

Antonis Rokas Department of Biological Sciences, Vanderbilt University http://www.rokaslab.org @RokasLab

#### Brief Bio

93-98	B.Sc.	Biology	Univ. of Crete, Greece (Advisor: L. Zouros)
98-01	Ph.D.	Evolutionary Ecology	Edinburgh Univ., Scotland (Advisor: G. Stone)
02-05	PostDoc	<b>Evolutionary Genomics</b>	Univ. Wisconsin-Madison (Advisor: S. Carroll)
05-07	Res. Scientist	Fungal Genomics	Broad Institute

07-now: Faculty Evo

**Evolutionary Biology** 

Vanderbilt University





http://www.rokaslab.org

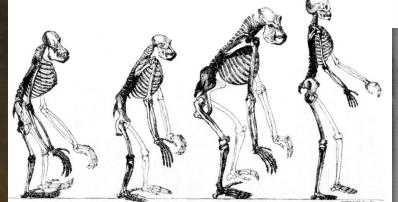
#### The Workshop on Molecular Evolution@Woods Hole



Antonis (me!) & Scott Handley

#### Darwin's data





Sheletons of the CHIMPANZEE.





ORANG.







Fig. 18 --English Poster



Fig. 25. - Short Gard English Tundler.

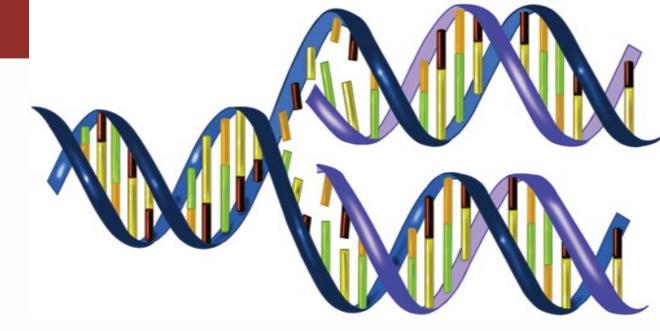


neckel Kntwickelungsgeschachte

Taf. V.



## The DNA record



"The genome is, it's a fossil record; the genome is a landscape; the genome is a whole geography of distributions. [...] you might think the genome's just a boring string of letters [...] The genome is a storybook that's been edited for a couple of billion years, and you could take it to bed, like *A Thousand and One Arabian Nights*, and read a different story, in the genome, every night."

#### **Eric Lander**

#### The Rokas Lab



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

#### Vanderbilt Univ. is in Nashville, Music City - USA







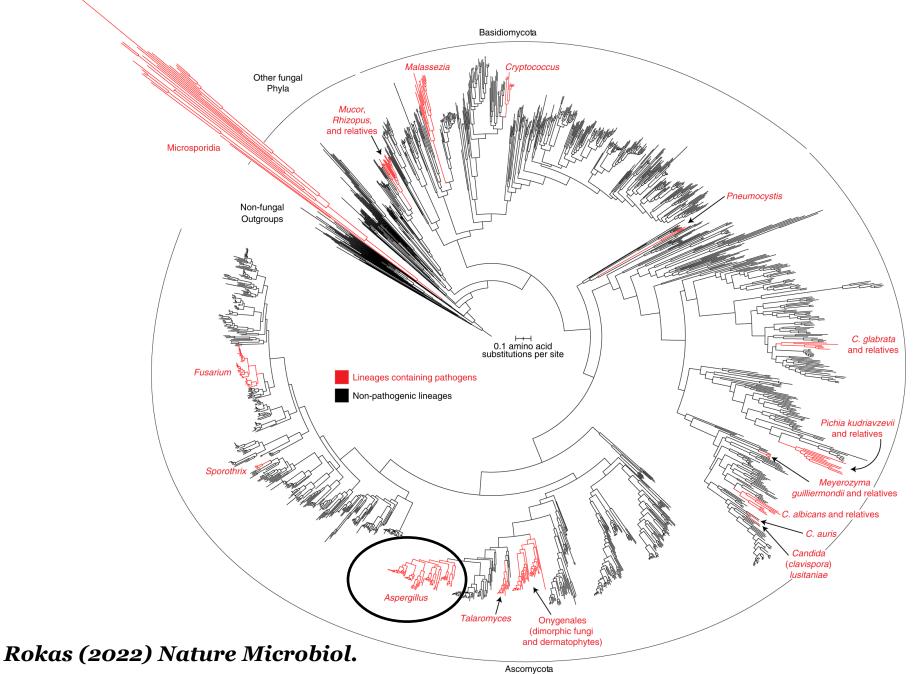


## Phylogenomics (NSF)

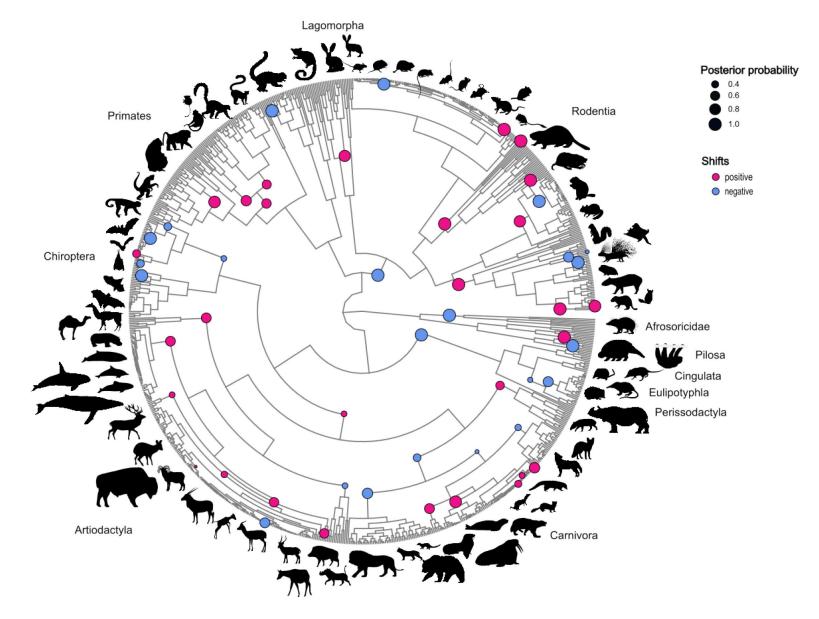
The molecular foundations of the fungal lifestyle (NSF & NIH)

The evolution of mammalian pregnancy (BWF & March of Dimes)

## The repeated evolution of fungal pathogenicity



#### Evolution of variation in gestation length in mammals



Danis & Rokas (2023) bioRxiv

#### ...But I'm also an evolutionist in Tennessee (USA)



Foes of science faced ridicule at the Scopes trial. We're paying the price 95 years later.

The Washington Post



Opinion by Max Boot Columnist

July 8, 2020 at 1:01 p.m. CDT



www.vanderbilt.edu/evolution/

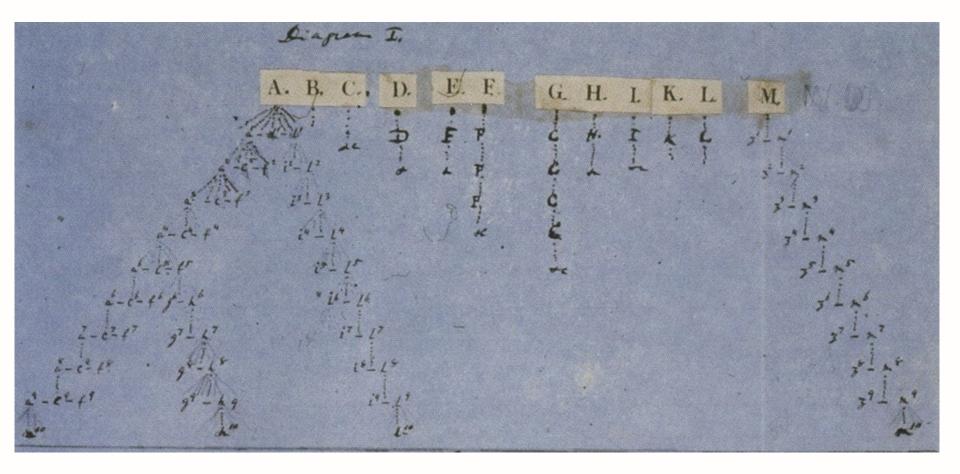
Lecture outline

## Incongruence and its causes

## ----- Coffee Break -----

 Handling incongruence in phylogenomic data

#### Darwin's tree



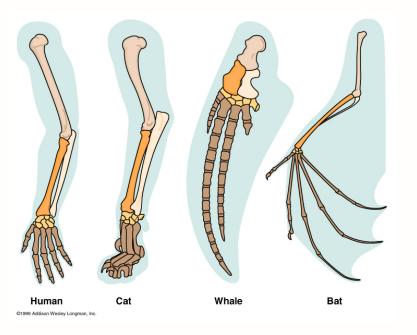


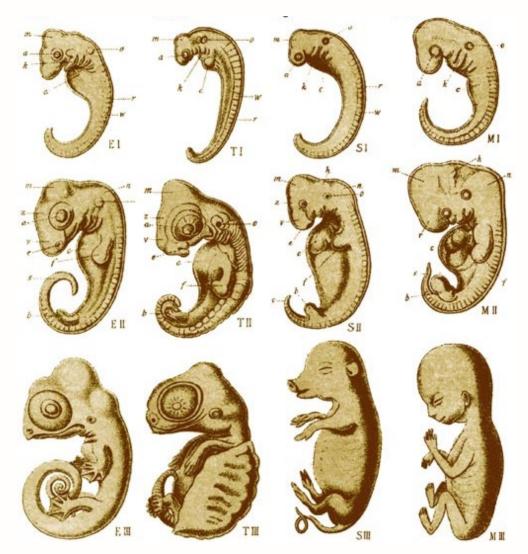
Darwin's hand-made proof of the famous diagram in his Origin of Species; Maderspacher (2006) Curr. Biol. and instinct as the summing up of many contrivances, each useful to the possessor, nearly in the same way as when we look at any great mechanical invention as the summing up of the labour, the experience, the reason, and even the blunders of numerous workmen; when we thus view each organic being, how far more interesting, I speak from experience, will the study of natural history become !

A grand and almost untrodden field of inquiry will be opened, on the causes and laws of variation, on correlation of growth, on the effects of use and disuse, on the direct action of external conditions, and so forth. The study of domestic productions will rise immensely in value. A new variety raised by man will be a far more important and interesting subject for study than one more species added to the infinitude of already recorded species. Our classifications will come to be, as far as they can be so made, genealogies; and will then truly give what may be called the plan of creation. The rules for classifying will no doubt become simpler when we have a definite object in view. We possess no pedigrees or armorial bearings; and we have to discover and trace the many diverging lines of descent in our natural genealogies, by characters of any kind which have long been inherited. Rudimentary organs will speak infallibly with respect to the nature of long-lost structures. Species and groups of species, which are called aberrant, and which may fancifully be called living fossils, will aid us in forming a picture of the ancient forms of life. Embryology will reveal to us the structure, in some degree obscured, of the prototypes of each great class.

When we can feel assured that all the individuals of the same species, and all the closely allied species of most genera, have within a not very remote period de-

## Data from comparative morphology and embryology

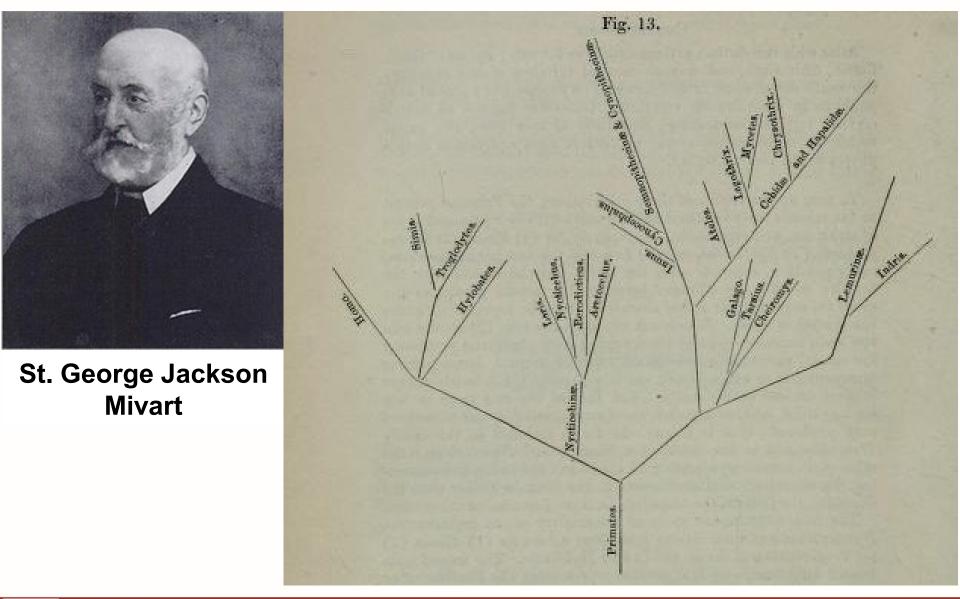






http://www.mun.ca/biology/scarr/139393\_forelimb\_homology.jpg & http://www.nature.com/nrg/journal/v7/n11/images/nrg1918-f2.jpg

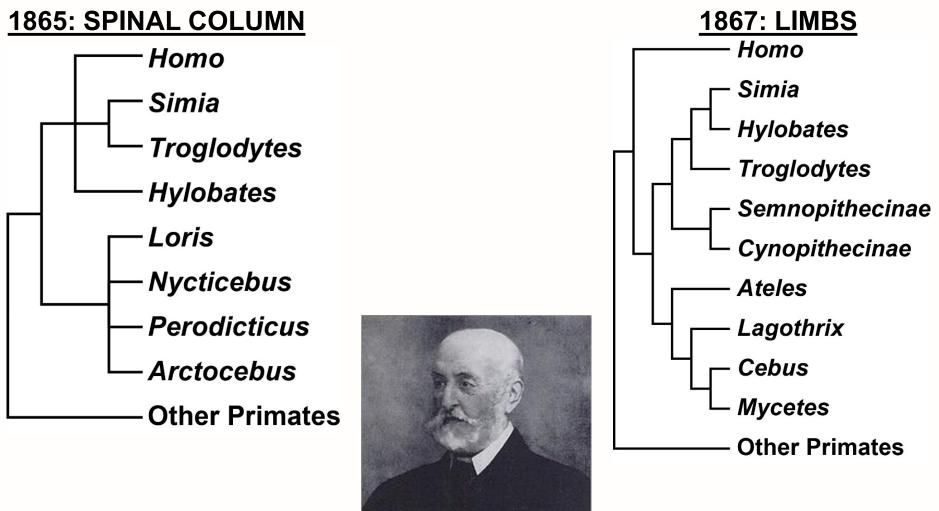
#### The first published phylogeny





Mivart (1865) Proc. Zool. Soc. London

#### **Disagreement between phylogenies**



#### St. George Jackson Mivart



http://phylonetworks.blogspot.se/2012/09/the-first-network-from-conflicting.html

In some M.S. [... I say] that on genealogical principles alone, & considering whole organisation man probably diverged from the Catarhine stem a little below the branch of the anthropo:apes [...]. I have then added in my M.S. that this is your opinion [...]. Is this your opinion?

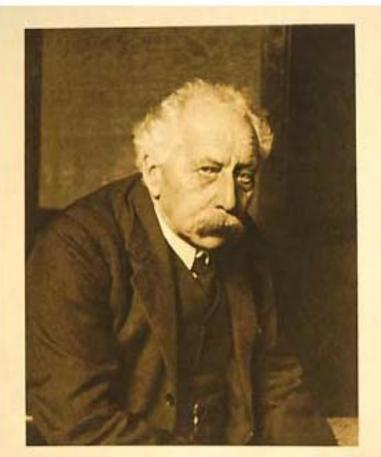
I have really expressed no opinion as to Man's origin nor am I prepared to do so at this moment. The [1865] diagram [...] expresses what I believe to be the degree of resemblance as regards the <u>spinal</u> <u>column only</u>. The [1867] diagram expresses what I believe to be the degree of resemblance as regards the <u>appendicular</u> <u>skeleton only</u>



Darwin Correspondence Project letters 7718A & 7170

"From the same facts, opposite conclusions are drawn; facts of the same kind will take us no further. [...] Need we waste more effort in these vain and sophistical disputes. If facts of the old kind will not help, let us seek facts of a new kind."

