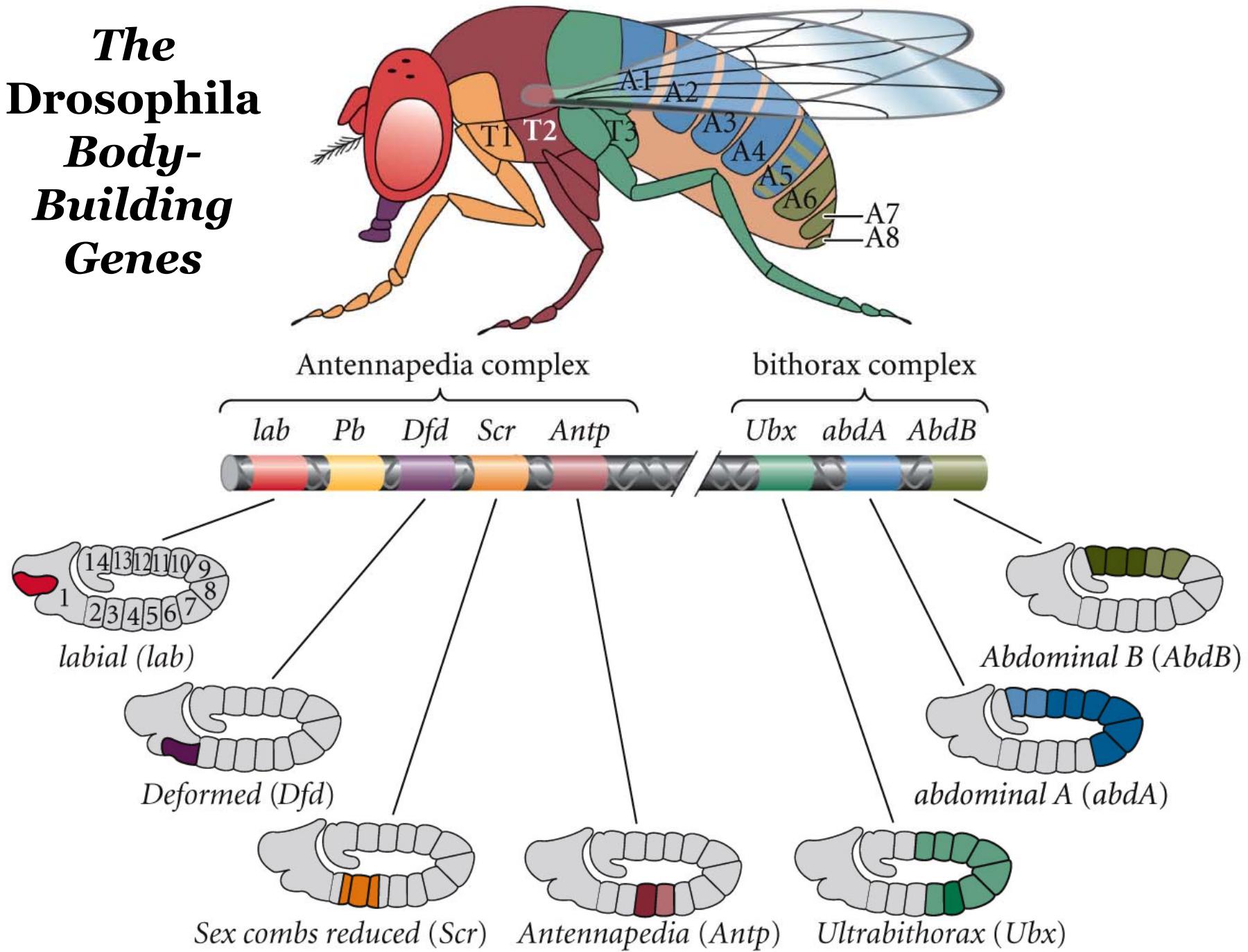
## F W Y Malformation Syndromes

-			Aarskog-Scott-FGD1
+			Achondroplasia-FGFR3
+			Alagille-JAG1
+			Barth-TAZ
-			Beckwith-Wiedemann-CDKN1C
-			Cerebral Cavern. Malf.-CCM1
+			Chondrodyspl. Punct. 1-ARSE
+			Cleidocranial Dysplasia-OFC1
-			Cockayne I-CKN1
+			Coffin-Lowry-RPS6KA3
+			Diastrophic Dyspl.-SLC26A2
+			EEC 3-Ket. P63
+			Greig Cephalopolysynd.-GLI3
-			Hand-Foot-Genital-HOXA13
+			Holoprosencephaly 3-SHH
+			Holoprosencephaly-SIX3
+			Holt-Oram-TBX5
-			ICF-DNMT3B
+			Kallman-KAL1
-			Laterality, X-Linked-ZIC3
+			Melnick-Fraser-EYA1
+			Nail Patella-LMX1B
-			Opitz-MID1
+			Renal Coloboma-PAX2
+			Rieger, Type 1-PITX2
-			Rubinstein-Taybi-CREBBP
+			Saethre-Chotzen-TWIST
-			Septooptic Dysplasia-HESX1
+			Simpson-Golabi-Behmel-GPC3
+			Townes-Brockes-SALL1
-			Treacher-Collins-TCOF1
-			VMCM-TEK
+			Wardenburg-PAX3
+			Zellweger-PEX1



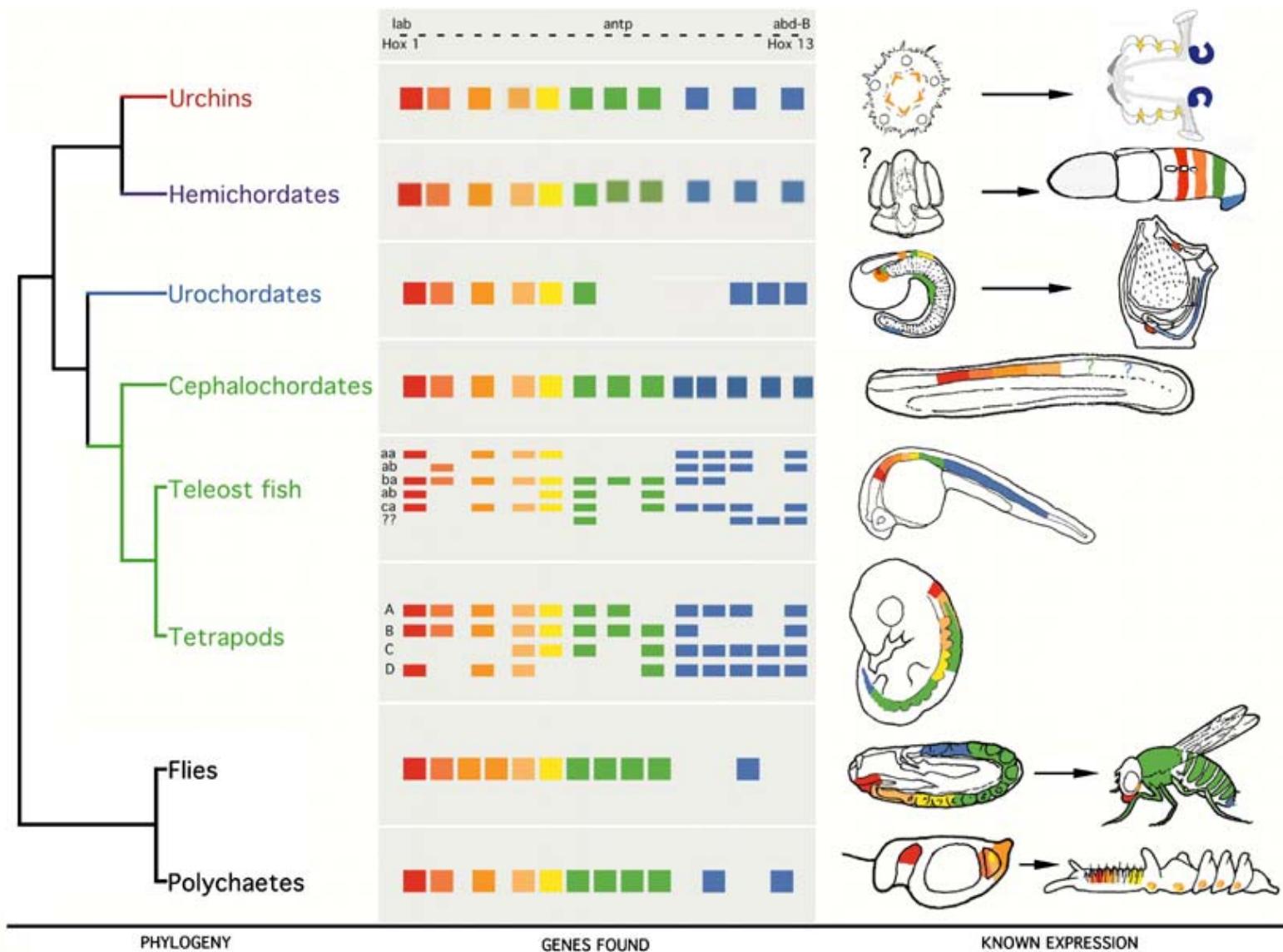
Human disease-associated genes shared with flies (F), worms (W), and Yeast (Y); from Rubin et al. (2000) Science

# The Drosophila Body-Building Genes



EVOLUTION 2e, Figure 21.2

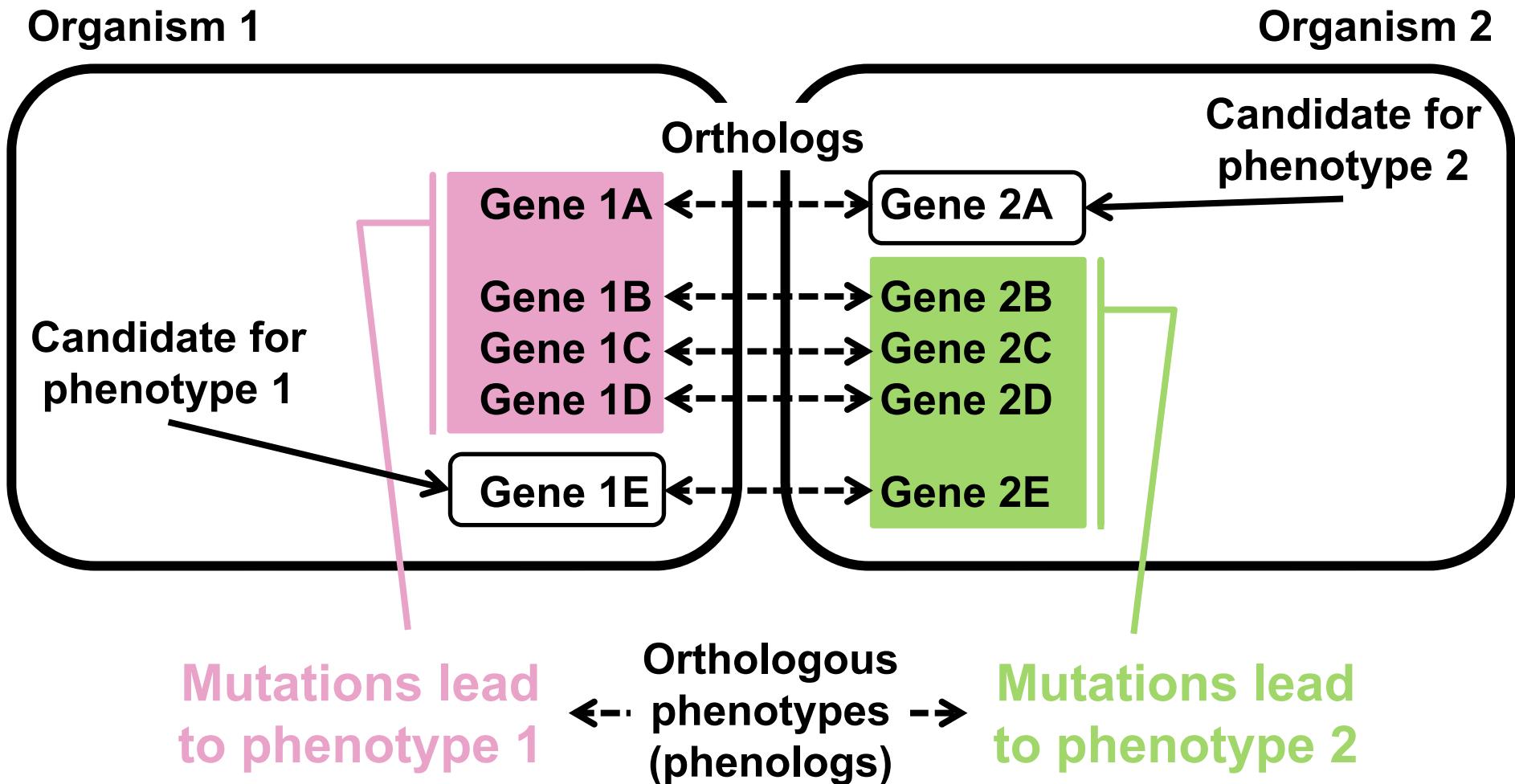
# Animal Bodies are Built from the Same Genetic Toolkit



Swalla (2006) Heredity

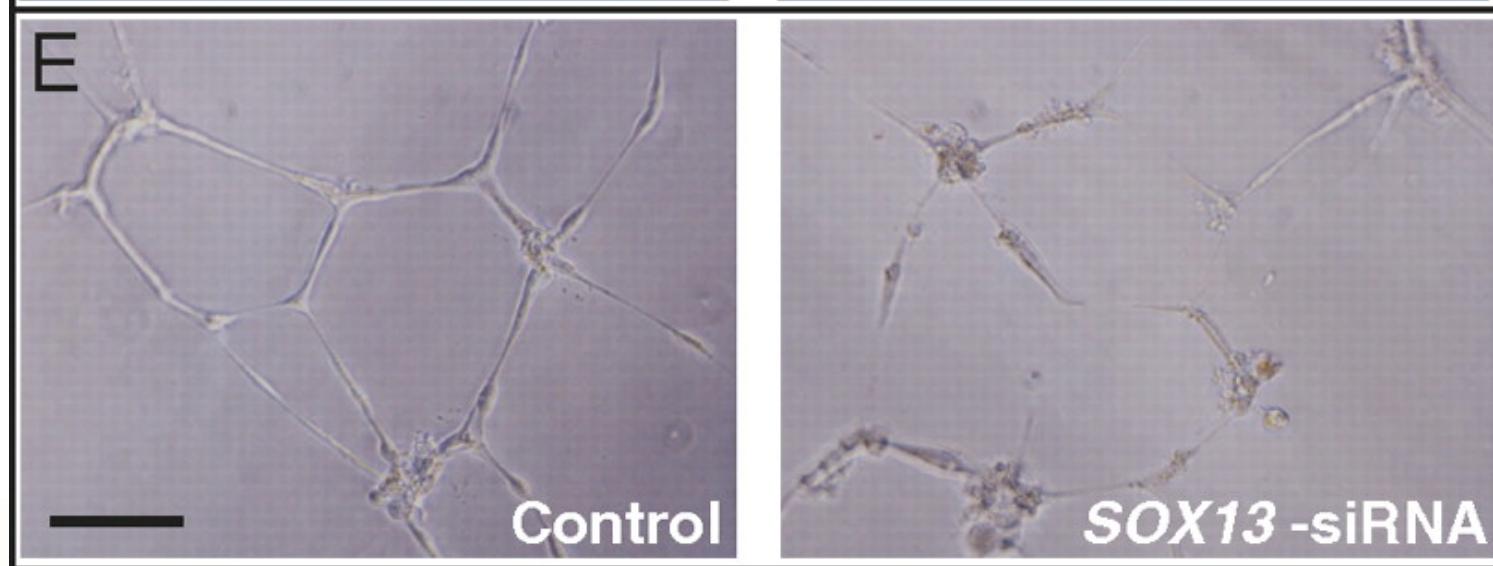
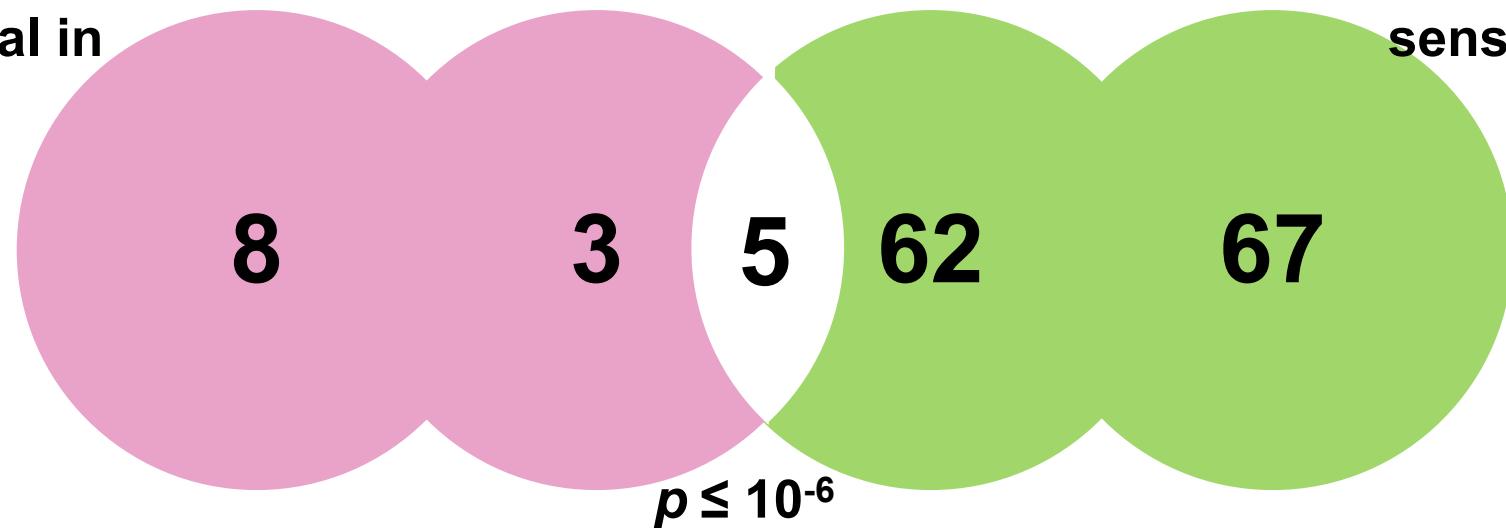


# *Evolution-Informed Analyses Have Great Predictive Power*



# *A Yeast Model for Angiogenesis*

Angiogenesis  
abnormal in  
mice



## *Genomics: “Big Science” Driven by a Few Centers*



# High-Throughput DNA Sequencing Technologies

**454 / Roche**

450 bp 1.5 Gbp / day



**Illumina**

150 bp 35 Gbp / day



**Helicos**

55 bp 4.5 Gb / day



**SOLID ABI**

75 bp 22 Gbp / day

**PacBio**

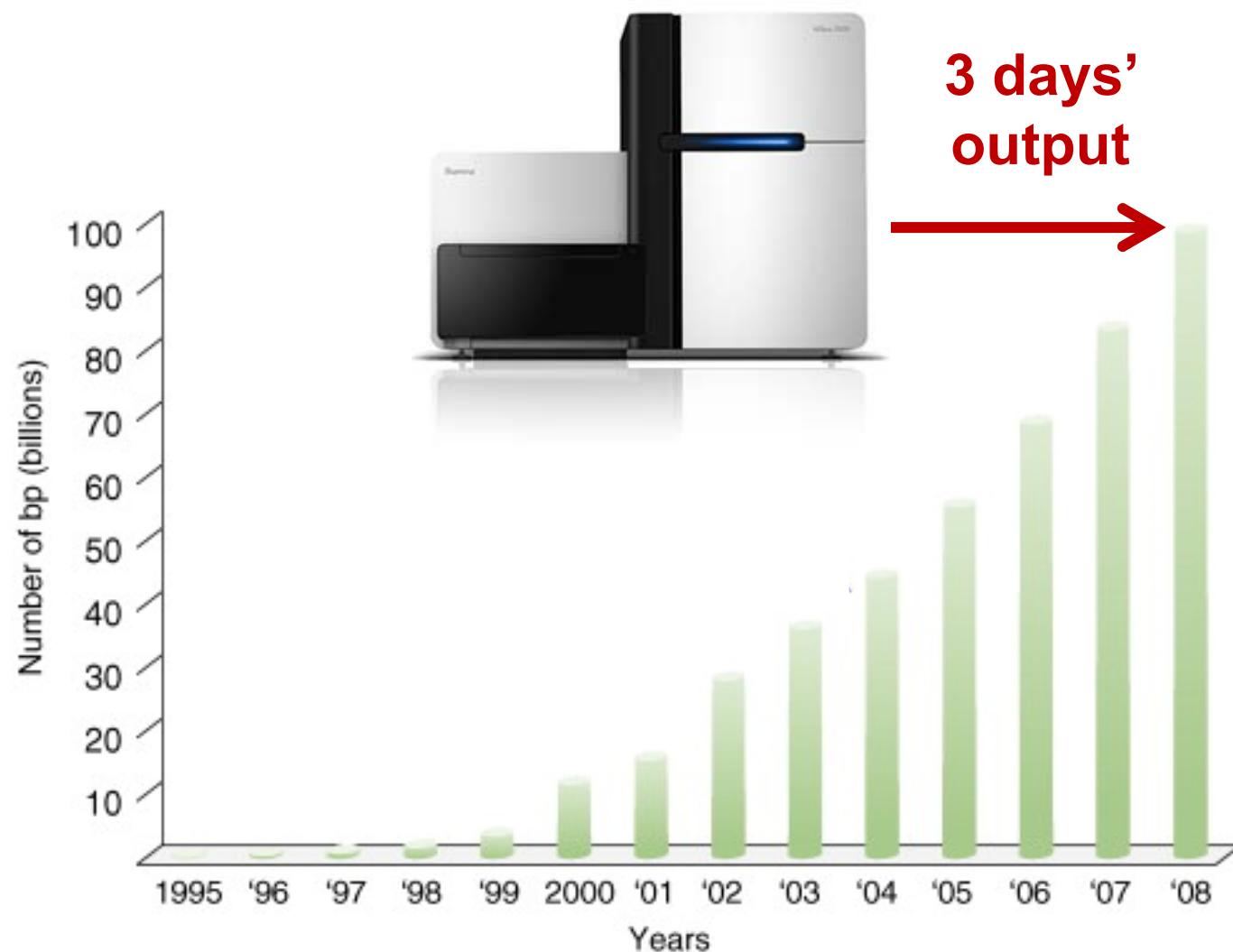
1000 bp 70 Gbp / day



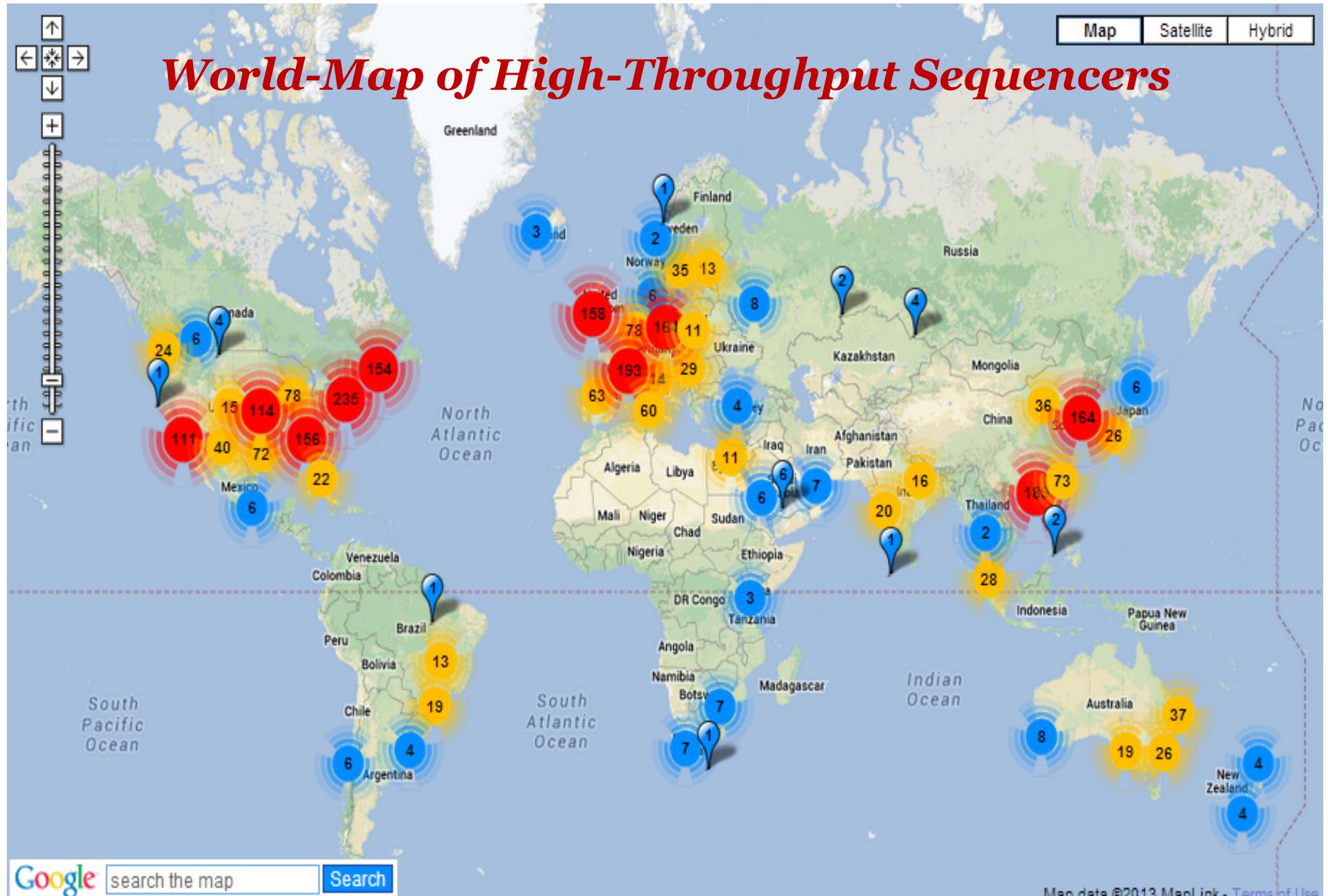
**Ion PGM**

100 bp 120 Gbp / day

# Why Is High-Throughput DNA Sequencing So Exciting?

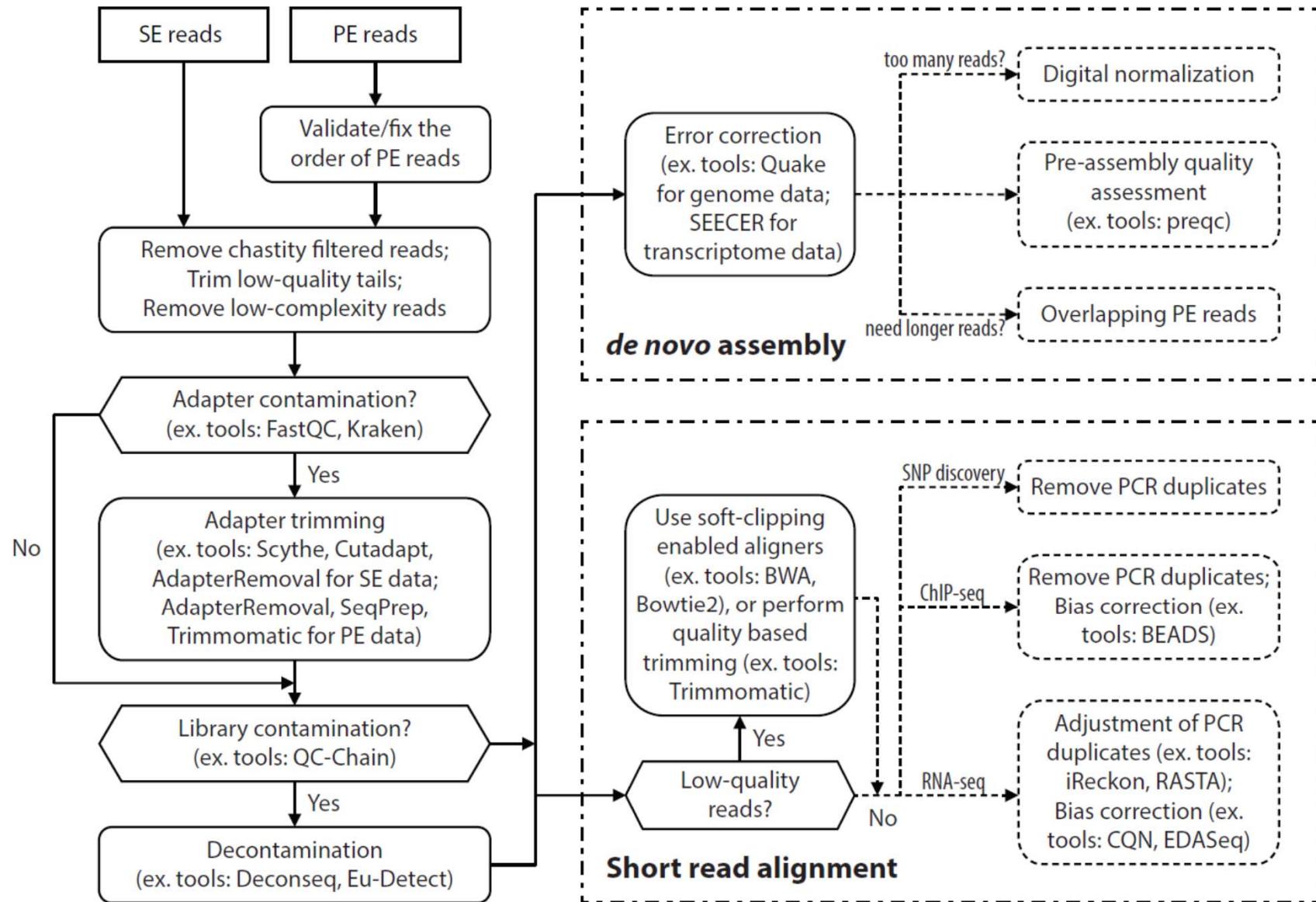


Gilad et al. (2009) Trends Genet.

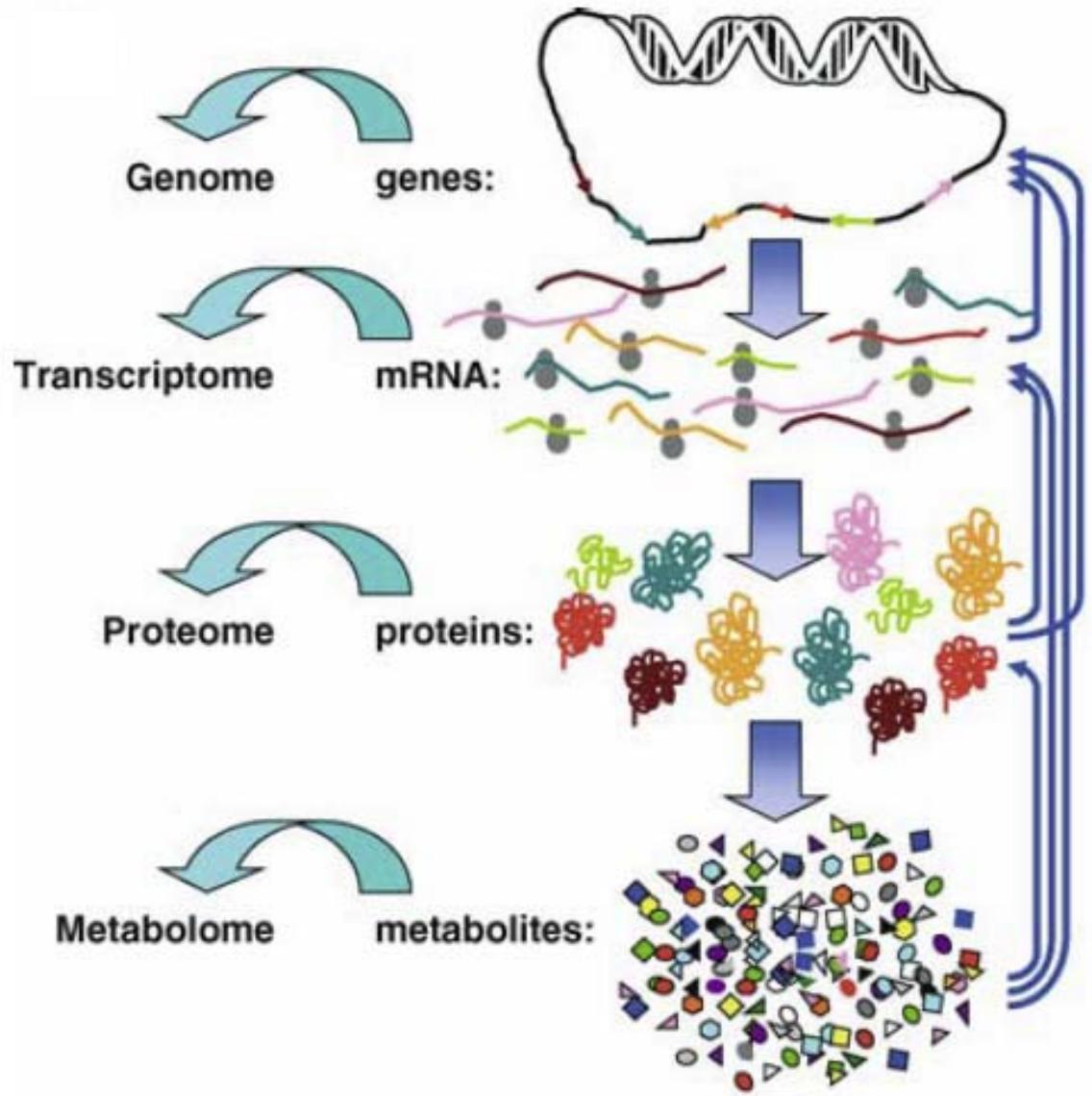


<http://omicsmaps.com/>

# High Throughput Sequencing Data Pathologies



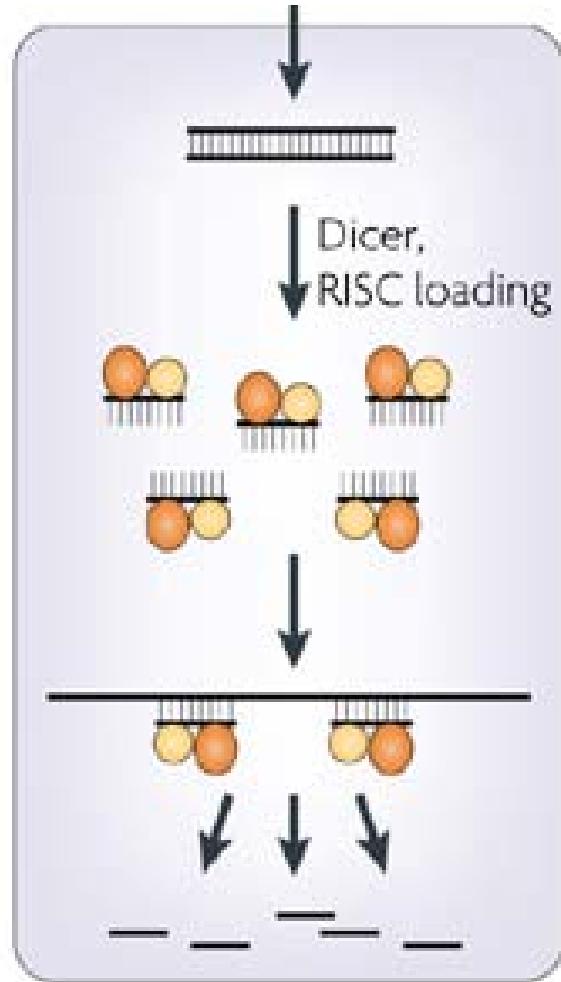
# *The Age of High Throughput Technologies*



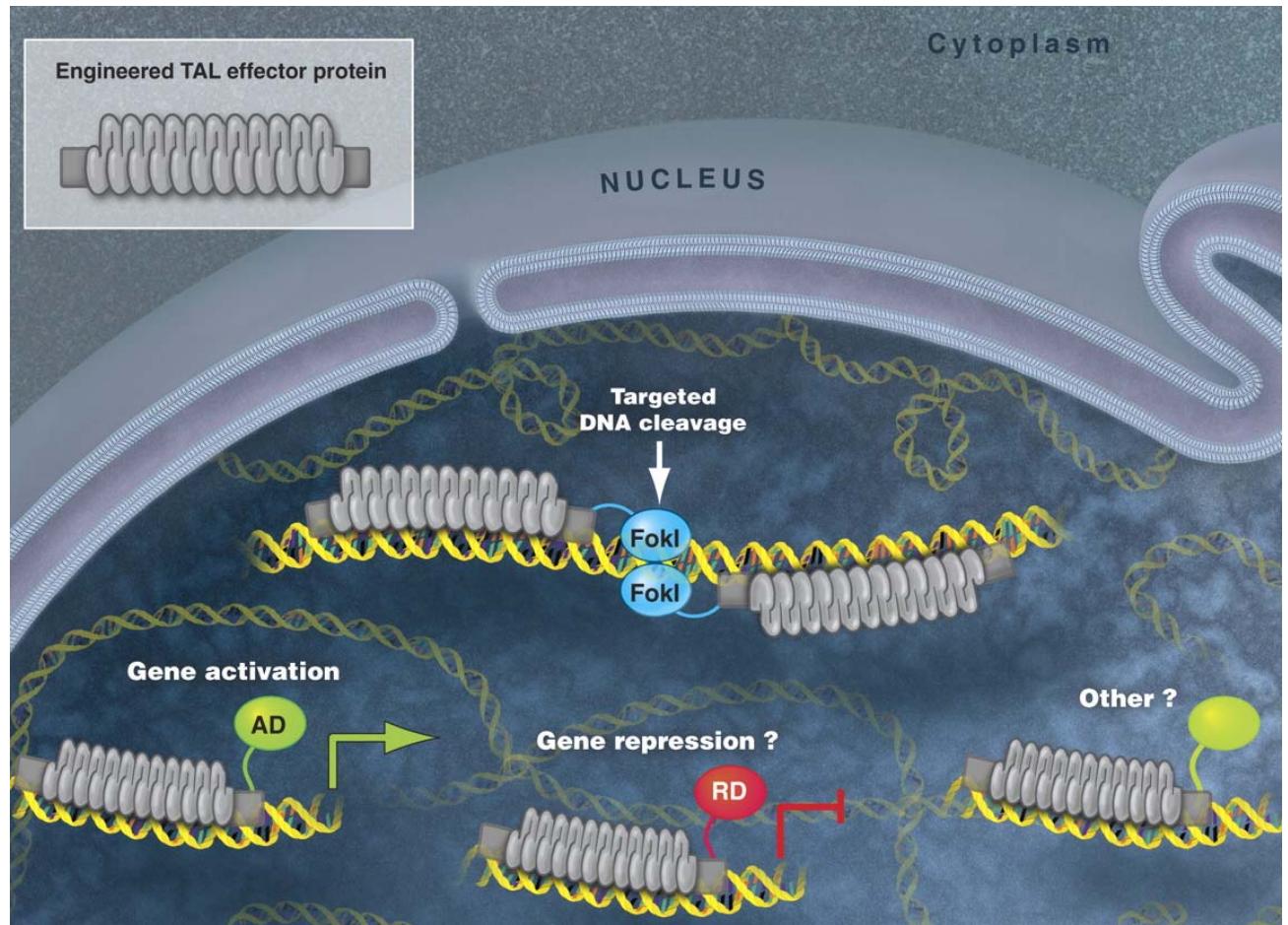
*Goodacre (2005) Metabolomics*

# Novel Technologies for Probing Gene Function

## RNAi



## TAL Effectors



Boutros & Ahringer (2008) *Nat. Rev. Genet.*;  
Bogdanove & Voytas (2011) *Science*

# *The Genomes of Non-Model Organisms are the New Frontiers*



*Rokas & Abbot (2009) Trends Ecol. Evol.*

## *Lecture Outline*

- ❖ **Introduction to Evolutionary Genomics**
- ❖ **Population Genomics**

----- Coffee Break -----

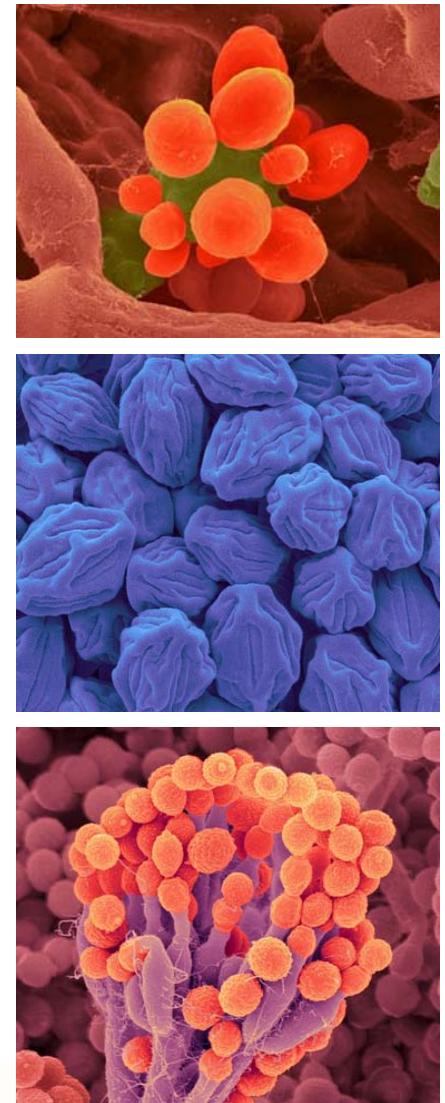
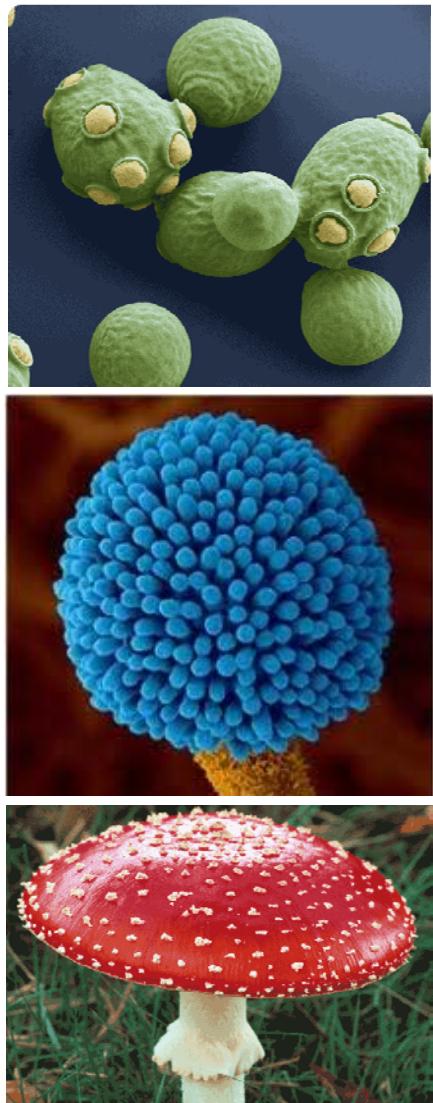
- ❖ **Phylogenomics**

## *The Rokas Lab*

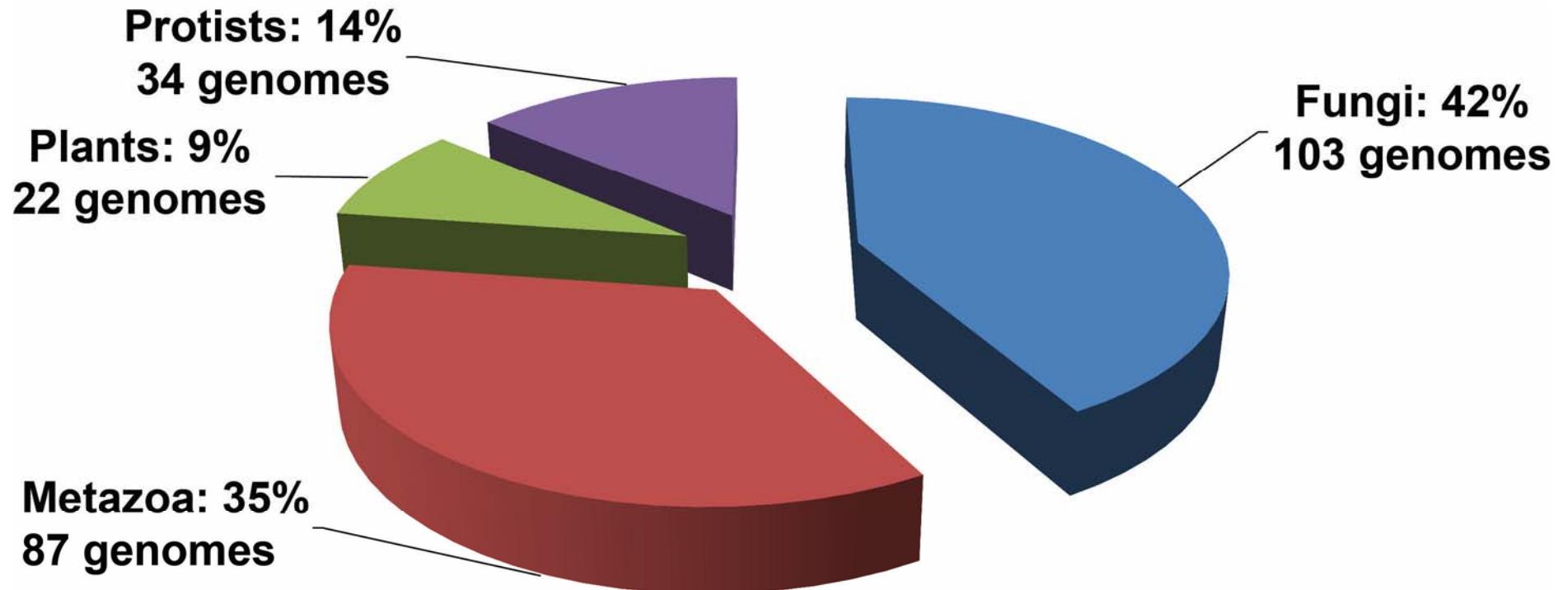


**We study the DNA record to gain insight into evolutionary patterns and processes using computational and experimental approaches**

# *Fungi: A Model for the Study of the DNA Record*



## *Fungi: the Most Sequenced Eukaryotic Lineage*

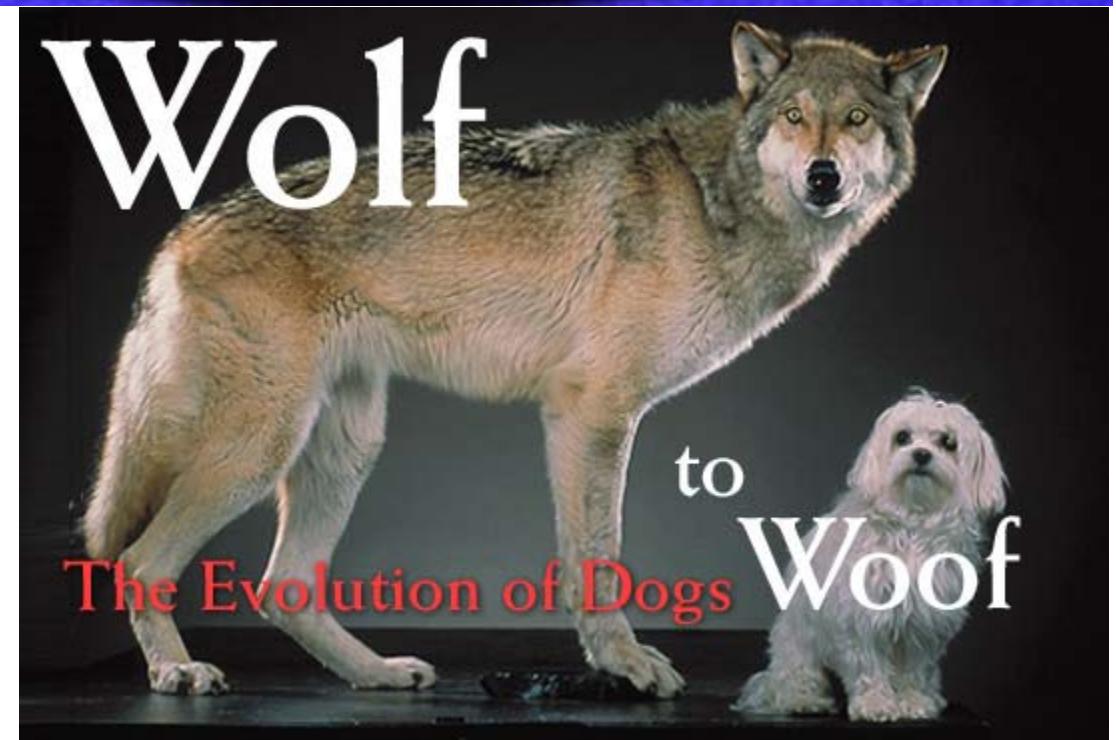
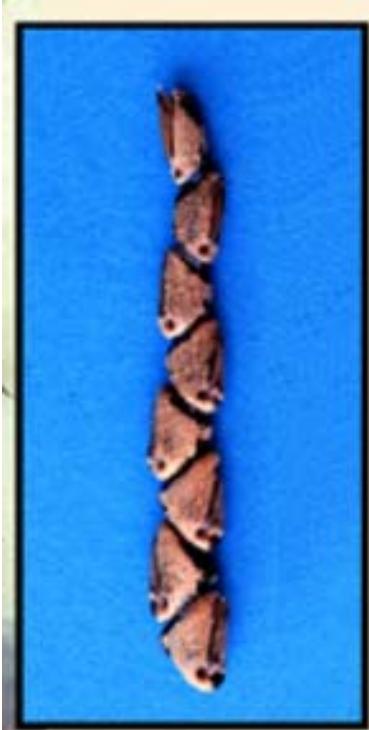


# fungi: 1000genomes

<http://www.jgi.doe.gov/sequencing/cspseqplans2012.html>



*Data from GOLD 3.0 ([www.genomesonline.org](http://www.genomesonline.org)), March 2011*

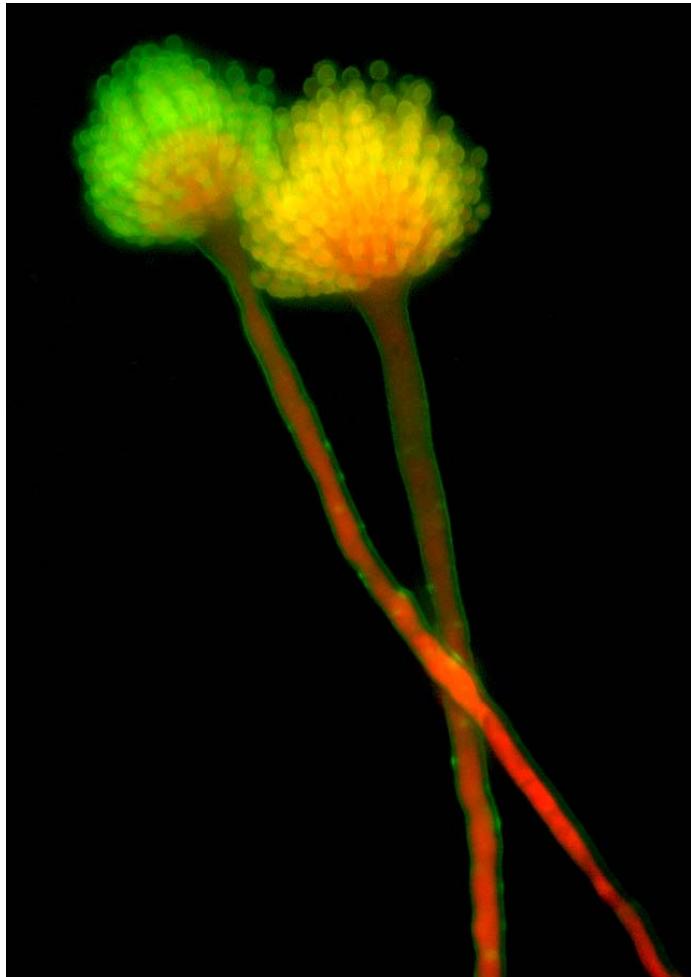




[change-diapers.com](http://change-diapers.com)



## *Aspergillus oryzae*: Cornerstone of Several Japanese Tasty Liquids



Archaeological evidence suggests that mixed fermented alcoholic beverage of rice, honey and fruit was made in China as early as 7 – 9 millennia ago

*Aspergillus oryzae*, a filamentous fungus, is involved in the production of *sake* (rice wine), *miso* (soy bean paste), *su* (vinegar) and *shoyu* (soy sauce)



McGovern et al. (2004) PNAS

# How Sake is Made

**1. Polishing**



**2. Washing**



**3. Steaming**



**4. Koji making**



**5. Yeast starter**



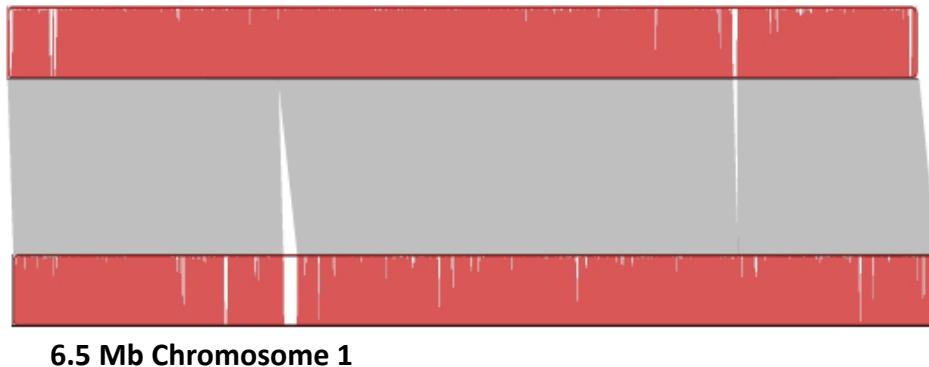
**6. Pressing**



[http://www.sakejapan.com.au/whats\\_nihonshu.html#what](http://www.sakejapan.com.au/whats_nihonshu.html#what)

# The *A. oryzae* and *A. flavus* Genomes are Nearly Identical

*A. oryzae*



*A. flavus*

- ❖ 8 Chromosomes
- ❖ 37 Mb
- ❖ 12,000 genes
- ❖ 99.5% nt identity

*A. oryzae*

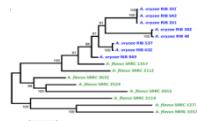
- ❖ Sake, soy sauce, miso
- ❖ Non-aflatoxin producer
- ❖ USDA GRAS species

*A. flavus*

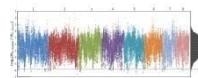
- ❖ Agricultural pest
- ❖ Aflatoxin producer
- ❖ ~\$1 billion annually



# *The Road to Domestication*



Evolutionary Relationship?



Positively Selected Genes?

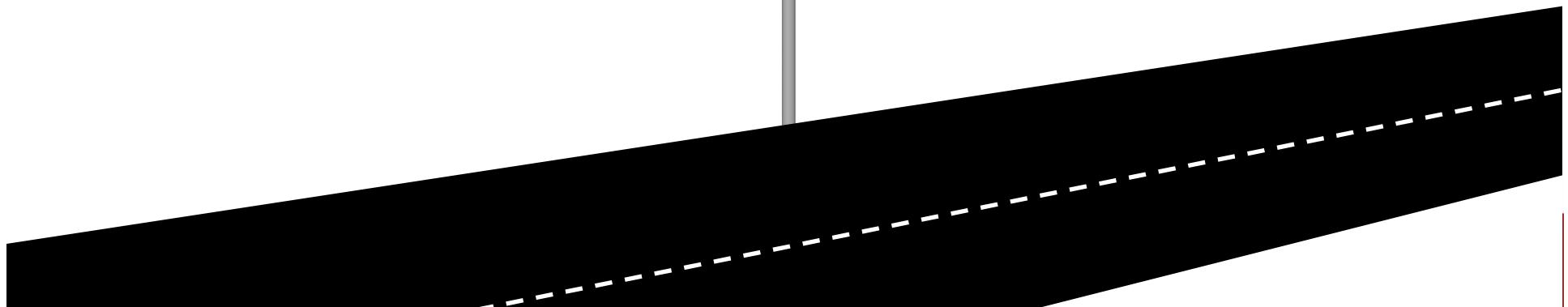


Functional Differences?



DOMESTICATION RD

ONE WAY



# *Sequencing 16 Genomes*

## *A. oryzae*

SRRC 302	Sake
RIB 331	Miso
RIB 333	Miso
RIB 537	Sake
RIB 632	Sake
RIB 642	Sake
RIB 949	Soy Sauce
RIB 40	Sake, Reference Strain

## *A. flavus*

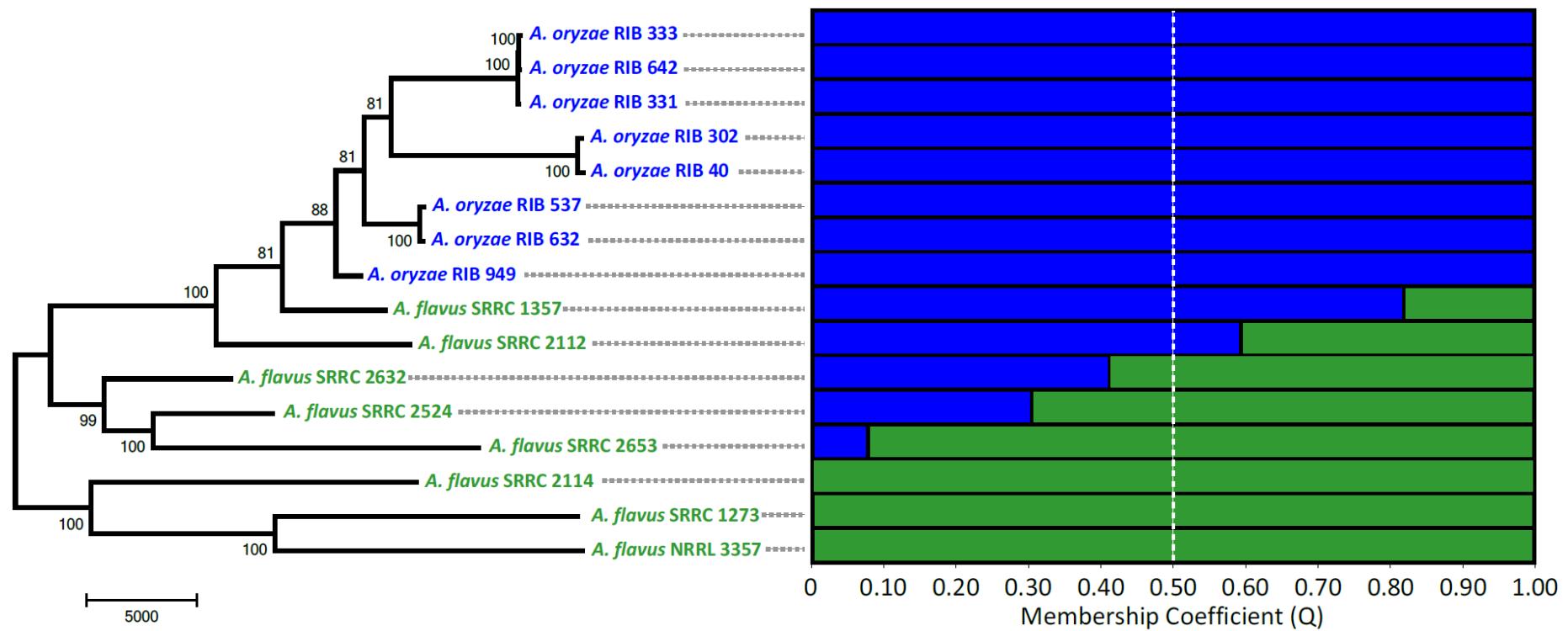
SRRC 1273	Soil, Arizona
SRRC 1357	Dried bacon, Croatia
SRRC 2112	Hazelnut, Turkey
SRRC 2114	Wheat, USA
SRRC 2524	Dead termites, China
SRRC 2632	Blood, Chicago, Illinois
SRRC 2653	Corneal ulcer, Miami, Florida
NRRL 3357	Peanut, Reference strain, USA

❖ Illumina Sequencing

❖ 12-30 million 80bp reads

❖ > 20x coverage

# *Aspergillus oryzae* Isolates are Genetically Distinct

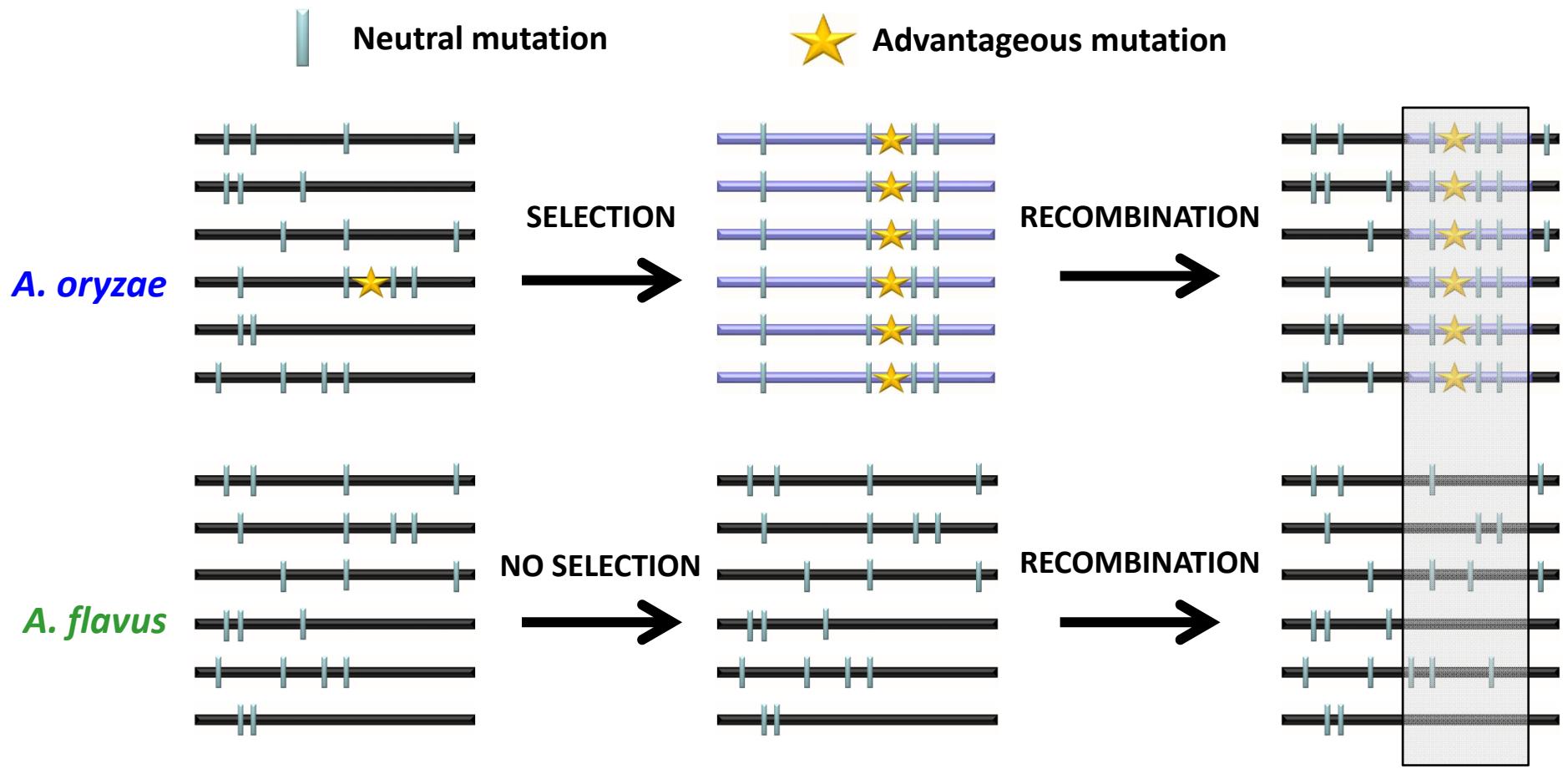


100,084 SNPs



Gibbons et al. (2012) Curr. Biol.