William Bateson (1894) Materials for the Study of Variation

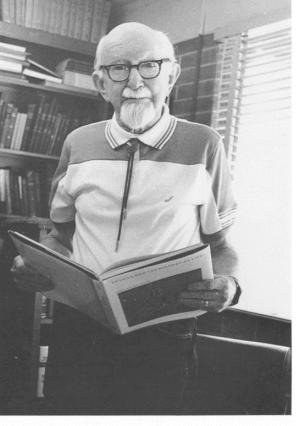


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Courtesy of American Philosophical Society, Curt Stern Papers. Noncommercial, educational use only.



https://www.dnalc.org/view/16197-Gallery-5-William-Bateson-Portrait.html



George Gaylord Simpun

"The stream of heredity makes phylogeny; in a sense, it is phylogeny. Complete genetic analysis would provide the most priceless data for the mapping of this stream"

G. G. Simpson, 1945

Proc. Natl. Acad. Sci. USA Vol. 74, No. 11, pp. 5088–5090, November 1977 Evolution

## Phylogenetic structure of the prokaryotic domain: The primary kingdoms

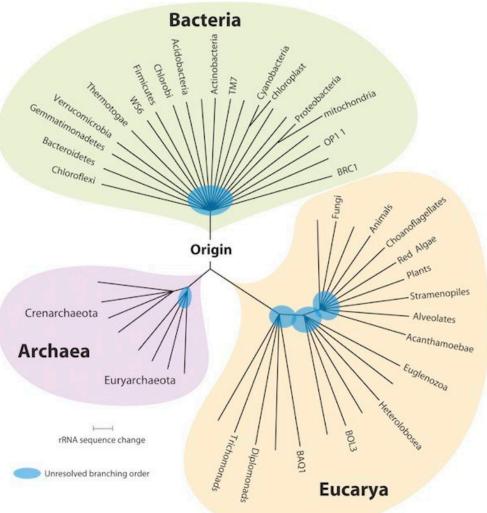
(archaebacteria/eubacteria/urkaryote/16S ribosomal RNA/molecular phylogeny)

#### CARL R. WOESE AND GEORGE E. FOX\*

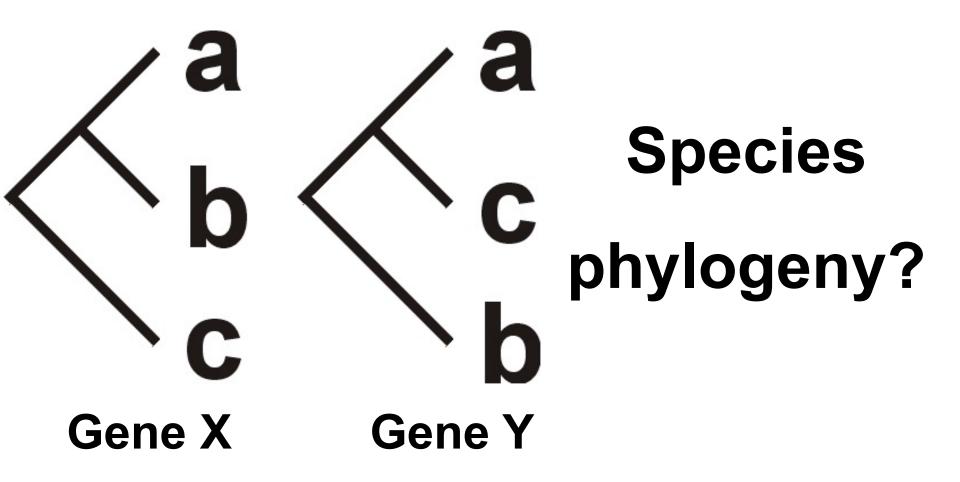
Department of Genetics and Development, University of Illinois, Urbana, Illinois

Communicated by T. M. Sonneborn, August 18, 1977

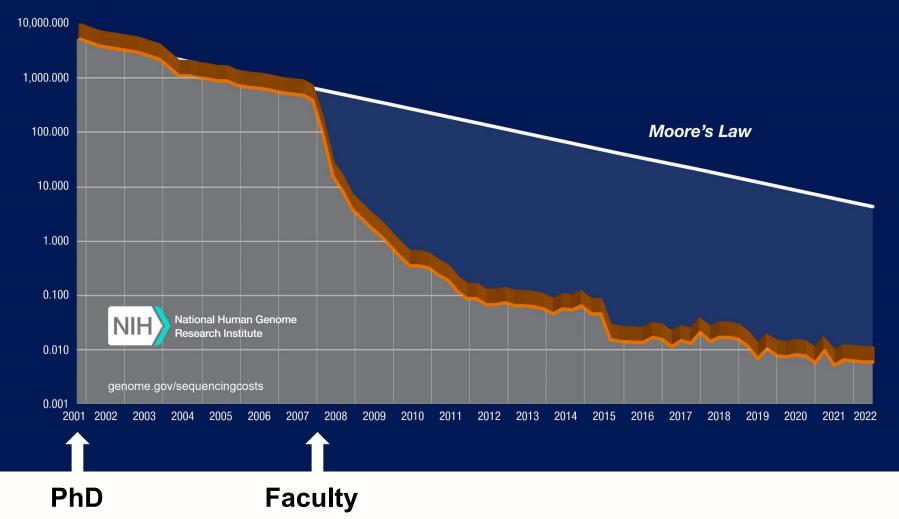
**ABSTRACT** A phylogenetic analysis based upon ribosomal RNA sequence characterization reveals that living systems represent one of three aboriginal lines of descent: (*i*) the eubacteria, comprising all typical bacteria; (*ii*) the archaebacteria, containing methanogenic bacteria; and (*iii*) the urkaryotes, now represented in the cytoplasmic component of eukaryotic cells.



## Incongruence / conflict / discordance



#### The genomics revolution



Cost per Raw Megabase of DNA Sequence

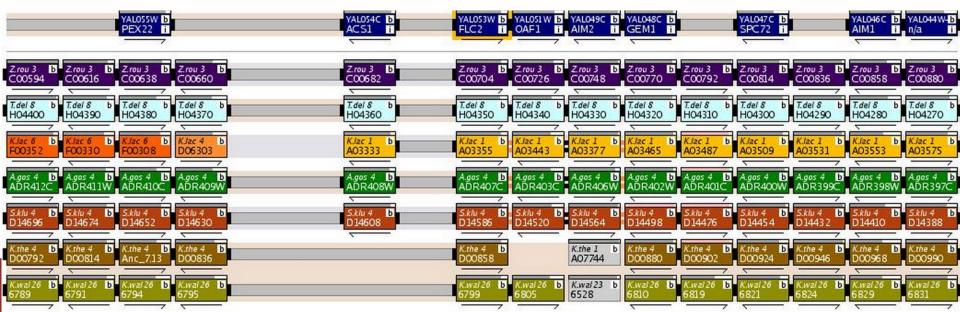


https://www.genome.gov/about-genomics/fact-sheets/DNA-Sequencing-Costs-Data

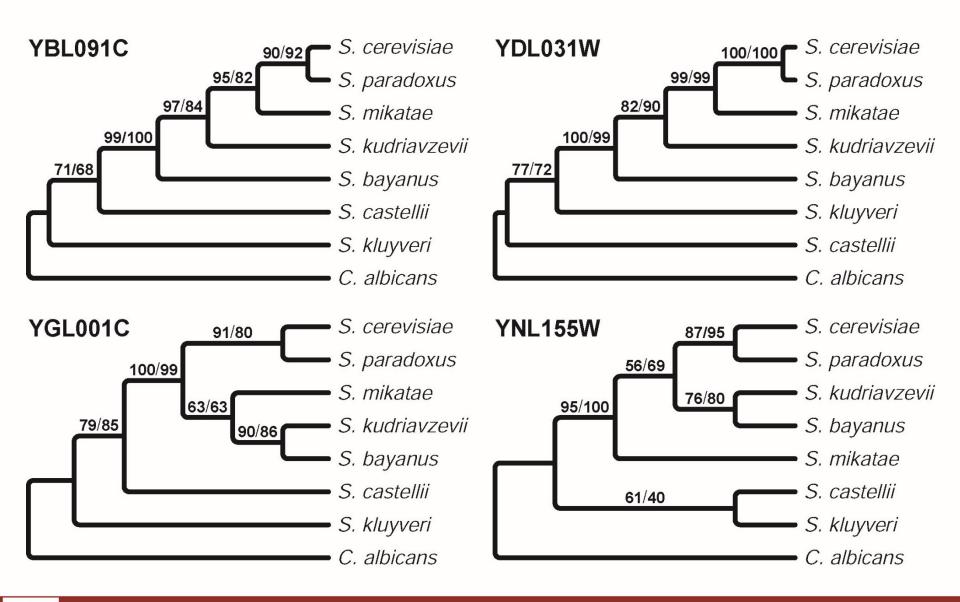
## A systematic evaluation of single gene phylogenies



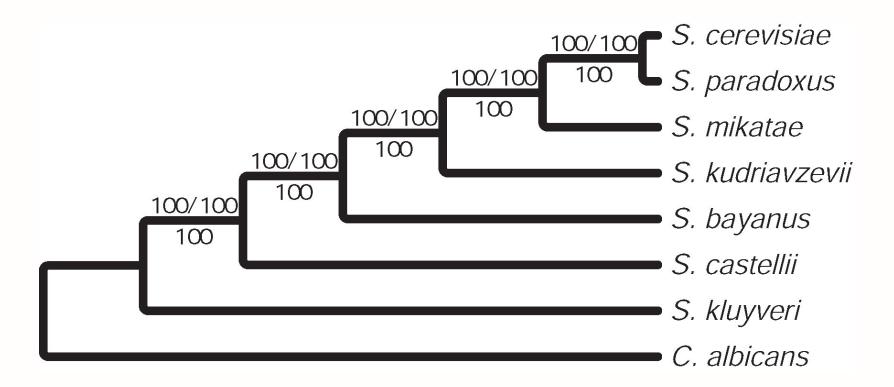
S. cerevisiae	S. bayanus
S. paradoxus	S. castellii
S. mikatae	S. kluyveri
S. kudriavzevii	Candida glabrata



#### Incongruence at the single gene level



ML / MP Anonymous Reviewer for Natur Ralasset al. (2003) Nature

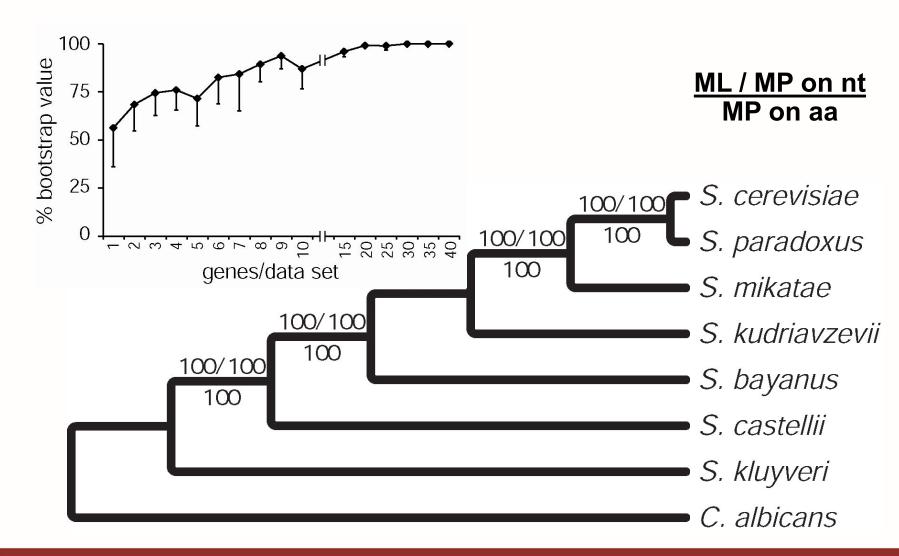


#### ML / MP on nt MP on aa



Rokas et al. (2003) Nature

#### The use of many genes eliminates incongruence





Rokas et al. (2003) Nature

## The dawn of the phylogenomics era

Syst. Biol. 61(1):150-164, 2012

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Advance Access publication on September 7, 2011

#### 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

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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

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

# Toward Resolving1Tree: The PhylogenBERNARD B.of Jakobids and Cercozoans

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

An Toward Resolving OPEN @ ACCESS Free Priors Prion-Like Proteins in the Fungal Kingdom

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

#### Towards

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

Samuli Lehtonei Department of Biology, Ul \*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

# Have we eliminated incongruence?

#### **Biological factors**

They lead to gene trees whose histories may differ from each other and from the species tree. Known factors include stochastic lineage sorting, hidden paralogy, horizontal gene transfer, recombination, hybridization / introgression, and natural selection

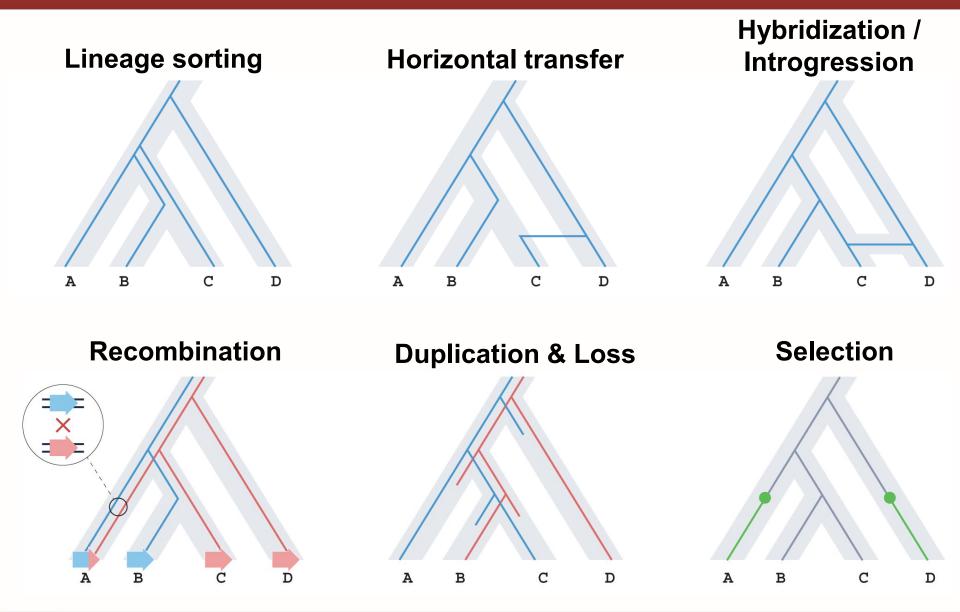
#### **Analytical factors**

They lead to failure in accurately inferring a gene tree; these can be either due to **stochastic error** (e.g., insufficient number of genes or taxa), **systematic error** (e.g., observed data deviate from model assumptions), or **treatment error** (e.g., excessive trimming)



Steenwyk et al. (2023) Nature Rev. Genet.

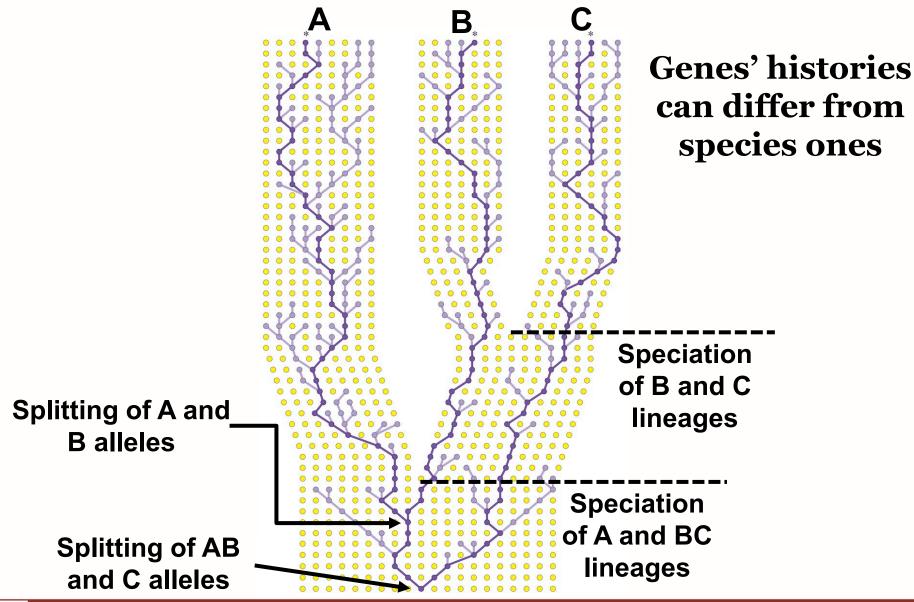
## **Biological factors**





Steenwyk et al. (2023) Nature Rev. Genet.

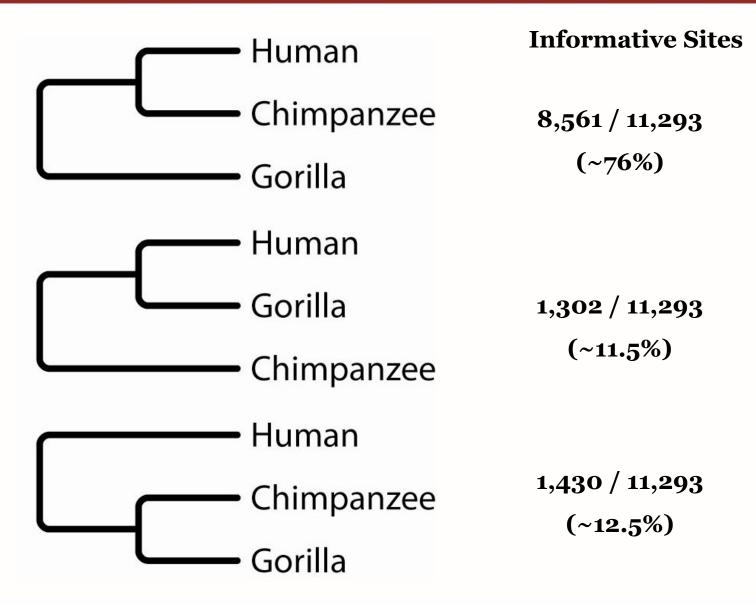
## Stochastic lineage sorting of ancestral polymorphisms



V

Nei (1987) Mol. Evol. Genet.; Maddison (1997) Syst. Biol.