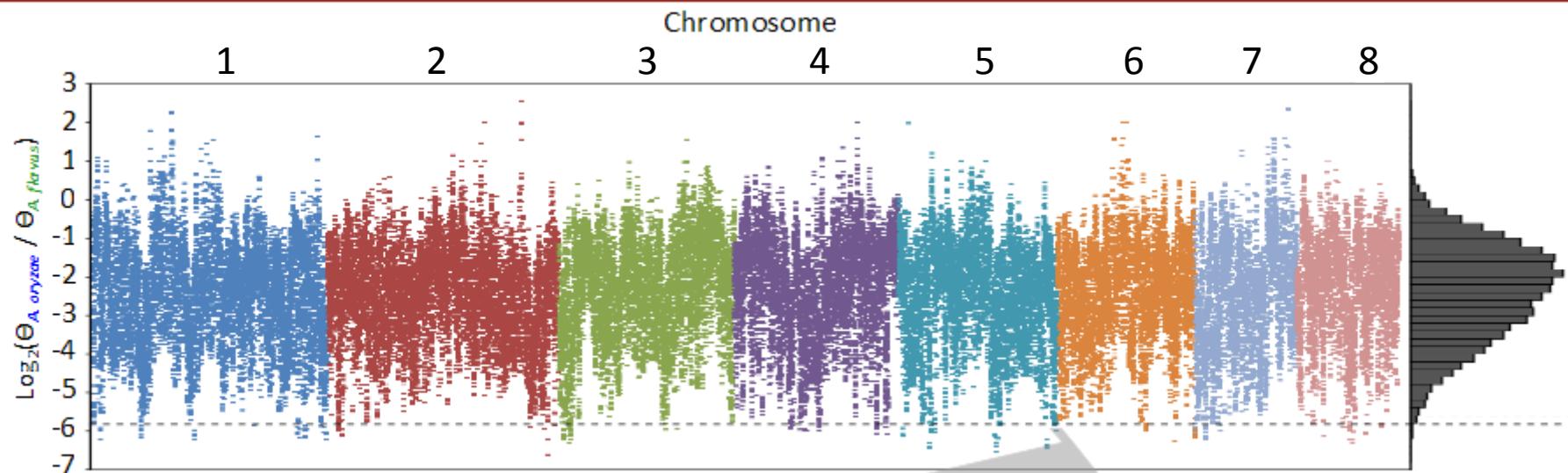
# Detecting Recent Positive Selection in *A. oryzae*



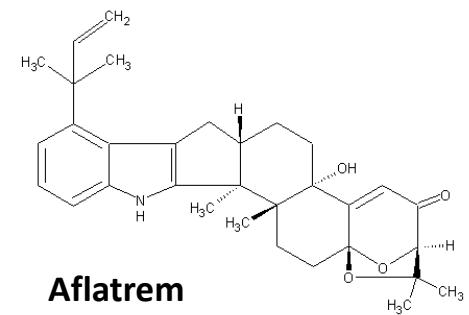
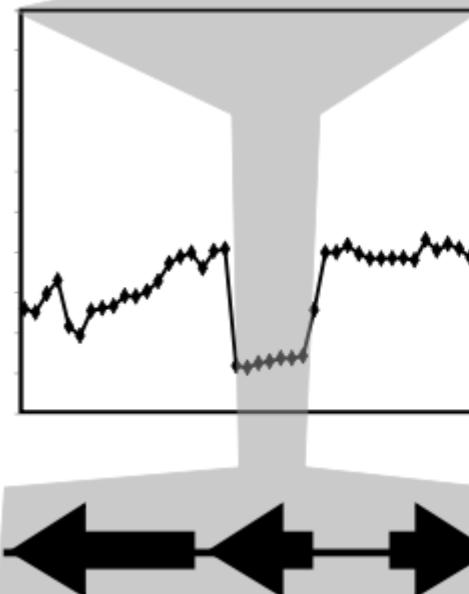
- ❖ Relative nucleotide diversity ( $\Theta_{A.oryzae} / \Theta_{A. flavus}$ )
- ❖ 5kb sliding windows, 500bp steps; >65,000 windows
- ❖ Overlapping regions of windows in the lowest 0.25%



# Recent Positive Selection in the *A. oryzae* Genome



65,894 total windows  
↓  
164 candidate windows  
↓  
61 Putative Selective Sweep Regions (PSSRs)  
↓  
148 Genes



Genes in Sweep Regions are Enriched in Secondary Metabolism ( $P < 0.0006$ )



# *The Complex Flavor of Sake*

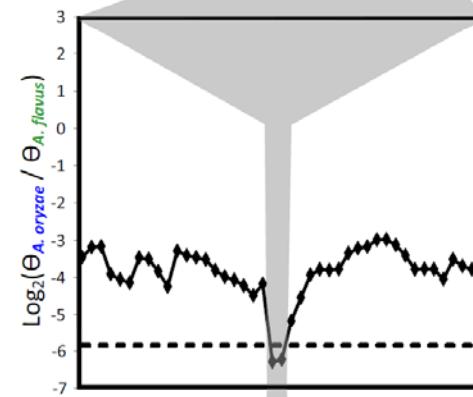
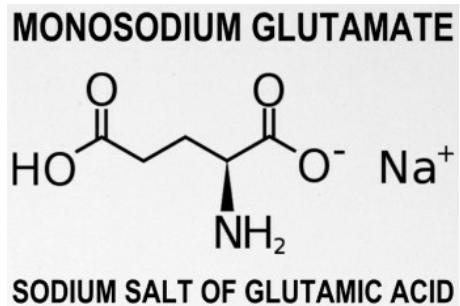
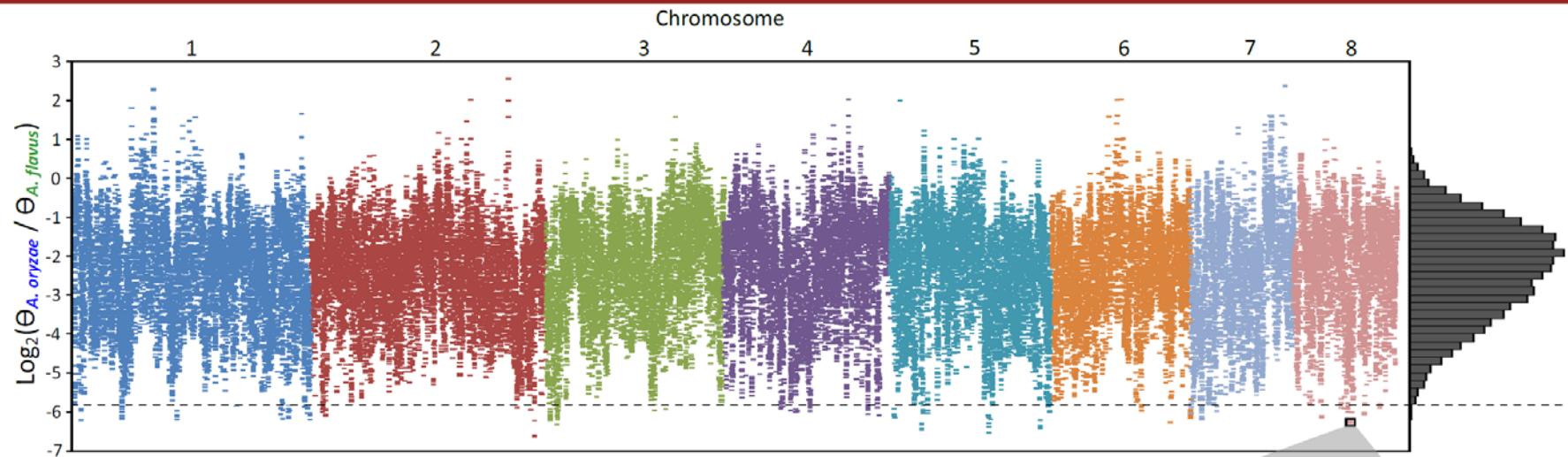


- ❖ Fragrance
- ❖ Impact
- ❖ Sweet/Dry
- ❖ Acidity
- ❖ Presence
- ❖ Complexity
- ❖ Earthiness
- ❖ Tail

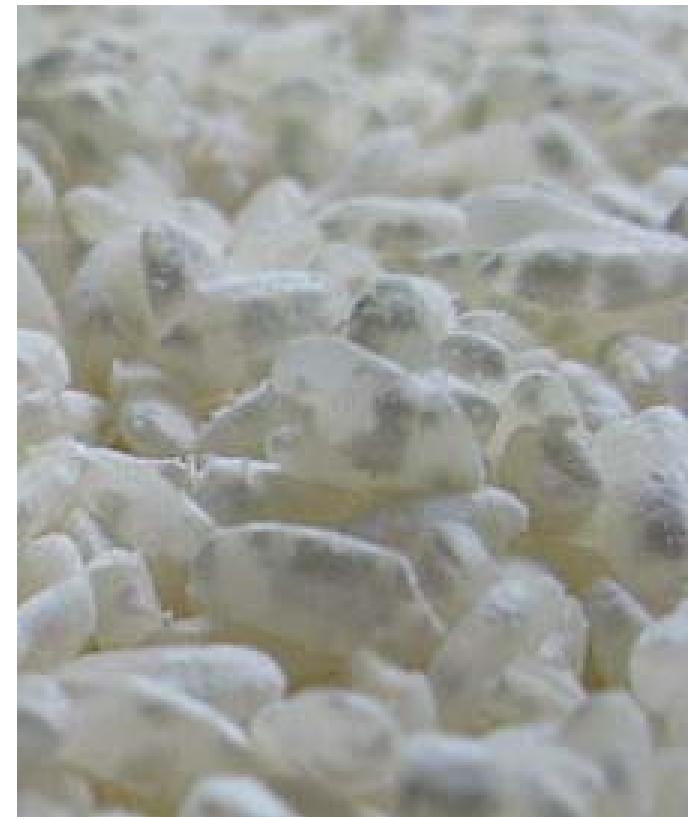
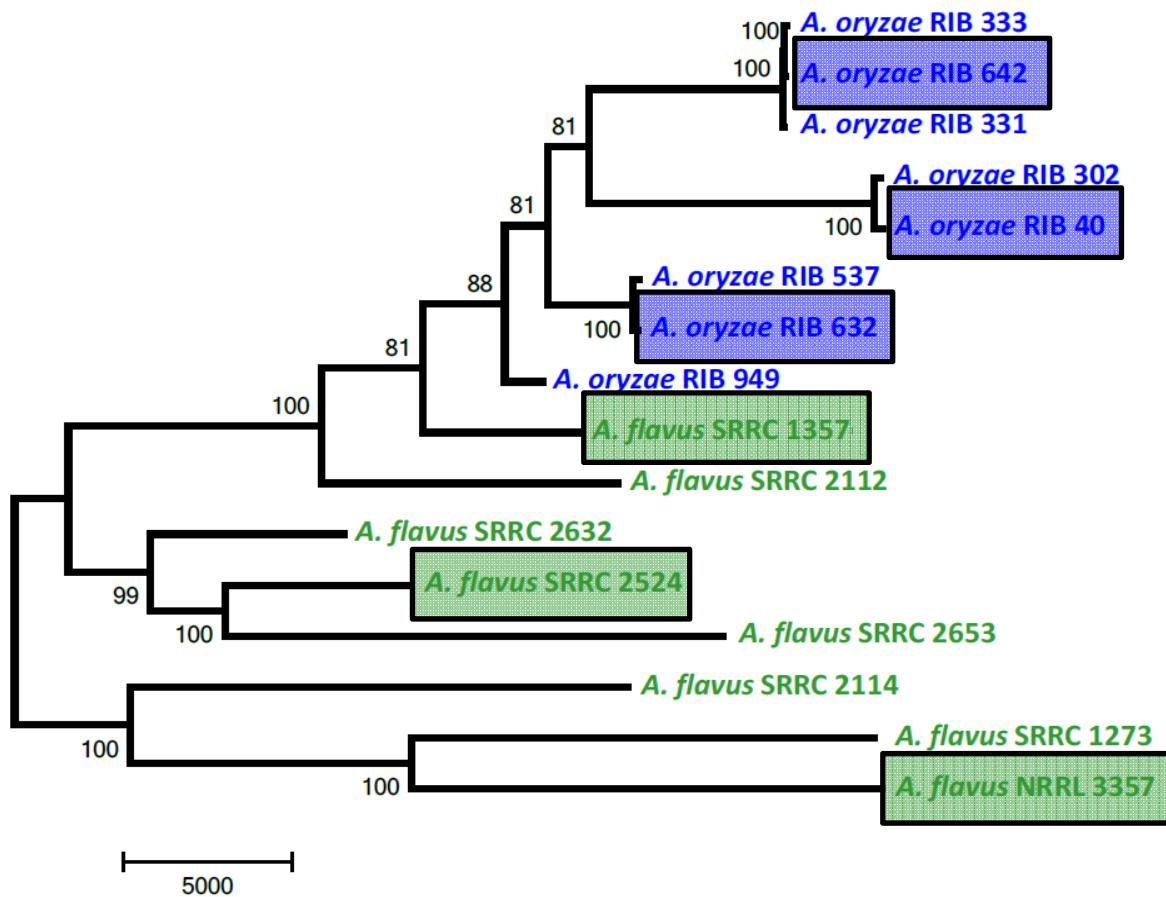
Have “flavor” genes been under selection?



# *Differences in a Flavor Associated Gene*



# Detecting Differences in Transcript and Protein Abundance

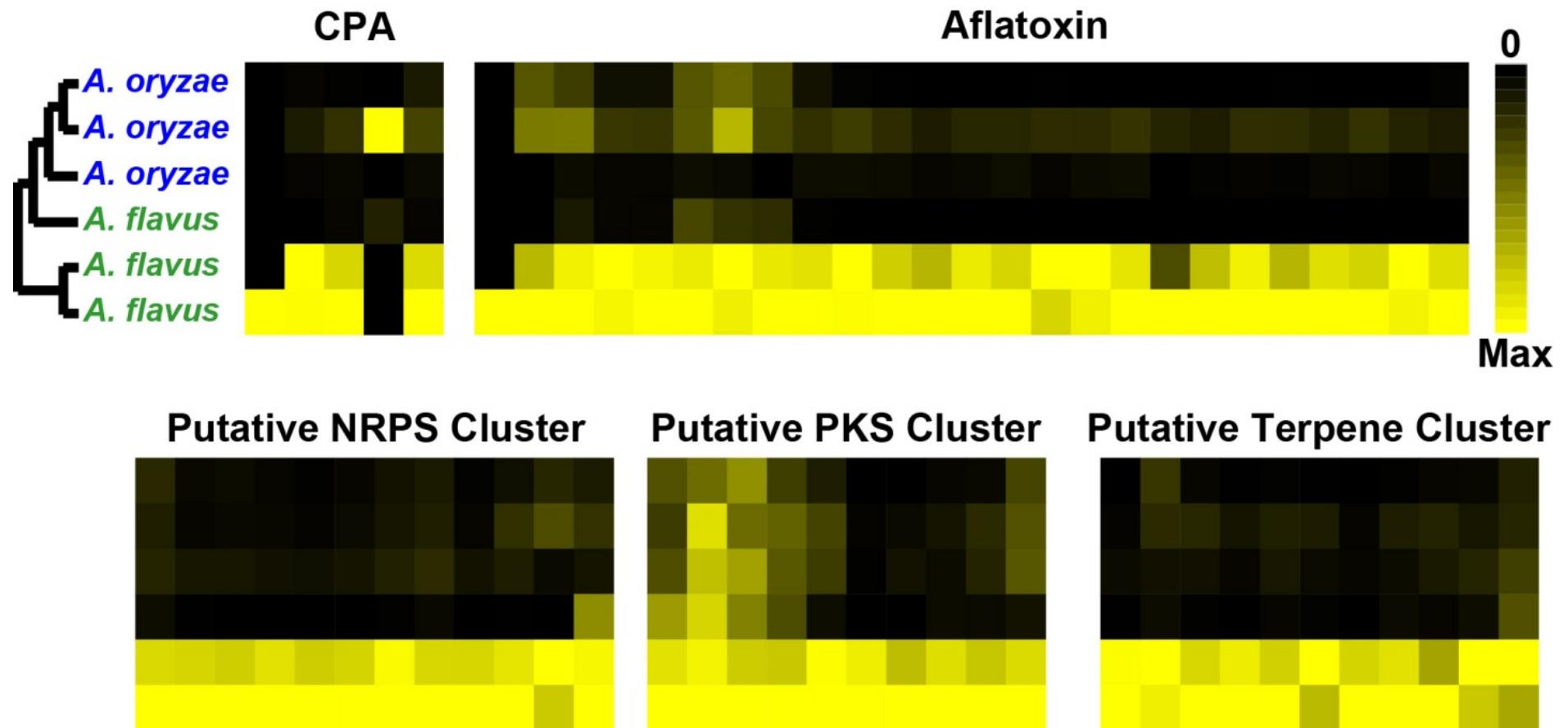


- ❖ Sake strains
- ❖ 30° C
- ❖ 24 hours

- ❖ Gene Expression (RNA-Seq)
- ❖ Protein Abundance (MudPIT)

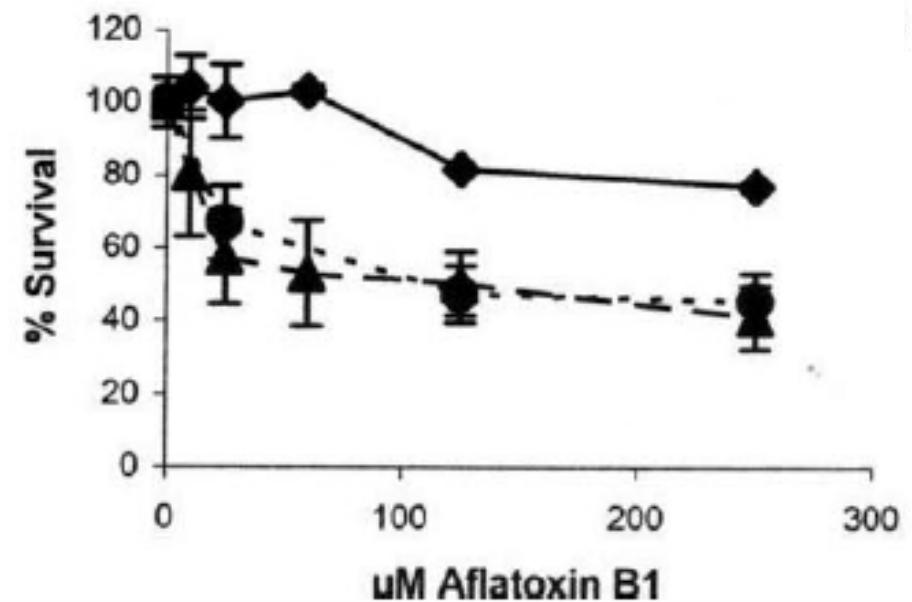
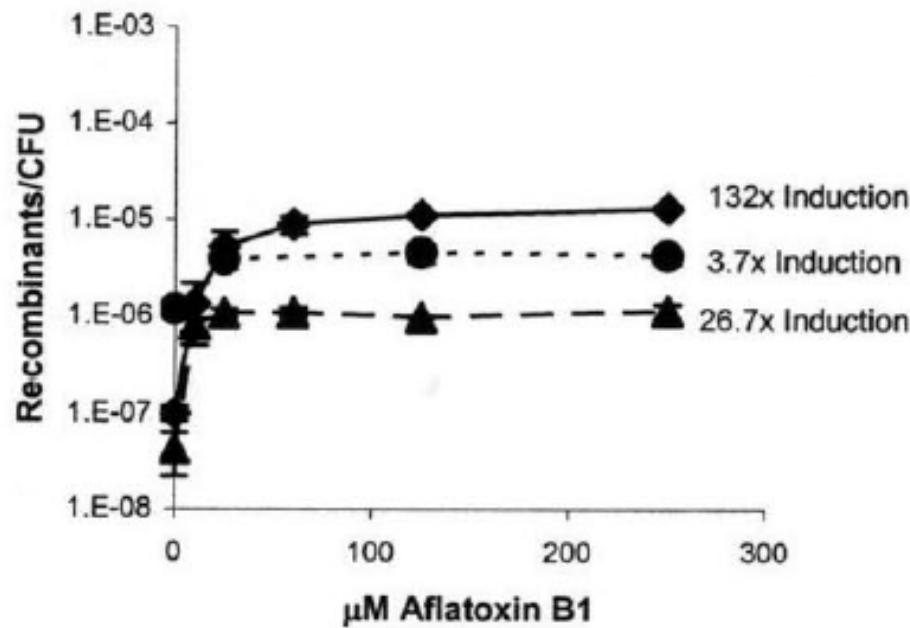


# *Down-Regulation of Secondary Metabolism in A. oryzae*



# Why is *A. oryzae* Atoxic?

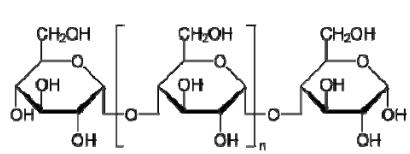
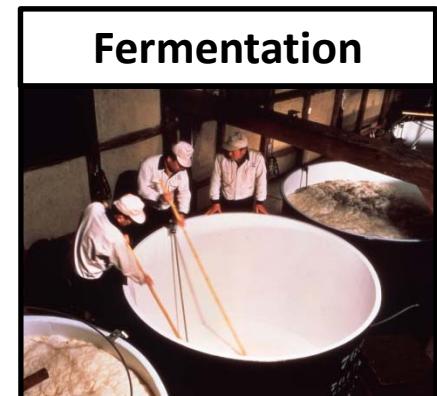
Aflatoxin is genotoxic to *S. cerevisiae*



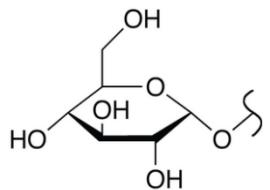
The atoxicity of *A. oryzae* might have been driven by its impact on yeast survival and, as a consequence, fermentation for making sake



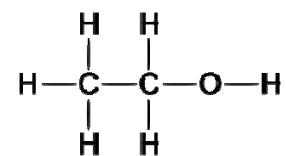
# *A. oryzae* Breaks Down Starch into Sugar



*A. oryzae*



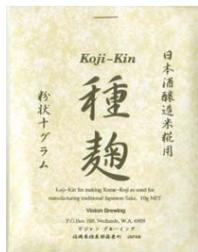
Yeast



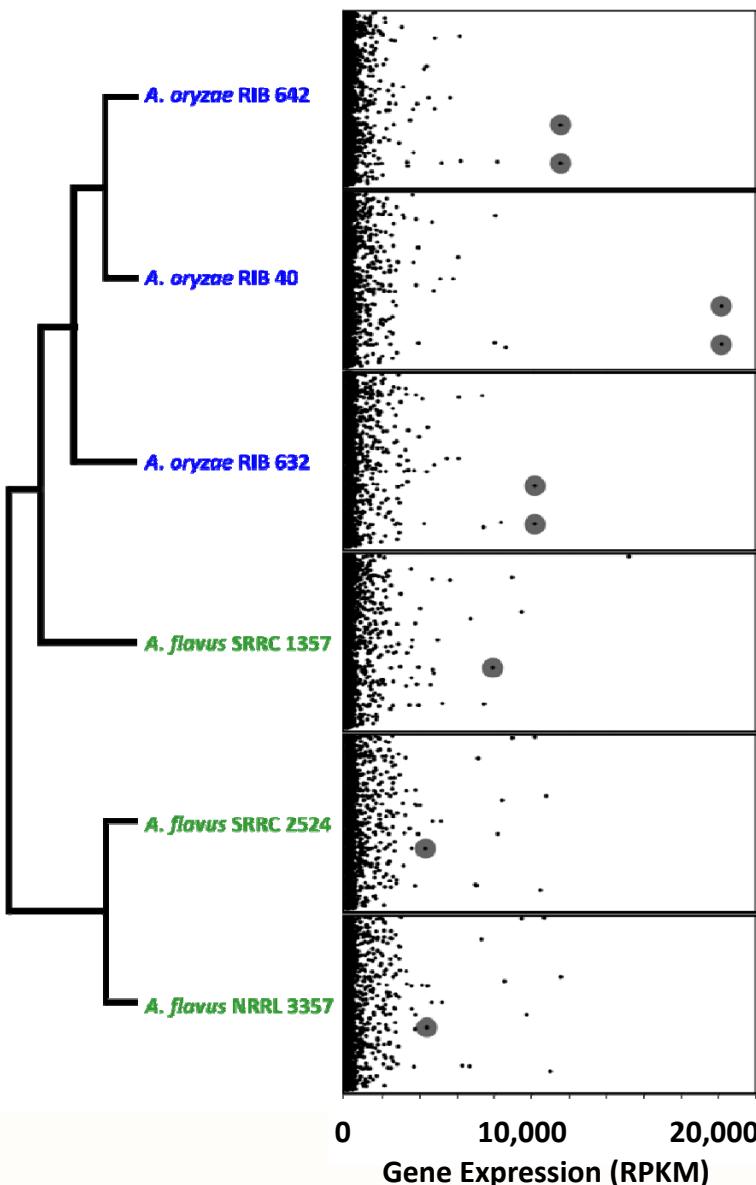
Starch

Sugar

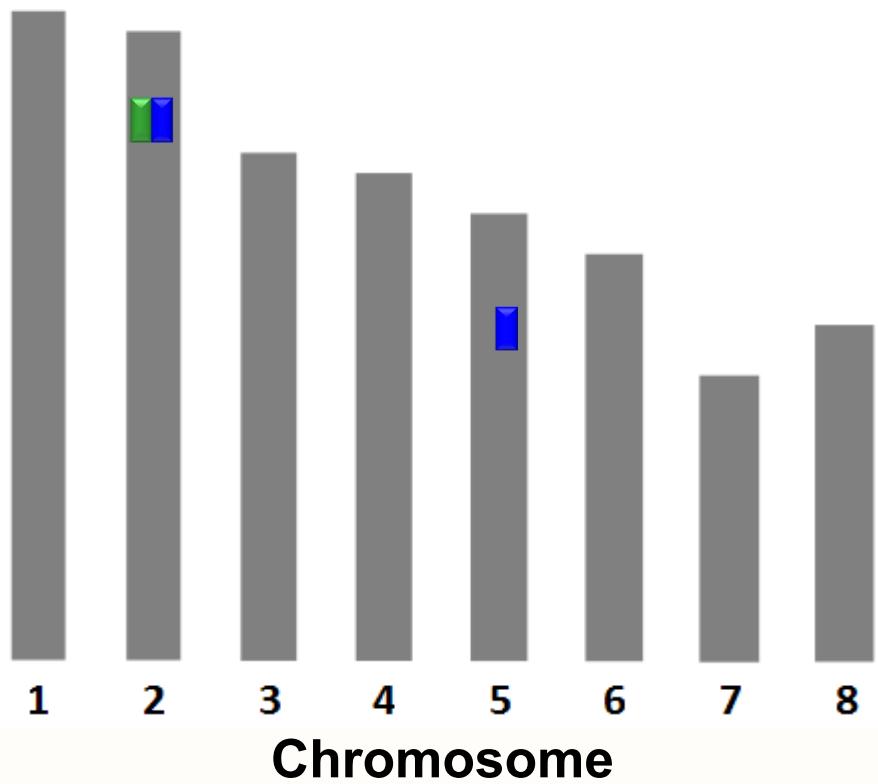
Alcohol



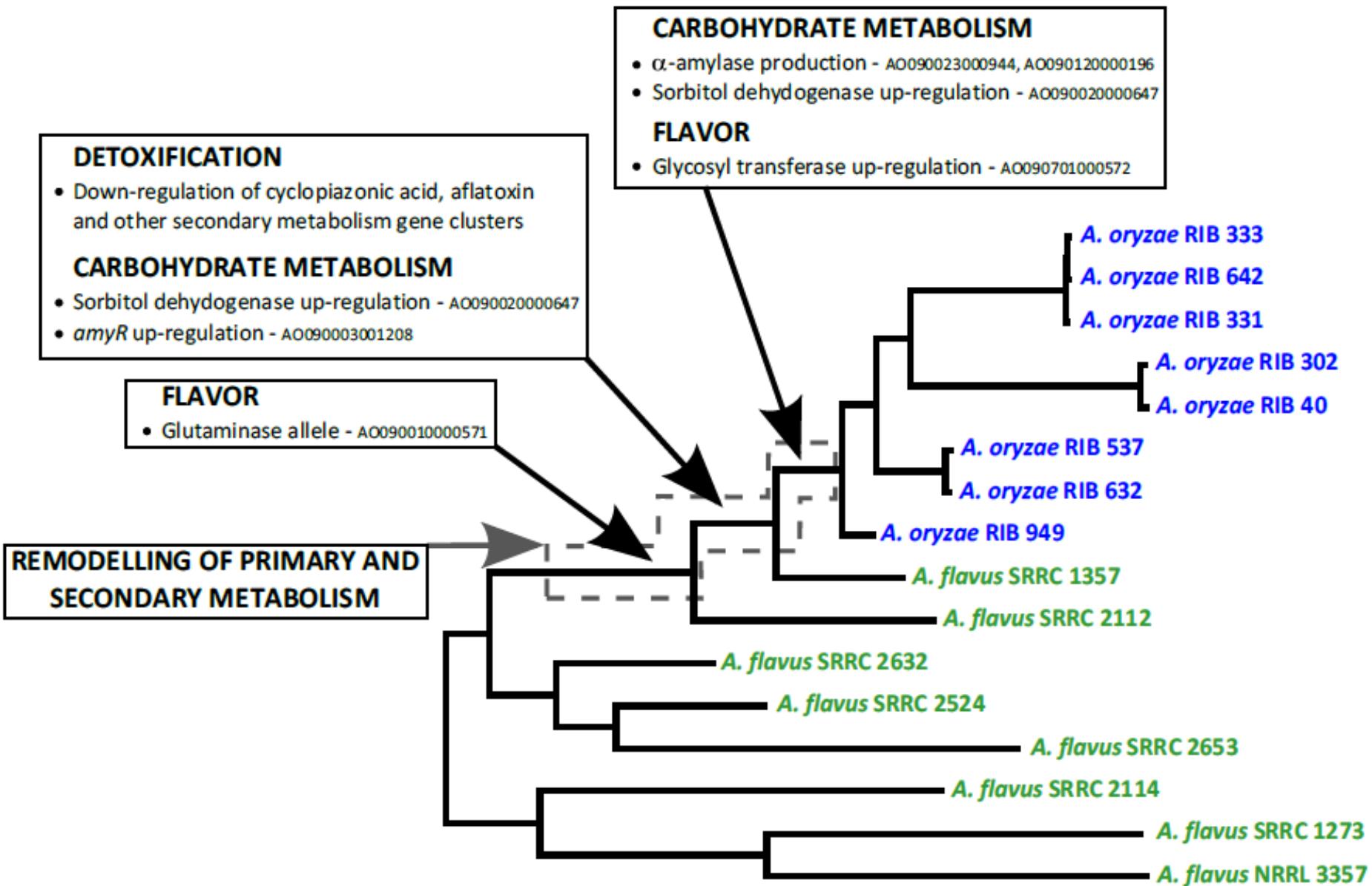
# *α-amylase is Highly Abundant*



- ❖ Gene Expression  $\uparrow P = 1e-300$
- ❖ Protein Enrichment  $\uparrow P = 8e-63$
- ❖ Carbohydrate Metabolism  $\uparrow P = 6e-5$



# DOMESTICATION RD

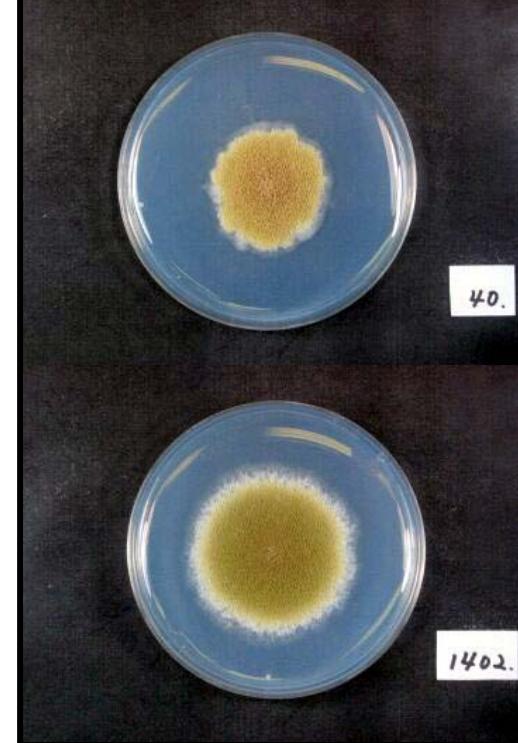


# *Contrasting Domestication Patterns Across Kingdoms*

## Plants



## Microbes



## Animals



## *Lecture Outline*

- ❖ **Introduction to Evolutionary Genomics**
- ❖ **Population Genomics**

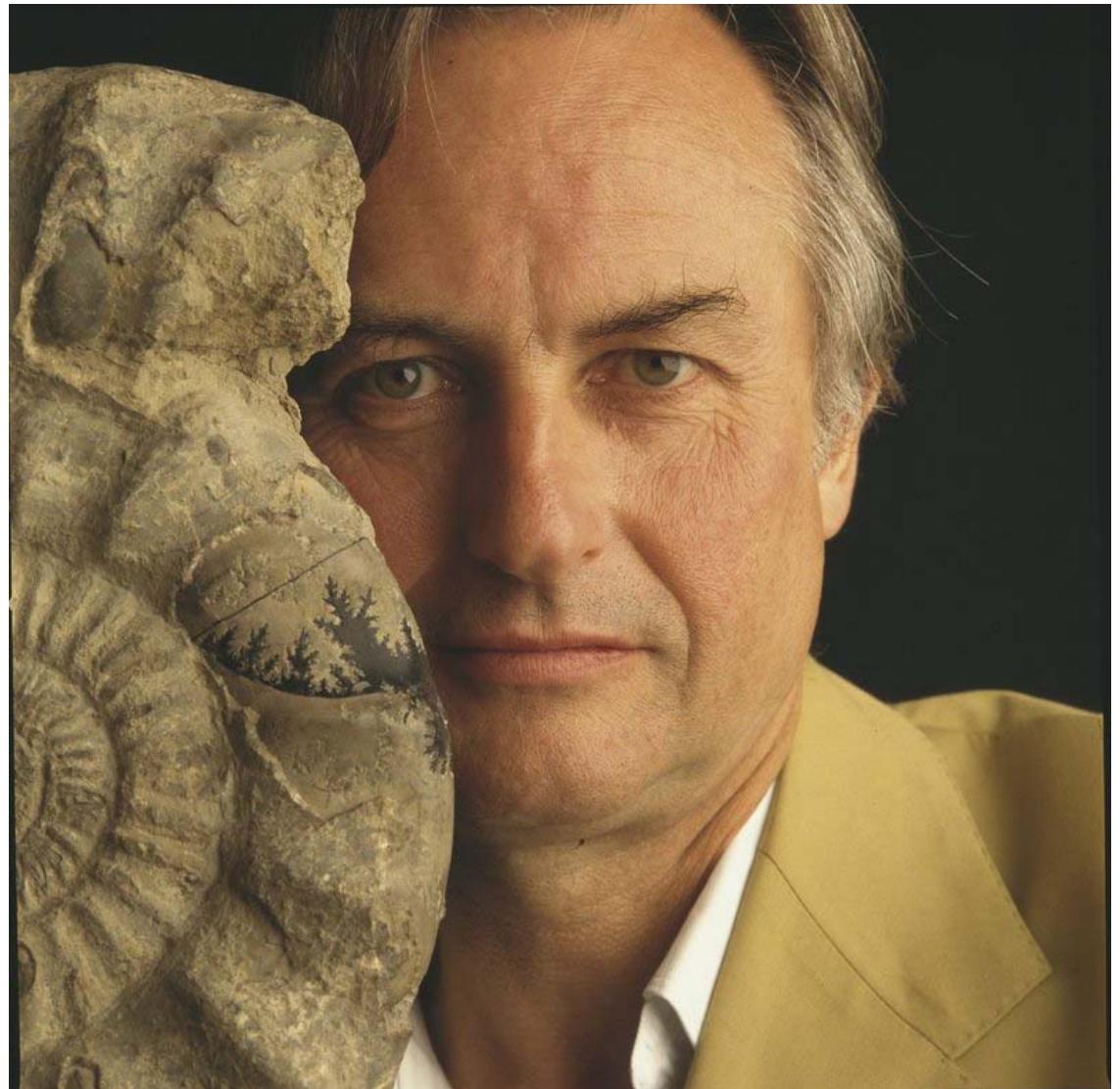
----- Coffee Break -----

- ❖ **Phylogenomics**

## *The Dawkins Delusion*

**“... there is, after all, one true tree of life [...]. It exists. It is in principle knowable. We don’t know it all yet. By 2050 we should – or if we do not, we shall have been defeated only at the terminal twigs, by the sheer number of species.”**

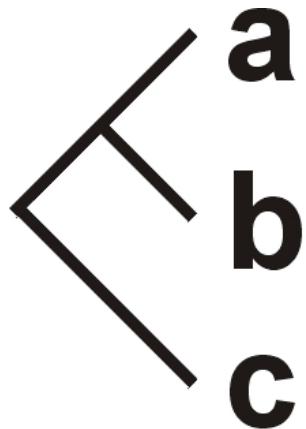
**Richard Dawkins**



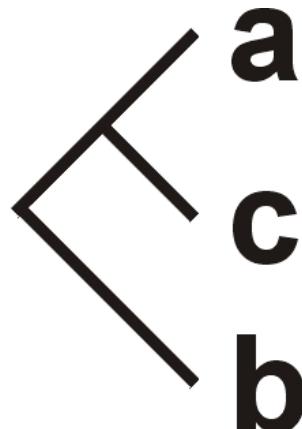
*Dawkins (2003), A Devil’s Chaplain*

# *The Problem of Incongruence*

Gene X

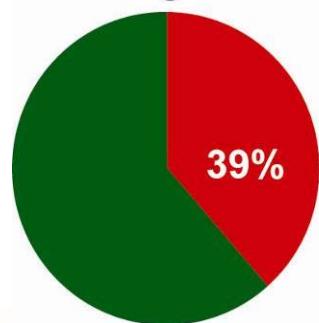


Gene Y

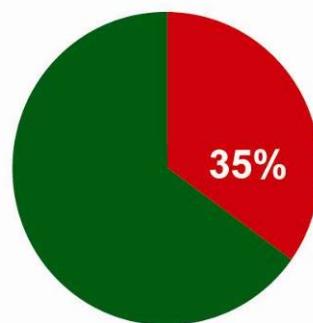


Species tree?

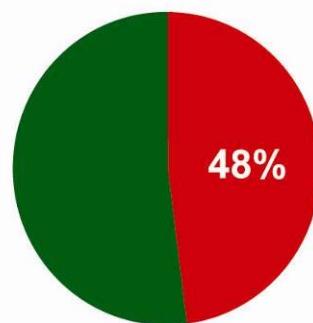
A: All organisms



B: Mammals



C: Insects



**Incongruence** is  
pervasive in the  
phylogenetics  
literature



# *A Systematic Evaluation of Single Gene Phylogenies*

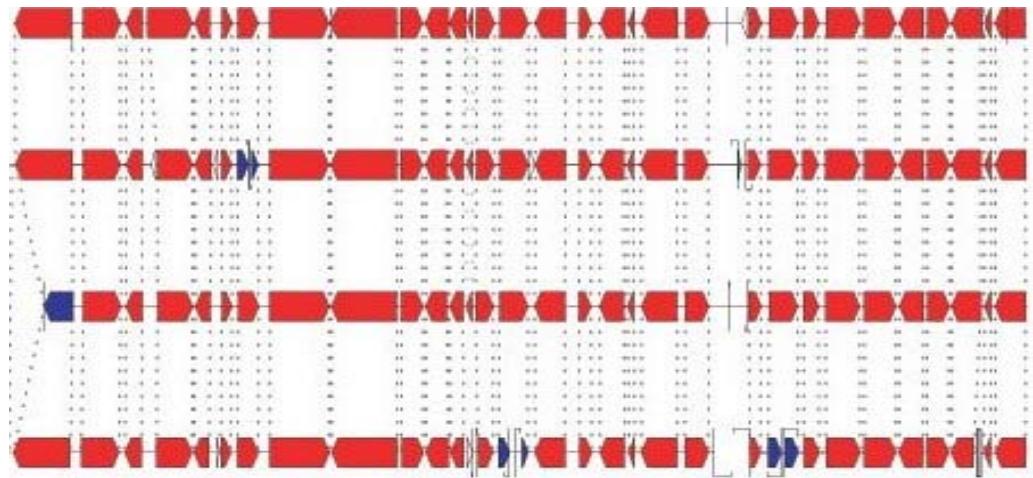


*S. cerevisiae*

*S. paradoxus*

*S. mikatae*

*S. bayanus*



Dataset: 106 genes on all 16 chromosomes totaling 127kb corresponding roughly to 1% of the genomic sequence, 2% of genes

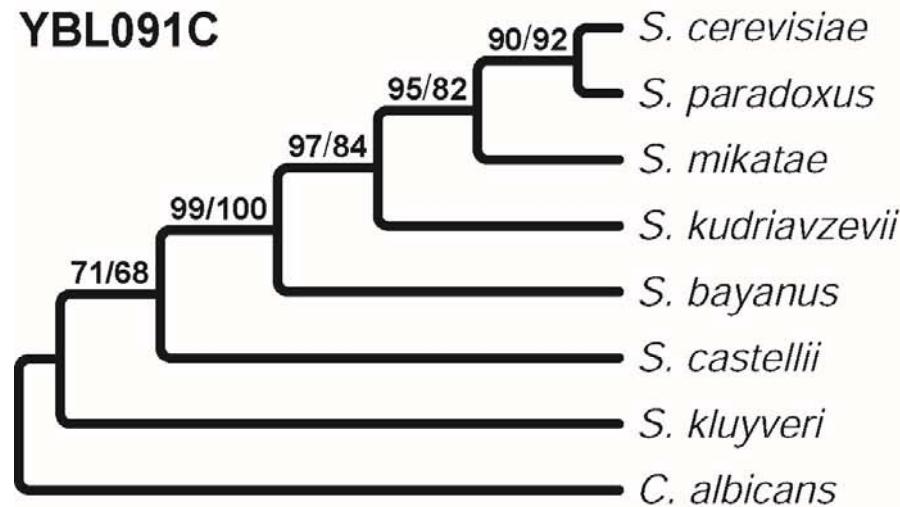
Analyses: Maximum Likelihood (ML) & Maximum Parsimony (MP) on nt data sets and MP on amino acid data sets



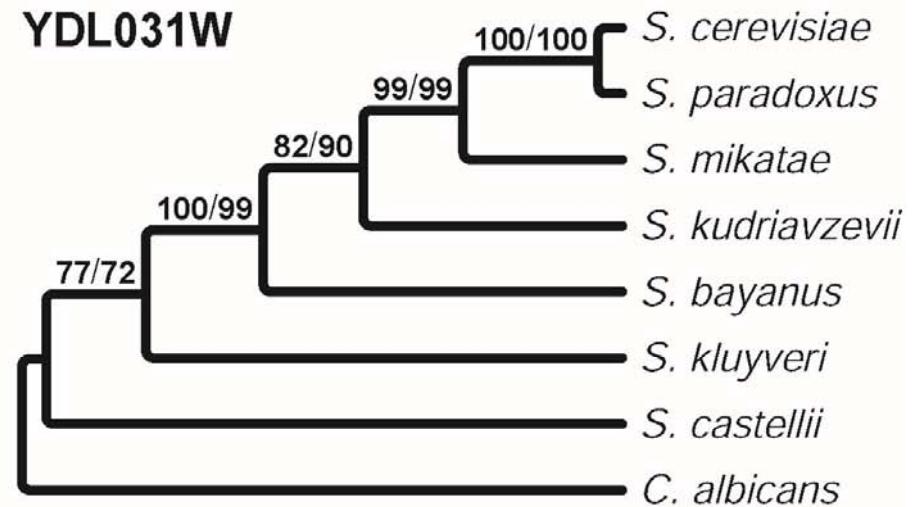
Kellis et al. (2003) Nature

# Incongruence at the Single Gene Level

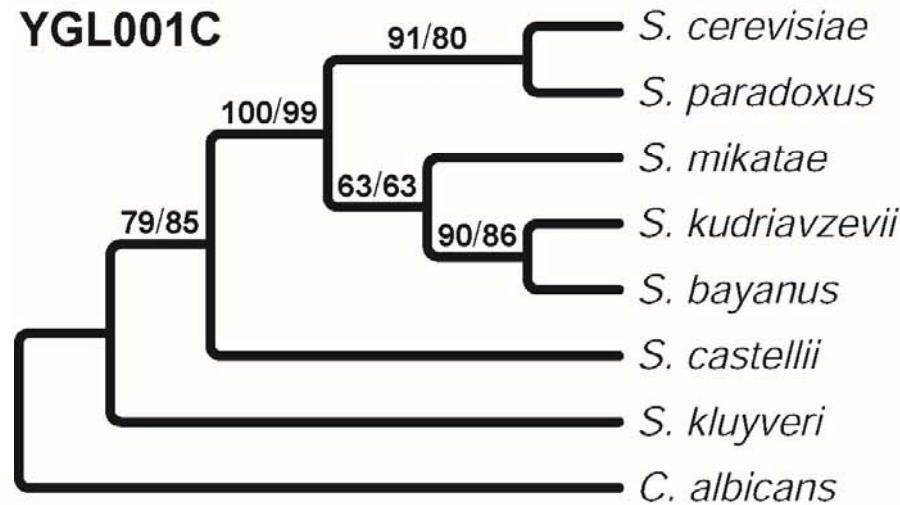
**YBL091C**



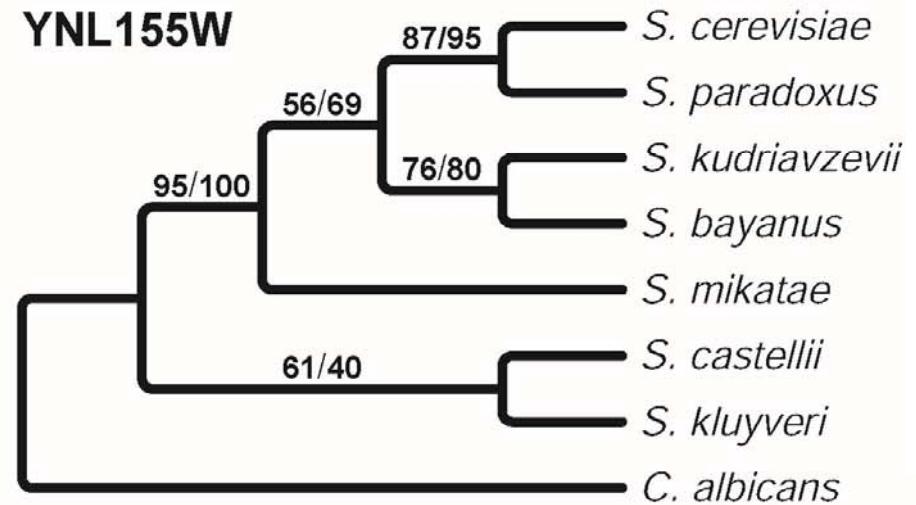
**YDL031W**



**YGL001C**



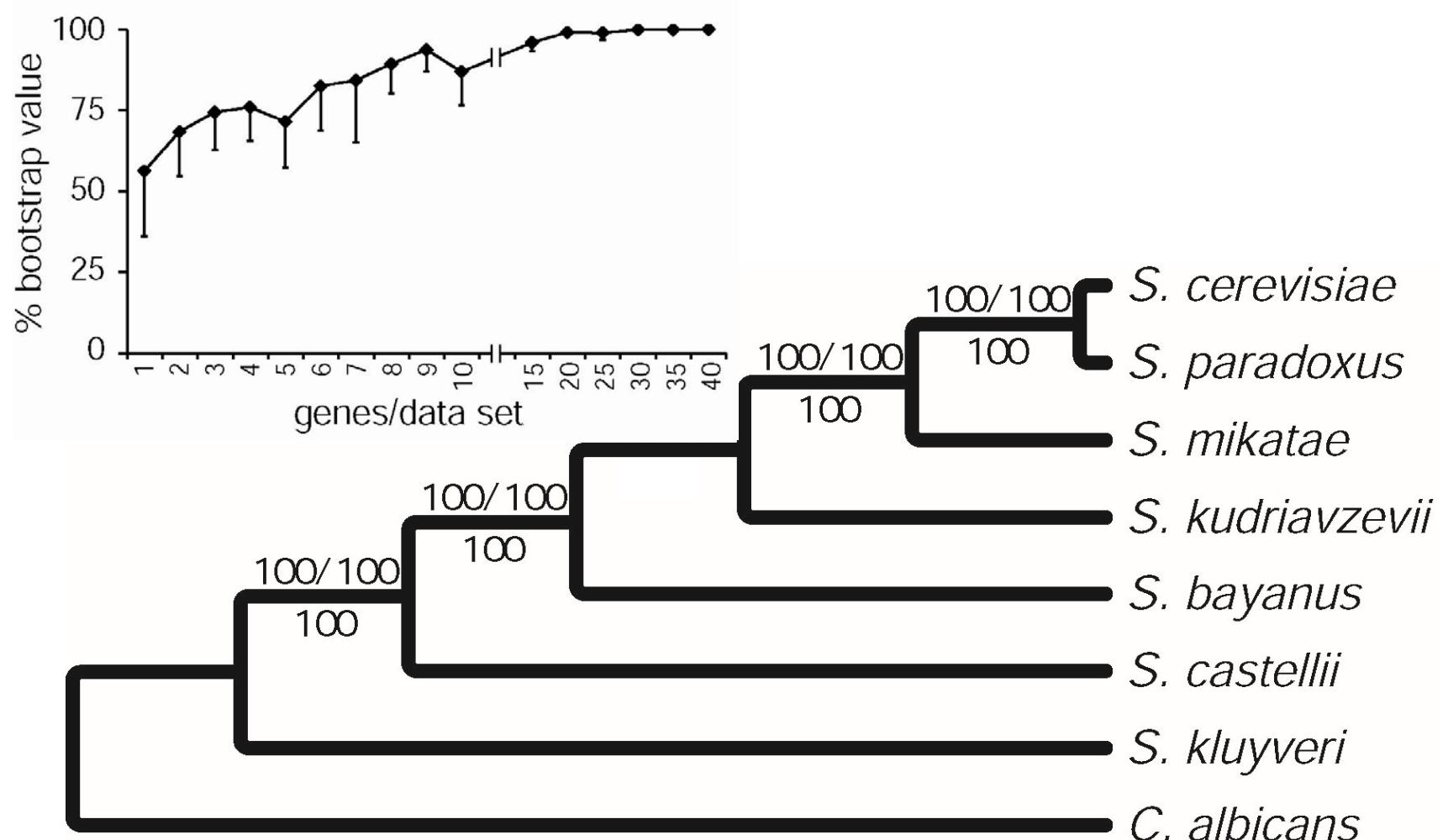
**YNL155W**



ML / MP

Rokas et al. (2003) Nature

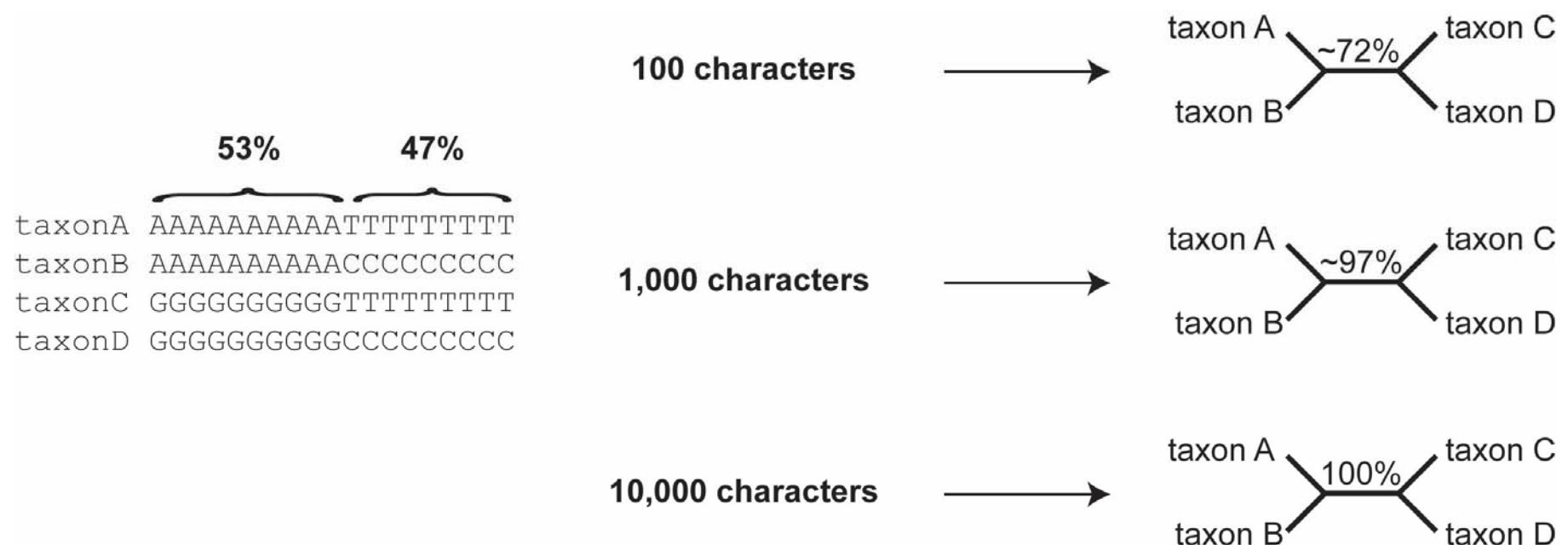
# Concatenation of 106 Genes Yields a Single Yeast Phylogeny



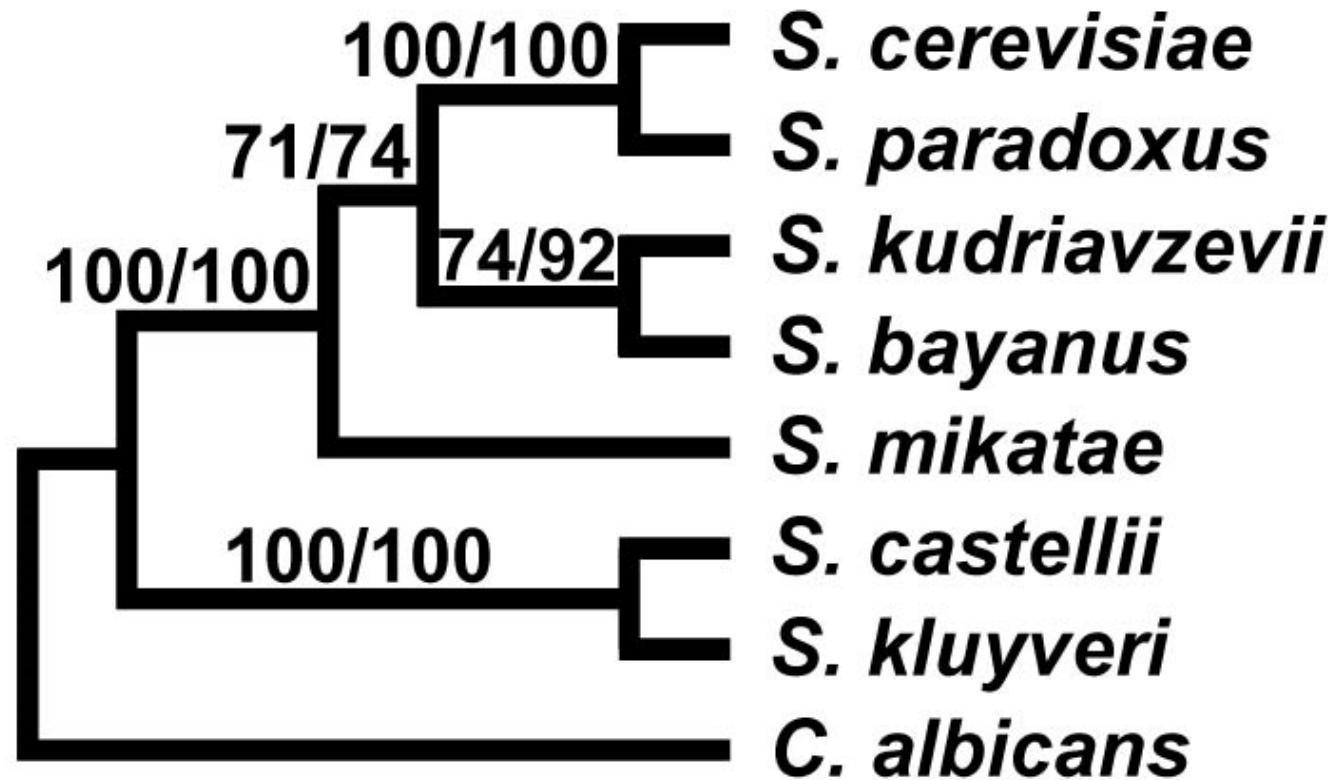
ML / MP on nt  
MP on aa

Rokas et al. (2003) Nature

# Bootstrap Support is Misleading When Used in Large Datasets

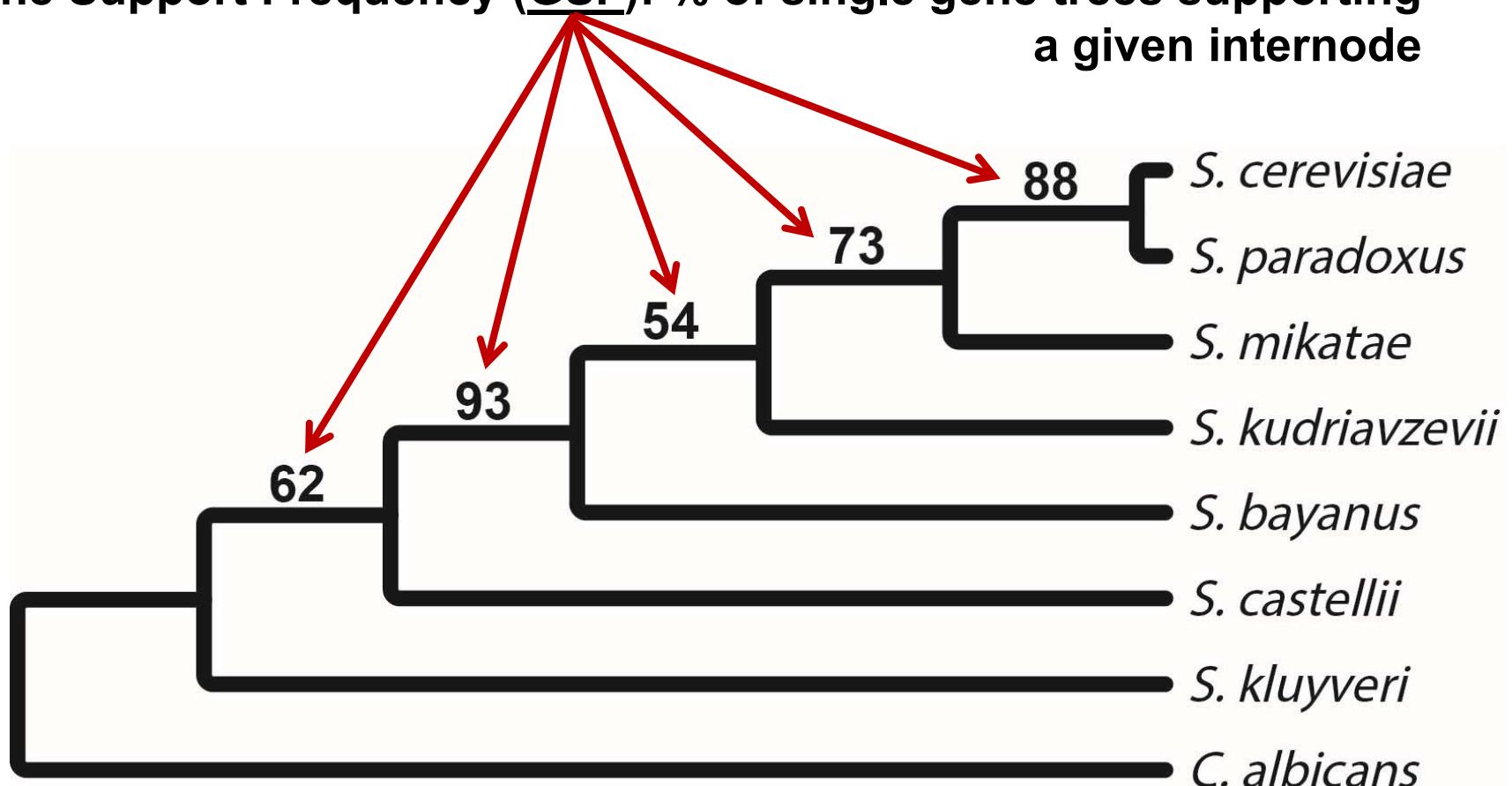


## *Bootstrap Support is Misleading When Used in Large Datasets*



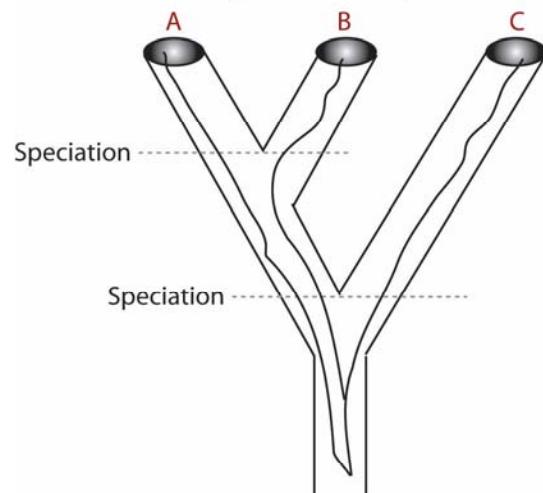
## The Majority of Single Genes Support the Concatenation Phylogeny

**Gene Support Frequency (GSF): % of single gene trees supporting a given internode**

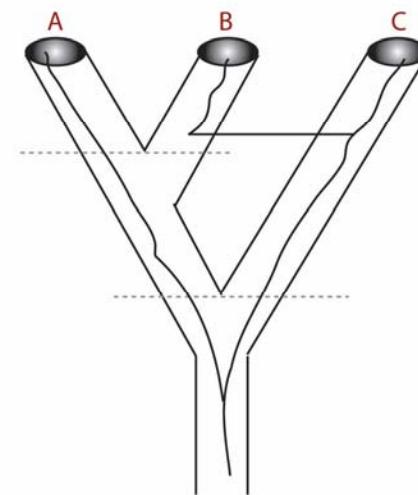


# *Gene Trees Can Differ from Species Trees*

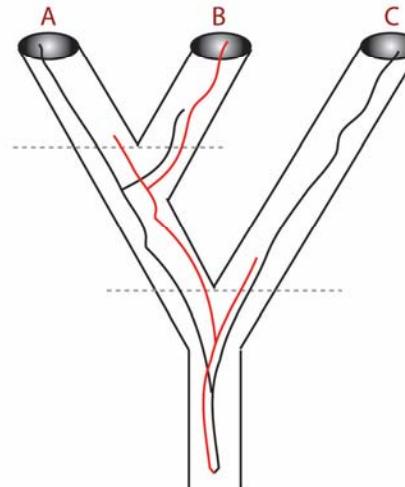
**Lineage Sorting**



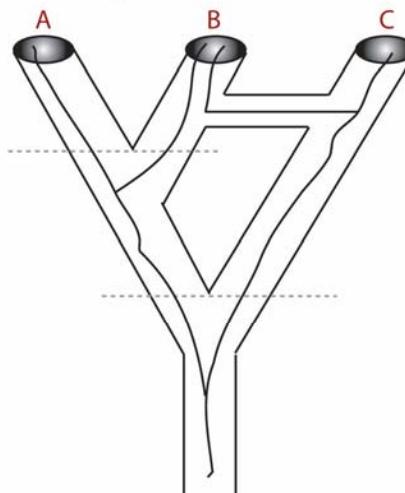
**Horizontal Gene Transfer**



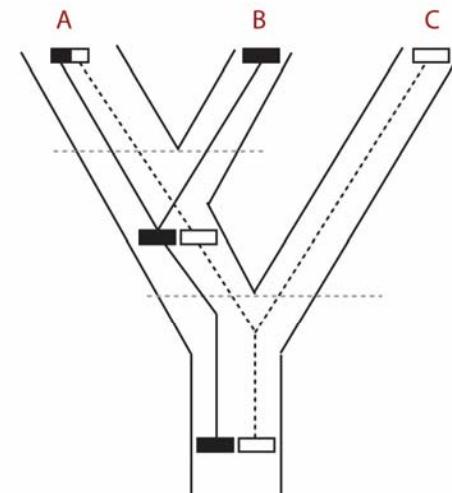
**Gene Duplication and Loss**



**Hybridization**

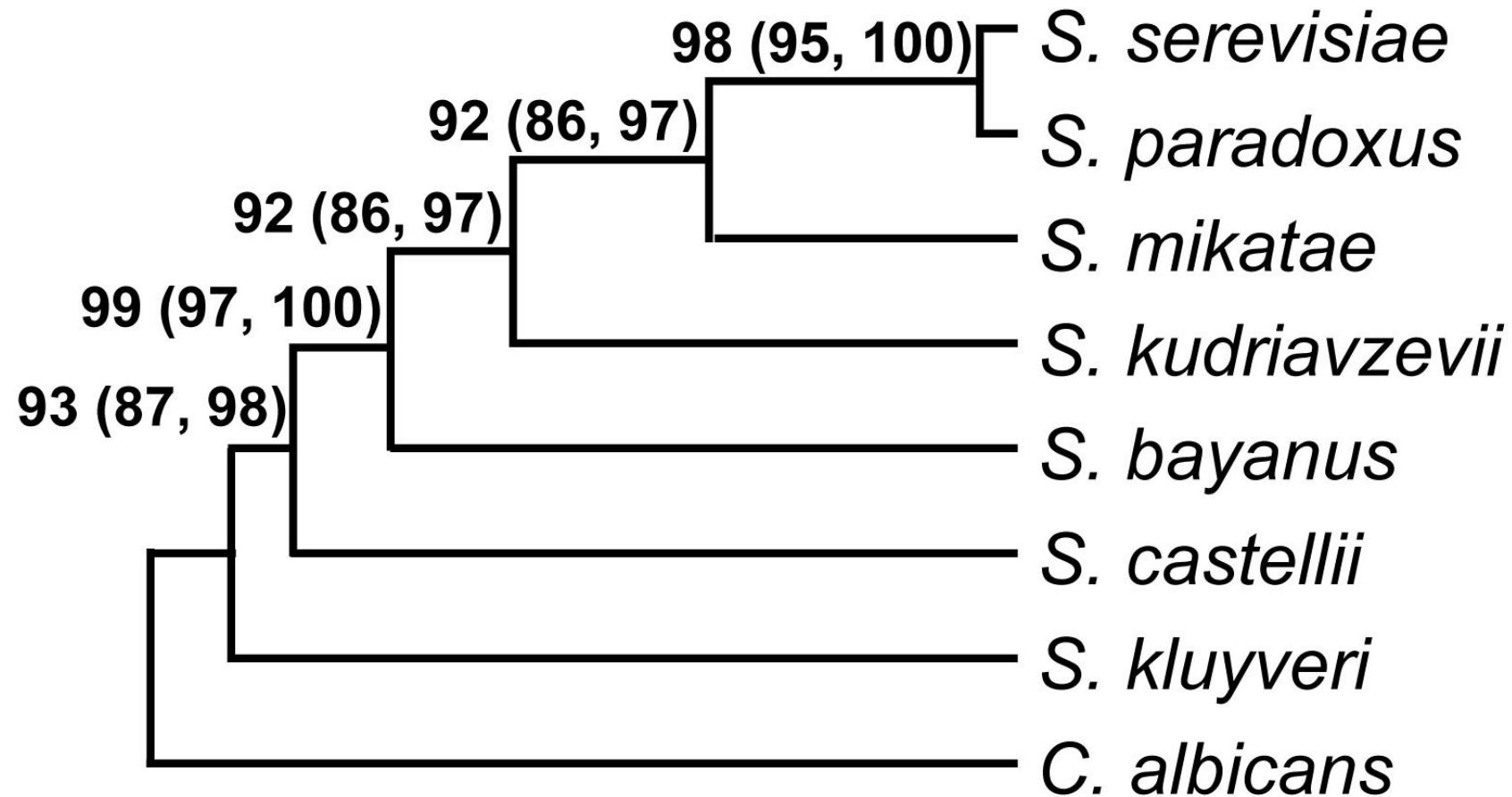


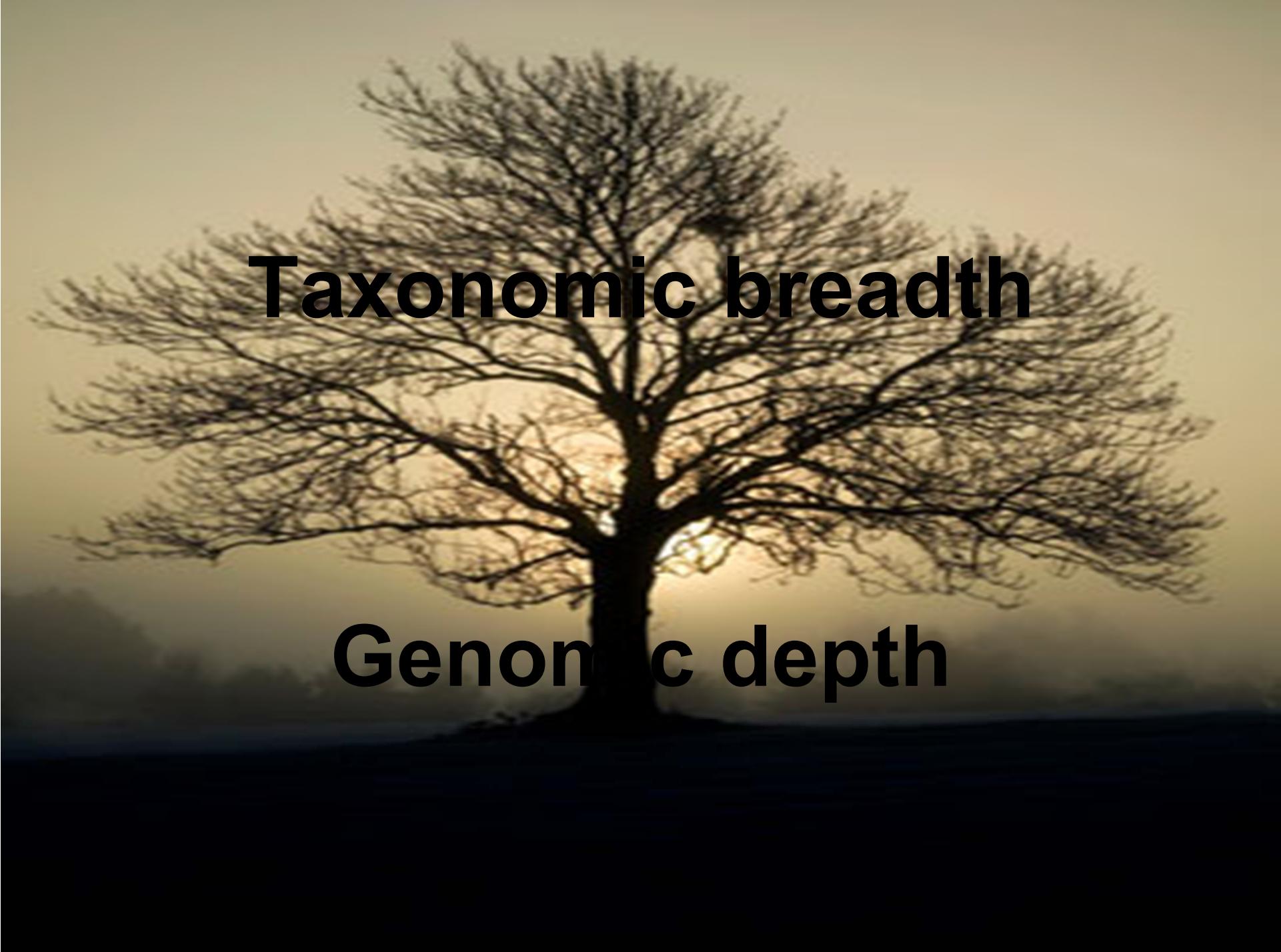
**Recombination**



# *Inferring the Species Phylogeny from Single Gene Histories*

**Concordance Factor:** The proportion of the genome for which a clade is true



A photograph of a bare tree with a complex, branching structure silhouetted against a warm, orange and yellow sunset or sunrise. The tree is centered in the frame, its branches reaching outwards. The background is a soft-focus landscape with hills or fields under the warm light.