#### Lineage sorting in primates

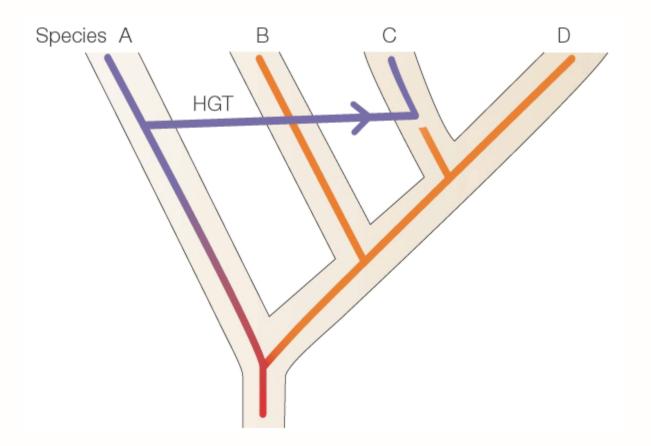




Patterson et al. (2006) Nature

### Horizontal transfer of genes

Exchange of genes between organisms other than through reproduction





Gogarten & Townsend (2005) Nature Rev. Genet.

Horizontal transfer of an entire operon in yeasts

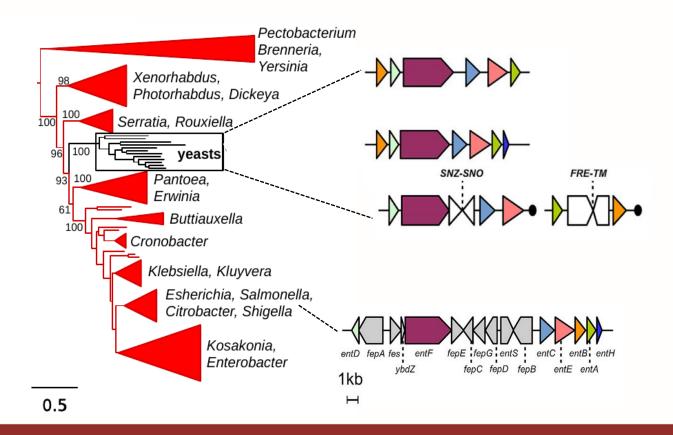
OH

ŃH ÓH

HC

HO

A clade of yeasts acquired the enterobactin operon from Enterobacteria – organisms from both lineages co-occur in insect guts, where iron is a growth-limiting factor





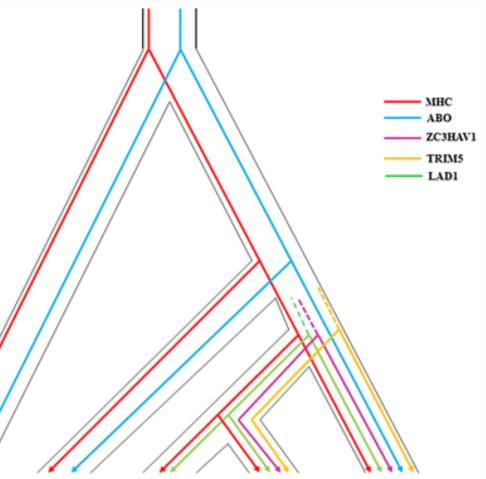
### Kominek, Doering, et al. (2019) Cell

### **Balancing selection**

Balancing selection can maintain "trans-species polymorphisms", in which the alleles are more ancient than the species

Best example: alleles at loci of the MHC – they have been retained by selection because they confer resistance to infection

Certain human MHC alleles appear to have diverged more than 65 million years ago (these alleles witnessed the extinction of dinosaurs!!!)

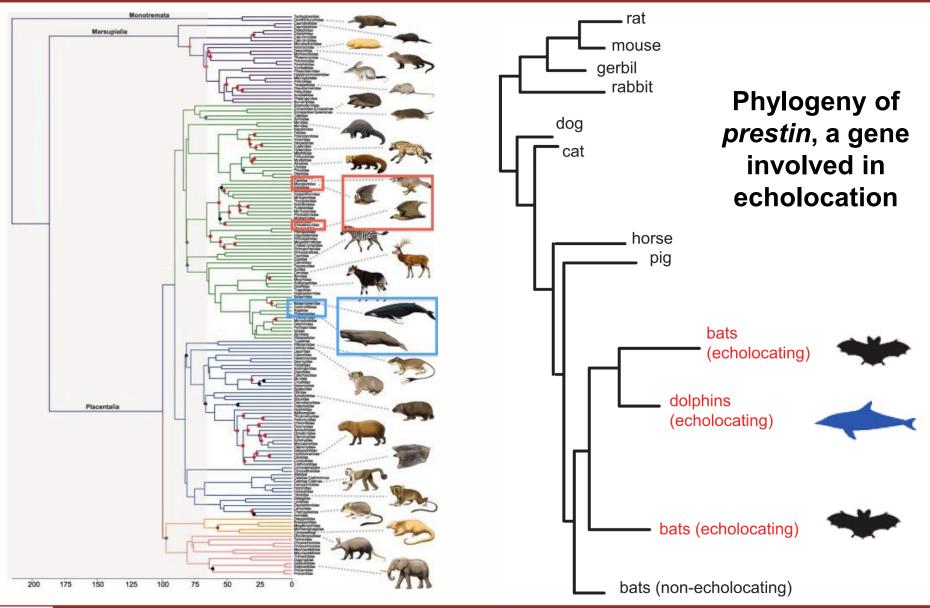


Pongo pygmaeus Gorilla gorilla Pan paniscus Pan troglodytes Homo sapiens



### Azevedo et al. (2015) Human Genomics

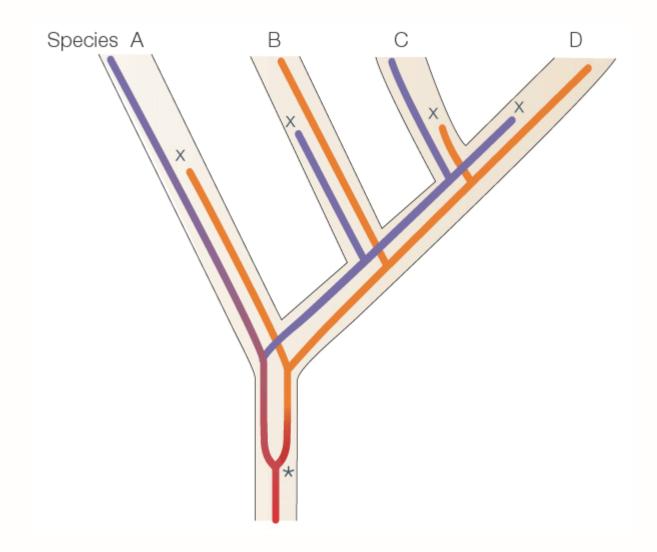
### **Positive selection**



V

Li et al. (2010) Curr. Biol.

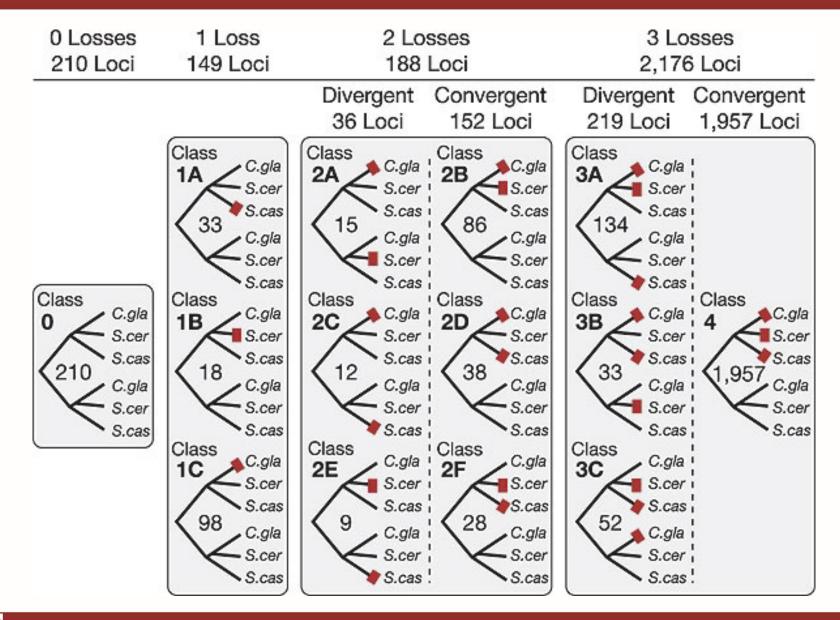
### Gene duplication and loss





Gogarten & Townsend (2005) Nature Rev. Genet.

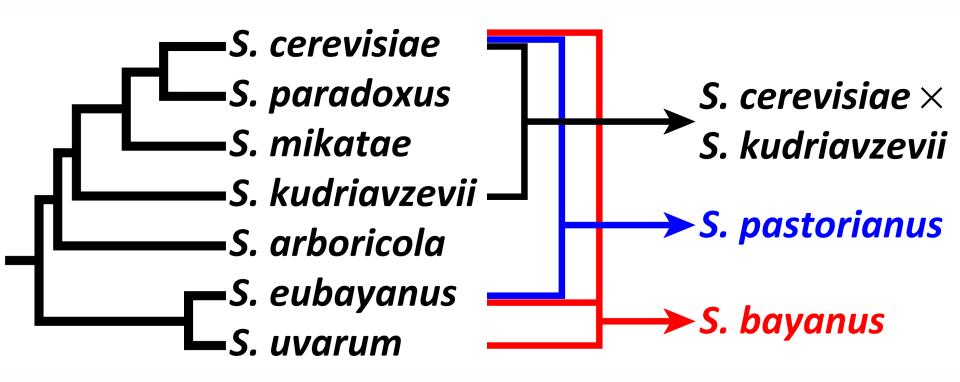
### Gene duplication and loss



### Scannell et al. (2006) Nature



### Hybridization and introgression



S. eubayanus was discovered in 2011 – until then, S. bayanus was thought to be a "pure" species

S. cerevisiae – S. paradoxus divergence ≈ human – mouse divergence S. cerevisiae – S. uvarum divergence ≈ human – chicken divergence



Hittinger (2013) Trends Genet.

### **Analytical factors**

### a Taxon selection

Taxon 1	Taxon 2	Taxon 3	Taxon 4	
				<ul> <li>Insufficient taxon sampling</li> <li>Insufficient locus sampling</li> </ul>
				<ul> <li>Fast-evolving lineages</li> <li>Rogue taxa</li> </ul>
				<ul> <li>Outgroup choice</li> </ul>

### **b** Orthology inference

Taxon 1	Taxon 2	Taxon 3	Taxon 4	
				<ul> <li>Sequence length biases</li> <li>Erroneous orthologue inference (hidden paralogy and orthology)</li> </ul>

### C Alignment and site trimming

Taxon 1	MPSQPVQ	Taxon 1 MGHYEEN	Taxon 1 MSP-VKG-PR	- Missligement
Taxon 2	MPSQPVQ	Taxon 2 MLRY	Taxon 2 MSPTVKPR	<ul> <li>Misalignment</li> <li>Excessive trimmin</li> </ul>
Taxon 3	MPSQPYVQVQ	Taxon 3 MGHL-YEEN	Taxon 3 MSPTVKGIPR	<ul> <li>Inappropriate reco</li> </ul>
Taxon 4	MQPYVQVQ	Taxon 4 MLRYEEN	Taxon 4 MSKGI-R	<ul> <li>Inappropriate rect</li> </ul>

#### d Selection of substitution model

Site-ho	mogeneous model	Site-homogeneous with partitioning
Taxon 1		Taxon 1
Taxon 2		Taxon 2
Taxon 3		Taxon 3
Taxon 4		Taxon 4

Taxon 1			l			l		
Taxon 2	Į.		ł			ł		
Taxon 3	J.		ł			ł		
Taxon 4			l			l		

Taxon 1	l	•		ļ		-	l		
Taxon 2	ų			ł		-	k	ł	
Taxon 3	ų			ł			k	ł	
Taxon 4	ų			ł			k		

### Long-branch attraction

- Model misspecification
- · Inadequate model complexity

Contributor of incongruence

### e Method of tree inference



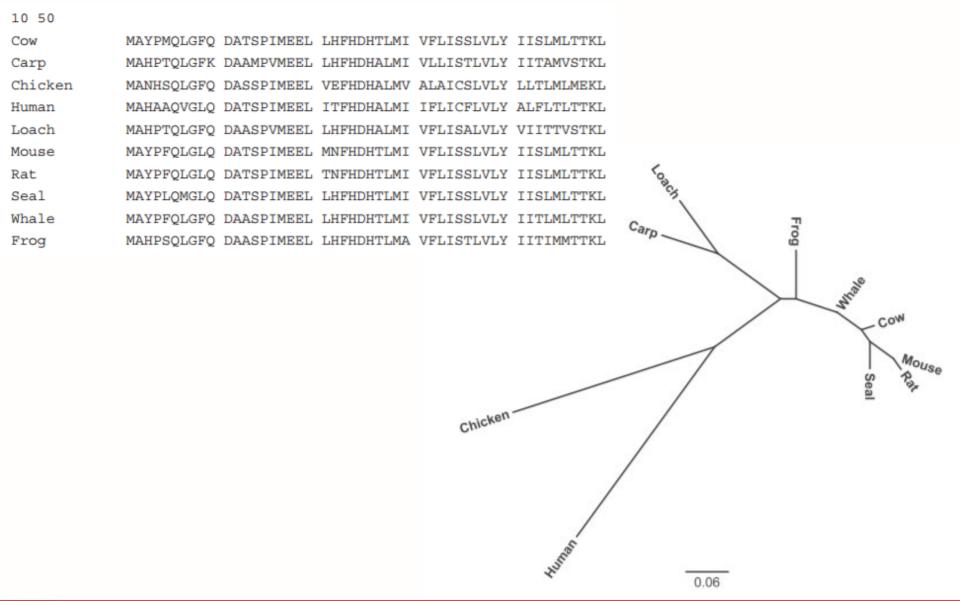
Irreproducibility

Single-locus accuracy



### Steenwyk et al. (2023) Nature Rev. Genet.

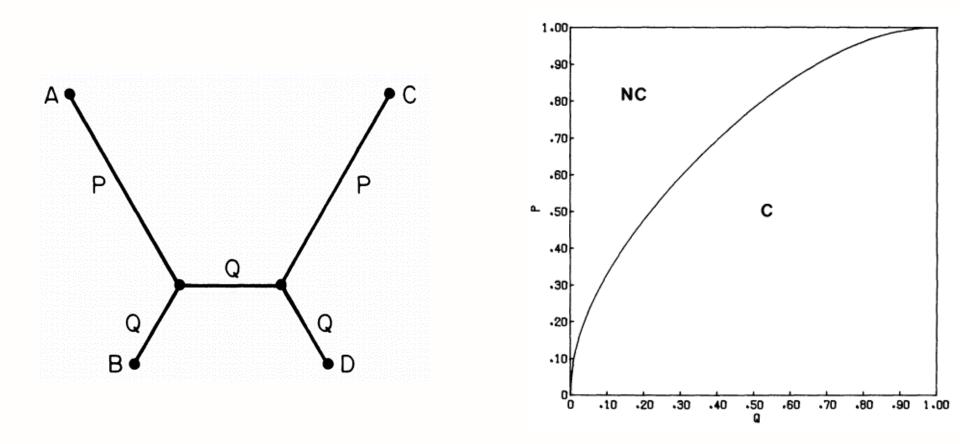
### Sampling error





Rokas (2011) Curr. Prot. Mol. Biol.

### Systematic error

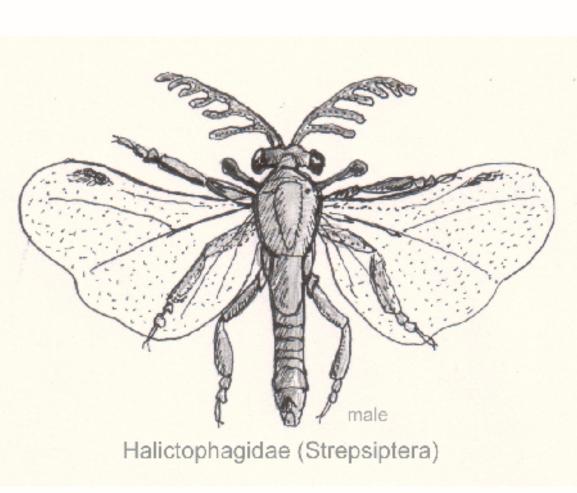


## Long branch attraction



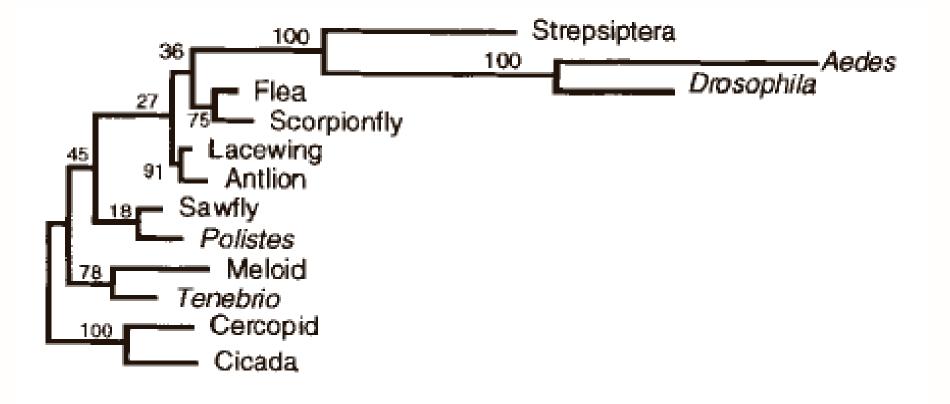
Felsenstein (1978) Syst. Zool.