**Taxonomic breadth**

**Genomic depth**



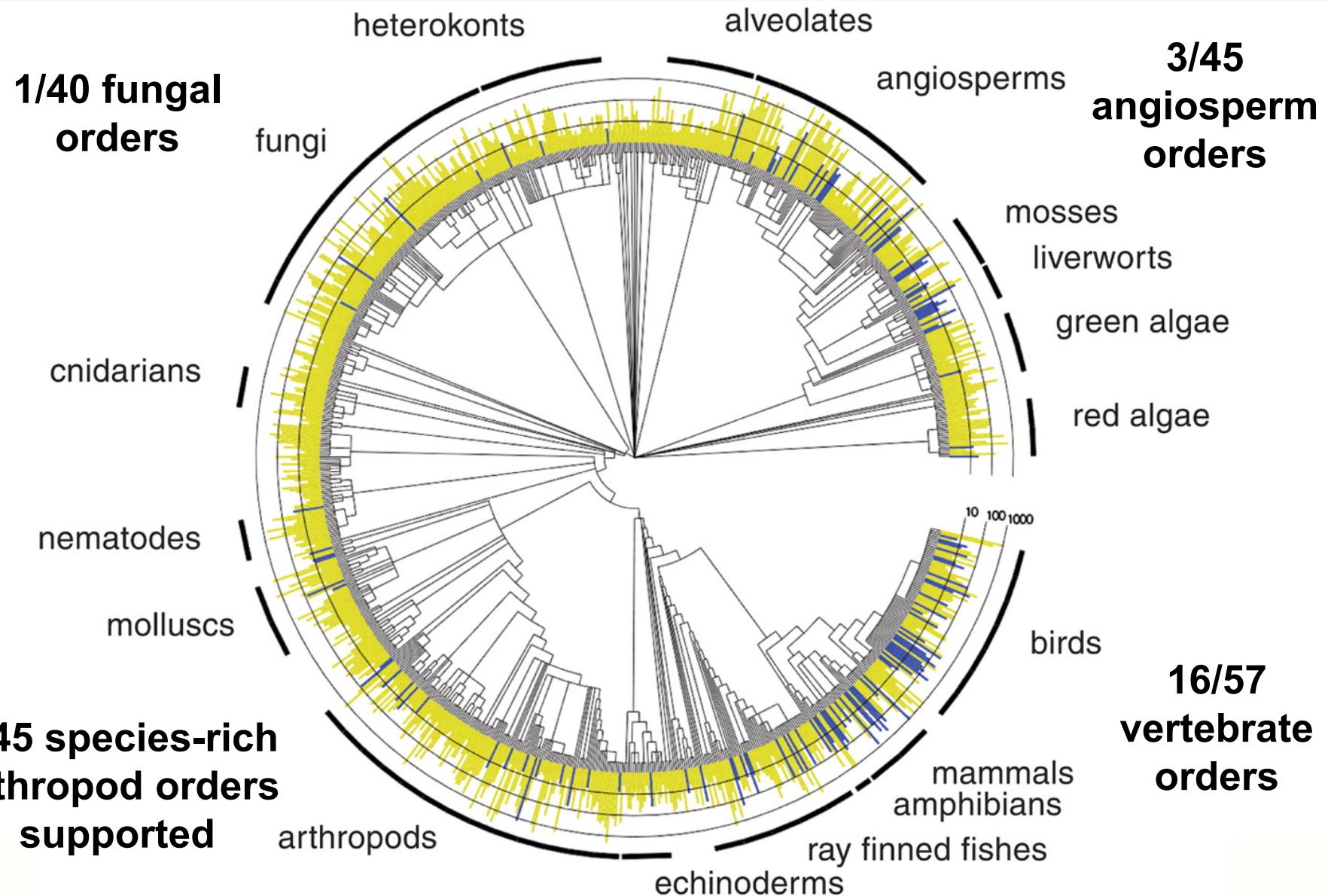
## *Estimating the Taxonomic Breadth of the Tree of Life*

**2002: Cracraft**  
“guess-timates”  
**that 0.4% of all 2**  
**million known**  
**species have been**  
**included in at least**  
**one published**  
**phylogeny**

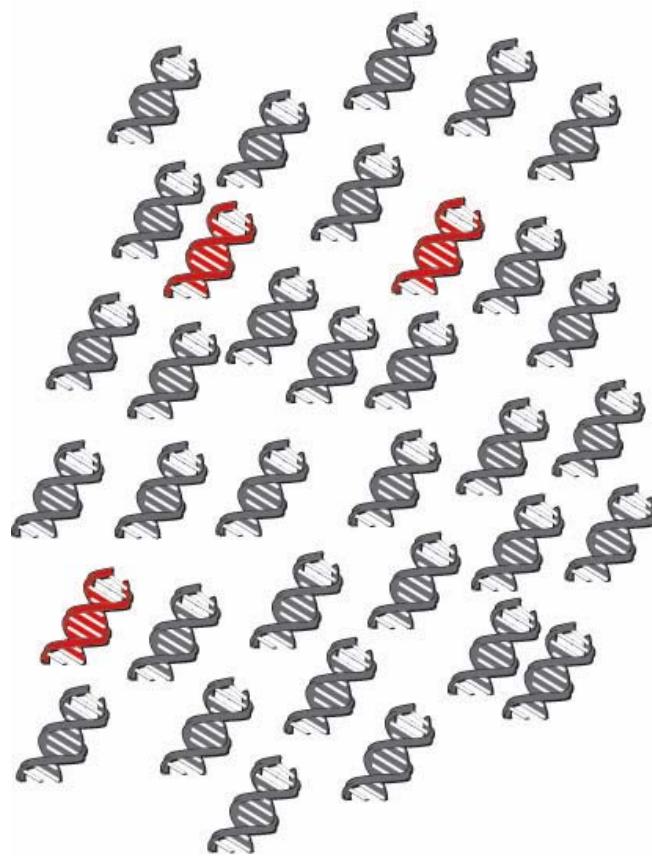
**2008: Sanderson**  
**reports that**  
**molecular**  
**sequence data**  
**have been sampled**  
**from 10% of all 2**  
**million known**  
**species**



# *The Genomic Depth of the Tree of Life*



# *Next-Gen Sequencing is Qualitative and Quantitative*



**NGSTs**  
Each DNA template  
is sequenced directly

**Capillary Sequencing**  
All DNA templates are sequenced  
together to create a single  
consensus sequence

Grey transcript  
Grey transcript  
Grey transcript  
Grey transcript  
**Red transcript**  
Grey transcript  
Grey transcript  
Grey transcript  
Grey transcript  
**Red transcript**  
Grey transcript  
Grey transcript  
**Red transcript**  
Grey transcript  
Grey transcript

Grey transcript

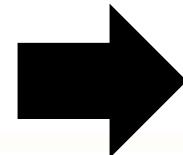


## *Can we Use RNA-Seq to Increase Genomic Depth?*

Species	Stock No.	Collection Location
<i>Anopheles albimanus (Nyssorhynchus)</i>	MRA-126	El Salvador
<i>Anopheles arabiensis (Cellia)</i>	MRA-339	Zimbabwe
<i>Anopheles dirus (Cellia)</i>	MRA-700	Thailand
<i>Anopheles farauti (Cellia)</i>	MRA-489	Papua New Guinea
<i>Anopheles freeborni (Anopheles)</i>	MRA-130	USA
<i>Anopheles gambiae (Cellia)</i>	MRA-765	Liberia
<i>Anopheles quadriannulatus (Cellia)</i>	MRA-761	South Africa
<i>Anopheles quadrimaculatus (Anopheles)</i>	MRA-139	USA
<i>Anopheles stephensi (Cellia)</i>	MRA-128	India
<i>Aedes aegypti (Stegomyia)</i>	MRA-735	West Africa

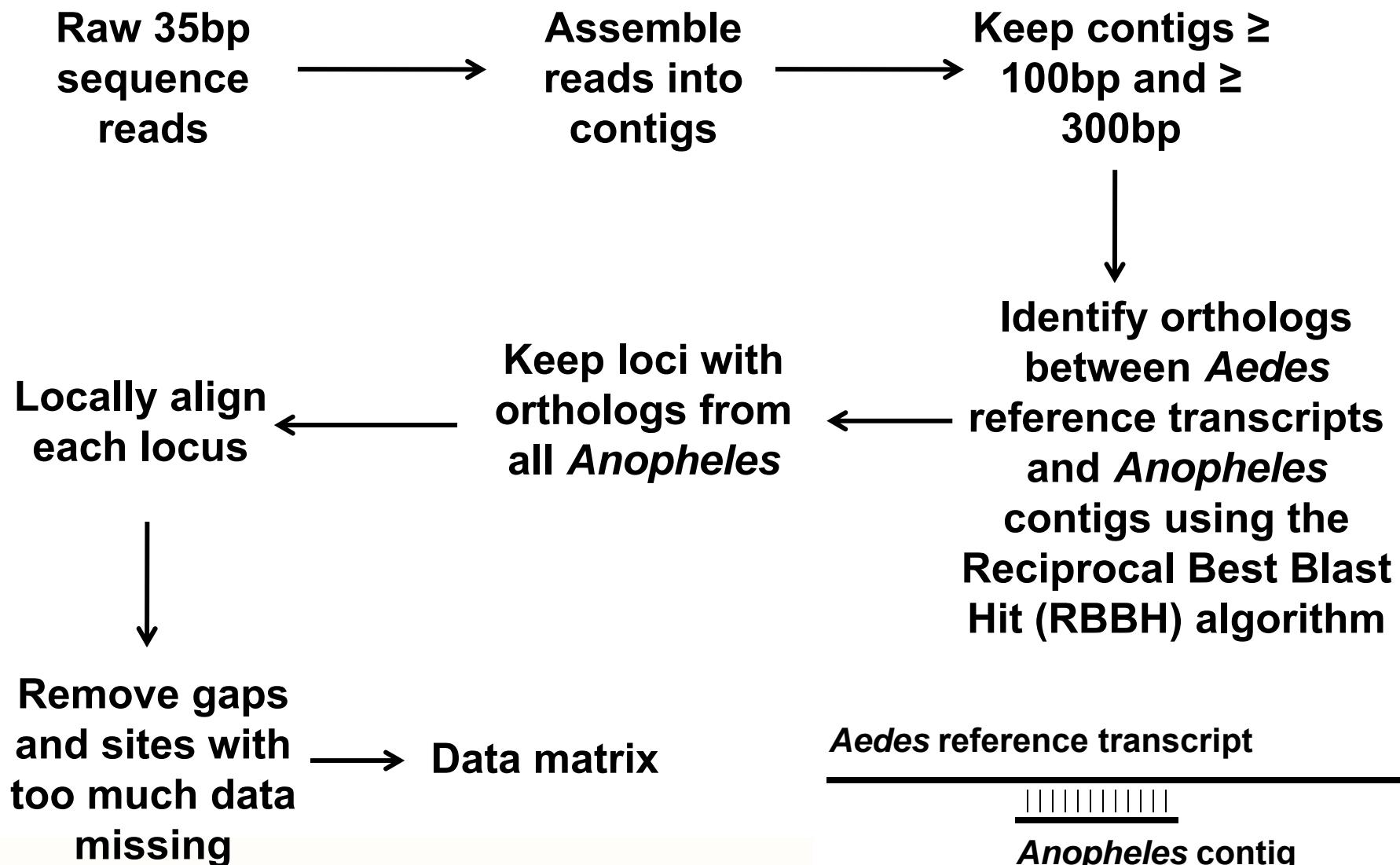


Illumina  
RNA-Seq



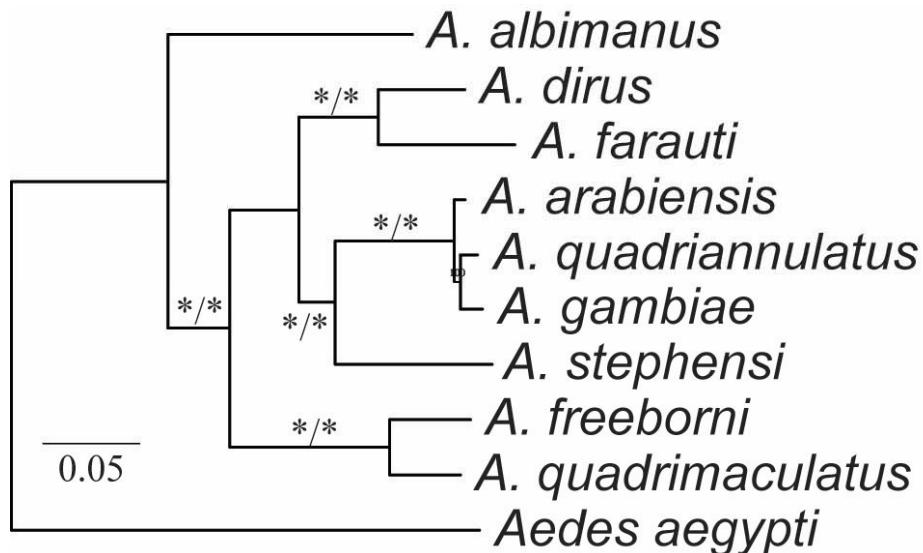
~150,000,000 reads  
5,250,000,000 bp

# Data Matrix Construction: The “Singlecontig” Strategy



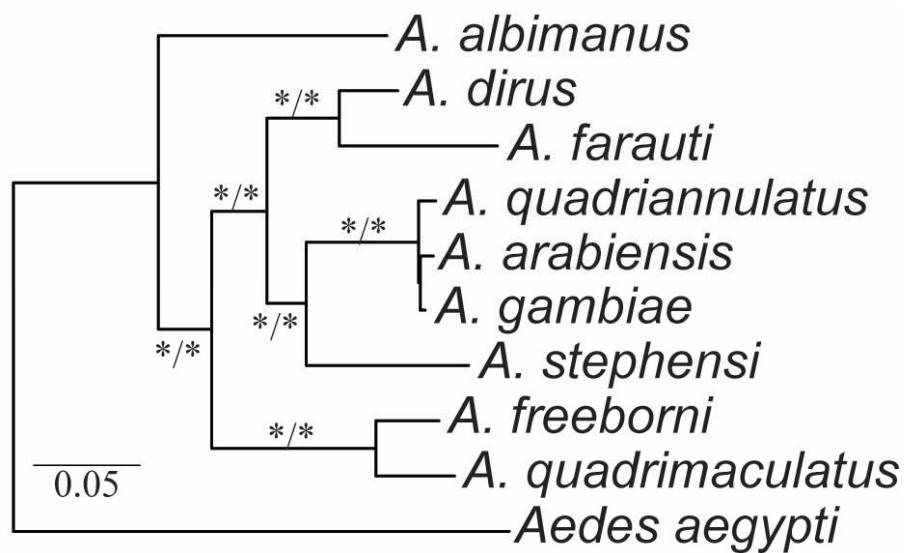
# Robust Phylogenetic Inference from RNA-Seq Data

## Using $\geq 100\text{bp}$ contigs



# Loci = 553  
Aln Length = ~390 Kb  
% Missing data = 51

## Using $\geq 300\text{bp}$ contigs

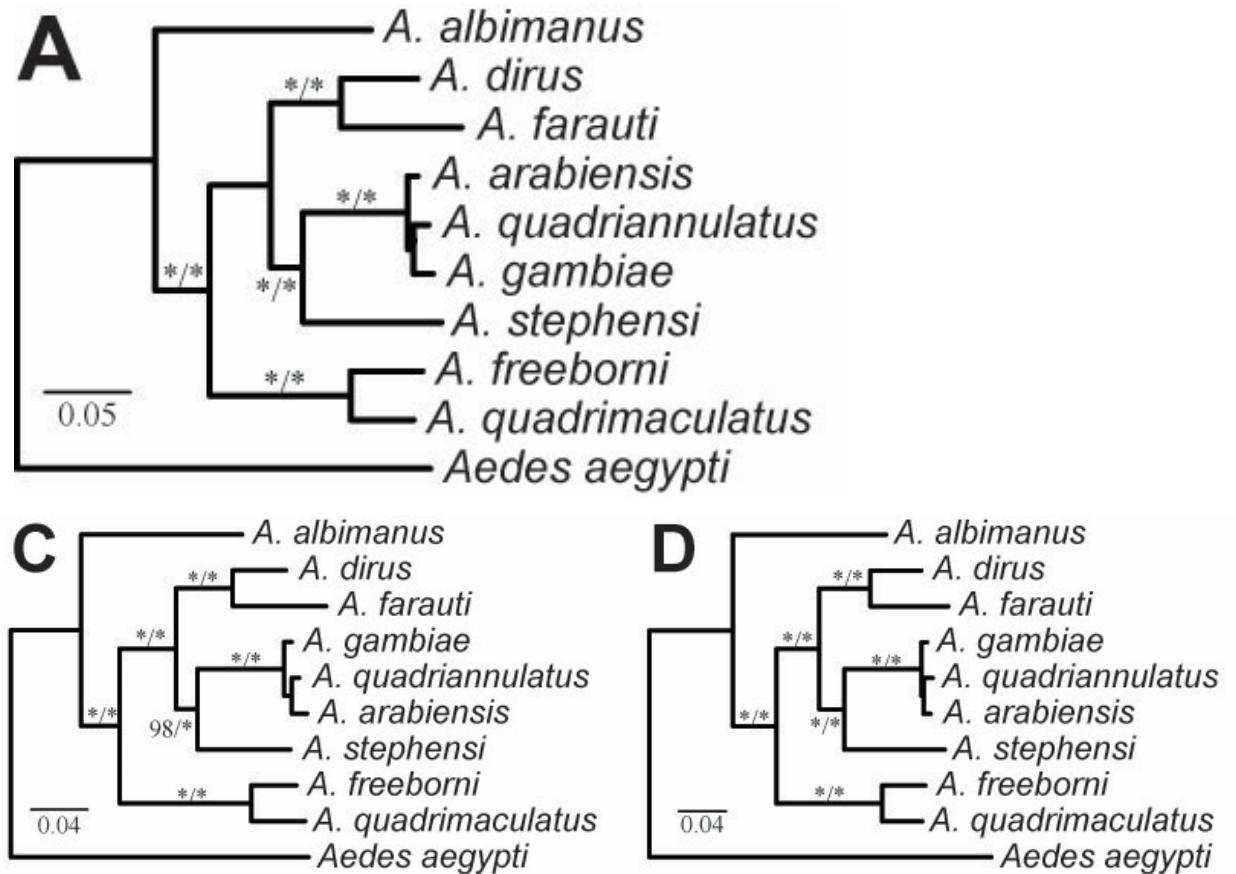


# Loci = 69  
Aln Length = ~73 Kb  
% Missing data = 44



# *Accurate Phylogenetic Inference From our Data*

**553 loci**  
**AIn L: ~390 Kb**  
**Missing data: 51%**



Exclude erroneous loci  
491 loci  
AIn L: ~329 Kb  
Missing data: 50%

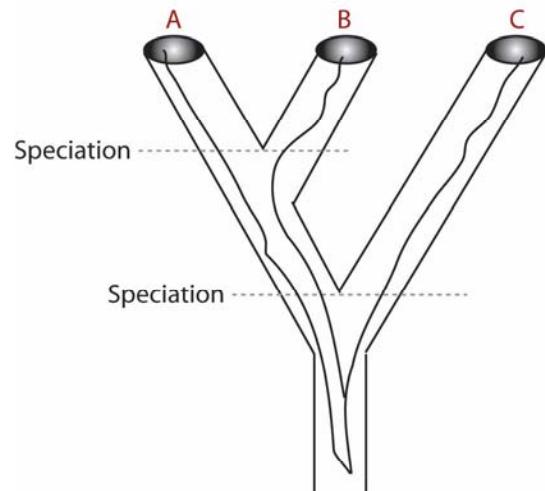
Use only sites without data missing  
AIn L: ~15 Kb  
Missing data: 0%

Use A. gambiae as ref.  
634 loci  
AIn L: ~472 Kb  
Missing data: 50%

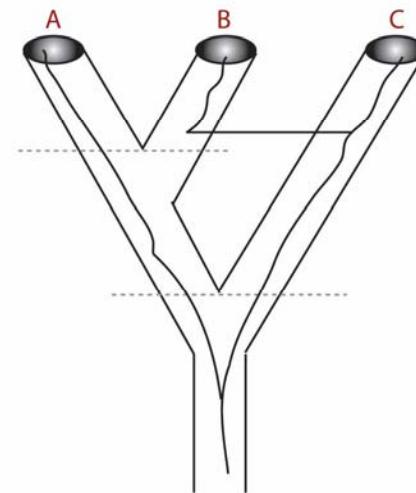


# *Gene Trees Can Differ from Species Trees*

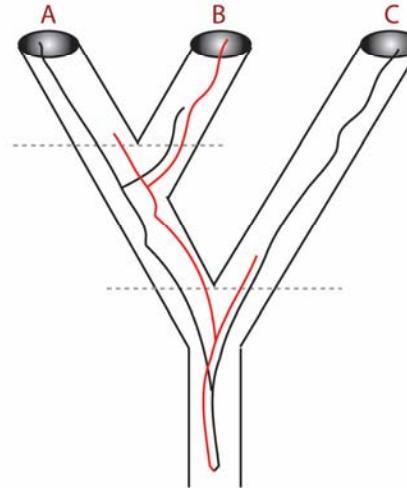
**Lineage Sorting**



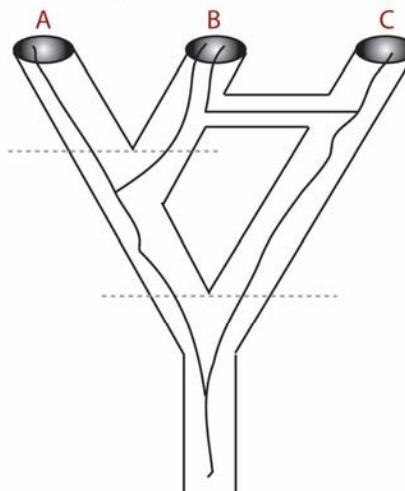
**Horizontal Gene Transfer**



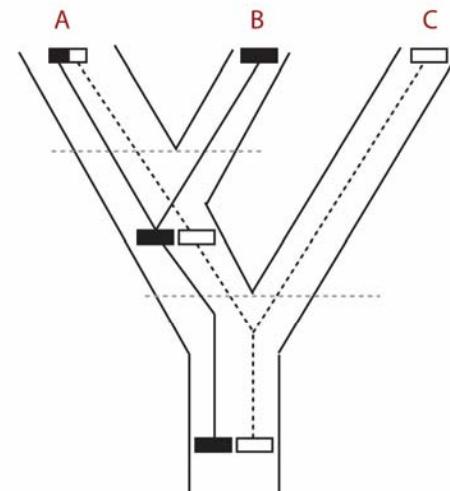
**Gene Duplication and Loss**



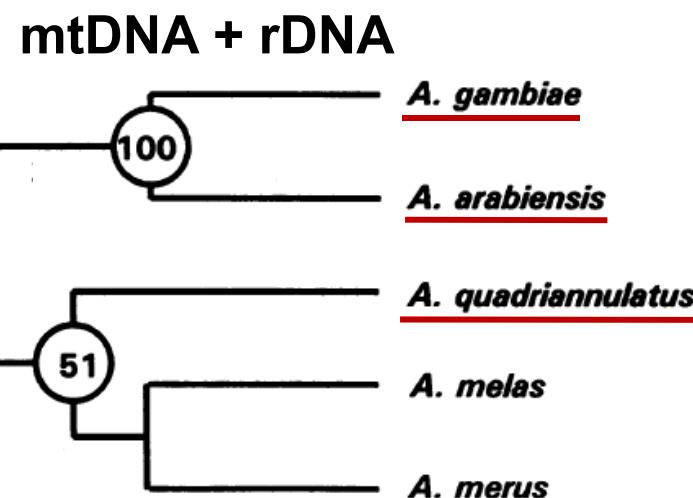
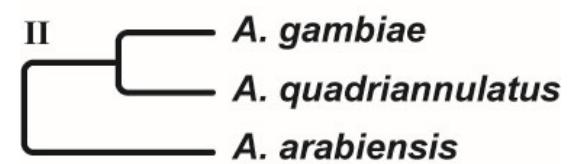
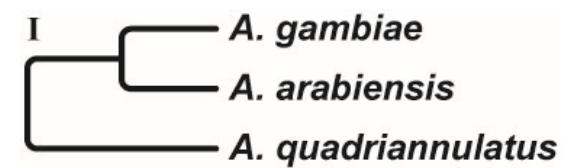
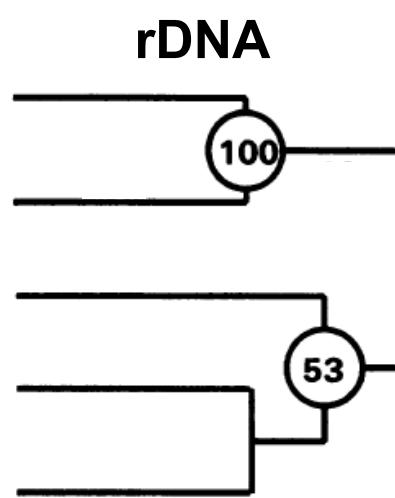
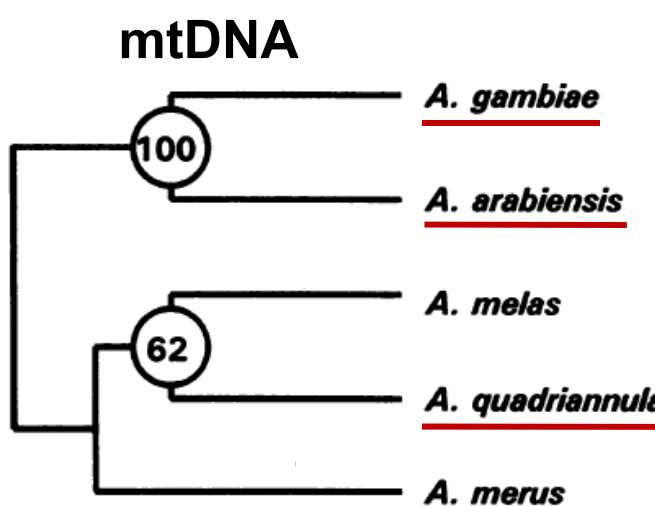
**Hybridization**



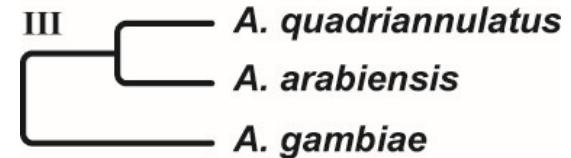
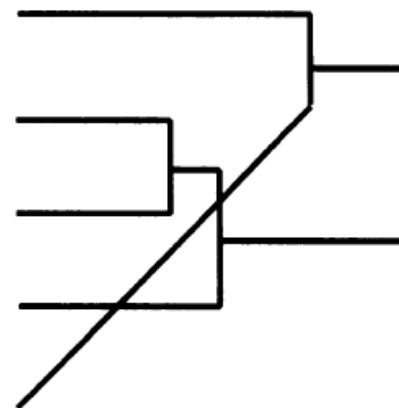
**Recombination**