### "The Strepsiptera Problem" is a classic example of LBA





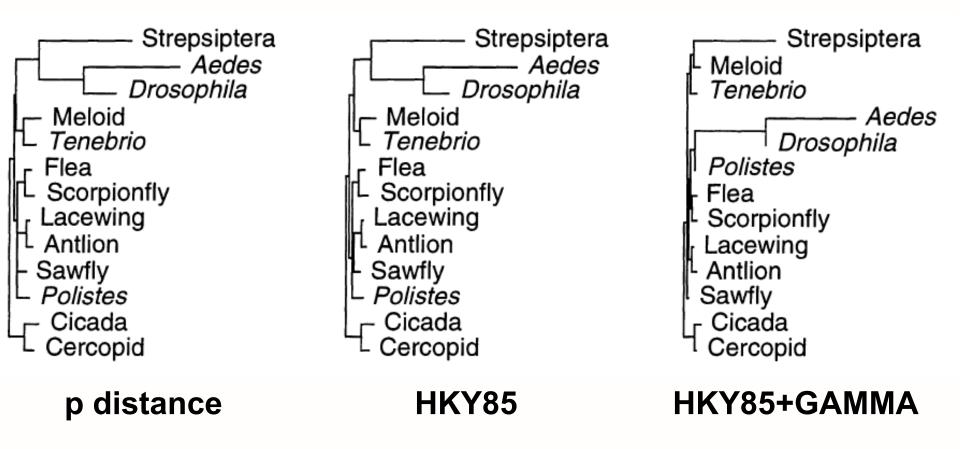
### The Strepsiptera Problem





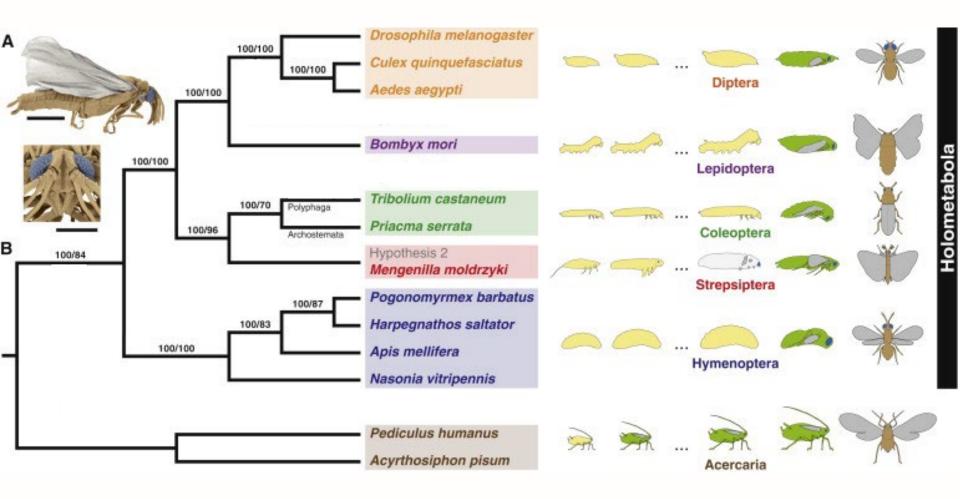
Carmean & Crespi (1995) Nature

### The Strepsiptera Problem





Huelsenbeck (1997) Syst. Biol.





Niehuis et al. (2012) Curr. Biol.

### **Multiple sequence alignment**

**Alignment trimming** 

**Character recoding** 

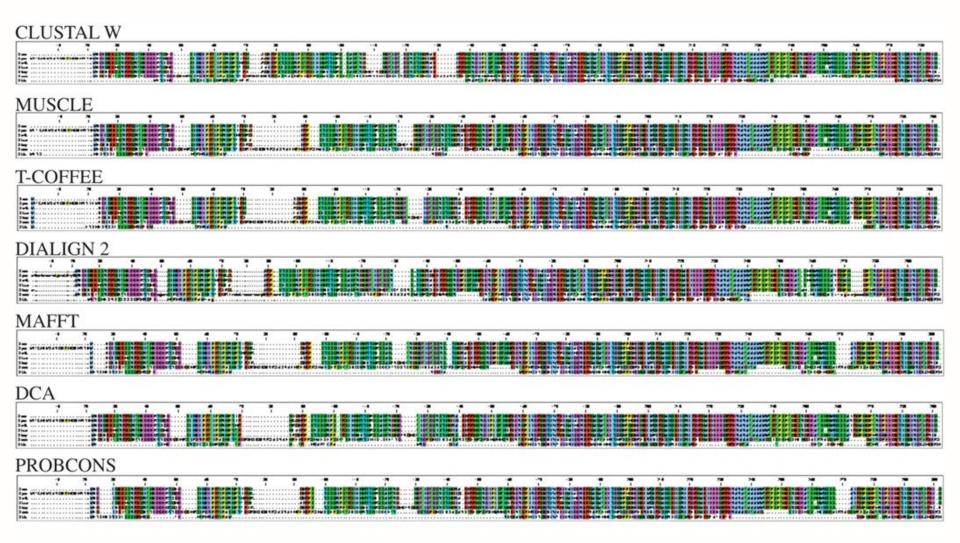
Irreproducibility



- - -

Steenwyk et al. (2023) Nature Rev. Genet.

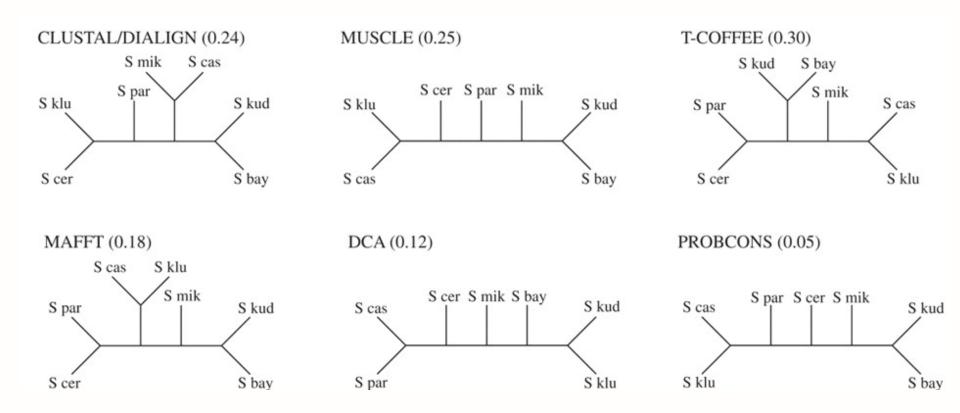
### Multiple sequence alignment





Wong et al. (2008) Science

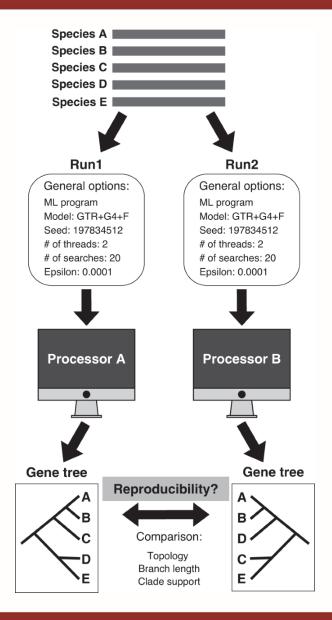
### 7 tools produce 6 different topologies





Wong et al. (2008) Science

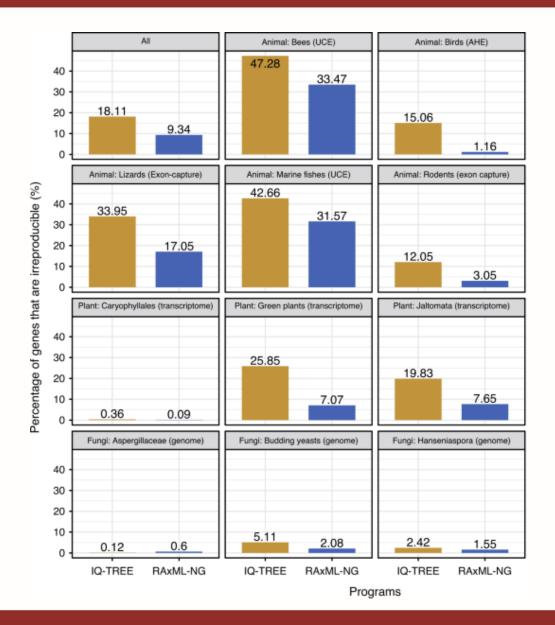
### What is the reproducibility of our analyses?





### Shen et al. (2020) Nature Comm.

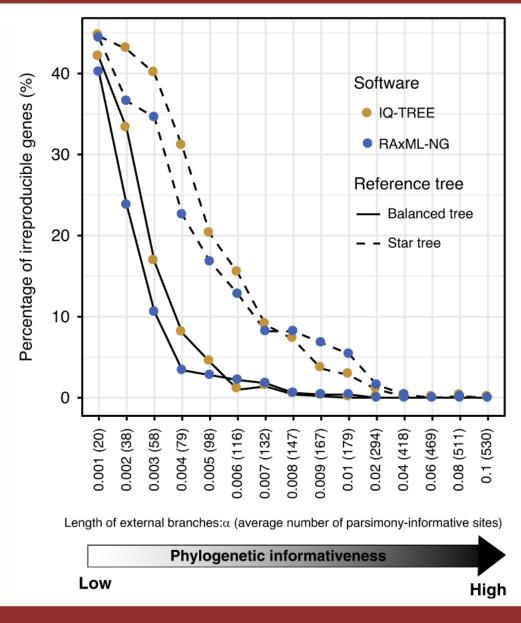
### 9-18% of gene trees are irreproducible





Shen et al. (2020) Nature Comm.

### Genes yielding irreproducible trees are less informative





### Shen et al. (2020) Nature Comm.

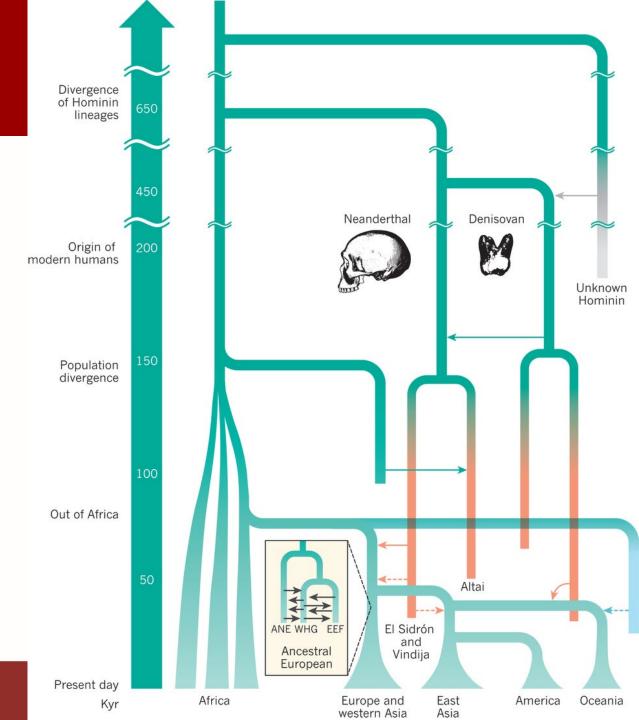
We have not eliminated incongruence but now better understand the biological and analytical contributing factors and their impact; sources vary by lineage and depth

# Inference at shallow depths is easier:

analytical factors

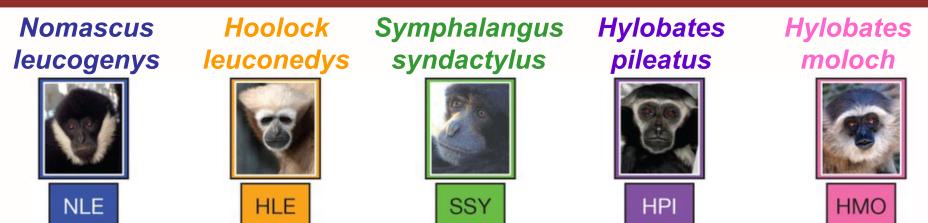
# **biological factors**

# The evolution of hominids



Nielsen et al. (2017) Nature

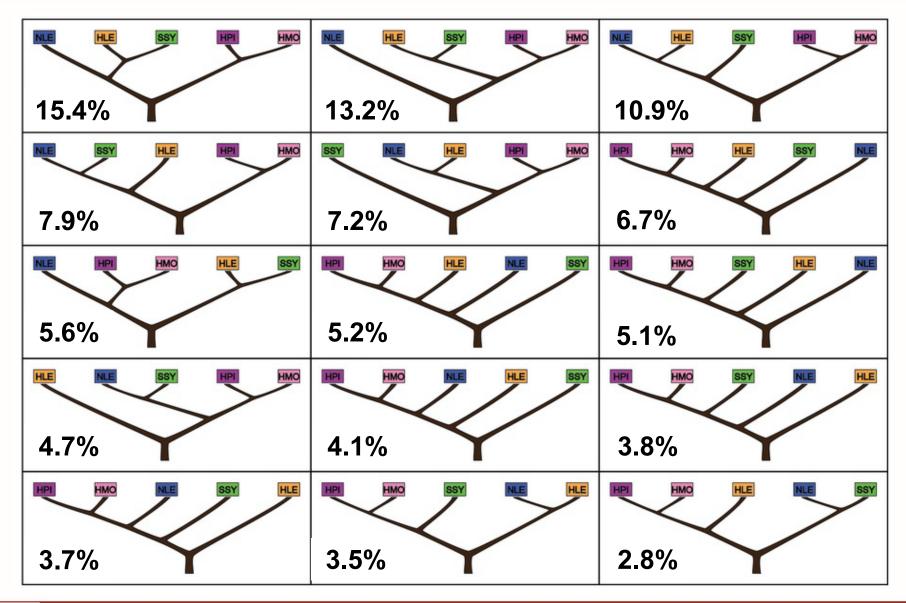
### The phylogeny of primate genera





Carbone et al. (2014) Nature

### "Easier" doesn't mean "easy"!





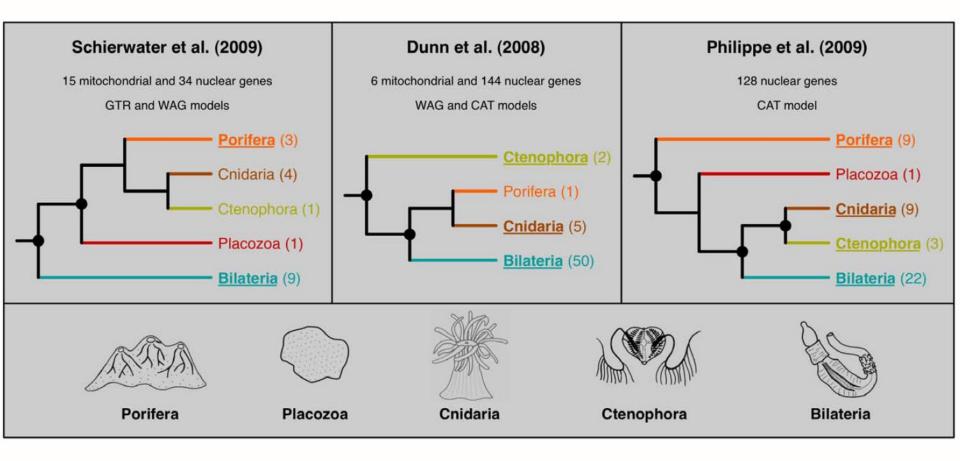
Carbone et al. (2014) Nature

# Inference in deep time can be more challenging:

# analytical factors

# biological factors

### Incongruence in deep time





Philippe et al. (2011) PLoS Biol.