# Our Data Matrices Can Detect Population-Level Events



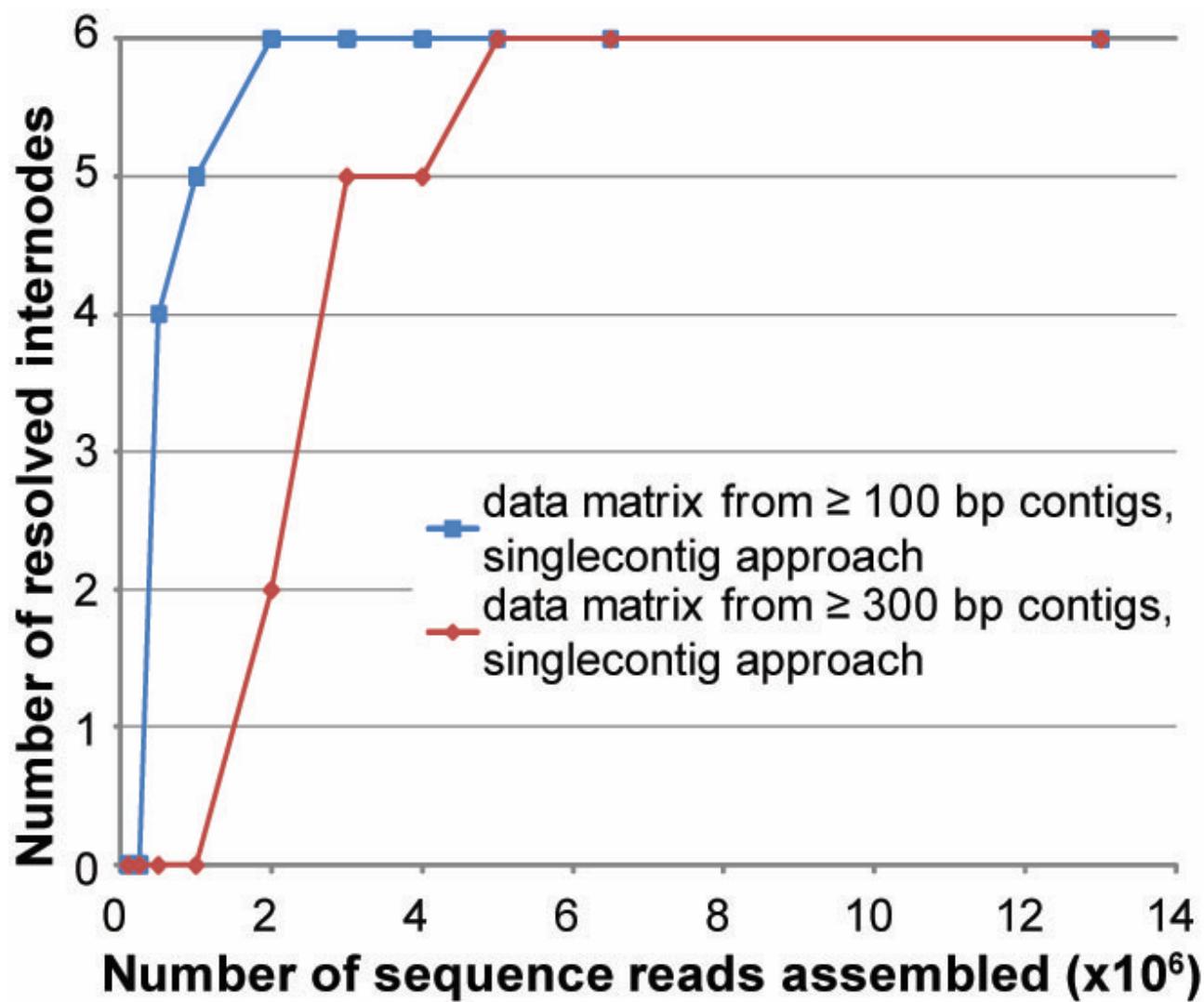
**inversions**



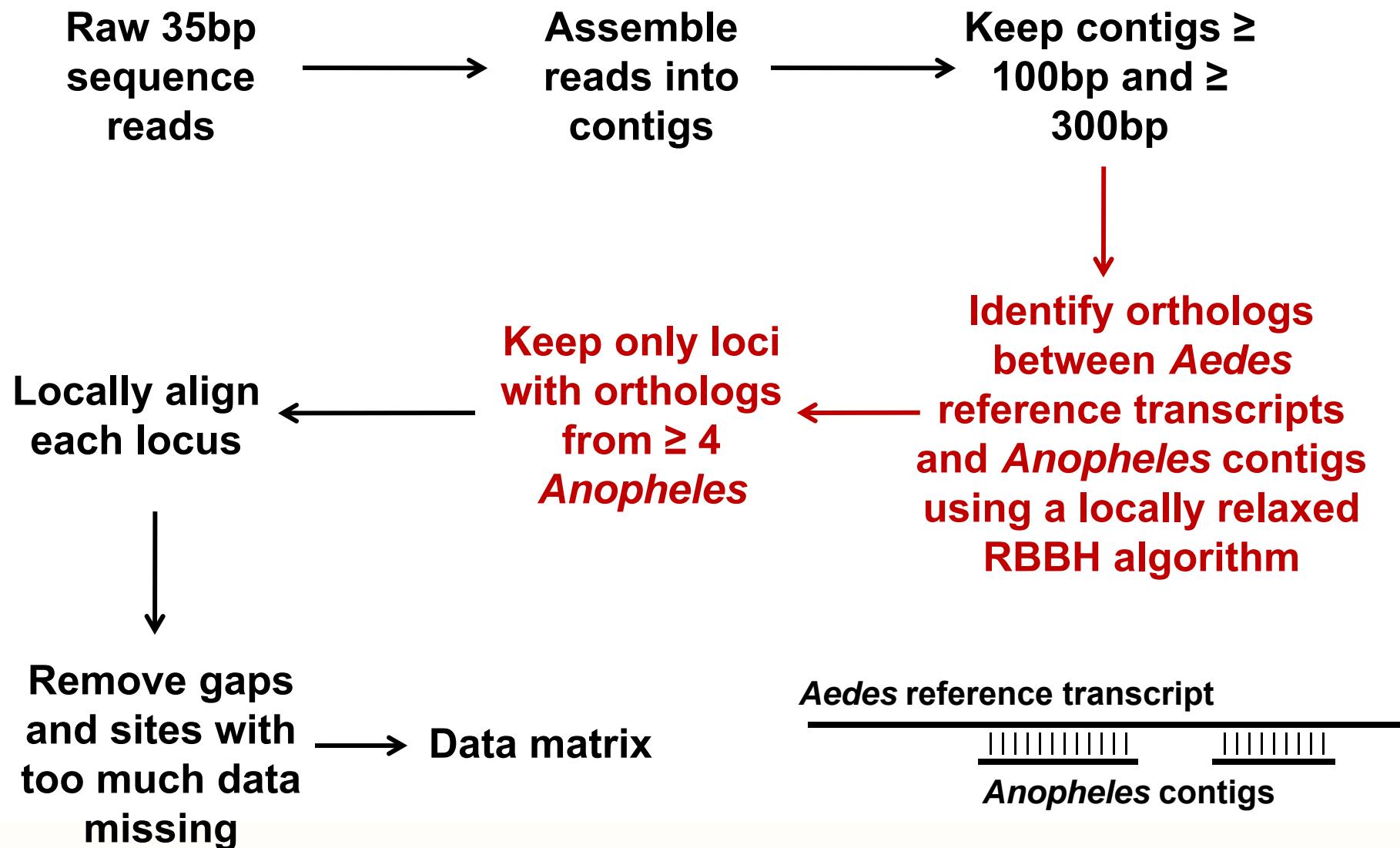
Besansky et al. (1994) PNAS

Hittinger et al. (2010) PNAS

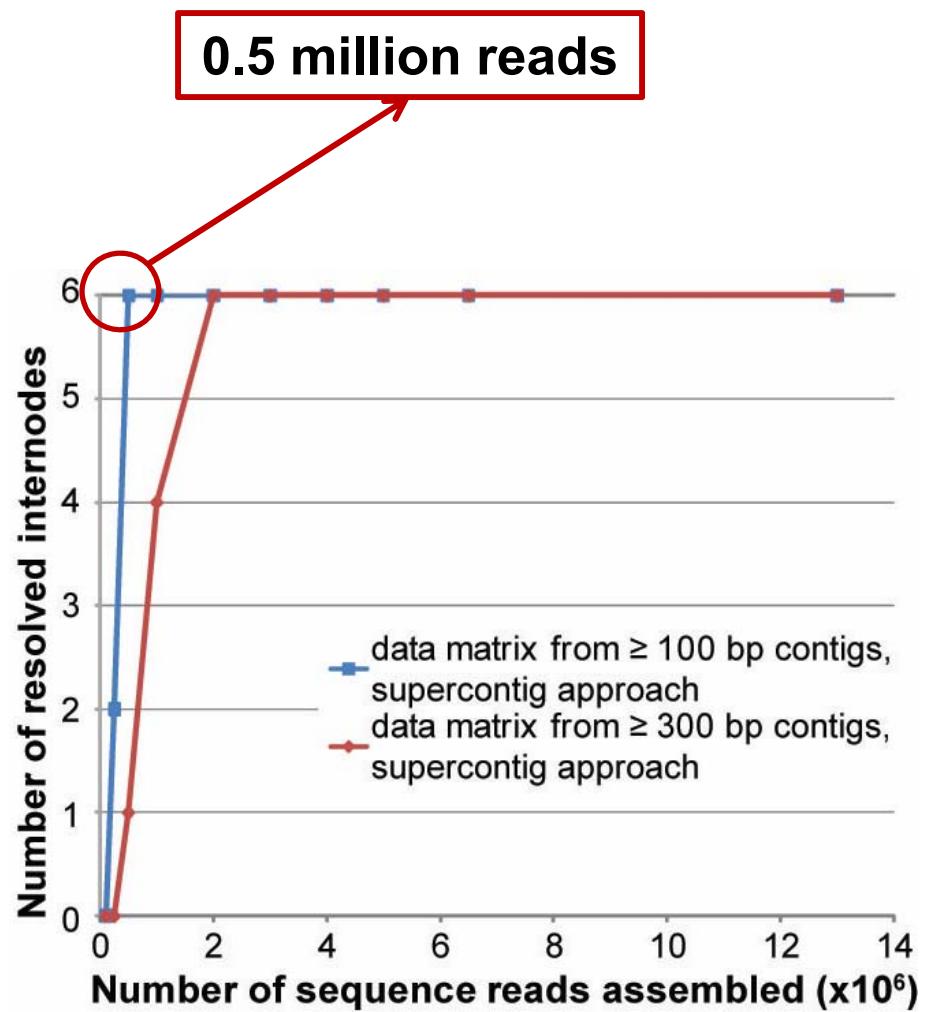
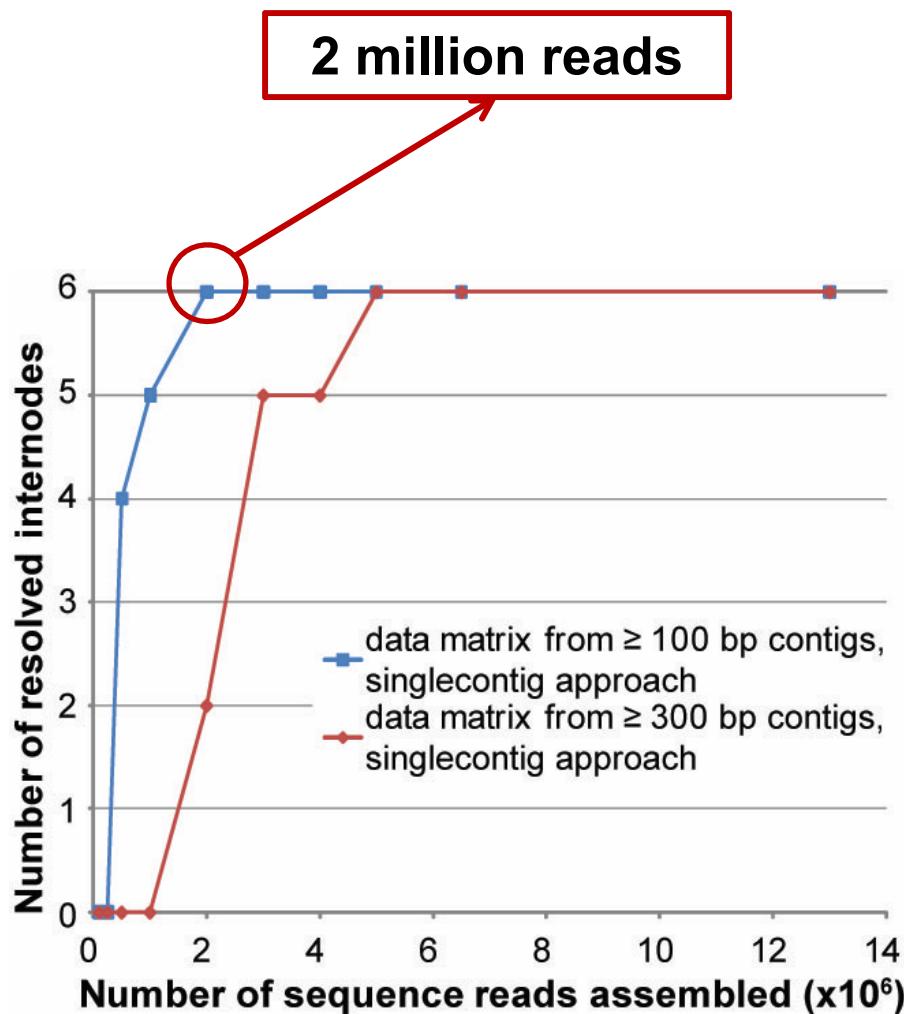
# *Robust Phylogenetic Inference From Few Sequence Reads*



# Experimental Design: The “Supercontig” Strategy



# *Robust Phylogenetic Inference From Very Few Reads*



553 loci, AlnL: ~390Kb, %miss: 51

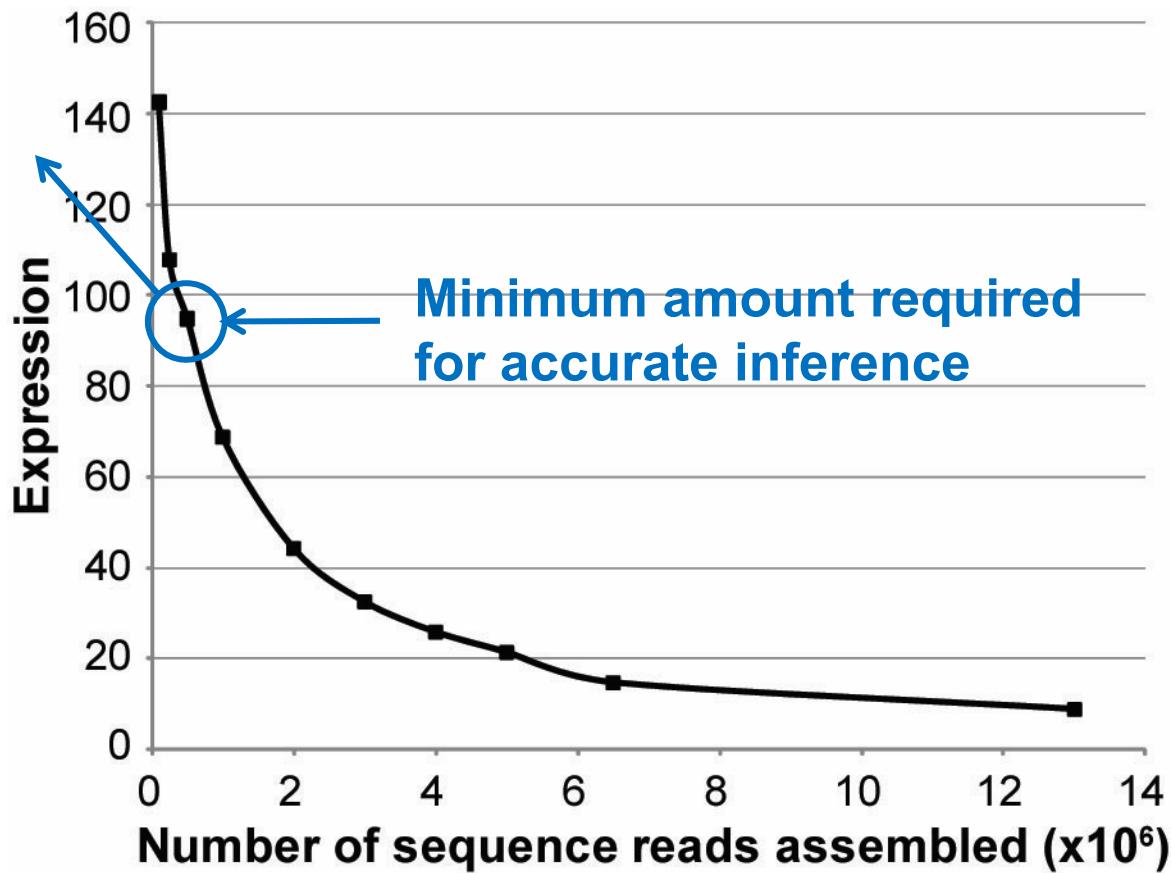
2,661 loci, AlnL: ~971Kb, %miss: 62



Hittinger et al. (2010) PNAS

## *Our Sequences are from Highly-Expressed Transcripts*

2008 cost: ~\$50  
2014 cost: < \$5



# The Phylogenomics Era – “Resolving” the Tree of Life

*Syst. Biol.* 61(1):150–164, 2012

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DOI:10.1093/sysbio/syr089

Advance Access publication on September 7, 2011

LETT  
LETT

## Phylogenomic Analysis Resolves the Interordinal Relationships and Rapid Diversification of the Laurasiatherian Mammals

XUMING ZHOU, SHIXIA XU, JUNXIAO XU, BINGYAO CHEN, KAIYA ZHOU, AND GUANG YANG\*

Jiangsu Key Laboratory for Biodiversity and Biotechnology, College of Life Sciences, Nanjing Normal University, Nanjing 210046, China;

\*Correspondence to be sent to: Jiangsu Key Laboratory for Biodiversity and Biotechnology, College of Life Sciences, Nanjing Normal University, Nanjing 210046, China; E-mail: gyang@njnu.edu.cn.

## Resolving the evolutionary relationships of molluscs with phylogenomic tools

nature

Stephen A. Smith<sup>1,2</sup>, Nerida G. Wilson<sup>3,4</sup>, Freya Gonzalo Giribet<sup>5</sup> & Casey W. Dunn<sup>1</sup>

*Syst. Biol.* 57(6):920–938, 2008  
Copyright © Society of Systematic Biologists  
ISSN: 1063-5157 print / 1076-836X online  
DOI: 10.1080/10635150802570791

## Toward Resolving the Tree: The Phylogeny of Jakobids and Cercozooans

An

## Toward Resolving Priors

## Towards

Samuli Lehtonen

Department of Biology, U

## Resolving Arthropod Phylogeny: Exploring Phylogenetic Signal within 41 kb of Protein-Coding Nuclear Gene Sequence

JEROME C. REGIER,<sup>1</sup> JEFFREY W. SHULTZ,<sup>2</sup> AUSTEN R. D. GANLEY,<sup>3,6</sup> APRIL HUSSEY,<sup>1</sup> DIANE SHI,<sup>1</sup> BERNARD BALL,<sup>3</sup> ANDREAS ZWICK,<sup>1</sup> JASON E. STAJICH,<sup>3,7</sup> MICHAEL P. CUMMINGS,<sup>4</sup> JOEL W. MARTIN,<sup>5</sup> AND CLIFFORD W. CUNNINGHAM<sup>3</sup>

Yeast

## Prion-Like Proteins in the Fungal Kingdom

Edgar M. Medina · Gary W. Jones ·  
David A. Fitzpatrick

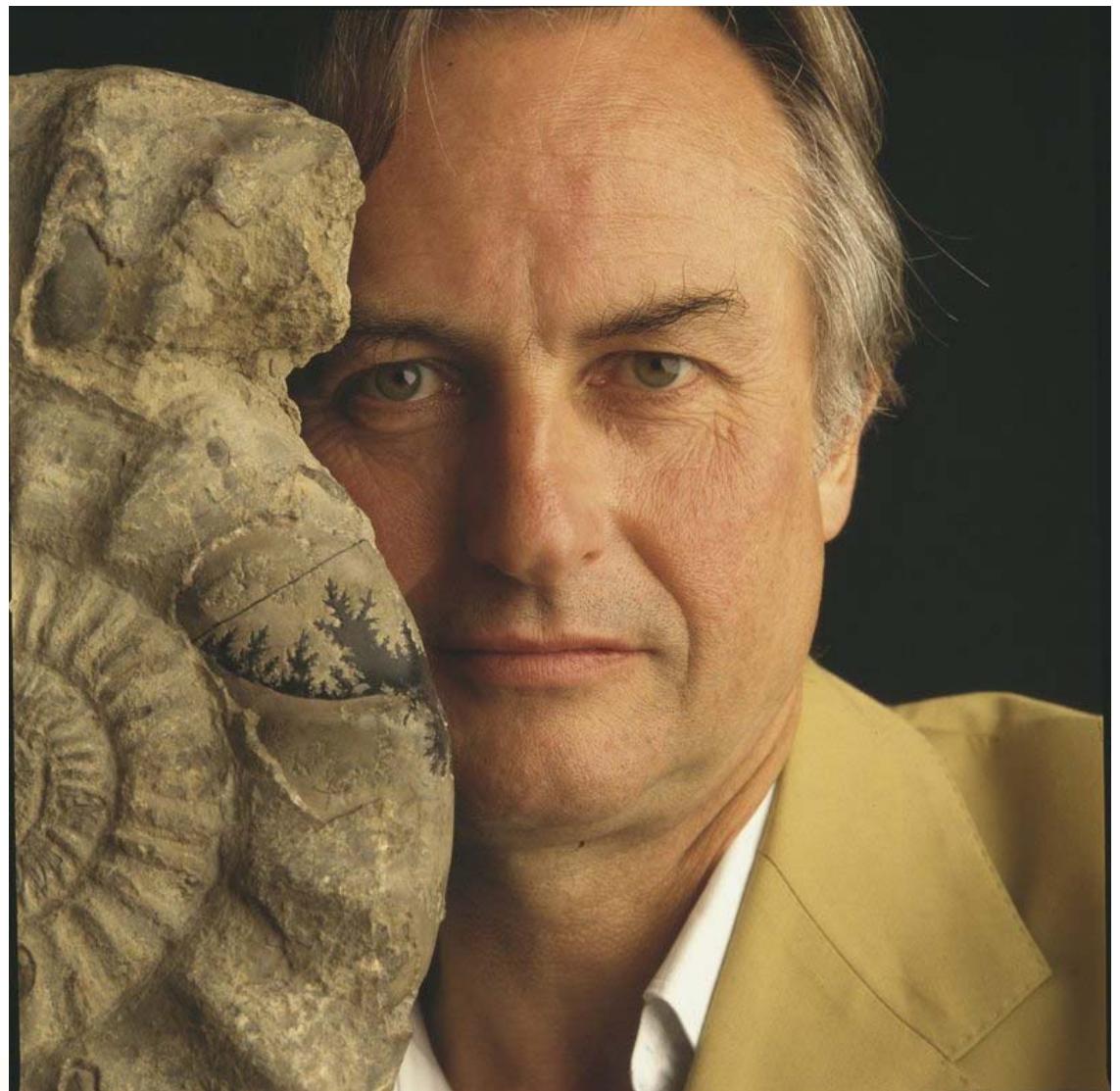
Renae C. Pratt,\* Gillian C. Gibb,\* Mary Morgan-Richards,\* Matthew J. Phillips,† Michael D. Hendy,\* and David Penny\*

\*Allan Wilson Centre for Molecular Ecology and Evolution, Massey University, Palmerston North, New Zealand; and †Centre for Macroevolution and Macroecology, School of Botany and Zoology, Australian National University, Canberra ACT, Australia

## *The Dawkins Delusion*

**“... there is, after all, one true tree of life [...]. It exists. It is in principle knowable. We don’t know it all yet. By 2050 we should – or if we do not, we shall have been defeated only at the terminal twigs, by the sheer number of species.”**

**Richard Dawkins**



*Dawkins (2003), A Devil’s Chaplain*

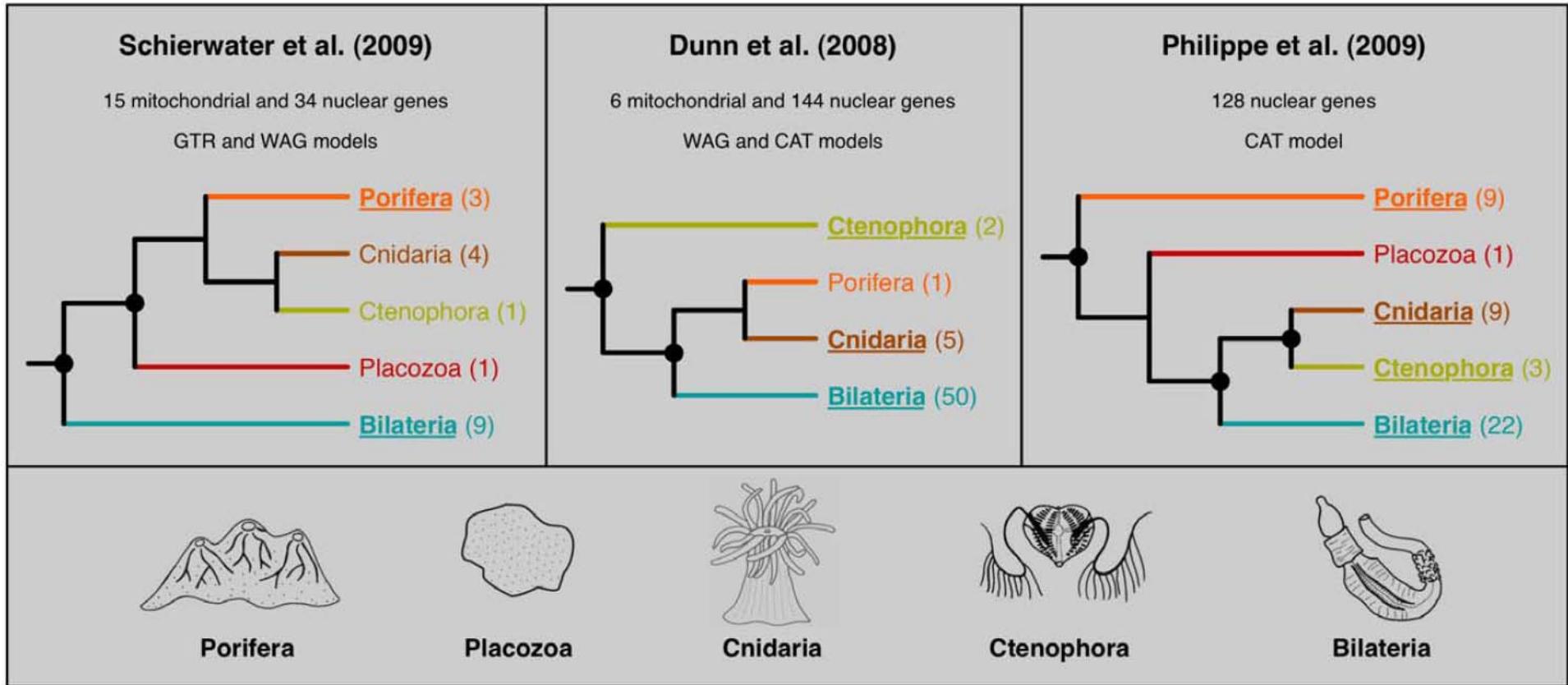
# *Incongruence in Deep Time*



*Kocot et al. (2011) Nature*

*Smith et al. (2011) Nature*

# Incongruence in Deep Time

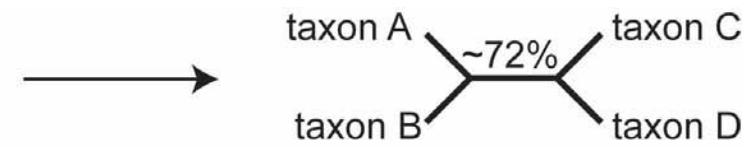


# *Bootstrap Support is Misleading When Used in Large Datasets*

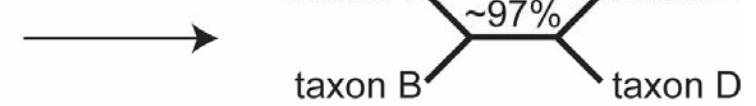
53%                  47%

taxonA	AAAAAAAATTTTTTTT
taxonB	AAAAAAAACCCCCCCC
taxonC	GGGGGGGGGGTTTTTTT
taxonD	GGGGGGGGGGCCCCCCCC

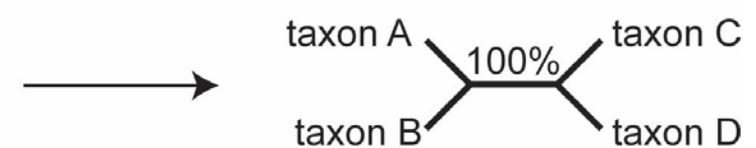
**100 characters**



**1,000 characters**



**10,000 characters**



# An Expanded Yeast Data Matrix

## Yeast Gene Order Browser (YGOB)



## Candida Gene Order Browser (CGOB)



Saccharomyces  
lineage

1,070 genes  
23 taxa  
no missing data

Candida  
lineage



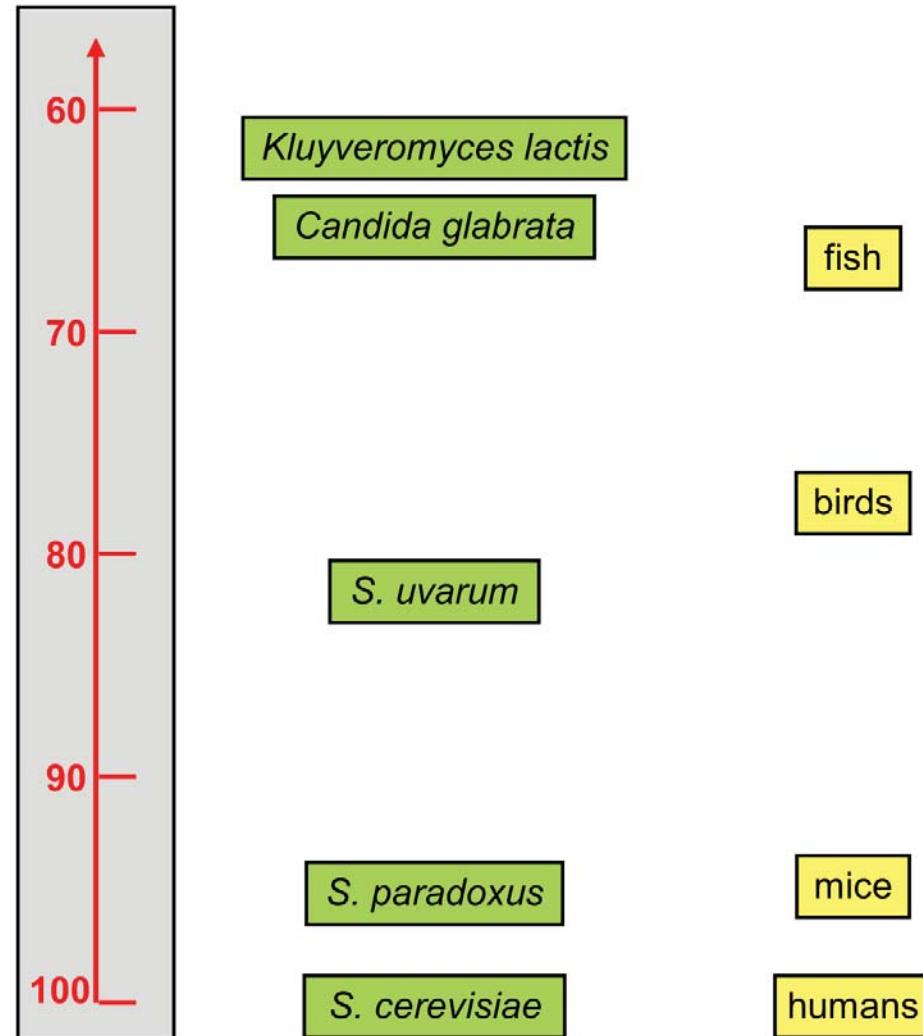
Byrne & Wolfe (2005) Genome Res.

Fitzpatrick et al. (2010) BMC Genom.

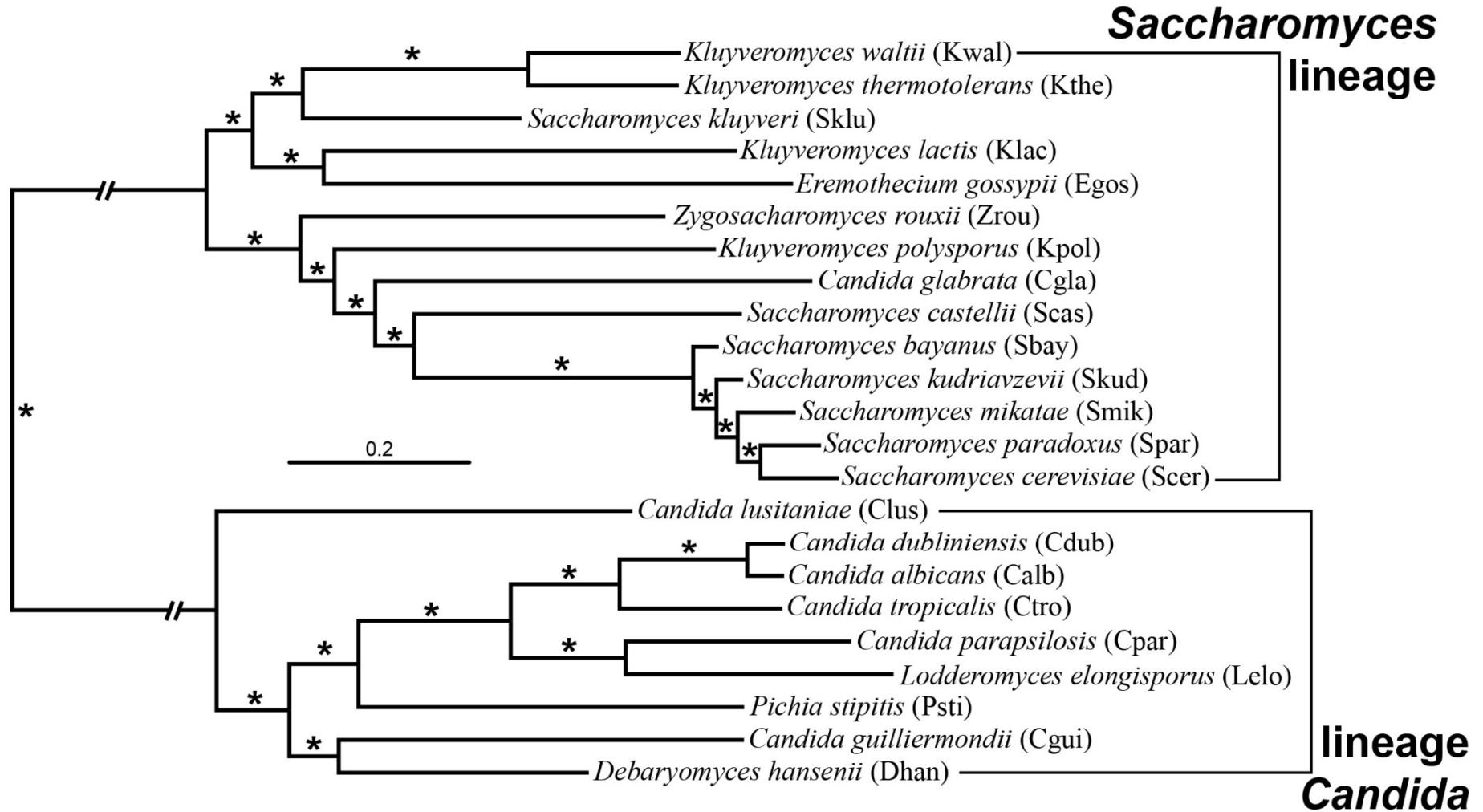
# *Yeast Divergence is Intermediate to Vertebrates and Animals*

Proteome-wide average pairwise amino acid sequence similarity

**Saccharomyces,**  
***Candida*, *Kluyveromyces*,**  
etc. are all polyphyletic  
genera

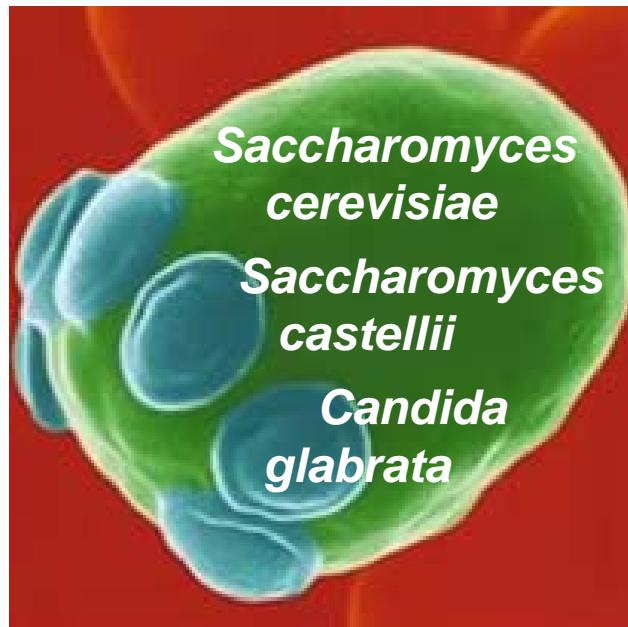


# Concatenation Yields an Absolutely Supported Phylogeny

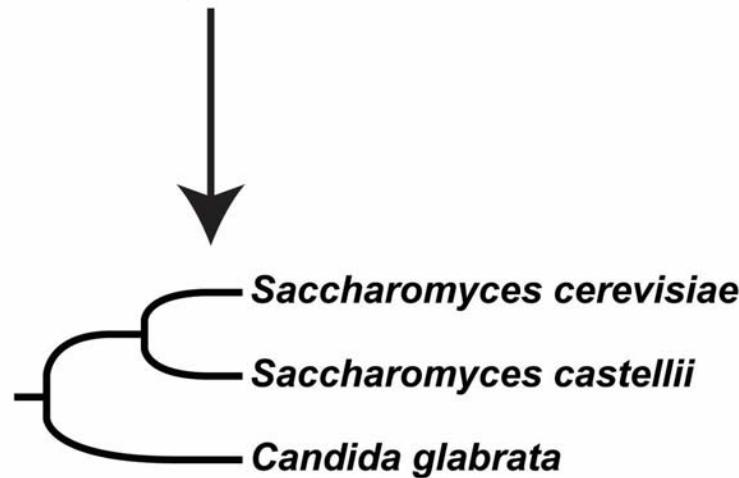


Salichos & Rokas (2013) Nature

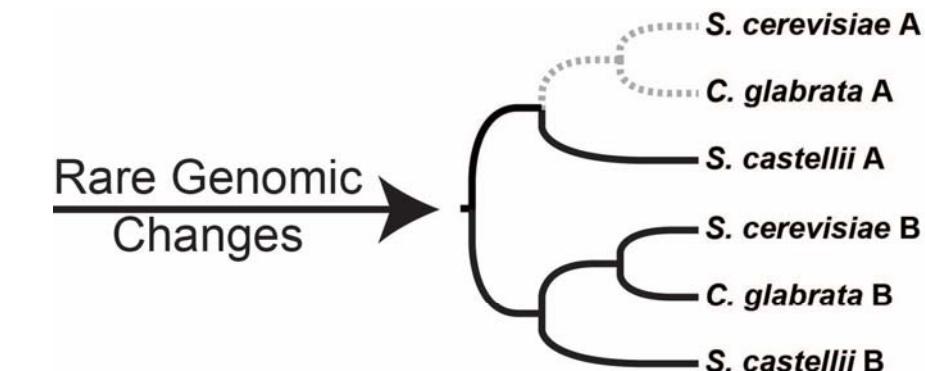
# The Concatenation Phylogeny is at Least Partly Wrong



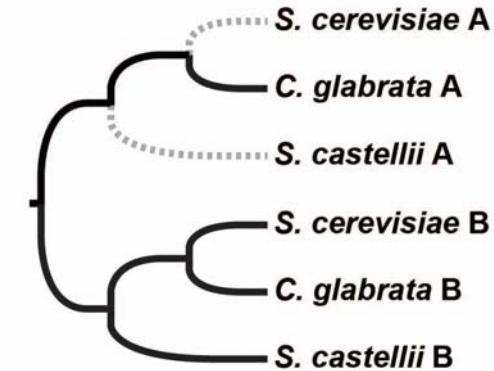
Linear Sequence Data



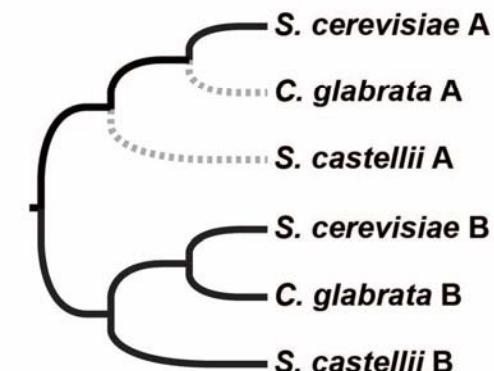
Rare Genomic  
Changes



86



28

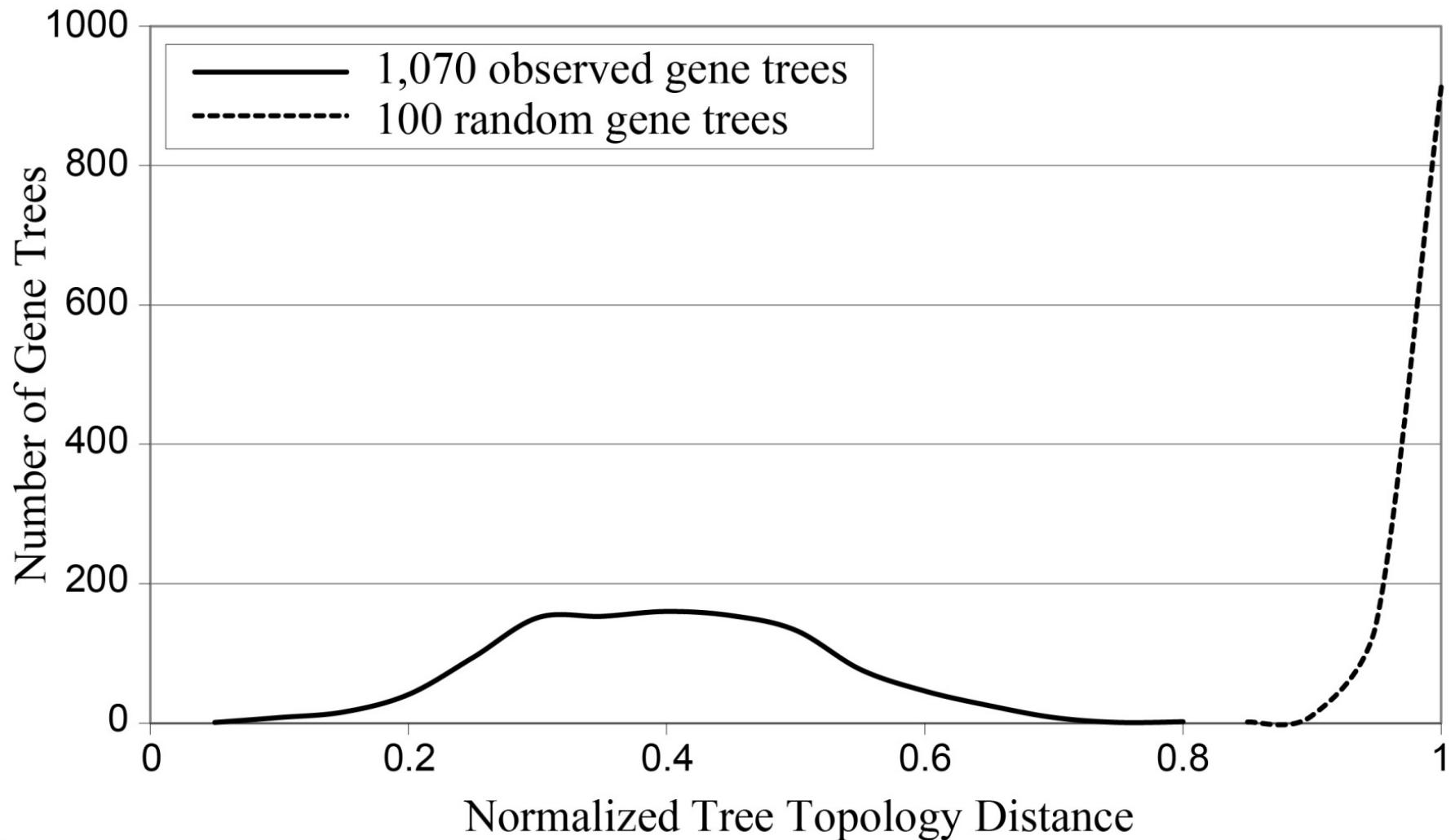


38

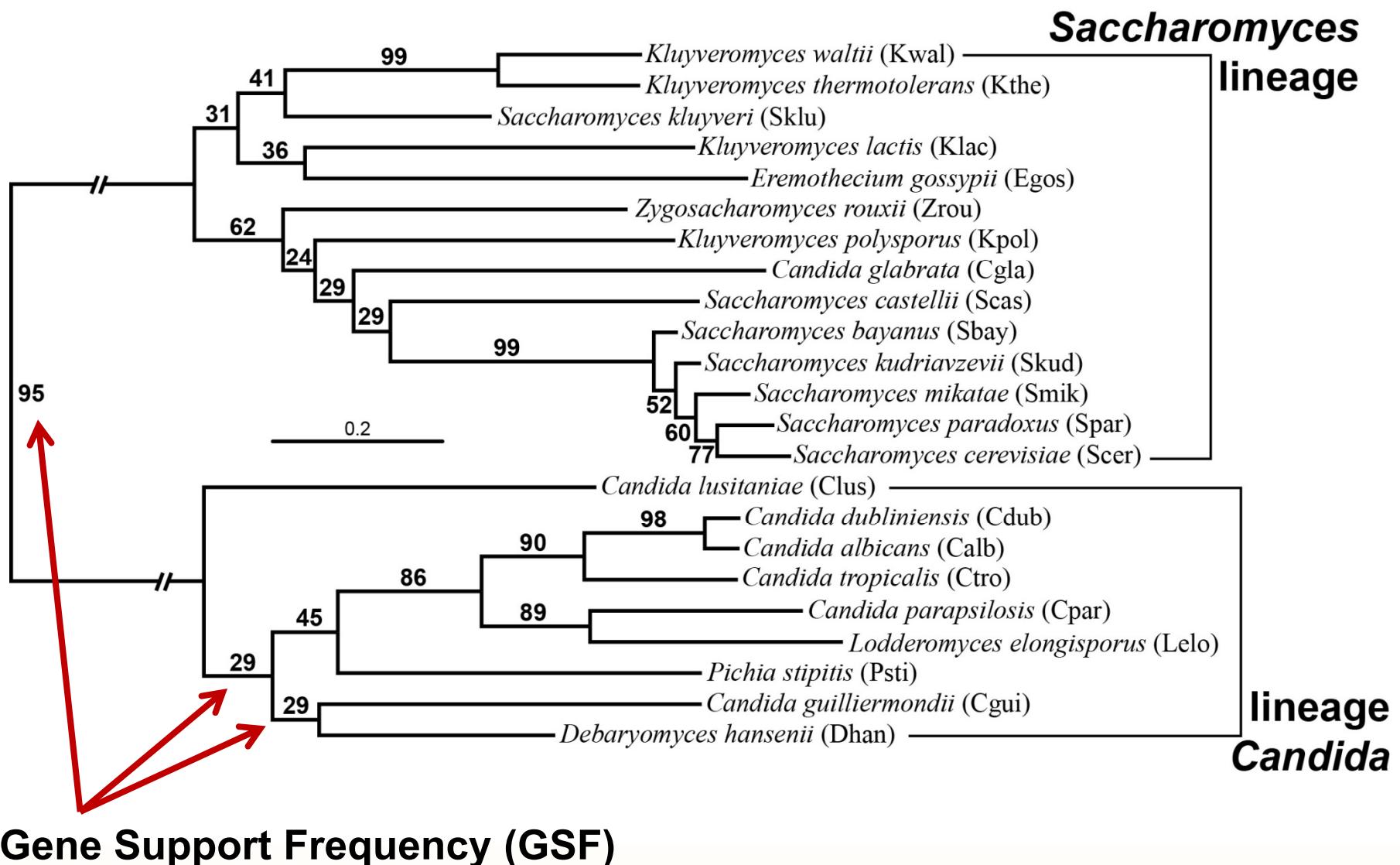
Scannell et al.(2006) Nature



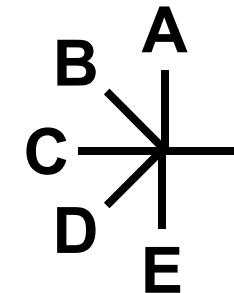
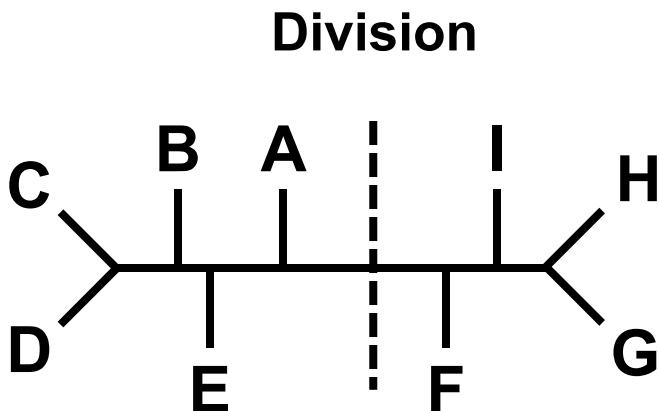
# All Gene Trees Differ from the Concatenation Phylogeny



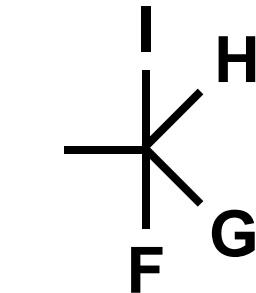
# The Yeast Phylogeny Inferred by Majority-Rule Consensus



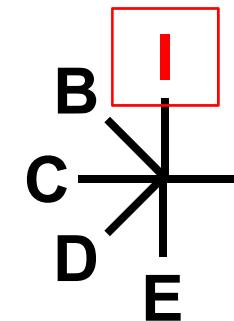
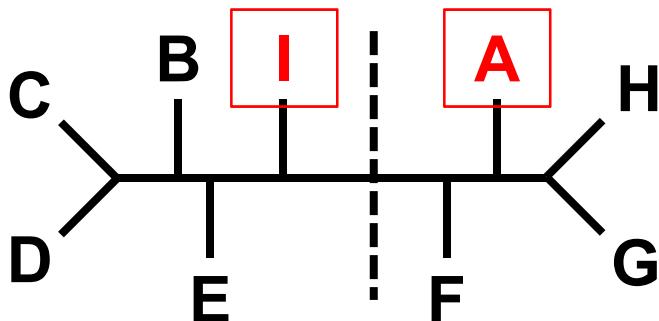
# *Phylogenetic Trees are Sets of Splits*



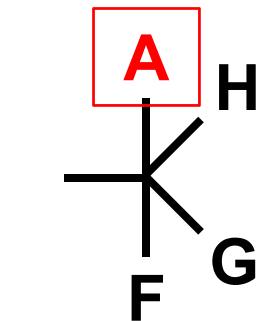
{A, B, C, D, E}



{F, G, H, I}



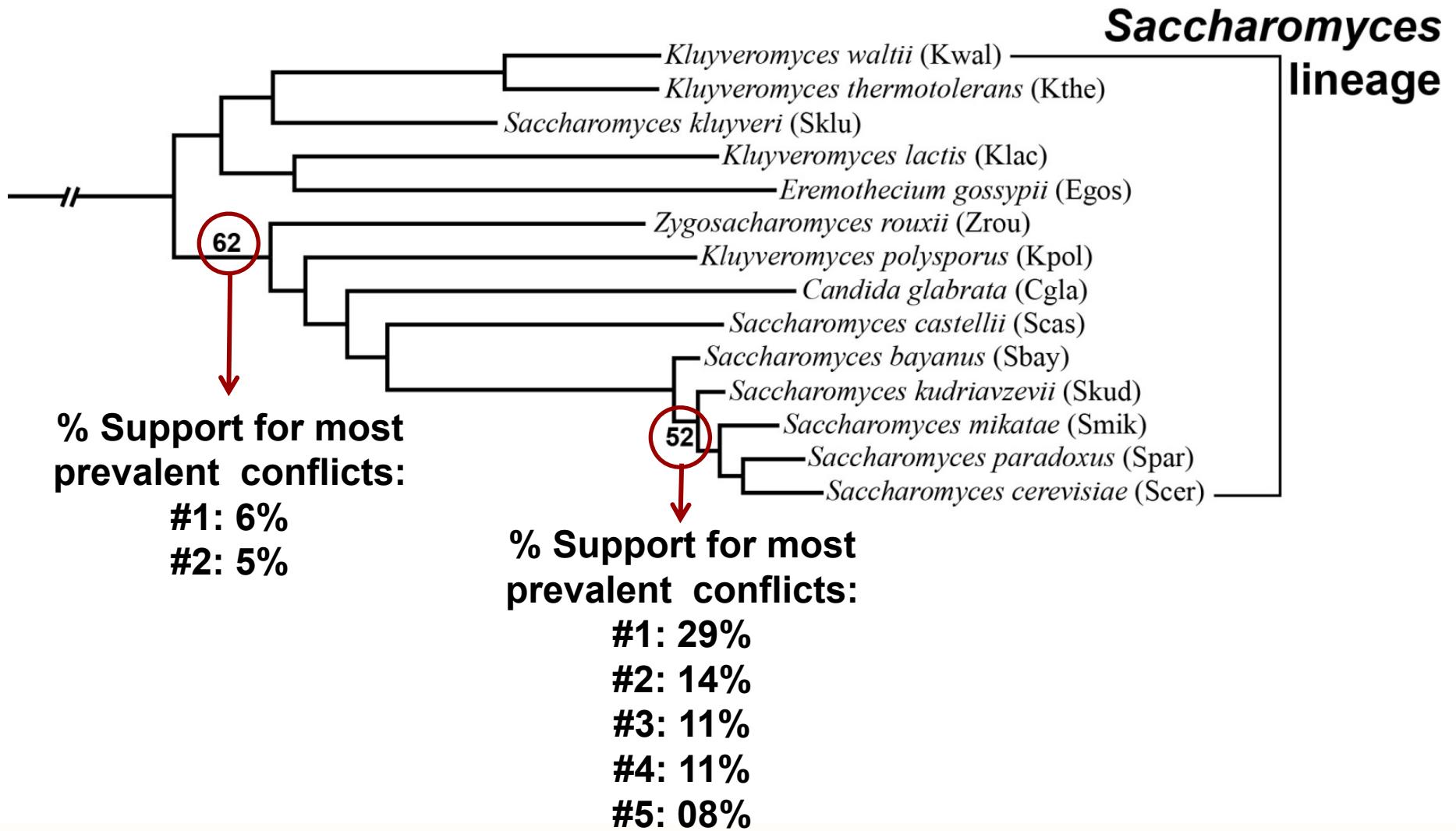
*Conflicting Splits:* {I, B, C, D, E}



{F, G, H, A}

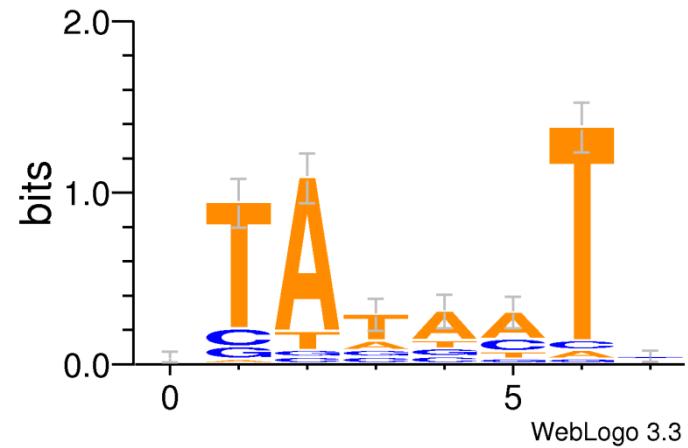
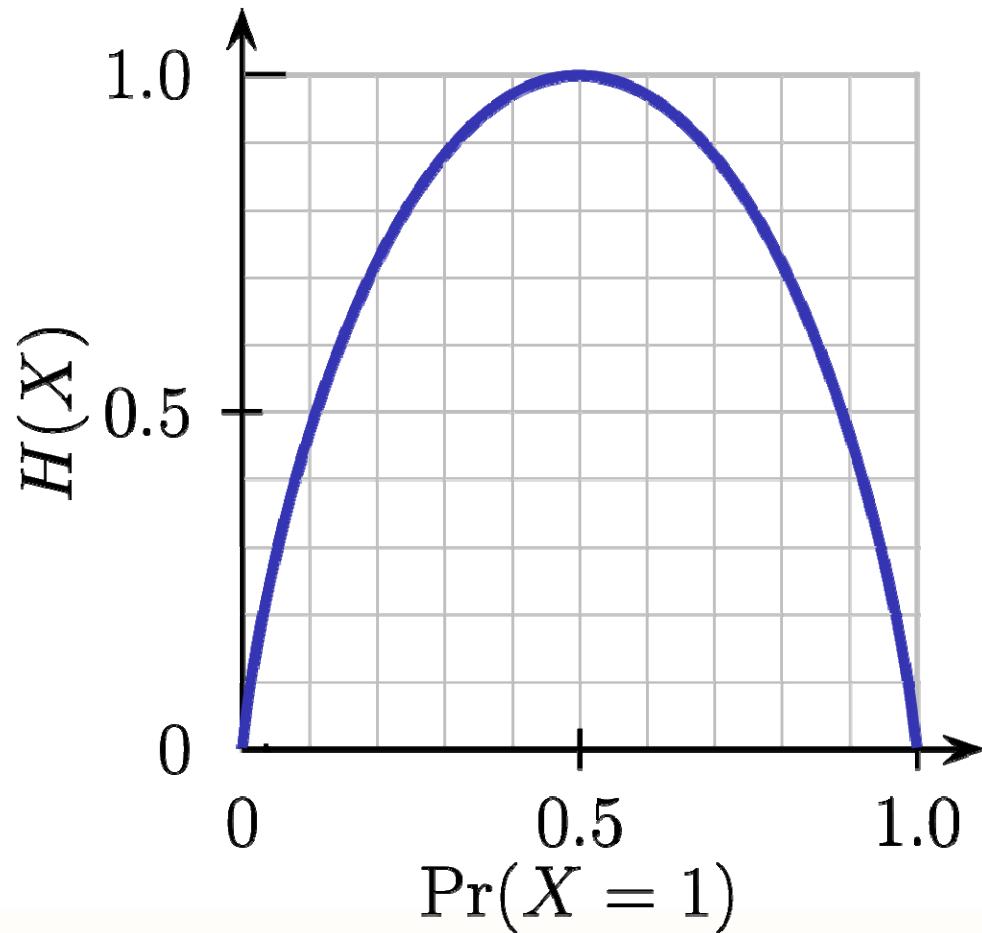


# *Measuring the Degree of Conflict for each Internode*



## *Shannon's Entropy Measures the Uncertainty in a Variable*

$$H(X) = - \sum_1^n p(X_n) \log_2(p(X_n))$$

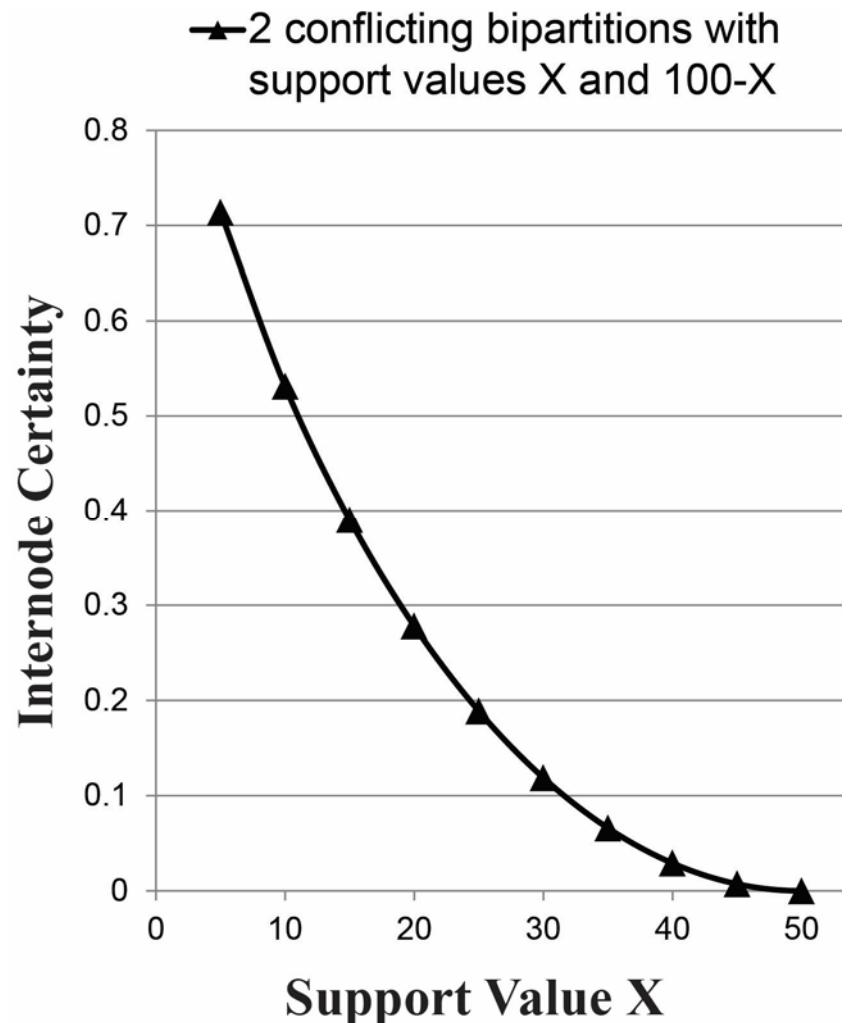


*Shannon (1948) Bell System Technical Journal*

# **Internode Certainty, a New Metric to Quantify Incongruence**

**Internode Certainty (IC):** an evaluation of the support for a given internode by considering its frequency in a given set of trees jointly with that of the most prevalent conflicting split in the same set of trees. IC equal to 1 describes absolute certainty for a given internode.

**Tree Certainty (TC):** the sum of IC across all internodes. The max TC value is equal to the taxon number



$$IC = \log_2(2) + \left( \frac{x_1}{x_1 + x_2} \right) * \log_2 \left( \frac{x_1}{x_1 + x_2} \right) + \left( \frac{x_2}{x_1 + x_2} \right) * \log_2 \left( \frac{x_2}{x_1 + x_2} \right)$$

# *Internode Certainty in RAxML*

IC and related measures are implemented in latest versions of RAxML  
(<https://github.com/stamatak/standard-RAxML>)

```
[rokasa@vmps65]$ more RAxML_verboseSplits.T6
```

Cint

Dmel

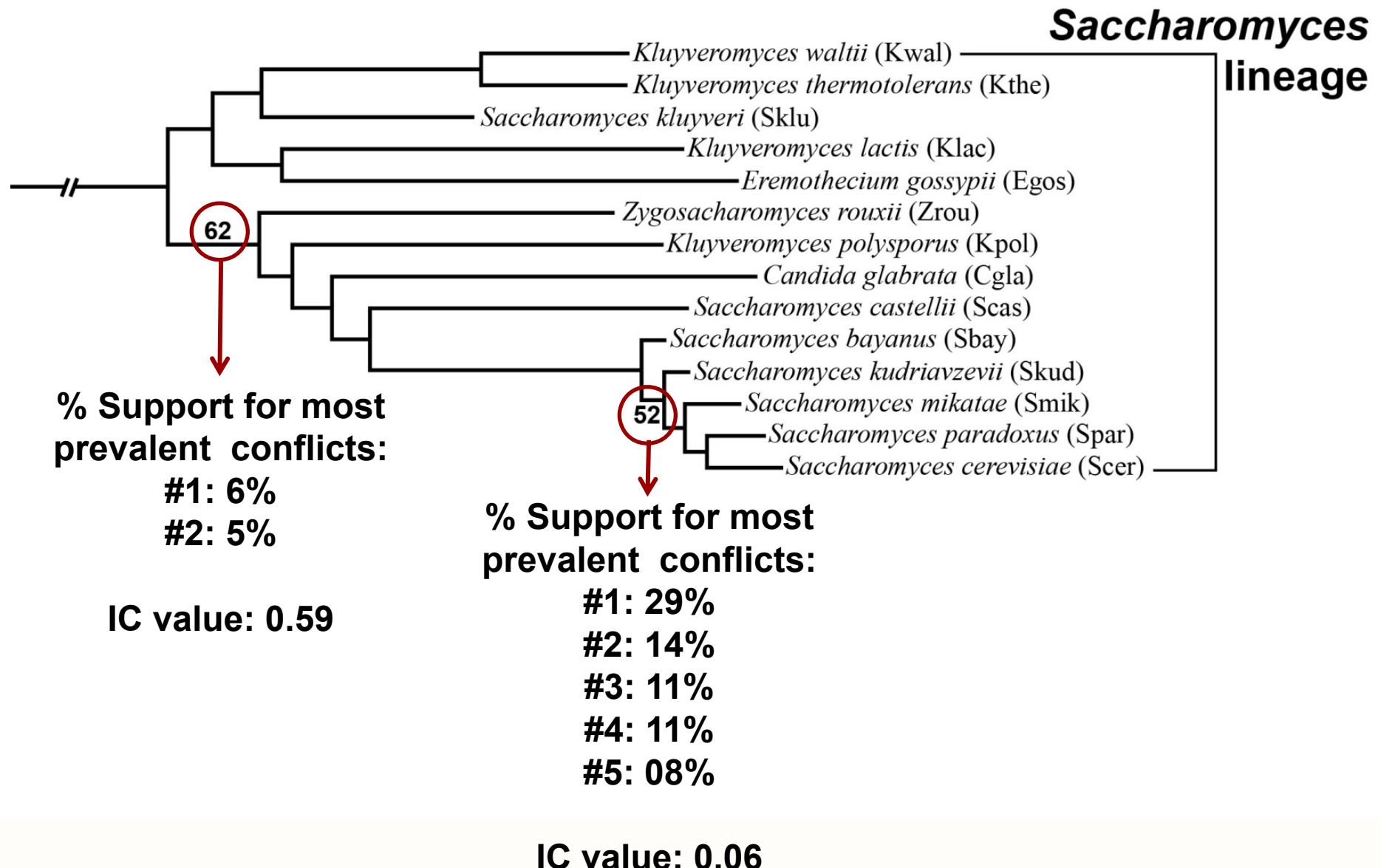
Sman

...

		Tree #	/ GSF	/ IC
partition:	-----**-----	211	/ 93.77	/ 0.82
	-----*-*-----	6	/ 2.66	/ 0.82
partition:	-----**-*----	170	/ 75.55	/ 0.56
	-----*---*---	17	/ 7.55	/ 0.56
	-----***-----	12	/ 5.33	/ 0.56
partition:	-*-----*****-----	11	/ 4.88	/ -0.26
	--*---*-----	42	/ 18.66	/ -0.26
	-**-----	32	/ 14.22	/ -0.26

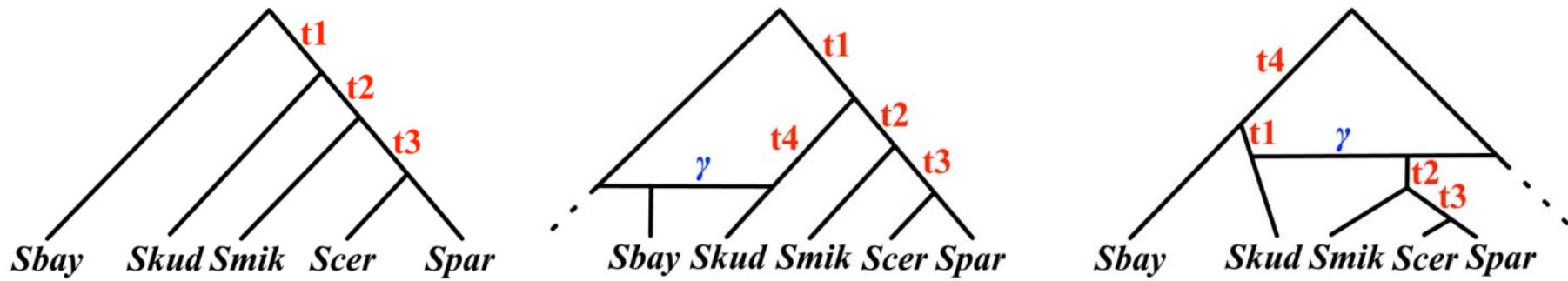
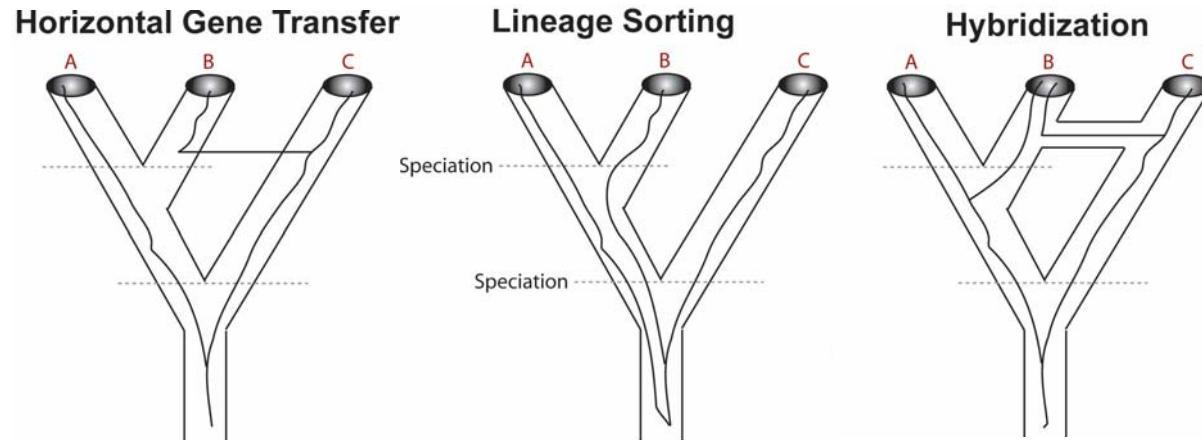


# *IC* is a Much More Informative Measure of Internode Support



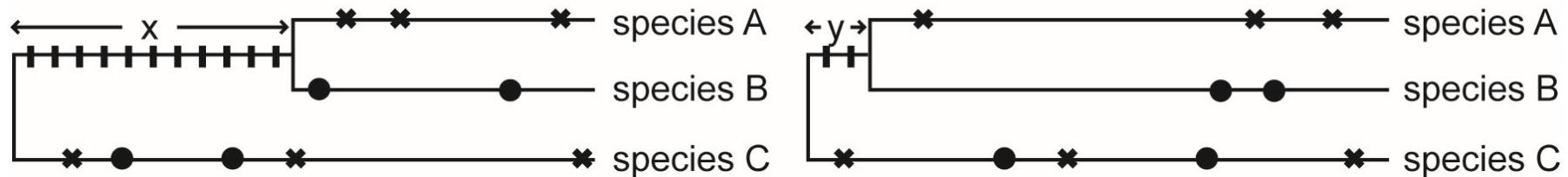
# Why is the Yeast Phylogeny Hard to Resolve?