### Incongruence in deep time

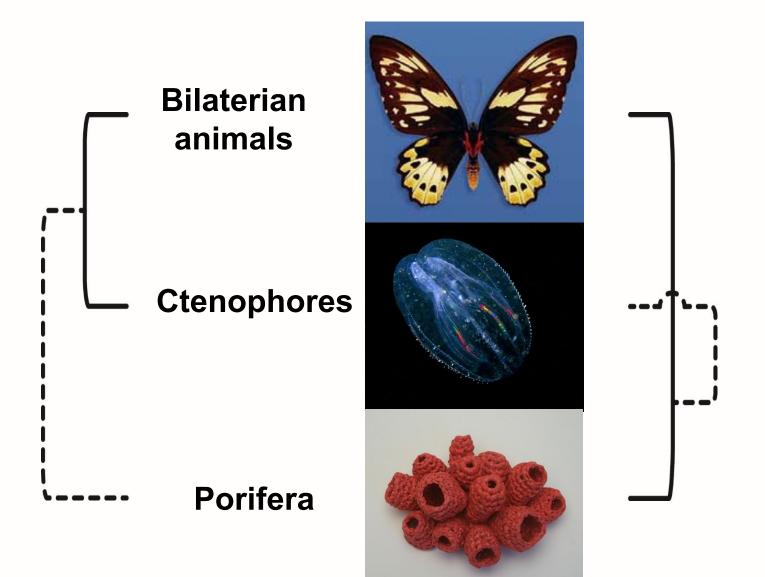




Kocot et al. (2011) Nature

Smith et al. (2011) Nature

### Incongruence in deep time





Pisani et al. (2015) PNAS

Chang et al. (2015) PNAS

### Lecture outline

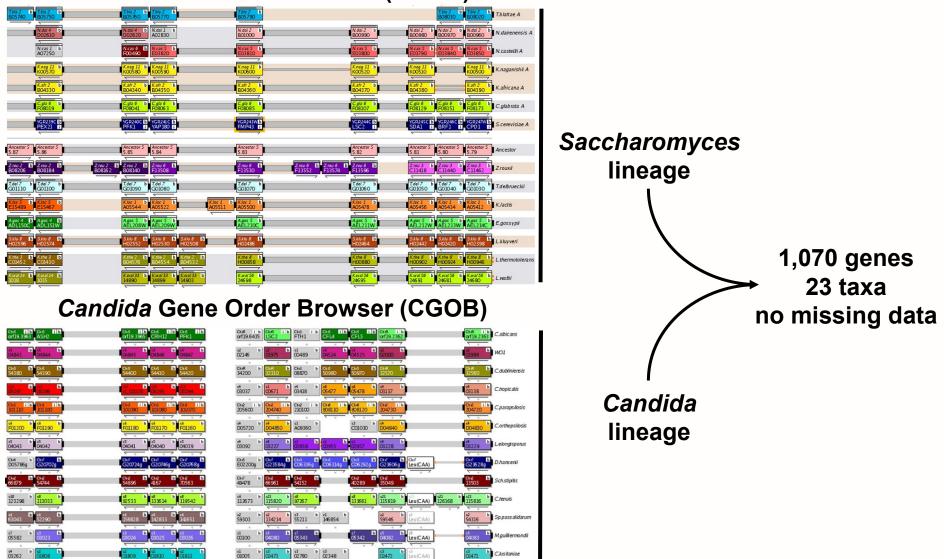
## Incongruence and its causes

## ----- Coffee Break ------

 Handling incongruence in phylogenomic data

### An expanded yeast data matrix

### Yeast Gene Order Browser (YGOB)

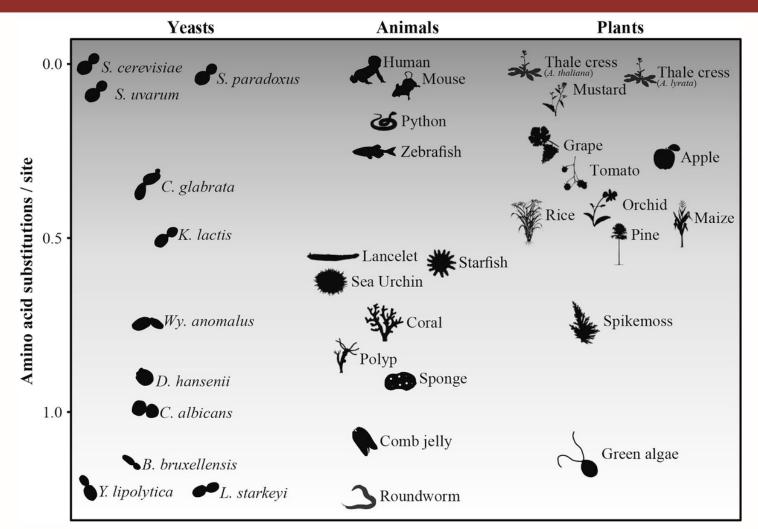




Byrne & Wolfe (2005) Genome Res.

Fitzpatrick et al. (2010) BMC Genom.

### Yeasts exhibit striking genomic diversity

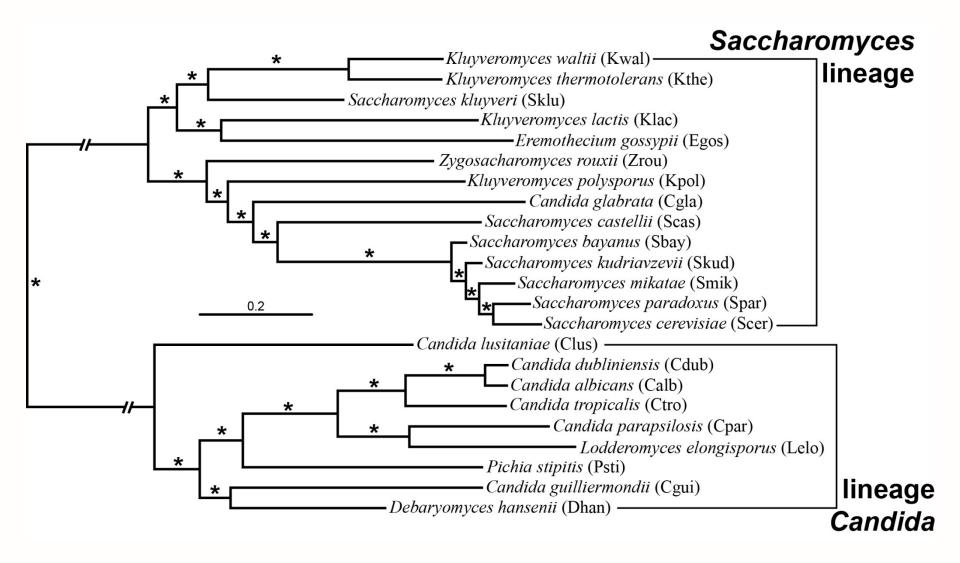


Saccharomyces, Candida, Kluyveromyces, etc. are all polyphyletic genera



### Shen, Opulente, Kominek, Zhou et al. (2018) Cell

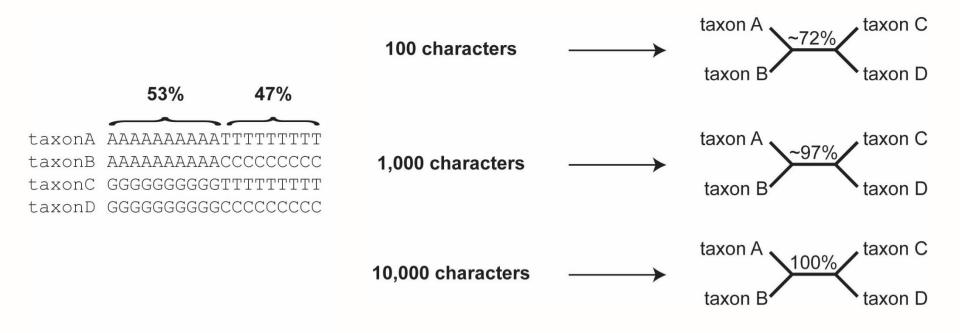
### Concatenation yields an absolutely supported phylogeny





Salichos & Rokas (2013) Nature

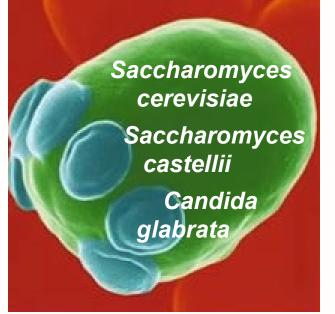
### Bootstrap support is misleading when used in large datasets

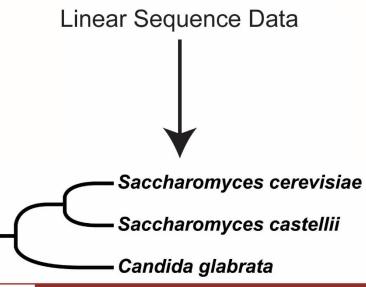


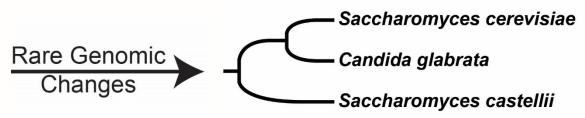


Rokas & Carroll (2006) PLoS Biol.

### The concatenation phylogeny is at least partly wrong



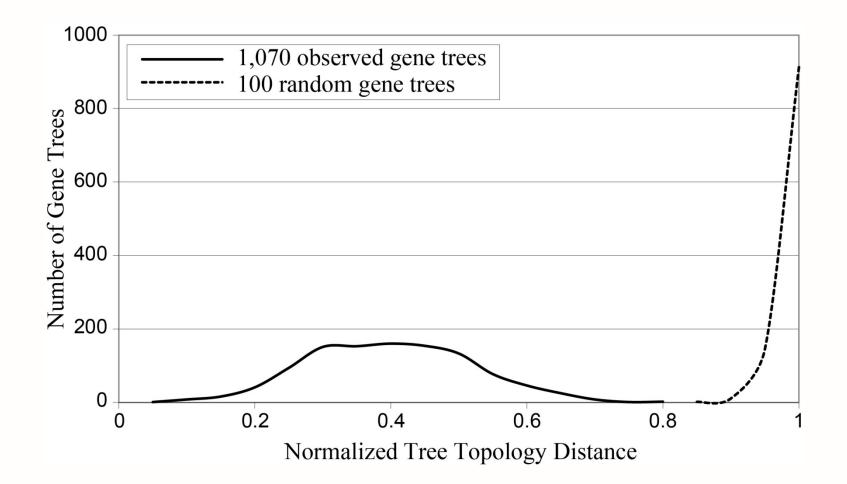




- 5 genomic rearrangements that are uniquely shared by *S. cerevisiae* and *C. glabrata*
- Much higher proportion of shared gene losses in S. cerevisiae and C. glabrata
- Bias in the placement of C. glabrata as an outgroup of S. cerevisiae and S. castellii

## V

### Scannell et al. (2006) Nature





Salichos & Rokas (2013) Nature

### Gene trees are incongruent in most datasets



### Zhong et al. (2013) Trends Plant Sci.

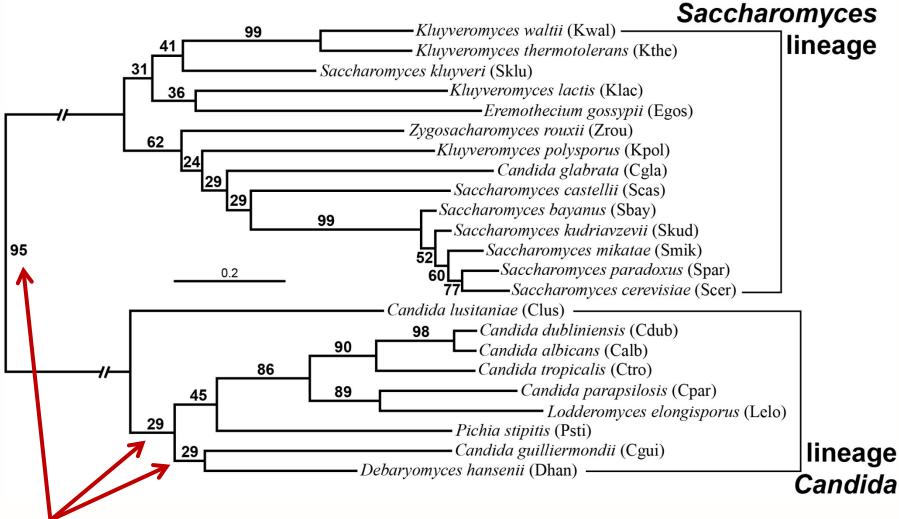
Song et al. (2012) PNAS

### 1,070 / 1,070 14,536 / 14,536

Salichos & Rokas (2013) Nature

Jarvis et al. (2014) Science

#### The yeast phylogeny inferred by majority-rule consensus



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



#### Gene and site concordance factors

# New Methods to Calculate Concordance Factors for Phylogenomic Datasets

Bui Quang Minh <sup>(i)</sup>, <sup>1,2</sup> Matthew W. Hahn,<sup>3,4</sup> and Robert Lanfear<sup>\*,2</sup>
<sup>1</sup>Research School of Computer Science, Australian National University, Canberra, ACT, Australia
<sup>2</sup>Department of Ecology and Evolution, Research School of Biology, Australian National University, Canberra, ACT, Australia
<sup>3</sup>Department of Biology, Indiana University, Bloomington, IN
<sup>4</sup>Department of Computer Science, Indiana University, Bloomington, IN **Correspondence to:** \*Corresponding author: E-mail: rob.lanfear@anu.edu.au. **Associate editor:** Michael Rosenberg

#### Abstract

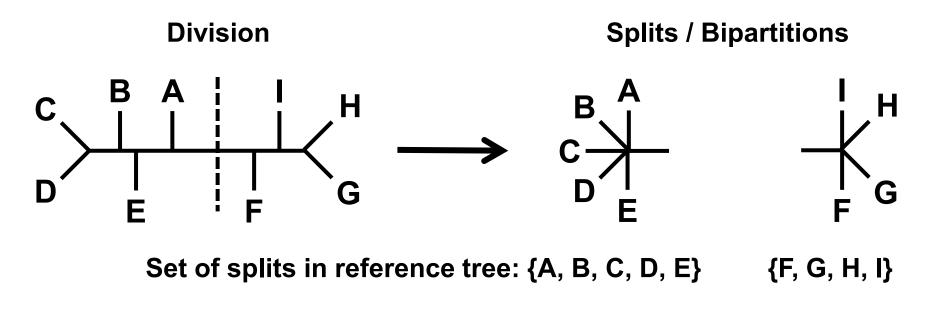
We implement two measures for quantifying genealogical concordance in phylogenomic data sets: the gene concordance factor (gCF) and the novel site concordance factor (sCF). For every branch of a reference tree, gCF is defined as the percentage of "decisive" gene trees containing that branch. This measure is already in wide usage, but here we introduce a package that calculates it while accounting for variable taxon coverage among gene trees. sCF is a new measure defined as the percentage of decisive sites supporting a branch in the reference tree. gCF and sCF complement classical measures of branch support in phylogenetics by providing a full description of underlying disagreement among loci and sites. An easy to use implementation and tutorial is freely available in the IQ-TREE software package (http://www.iqtree.org/doc/Concordance-Factor, last accessed May 13, 2020).

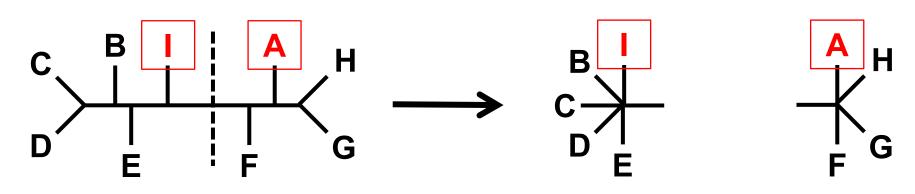
Key words: phylogenetic inference, concordance factor, phylogenomics.



#### Minh et al. (2020) Mol. Biol. Evol.

#### Phylogenetic trees are sets of splits / bipartitions





Conflicting set of splits: {I, B, C, D, E} {F, G, H, A}

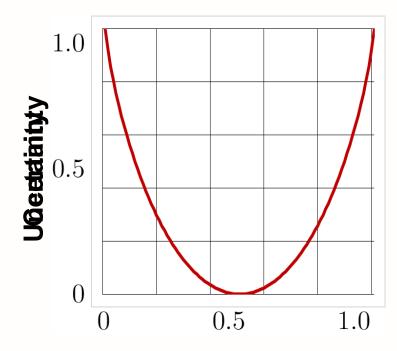
#### Quantifying incongruence

#### Internode Certainty (IC): a

measure of the support for a given internode (bipartition) by considering its frequency in a given set of trees jointly with that of the most prevalent conflicting bipartition in the same set of trees

Tree Certainty (TC): the sum of IC values across all internodes

#### Implemented in RAxML and QuartetScores (https://github.com/lutteropp/QuartetS cores)

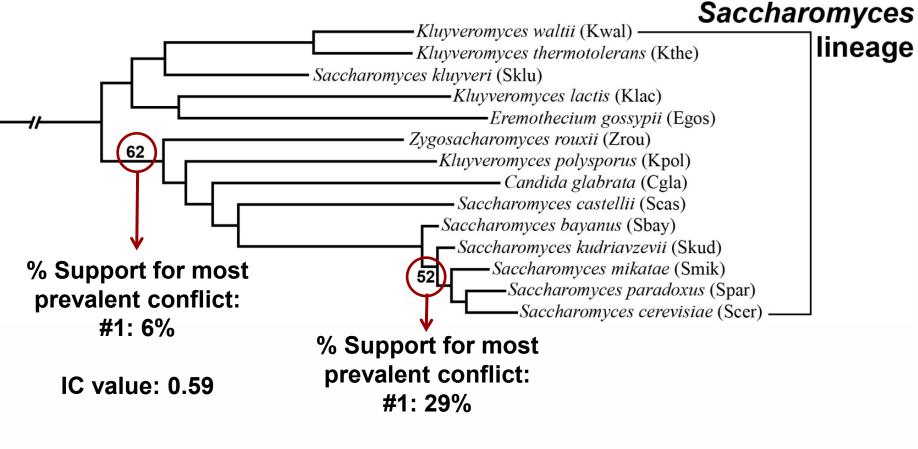


Ratiticooff Beapts/italits" Two Conflicting Bipartitions



Salichos et al. (2014) Mol. Biol. Evol.; Kobert et al. (2016) Mol. Biol. Evol.; Zhou et al. (2020) Syst. Biol.