## ❖ Biological factors

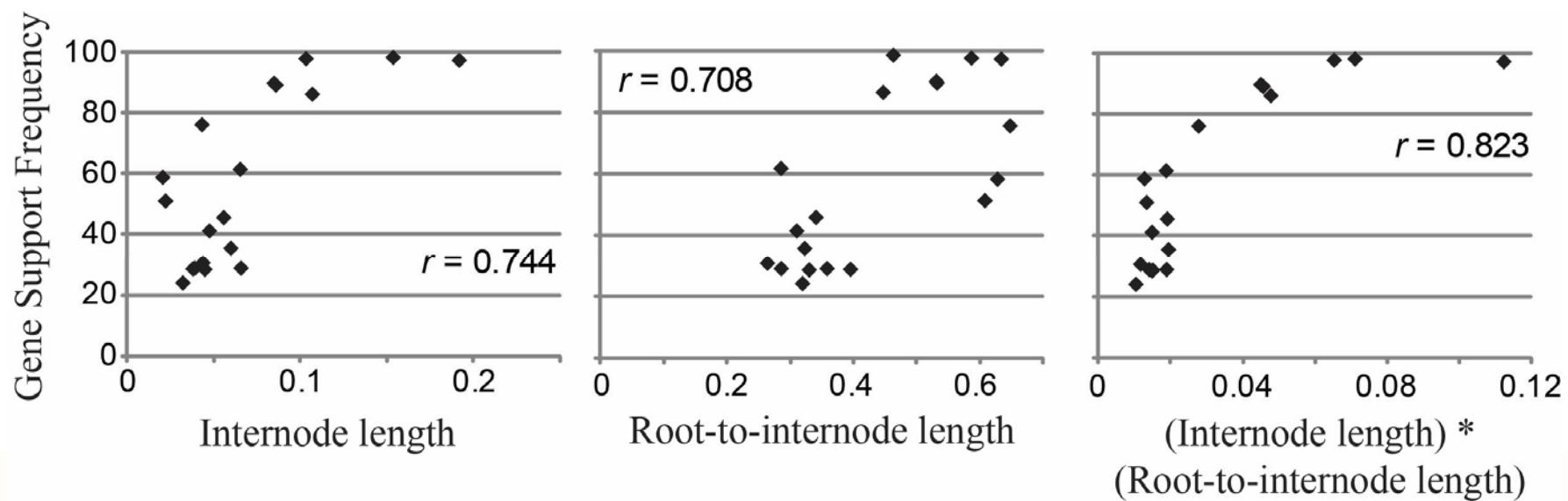


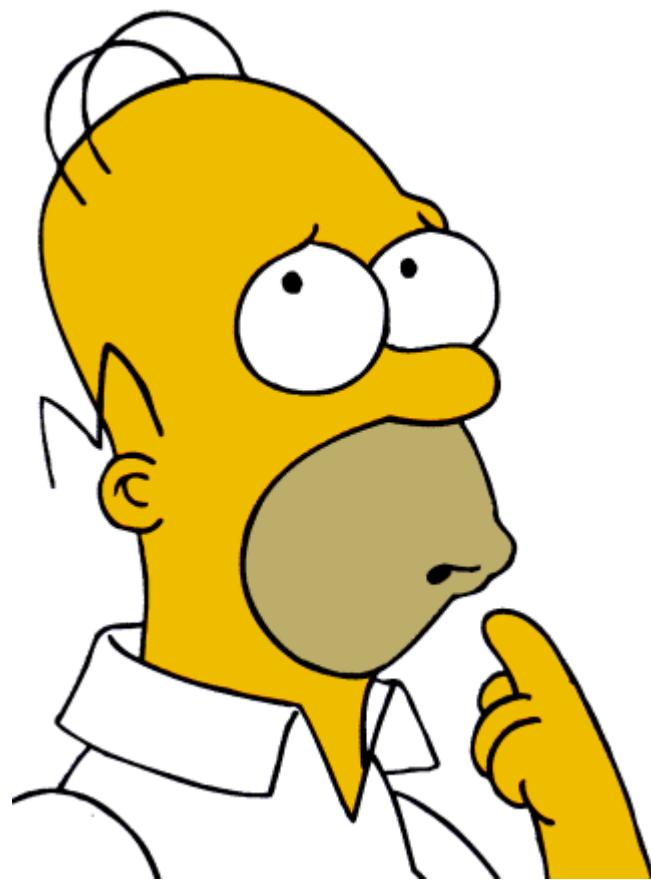
# Why is the Yeast Phylogeny Hard to Resolve?

## ❖ Analytical factors



**Internode length:** influences amount of phylogenetic signal (I)  
**Homoplasy:** independent evolution of identical characters (\*, ●)





## Standard Recipes for Handling Incongruence Didn't Help

Treatment	Tree Certainty	# of Internodes where IC increased   decreased
<b>Default analysis</b>	<b>8.35</b>	n/a
<i>Removing sites containing gaps</i>		
<b>All sites with gaps excluded</b>	<b>7.91</b>	<b>0   7</b>
<i>Removing fast-evolving or unstable species</i>		
<b><i>C. lusitaniae</i></b>	<b>8.15</b>	<b>1   2</b>
<b><i>C. glabrata</i></b>	<b>8.30</b>	<b>2   2</b>
<b><i>E. gossypii, C. glabrata, K. lactis</i></b>	<b>7.88</b>	<b>1   3</b>
<i>Selecting genes that recover specific clades</i>		
<b>[<i>C. tropicalis, C. dubliniensis, C. albicans</i>]</b>	<b>8.62</b>	<b>0   0</b>
<i>Selecting the most slow-evolving genes</i>		
<b>100 slowest-evolving genes</b>	<b>6.76</b>	<b>2   9</b>

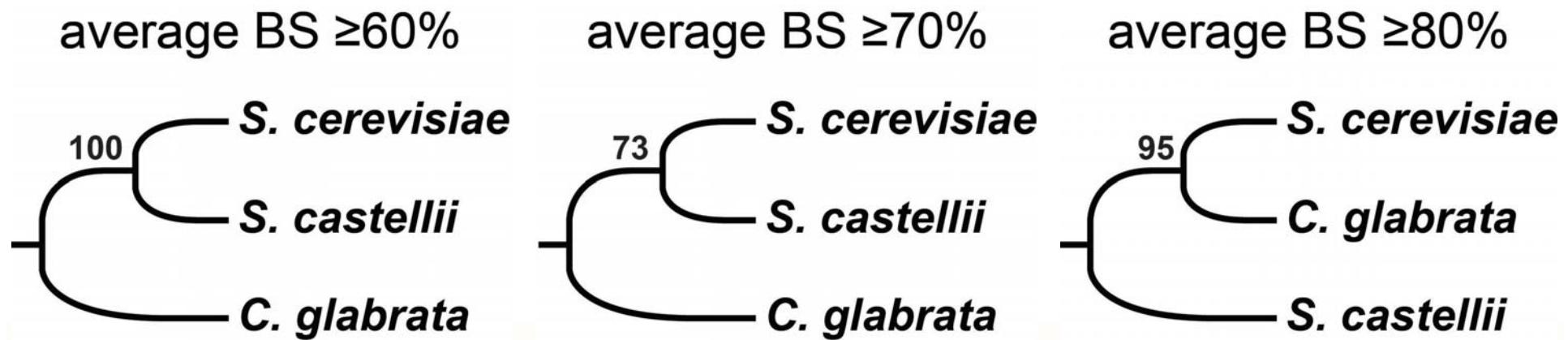


Salichos & Rokas (2013) Nature

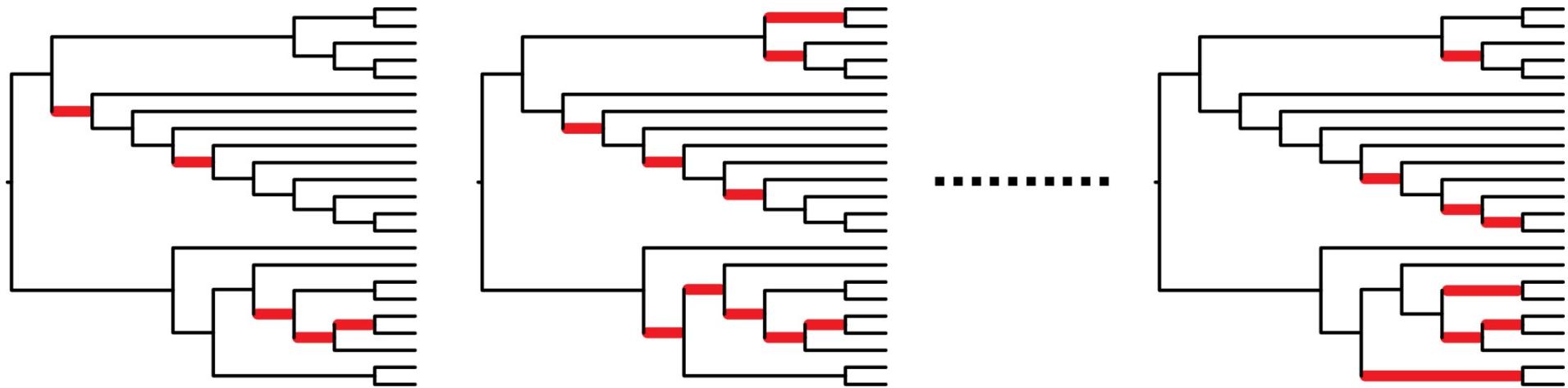


## What Do We Do Then?

Treatment	Tree Certainty	# of Internodes where IC increased   decreased
Default analysis	8.35	n/a
<i>Selecting genes whose bootstrap consensus trees have high average support</i>		
All genes with average BS $\geq 60\%$	8.59	4   0
All genes with average BS $\geq 70\%$	9.18	14   0
All genes with average BS $\geq 80\%$	9.92	15   0



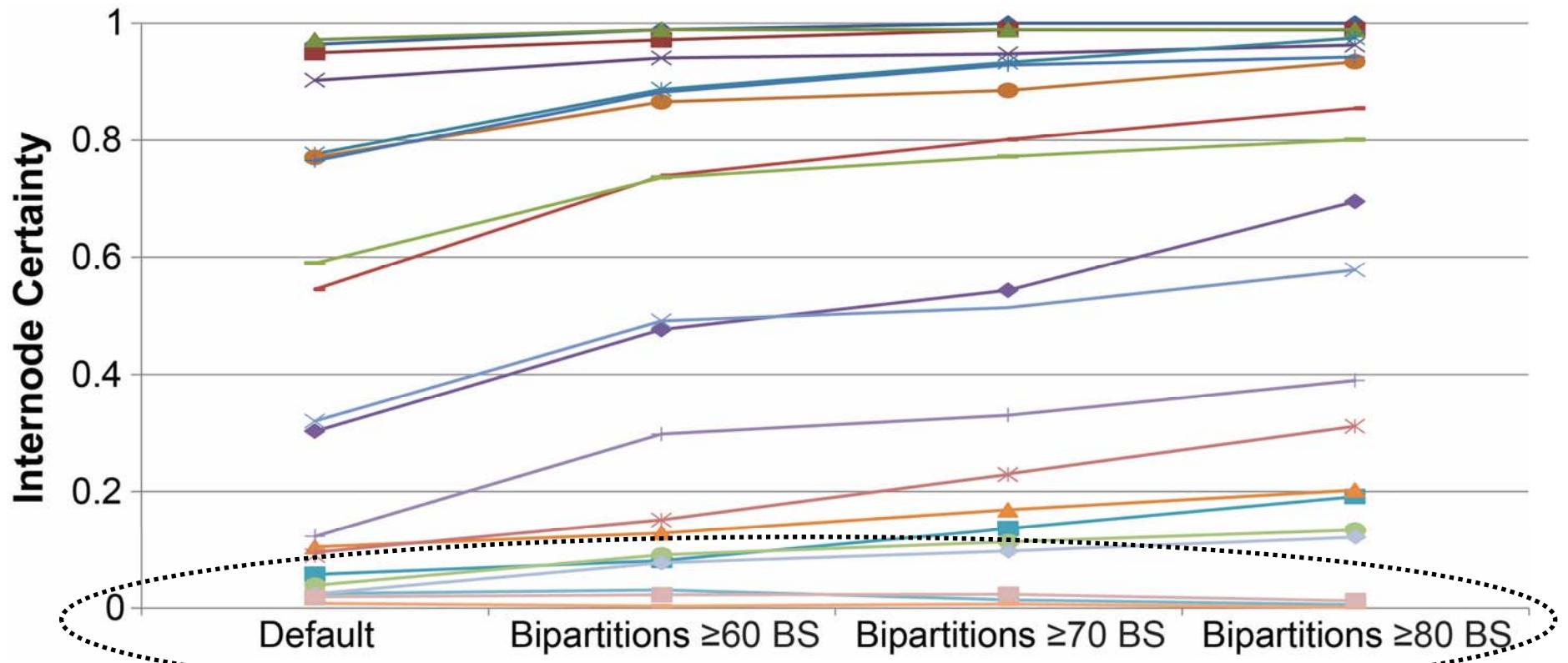
# Selecting Specific Bipartitions Dramatically Improves Phylogeny



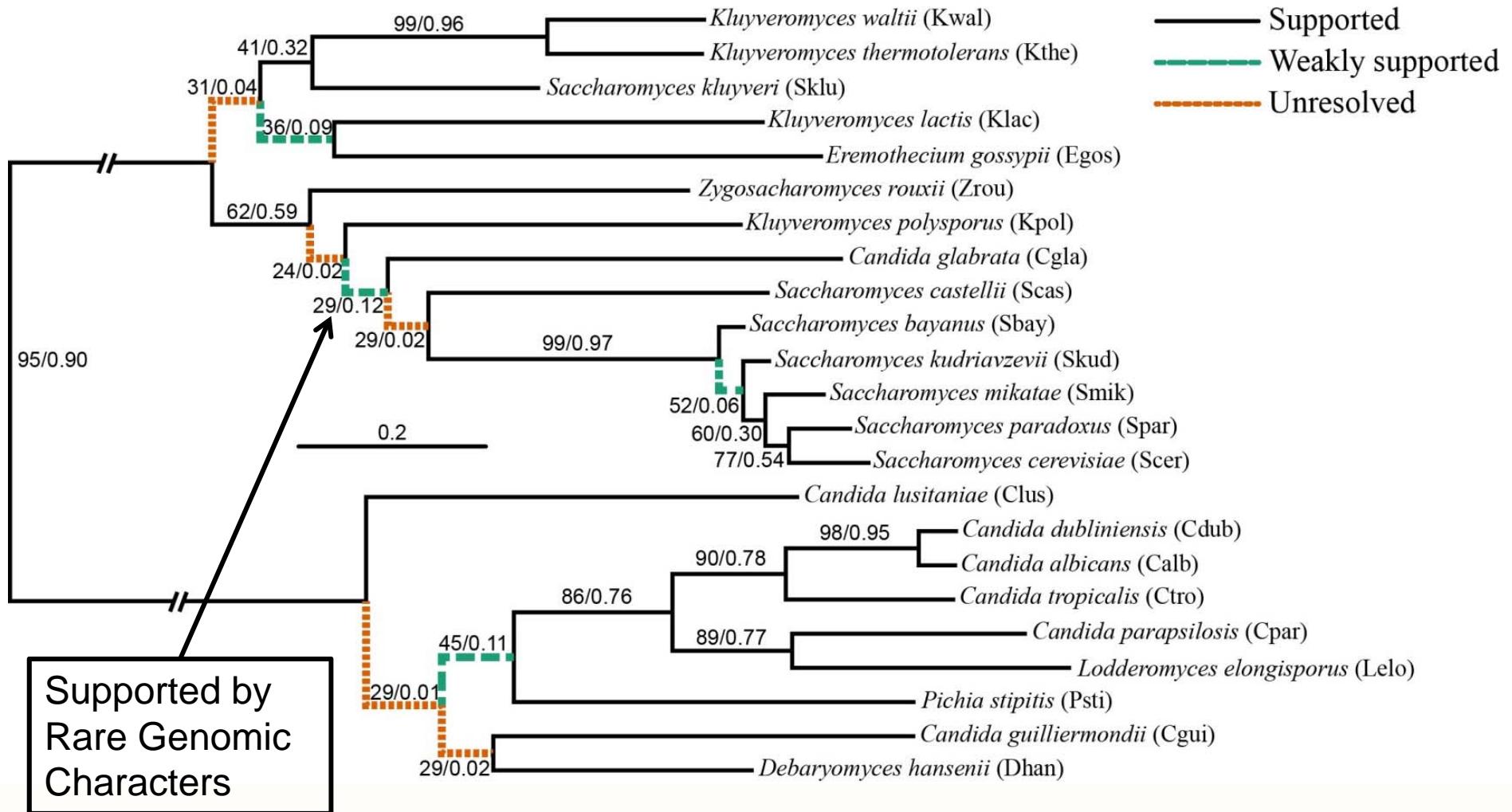
Treatment	Tree Certainty	# of Internodes where IC increased   decreased
Default analysis	8.35	n/a
<i>Selecting genes whose bootstrap consensus trees have high average support</i>		
All bipartitions with BS $\geq$ 60%	10.11	14   0
All bipartitions with BS $\geq$ 70%	10.70	16   0
All bipartitions with BS $\geq$ 80%	11.32	15   0



## *Least Supported Internodes Harbor the Most Conflict*



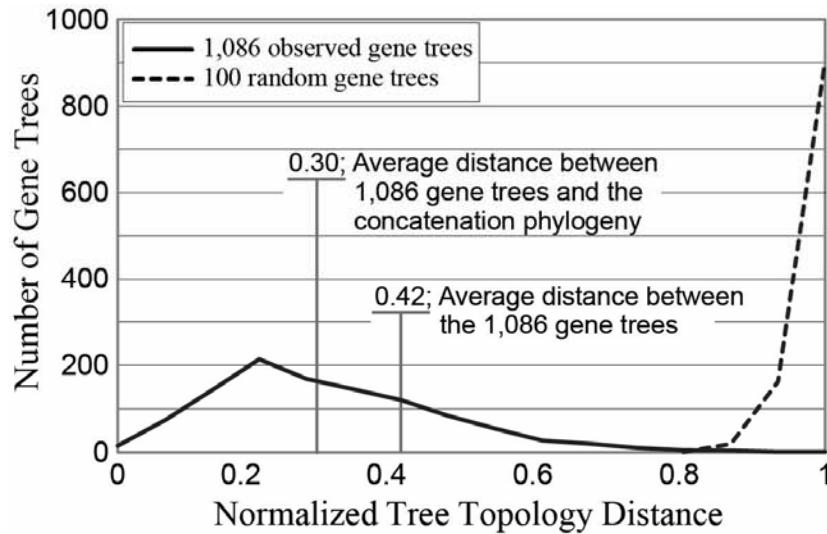
# The Status of the Yeast Phylogeny



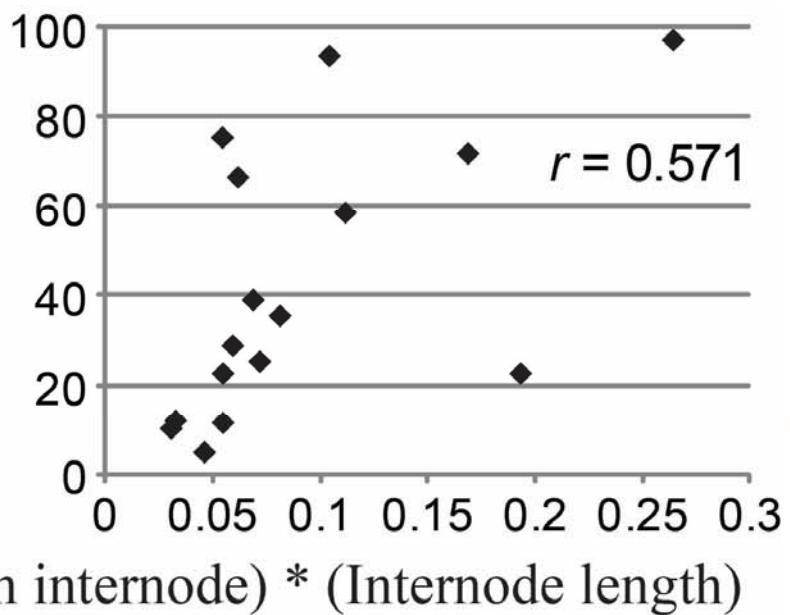
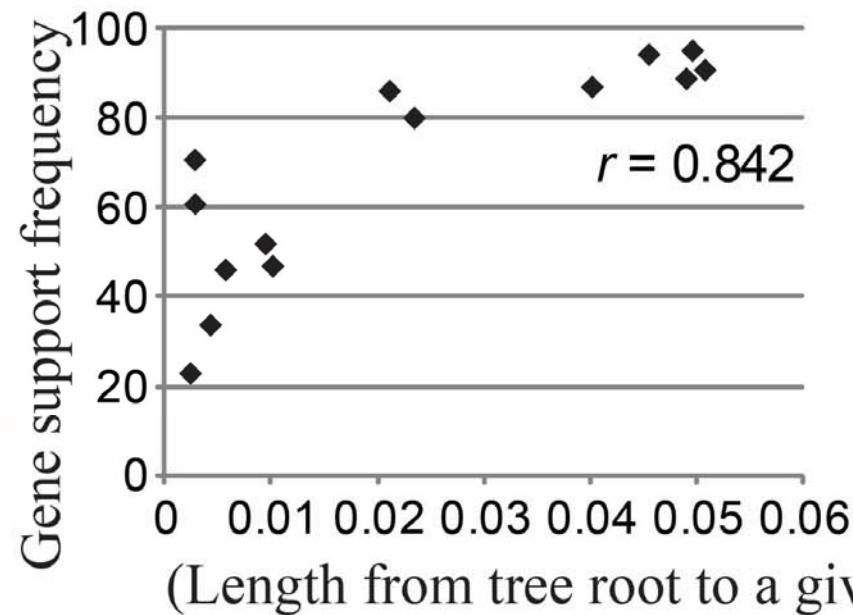
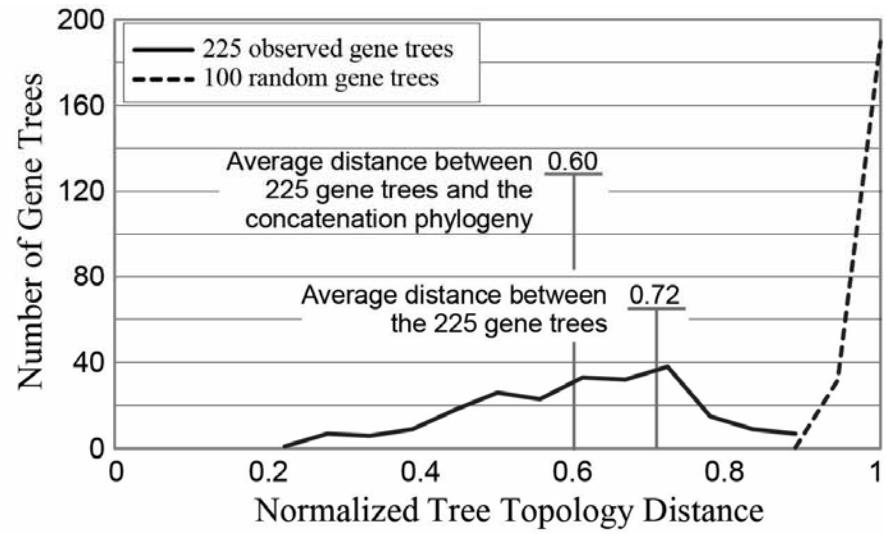
Gene Support Frequency / Internode Certainty

# *The Same is True for Vertebrate and Metazoan Datasets*

## Vertebrates (1,086 genes, 18 taxa)



## Animals (225 genes, 21 taxa)

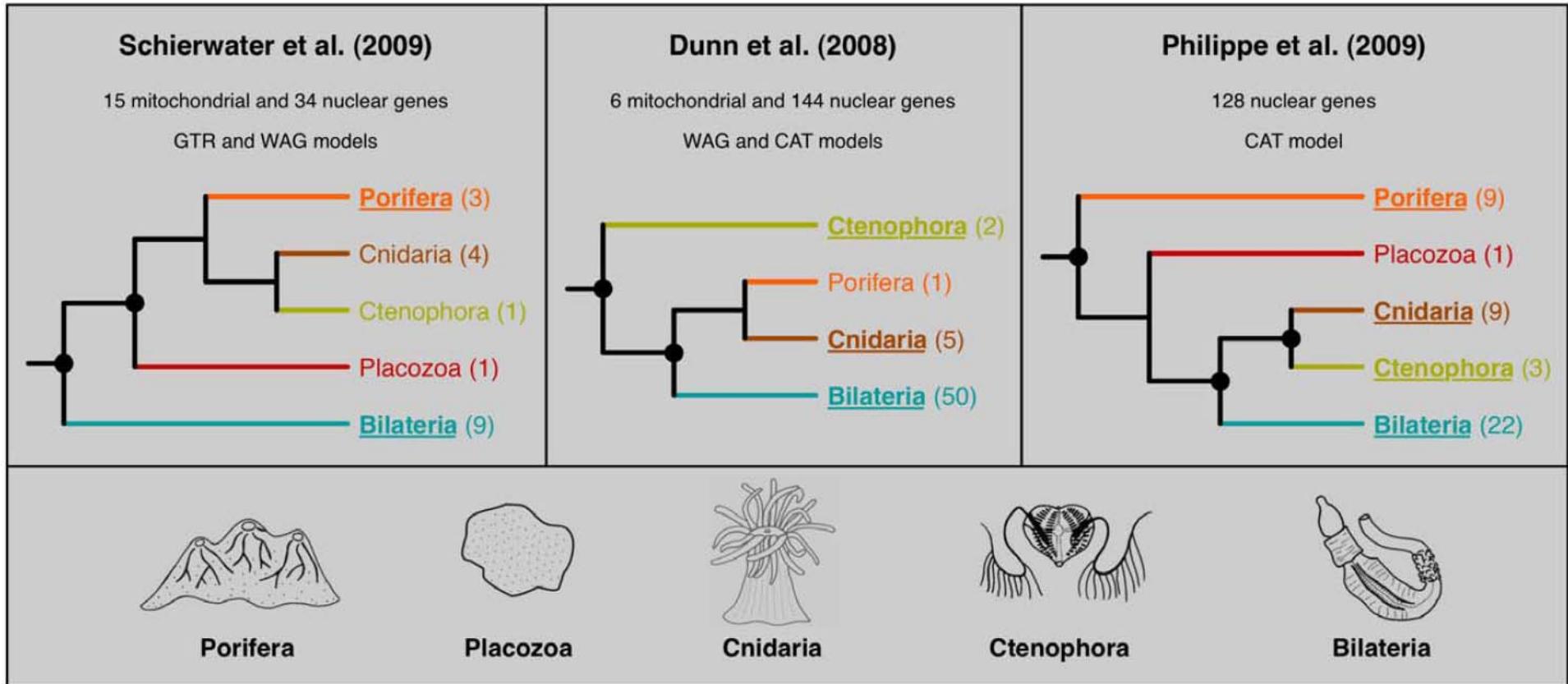


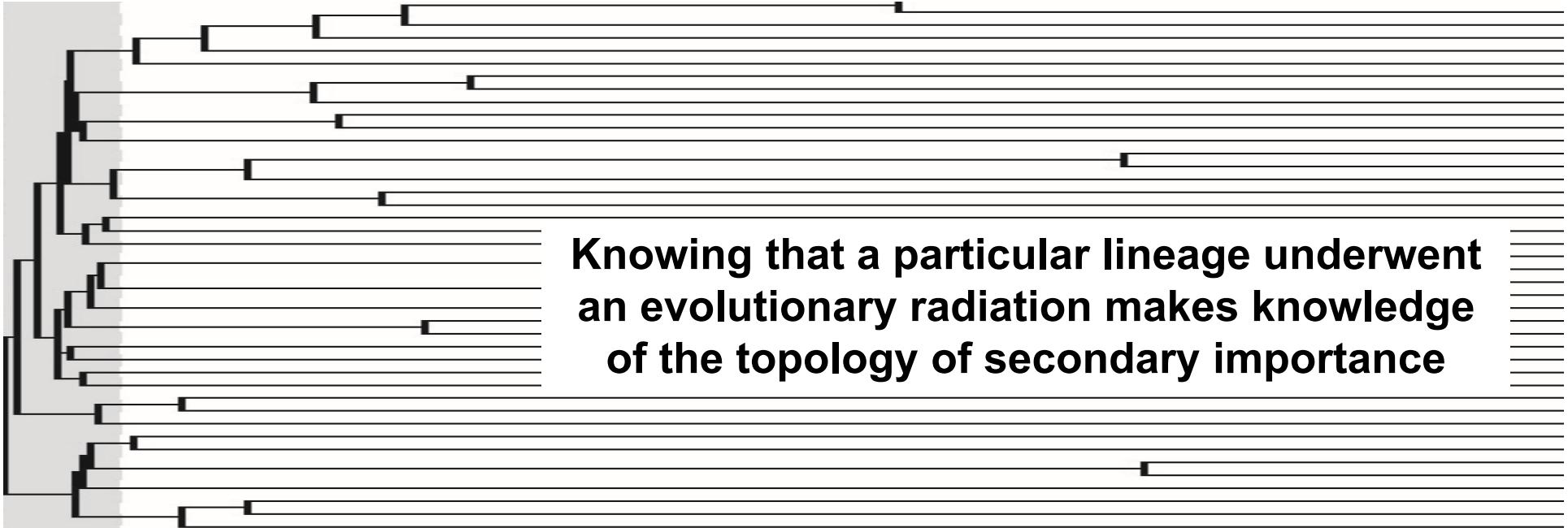
## *Lessons from Yeasts, Vertebrates & Animals*

- ❖ Few, if any, of the Gene Trees are Topologically Identical to Each Other or to the Phylogeny Inferred by Concatenation
- ❖ Concatenation analysis Overconfident and Can Mislead
- ❖ Internode Support is Inversely Correlated with Internode Length and Depth
- ❖ Selecting Genes or Gene Tree Bipartitions with Strong Signal Reduces Incongruence



# Incongruence in Deep Time





**Knowing that a particular lineage underwent an evolutionary radiation makes knowledge of the topology of secondary importance**



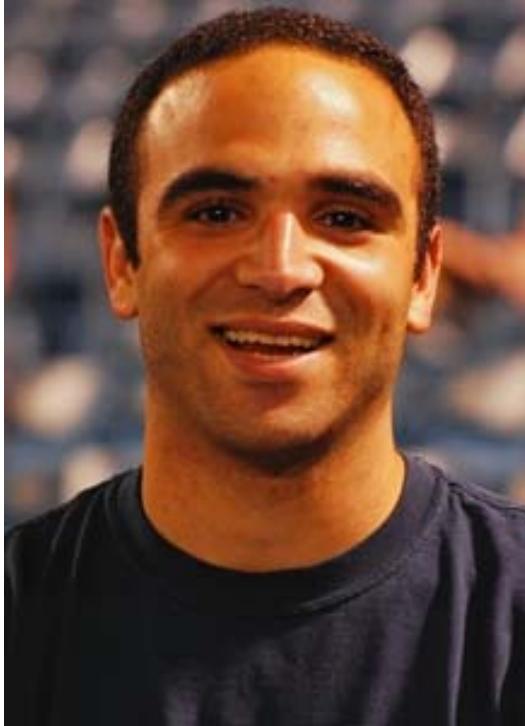
**“One can use the most sophisticated audio equipment to listen, for an eternity, to a recording of white noise and still not glean a useful scrap of information”**

Rodrigo et al. (1994) Chapter in:  
Sponge in Time and Space; Biology, Chemistry, Paleontology



*Rokas & Carroll (2006) PLoS Biol.*

## *Acknowledgements*



**John Gibbons**



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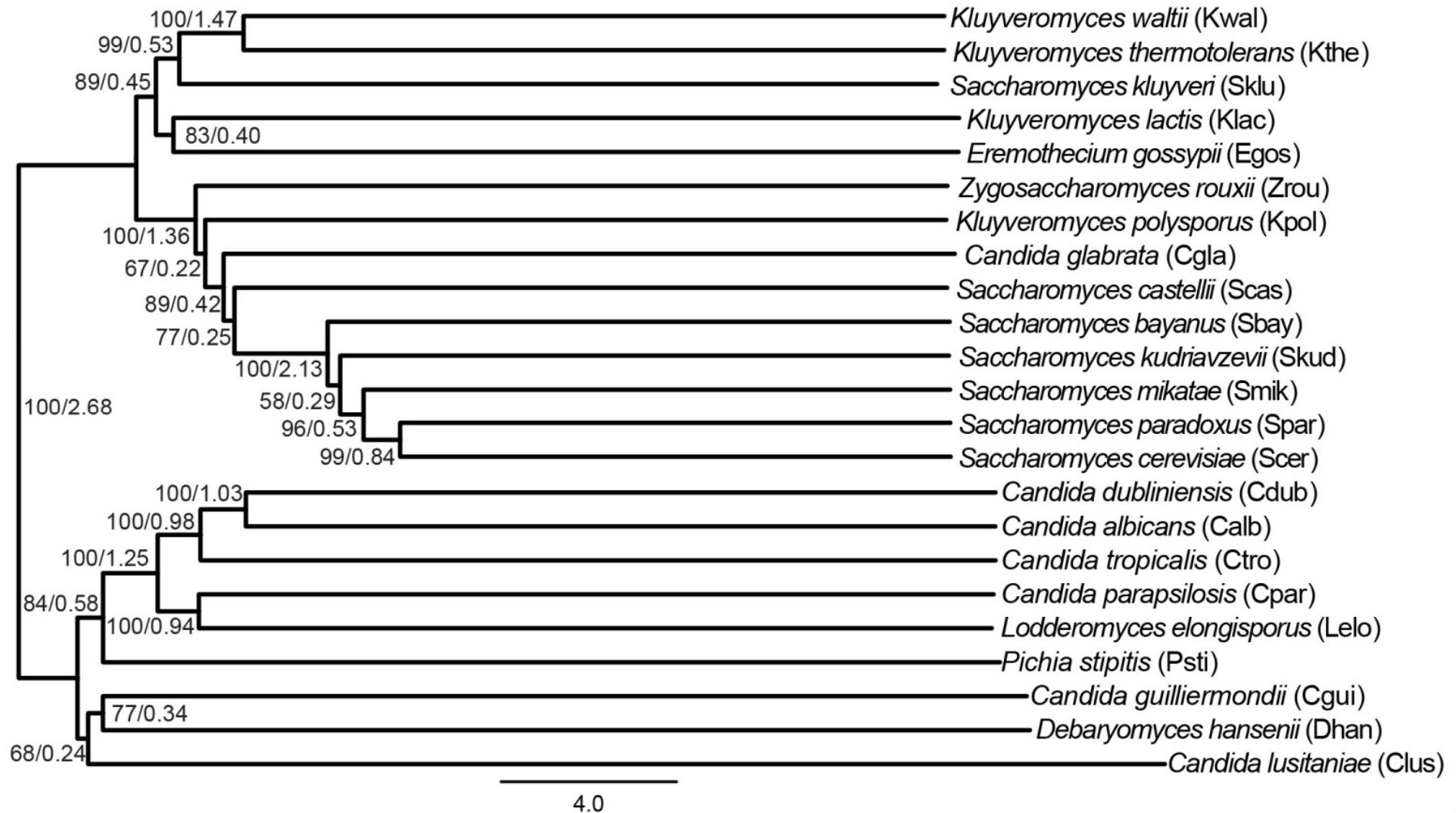
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<http://as.vanderbilt.edu/rokaslab>

# The Yeast Phylogeny Using a Species Tree Method



Bootstrap support / Internode length in coalescent units

# *STAR Internode Lengths Correlate with GSF / IC*