#### IC is a more informative measure of branch support

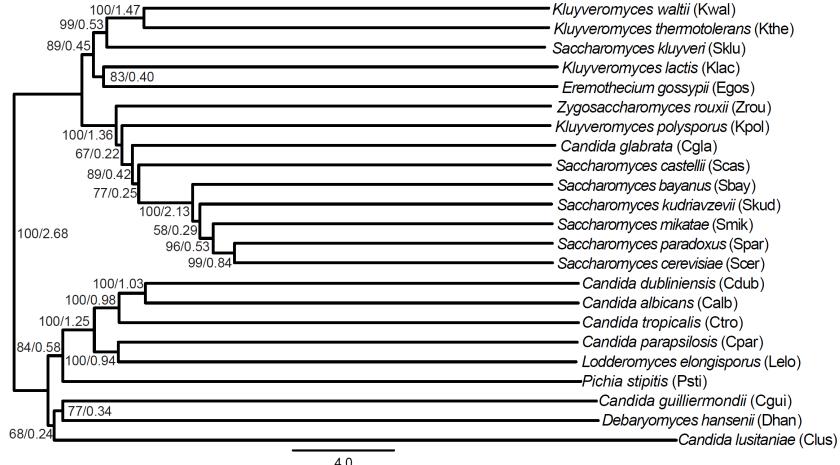


IC value: 0.06



### Coalescent-based inference of the yeast phylogeny

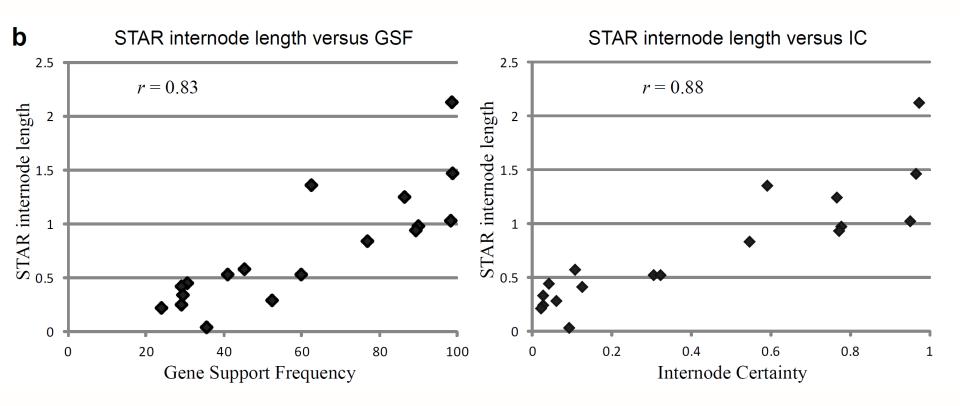
The yeast species phylogeny inferred using the STAR species tree method



#### Coalescent units / IC

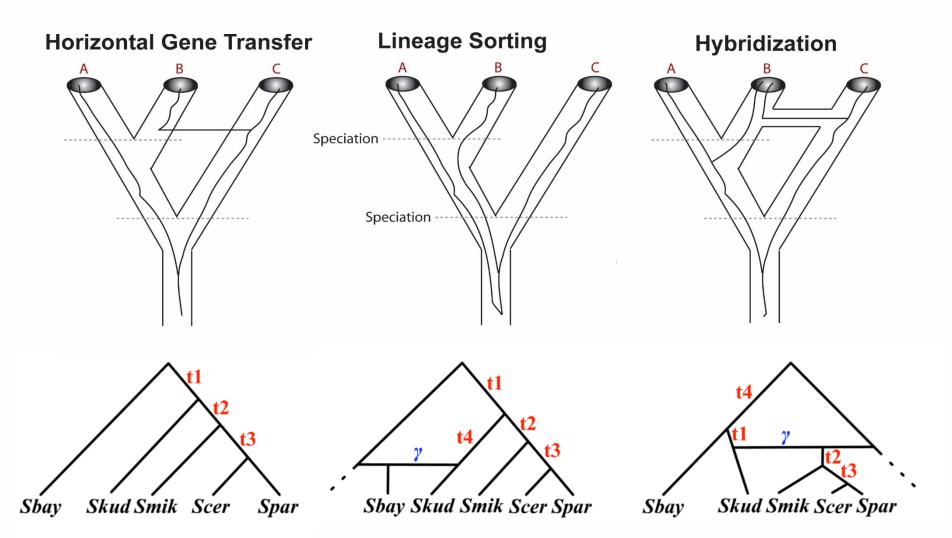


#### Coalescent branch lengths are correlated with GSF/IC





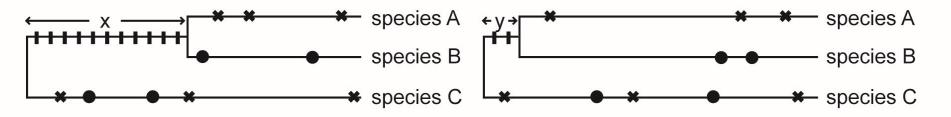
#### Why so much incongruence? Biological factors



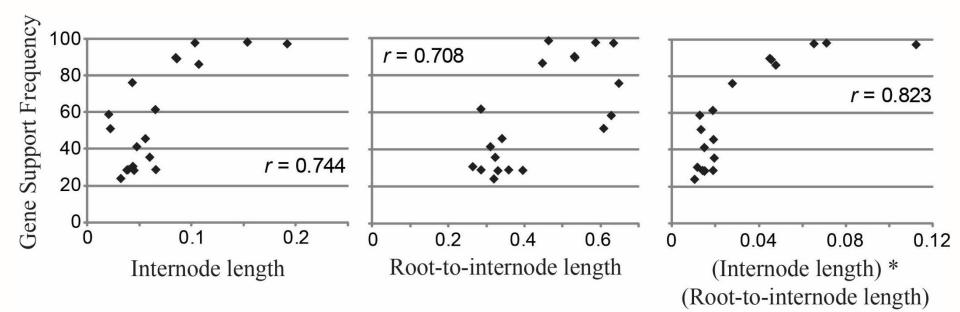


Yu et al. (2012) PLOS Genet.

#### Why so much incongruence? Analytical factors



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





Rokas & Carroll (2006) PLOS Biol.

#### Certain recipes for handling incongruence didn't help

Treatment	Tree Certainty	# of Internodes where IC increased   decreased
Default analysis	8.35	n/a
Removing sites containing gaps		
All sites with gaps excluded	7.91	<b>0</b>   7
Removing fast-evolving or unstable species		
C. lusitaniae	8.15	1   2
C. glabrata	8.30	2   2
E. gossypii, C. glabrata, K. lactis	7.88	1   3
Selecting genes that recover specific clades		
[C. tropicalis, C. dubliniensis, C. albicans]	8.62	<b>0</b>   <b>0</b>
Selecting the most slow-evolving genes		
100 slowest-evolving genes	6.76	2   9
Salichos & Rokas (2013) Nature		

#### What do we do then?

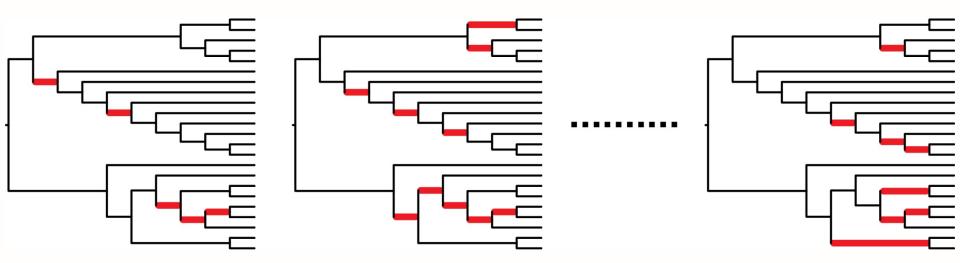
Treatment	Tree Certainty	# of Internodes where IC increased   decreased
Default analysis	8.35	n/a

Selecting genes whose bootstrap consensus trees have high average support

All genes with average BS $\ge 60\%$	8.59	4   O
All genes with average BS $\ge 70\%$	9.18	14   0
All genes with average BS ≥ 80%	9.92	15   0
average BS ≥60% averag	ge BS ≥70%	average BS ≥80%
100 S. cerevisiae	– S. cerevisiae	95 S. cerevisiae
S. castellii	– S. castellii	C. glabrata
C. glabrata	– C. glabrata	S. castellii



#### Selecting specific bipartitions dramatically improves phylogeny



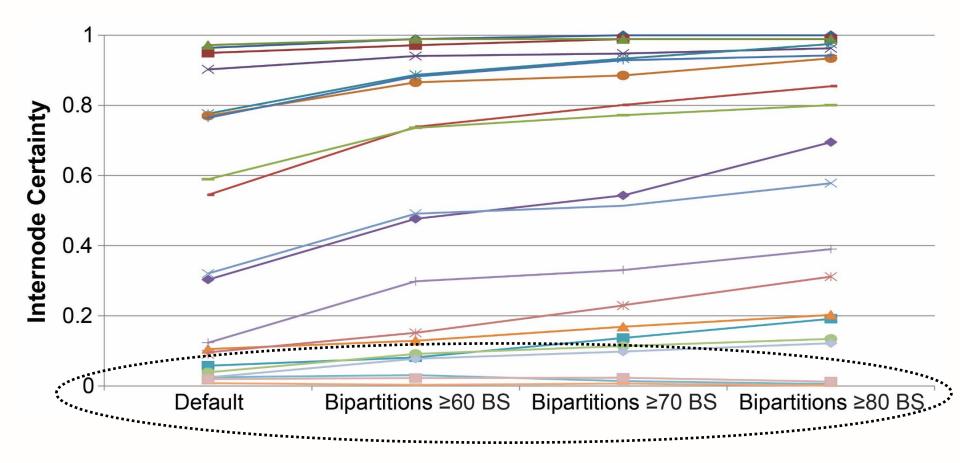
Treatment	Tree Certainty	# of Internodes where IC increased   decreased
Default analysis	8.35	n/a

Selecting genes whose bootstrap consensus trees have high average support

All bipartitions with BS $\ge$ 60%	10.11	14   0
All bipartitions with BS $\ge$ 70%	10.70	16   0
All bipartitions with BS $\ge$ 80%	11.32	15   0

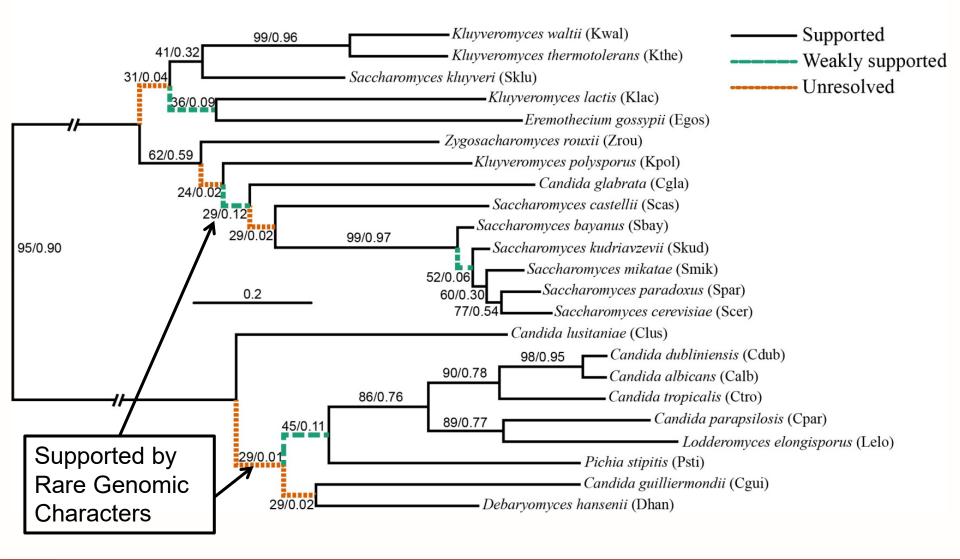


#### Least supported internodes harbor the most conflict





#### The status of the yeast phylogeny





Gene Support Frequency (or gene Concordance Factor) / Internode Certainty

Similar results in other lineages

# Vertebrates (1,086 genes, 18 taxa)

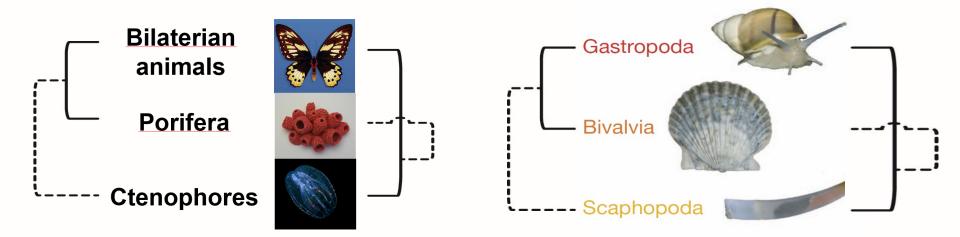
# Animals (225 genes, 21 taxa)

# Mosquitoes (2,007 genes, 20 taxa)



Salichos & Rokas (2013) Nature; Wang et al. (2015) Genome Biol. Evol.

#### Incongruence in phylogenomic datasets



Hypothesis: these debates concern internodes that are poorly supported by individual gene trees

Test: measure the phylogenetic signal in contentious branches of the tree of life

#### Definitions of phylogenetic signal

A measure of the statistical dependence among species' trait values due to their phylogenetic relationships / the tendency of related species to resemble each other more than species drawn at random from the same tree

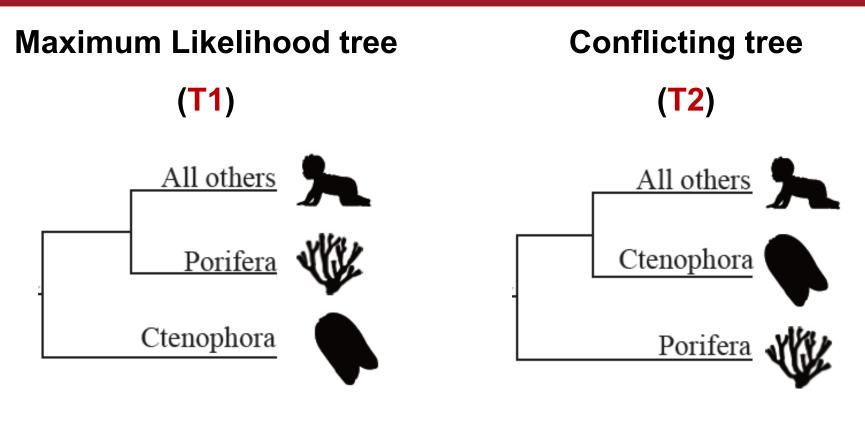
> Revell et al. (2008) Syst. Biol. Münkemüller et al. (2012) Methods Ecol. Evol.

The amount of support for a particular topology, e.g., the relative number of resolved internodes in a consensus tree Sanderson (2008) Science

A measure of the substitutions occurring along a given branch of the evolutionary tree. In parsimony methods, the signal is encoded in shared derived characters. In probabilistic methods, the amount of phylogenetic signal actually extracted from a given dataset depends on the model and is expected to increase with the fit of the model to the data

> Philippe et al. (2011) PLoS Biol. Townsend et al. (2012) Syst. Biol.

#### **Our definition**



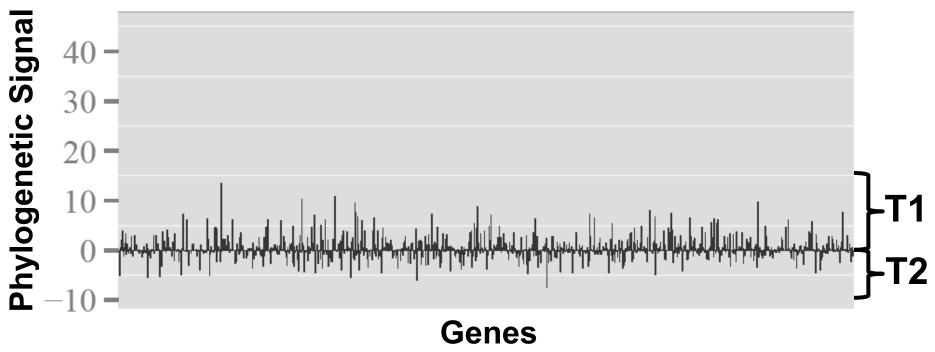
 $\ln(T_1|X_i) = -100$   $\ln(T_2|X_i) = -150$ 

Phylogenetic Signal =  $-(\ln(T_1|X_i) - \ln(T_2|X_i))$ 



Signal of genes in a phylogenomic data matrix

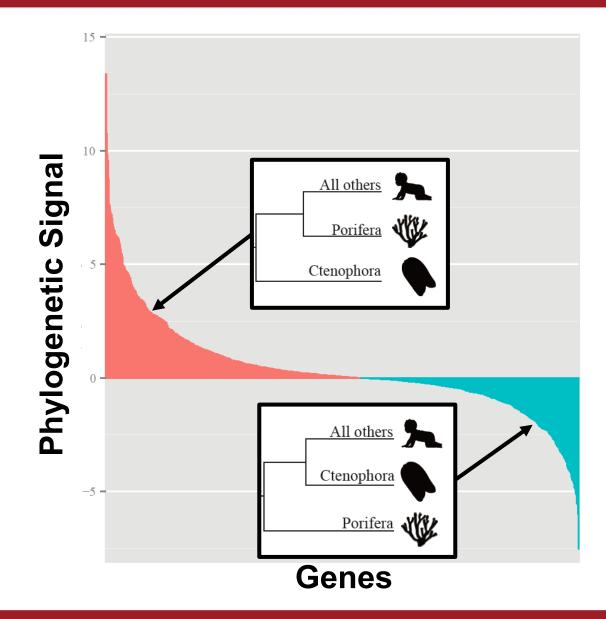
#### 1,080 genes from 36 animal taxa



V

Shen et al. (2017) Nature Ecol. Evol.; data from Borowiec et al. (2015) BMC Genomics

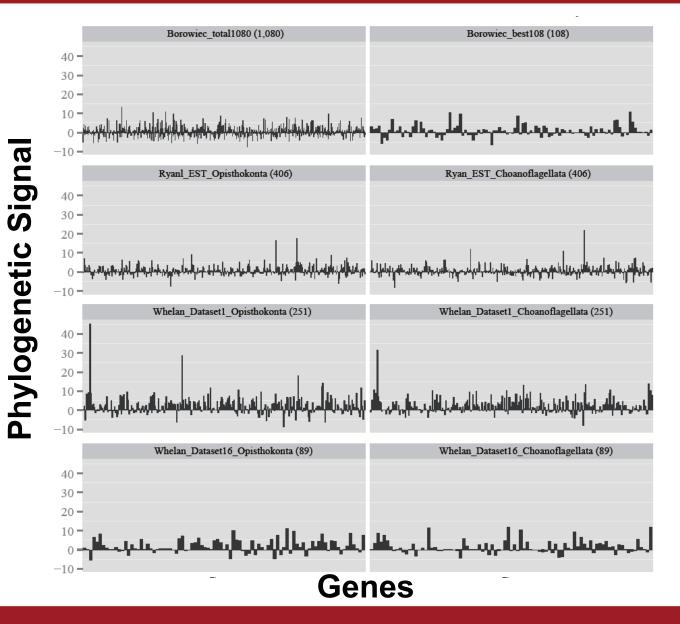
#### Signal of genes in a phylogenomic data matrix





Shen et al. (2017) Nature Ecol. Evol.

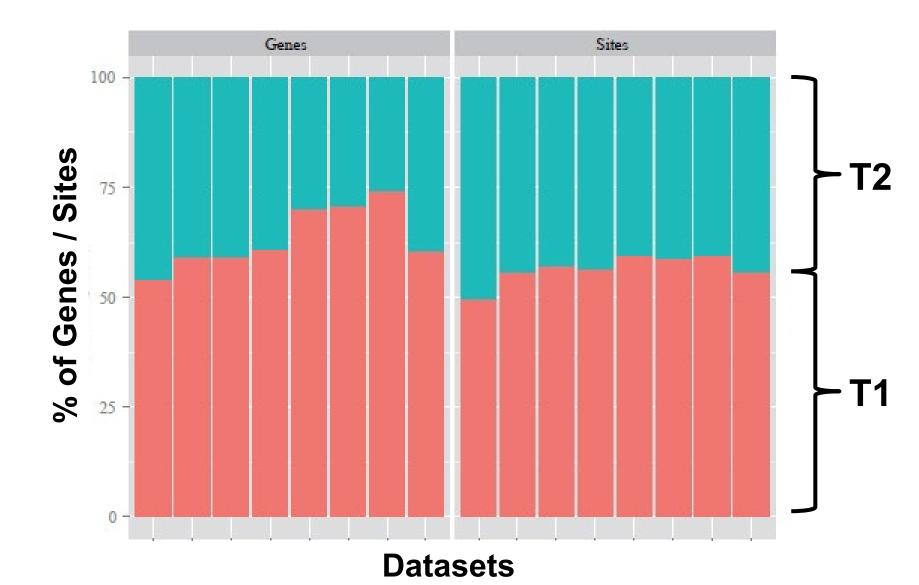
#### Signal of genes in multiple phylogenomic data matrices



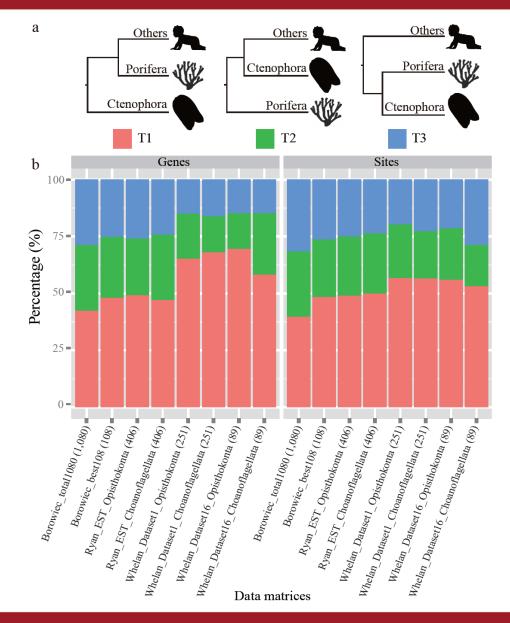


Shen et al. (2017) Nature Ecol. Evol.

#### Summarizing phylogenetic signal across genes and sites



#### Summarizing the signal across all 3 possible topologies





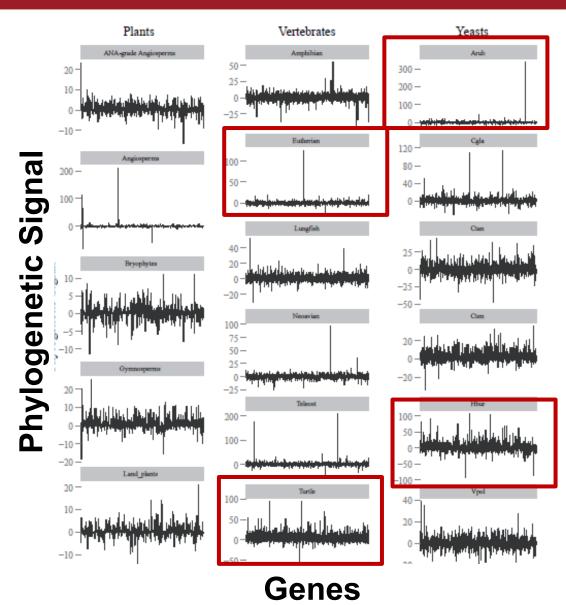
Shen et al. (2017) Nature Ecol. Evol.

#### Testing several contentious branches of the tree of life

Clade	ML Tree (T1)	Conflicting Tree (T2)
Plants	Amborella as sister to all other flowering plants	Amborella + Nuphar as sister to all other flowering plants
	Magnoliids as sister to Eudicots + Chloranthales	Eudicots as sister to Magnoliids + Chloranthales
	Hornworts as sister to all other land plants, followed by a	Hornworts as sister to a mosses + liverworts clade
	mosses + liverworts clade	
	Gnetales as sister to the Pinaceae, nested within the Coniferales	Gnetales as sister to the Coniferales
	Zygnematophyceae as sister to all land plants	Charales as sister to all land plants
Vertebrates	Gymnophiona as sister to all other amphibians	Anura as sister to all other amphibians
	Atlantogenata (Afrotheria + Xenarthra) as sister to all other	Afrotheria as sister to all other placental mammals
	placental mammals	
	Lungfishes as sister to all tetrapods	Lungfishes + coelacanths as sister to all tetrapods
	Pigeons as sister to all other Neoaves	Falcons as sister to all other Neoaves
	Elopomorpha + Osteoglossomorpha as sister to all other	Osteoglossomorpha alone as sister to all other teleosts
	teleosts	
	Turtles as sister to archosaurs (birds + crocodiles)	Turtles as sister to crocodiles
Yeasts	Ascoideaceae as sister to Phaffomycetaceae +	Ascoideaceae as sister to a clade comprising Pichiaceae,
	Saccharomycetaceae	Debaryomycetaceae, Phaffomycetaceae, and
		Saccharomycetaceae
	Candida glabrata rather than Naumovozyma castellii as	Naumovozyma castellii rather than Candida glabrata sister to
	sister to Saccharomyces sensu stricto yeasts	Saccharomyces sensu stricto yeasts
	Hyphopichia burtonii as sister to Candida auris + Metschnikowia bicuspidata	Hyphopichia burtonii as sister to Debaryomyces hansenii
	<i>Zygosaccharomyces rouxii</i> as sister to all other yeasts with occurring whole-genome duplication event	<i>Vanderwaltozyma polyspora</i> as sister to all other yeast with occurring whole-genome duplication event
	Meyerozyma guilliermondii as sister to Debaryomyces hansenii	Meyerozyma guilliermondii as sister to Hyphopichia burtonii + Candida auris
	Candida tanzawaensis as sister to Pichia stipiti + Candida maltosa	<i>Pichia stipiti</i> as sister to <i>Candida tanzawaensis</i> + <i>Candida maltosa</i>



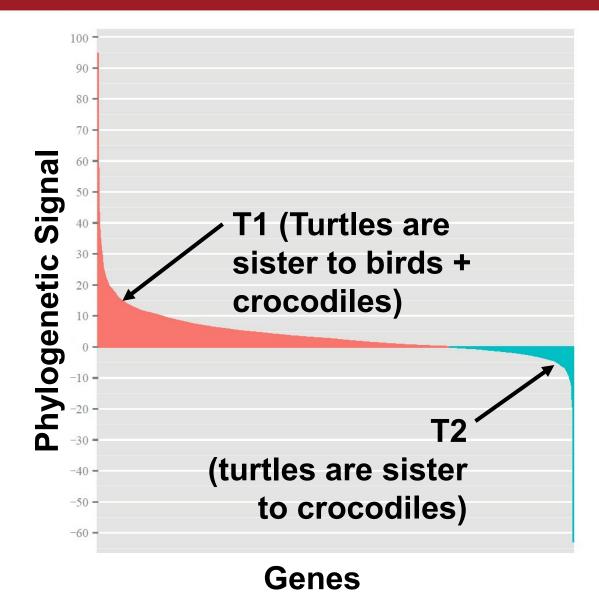
#### Phylogenetic signal in contentious branches of the ToL





Shen et al. (2017) Nature Ecol. Evol.

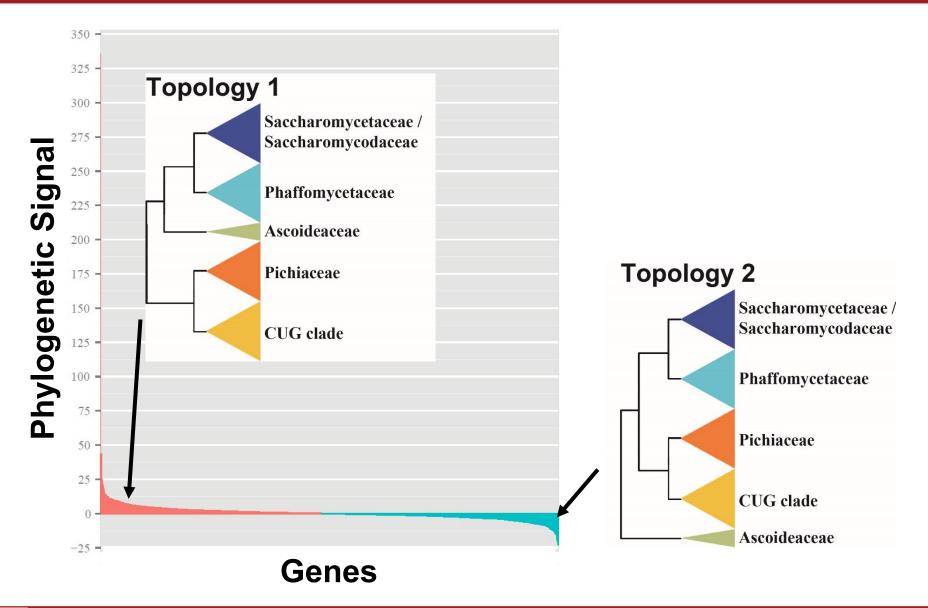
#### The signal in some branches is very strong...





Shen et al. (2017) Nature Ecol. Evol.

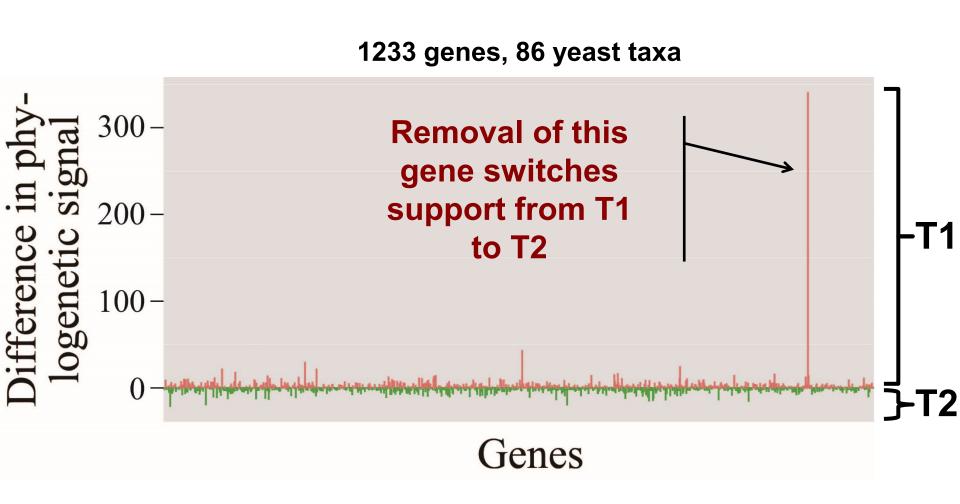
#### ...But in others it stems from one or two genes





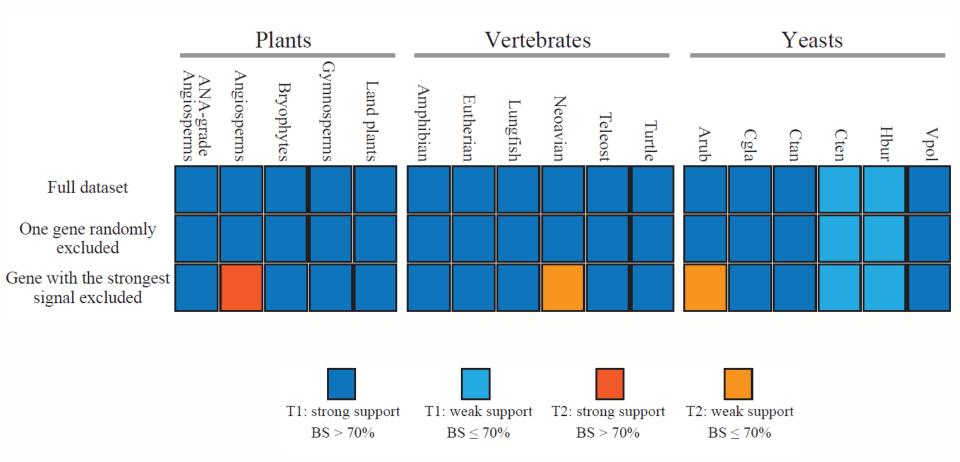
Shen et al. (2017) Nature Ecol. Evol.

#### Phylogenetic signal per gene for the two hypotheses





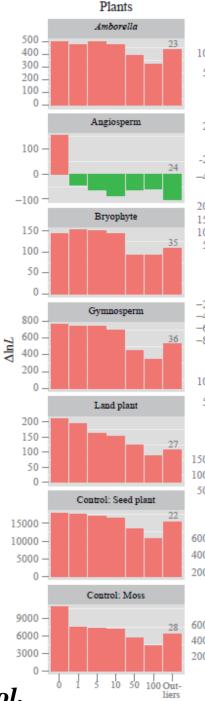
#### What happens if we remove that one gene?

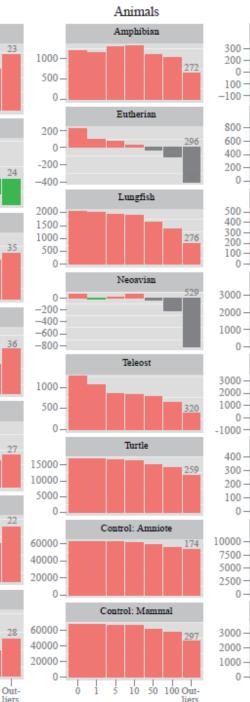


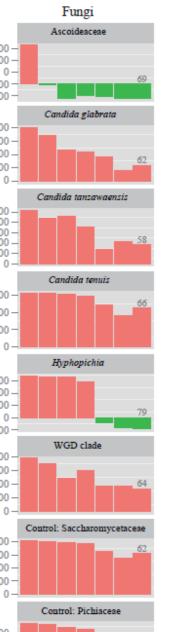


# T1 T2 Others # of genes excluded

#### Quantifying the impact of removing opinionated genes



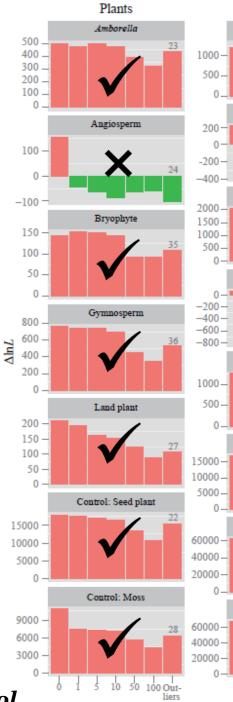


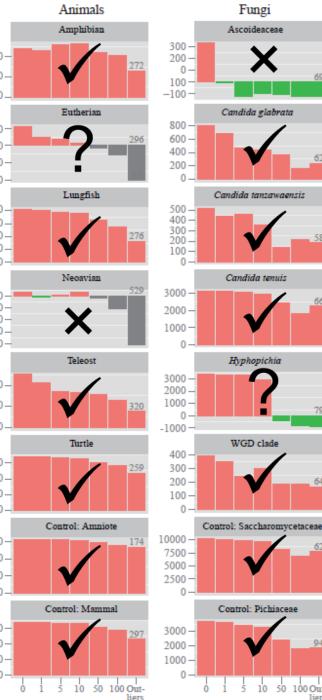


3000 -2000 -1000 -0 - 1 1 5 10 50 100 Out liers

#### T1T2Others # of genes excluded

Which branches are resolved and which are unresolved?

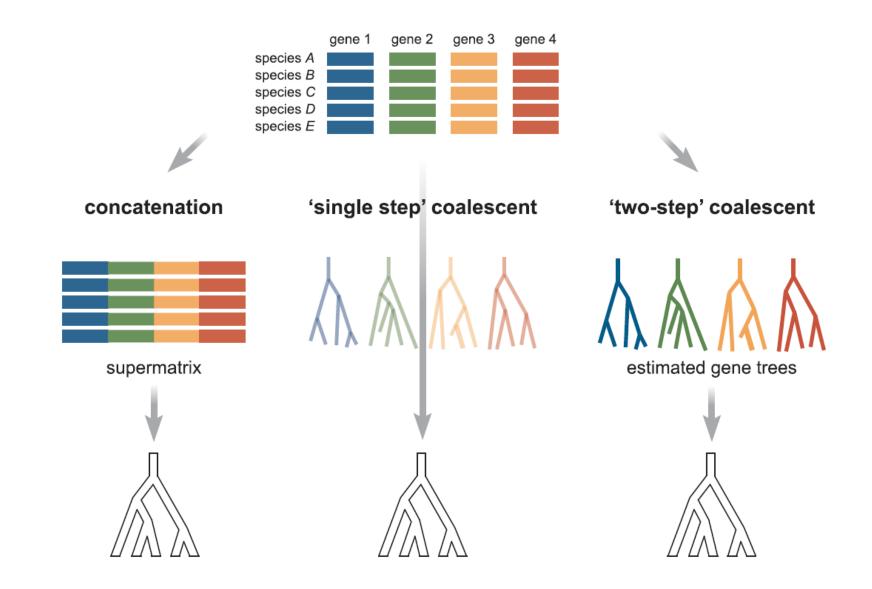




100 Out-

liers

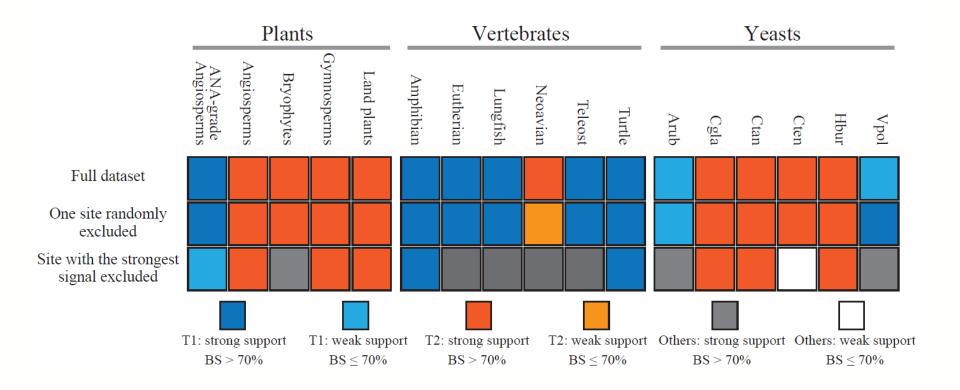
#### Methods for phylogenomic inference





Liu et al. (2015) Ann. N. Y. Acad. Sci.

#### What happens if we remove one site from every gene?

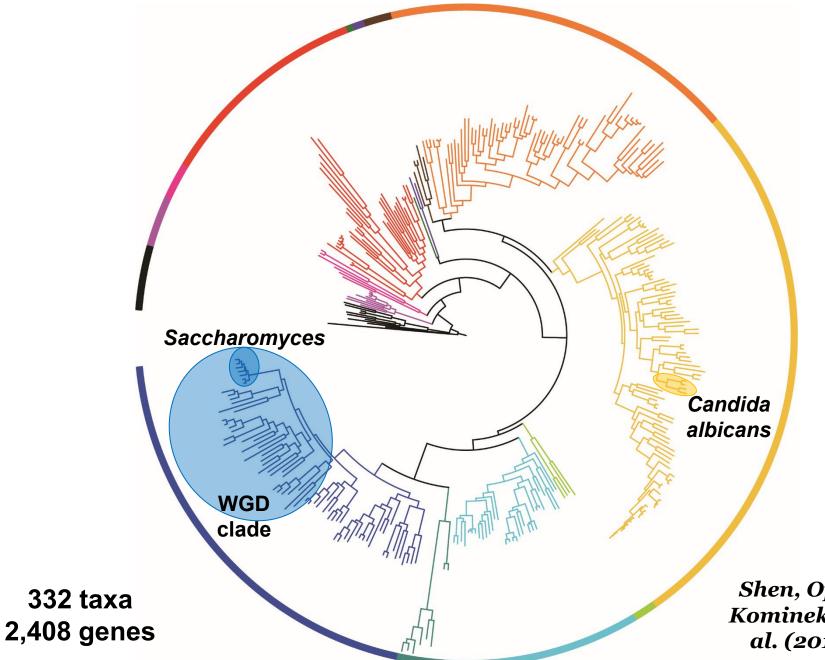




# Explanation #1: Biological factors (parts of the tree of life are bush-like / network-like rather than tree-like)

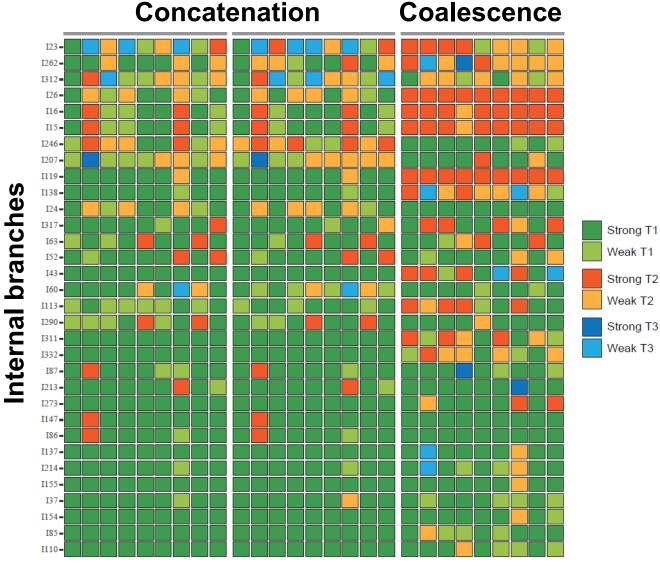
# Explanation #2: Analytical factors (systematic error due to the bad fit of our models to our data)

#### Genome-scale phylogeny of 332 yeasts



Shen, Opulente, Kominek, Zhou et al. (2018) Cell

# The 32 conflicting branches in the yeast phylogeny



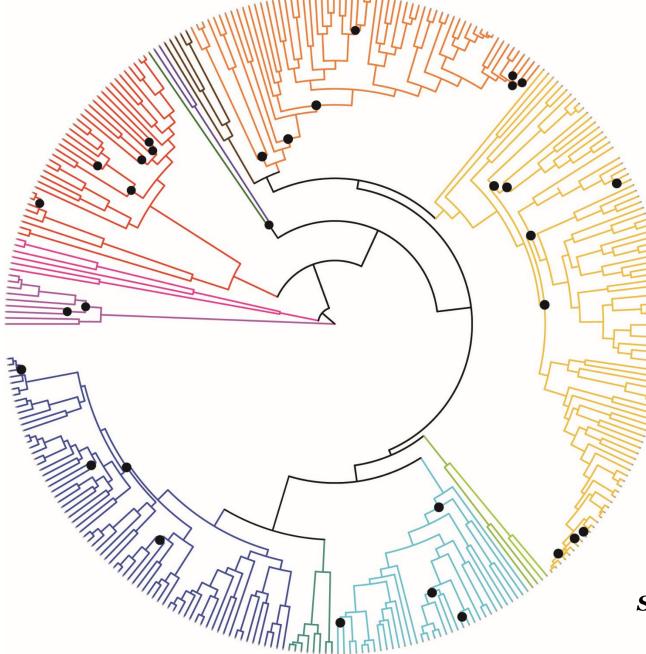
~10% (32 / 331) of internal branches show conflict between analyses

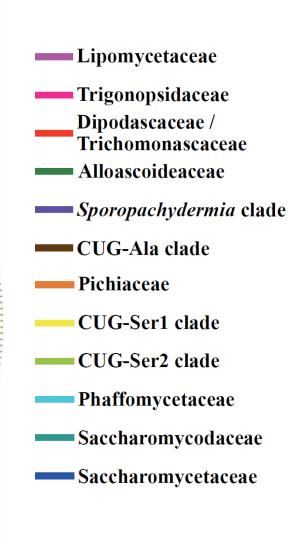
#### **Data matrices**



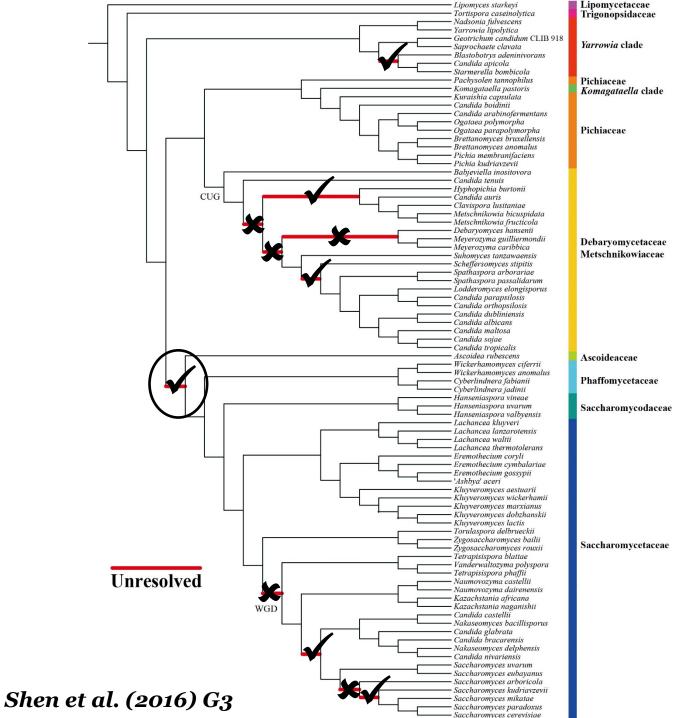
Shen, Opulente, Kominek, Zhou et al. (2018) Cell

#### Distribution of conflict on the yeast phylogeny





Shen, Opulente, Kominek, Zhou et al. (2018) Cell



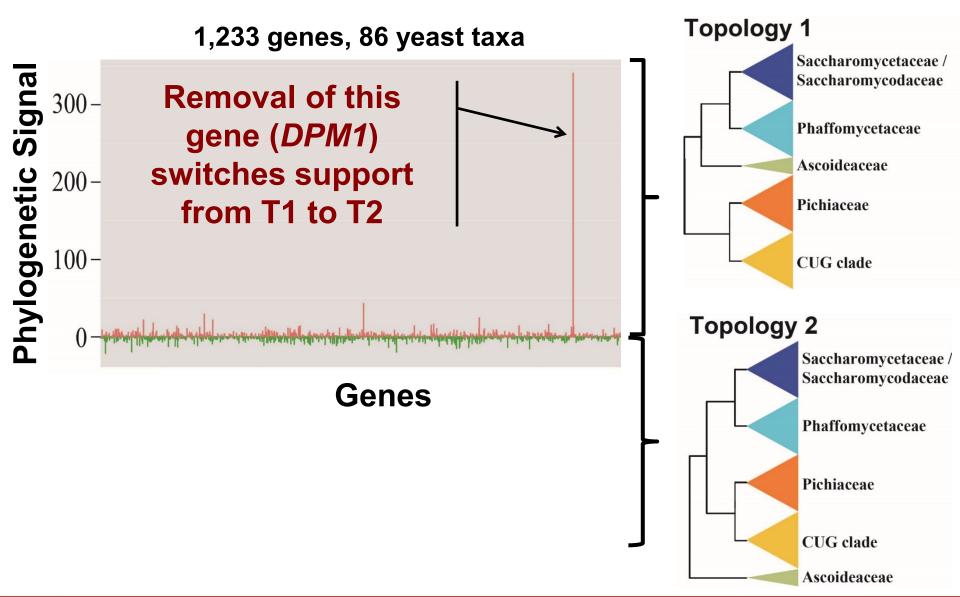
1,233-gene, 86taxon data matrix

~13% (11 / 85) of internal branches conflict between analyses

**Despite increasing** # internal branches ~4X, (85 -> 331), conflict decreased

Saccharomycetaceae

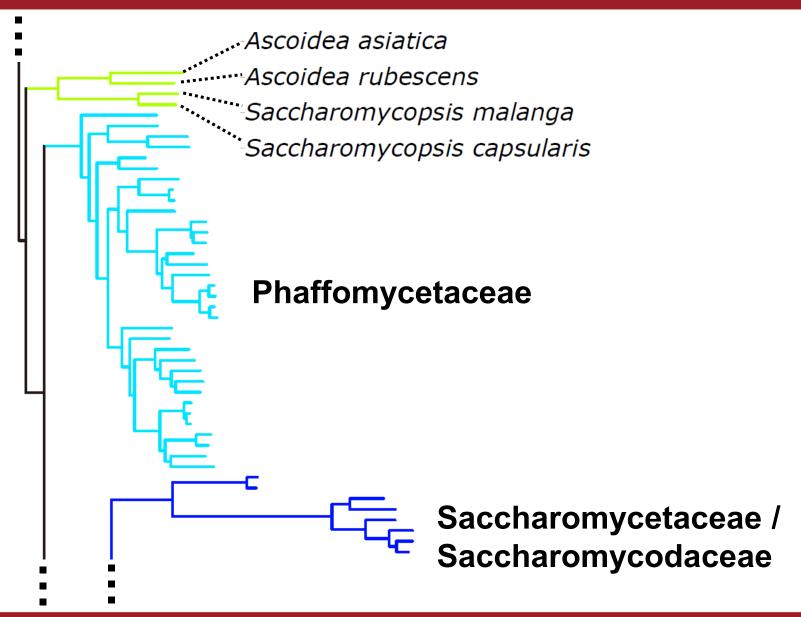
#### A single gene governs the placement of Ascoideaceae





Shen et al. (2017) Nature Ecol. Evol.

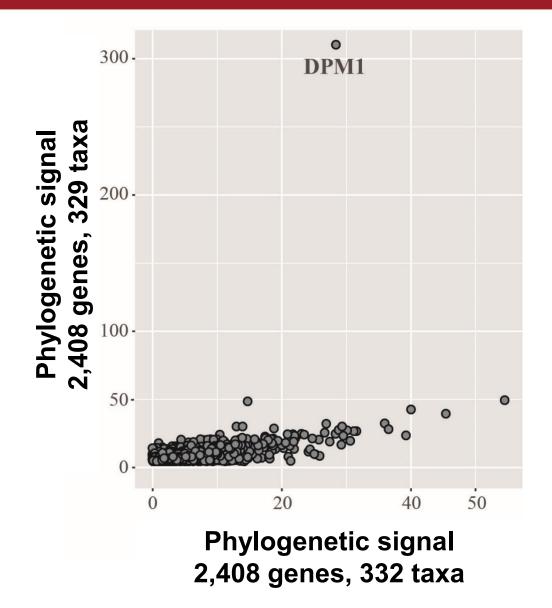
#### Sampling of 3 additional taxa "breaks" the long branch





Shen, Opulente, Kominek, Zhou et al. (2018) Cell

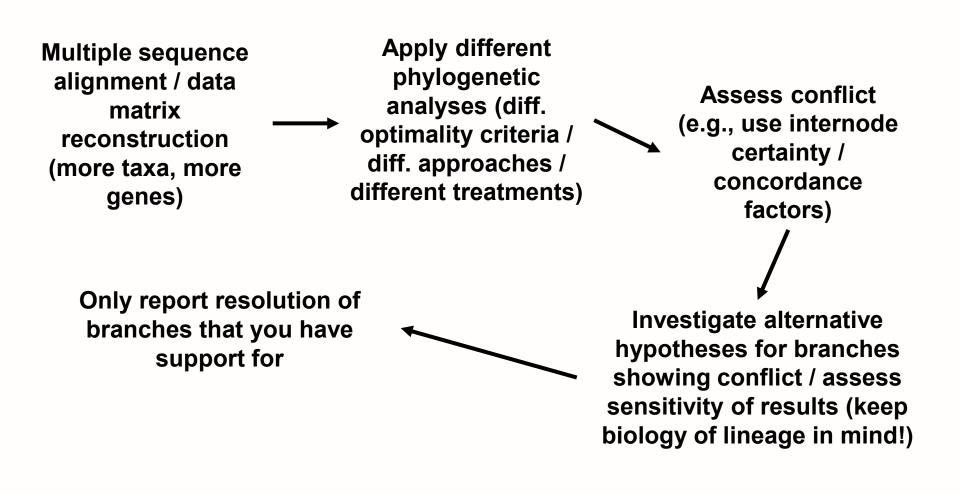
#### Sampling of 3 additional taxa decreases gene's signal





Shen, Opulente, Kominek, Zhou et al. (2018) Cell

Genomfart? The way forward?



# "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

#### **Acknowledgements**





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Leonidas Salichos

**NEW YORK INSTITUTE** OF TECHNOLOGY



Jacob Steenwyk Berkeley





Alexis **Stamatakis** 



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**Chris Todd** 





**Marizeth** Groenewald





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Hittinger

