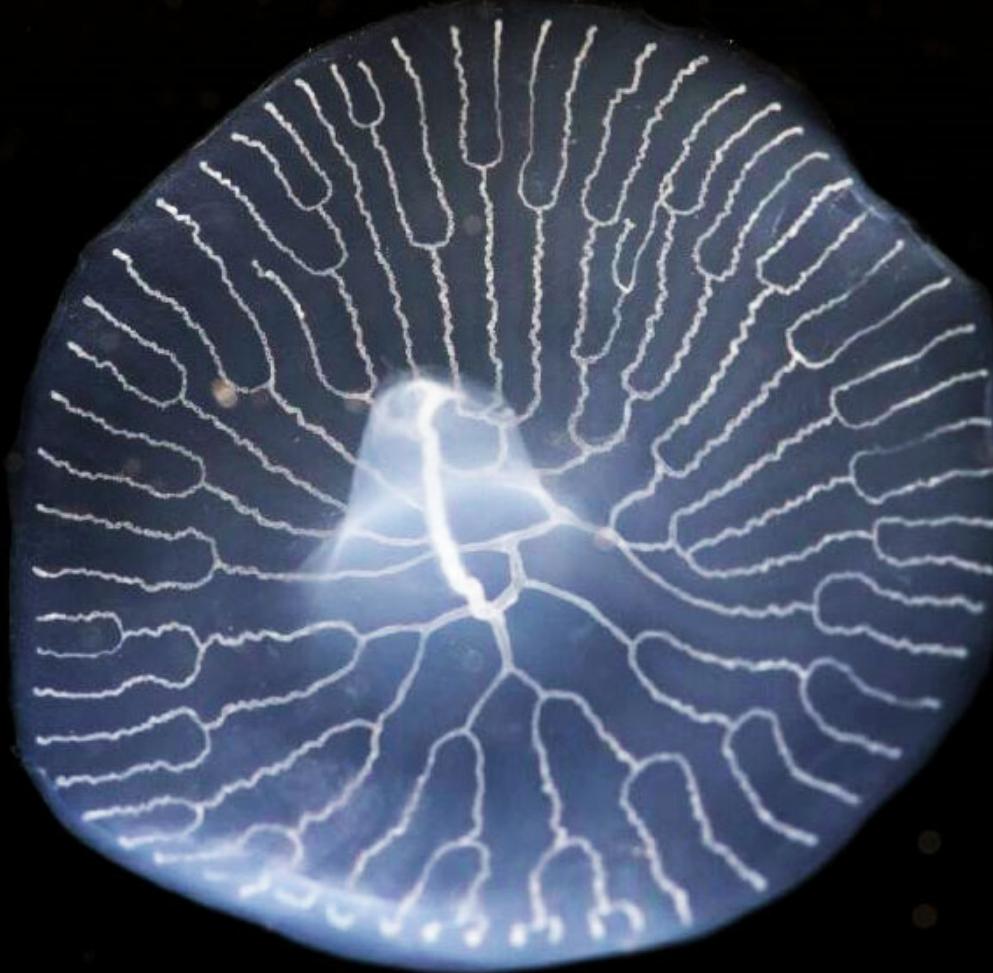


# *History of & Introduction to Phylogenomics*



Antonis Rokas

*Department of Biological Sciences, Vanderbilt University*

<http://www.rokaslab.org>

@RokasLab

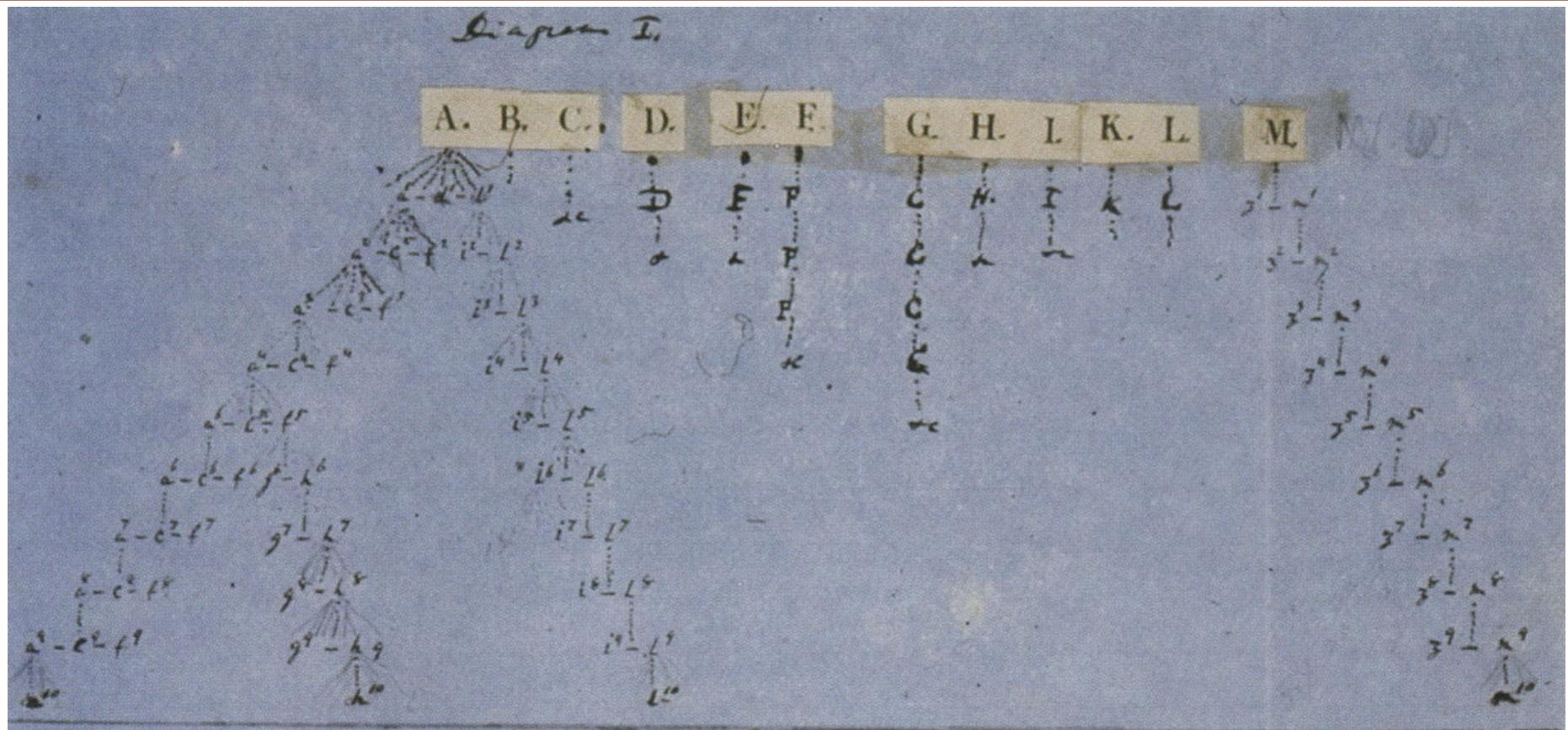
## *Lecture Outline*

### ❖ **From Darwin to Phylogenomics**

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

### ❖ **Prospects and Challenges of Phylogenomics**

# *Darwin's Tree*



**“As buds give rise by growth to fresh buds, and these, if vigorous, branch out and overtop on all sides many a feebler branch, so by generation I believe it has been with the great Tree of Life, which fills with its dead and broken branches the crust of the earth, and covers the surface with its ever branching and beautiful ramifications”**



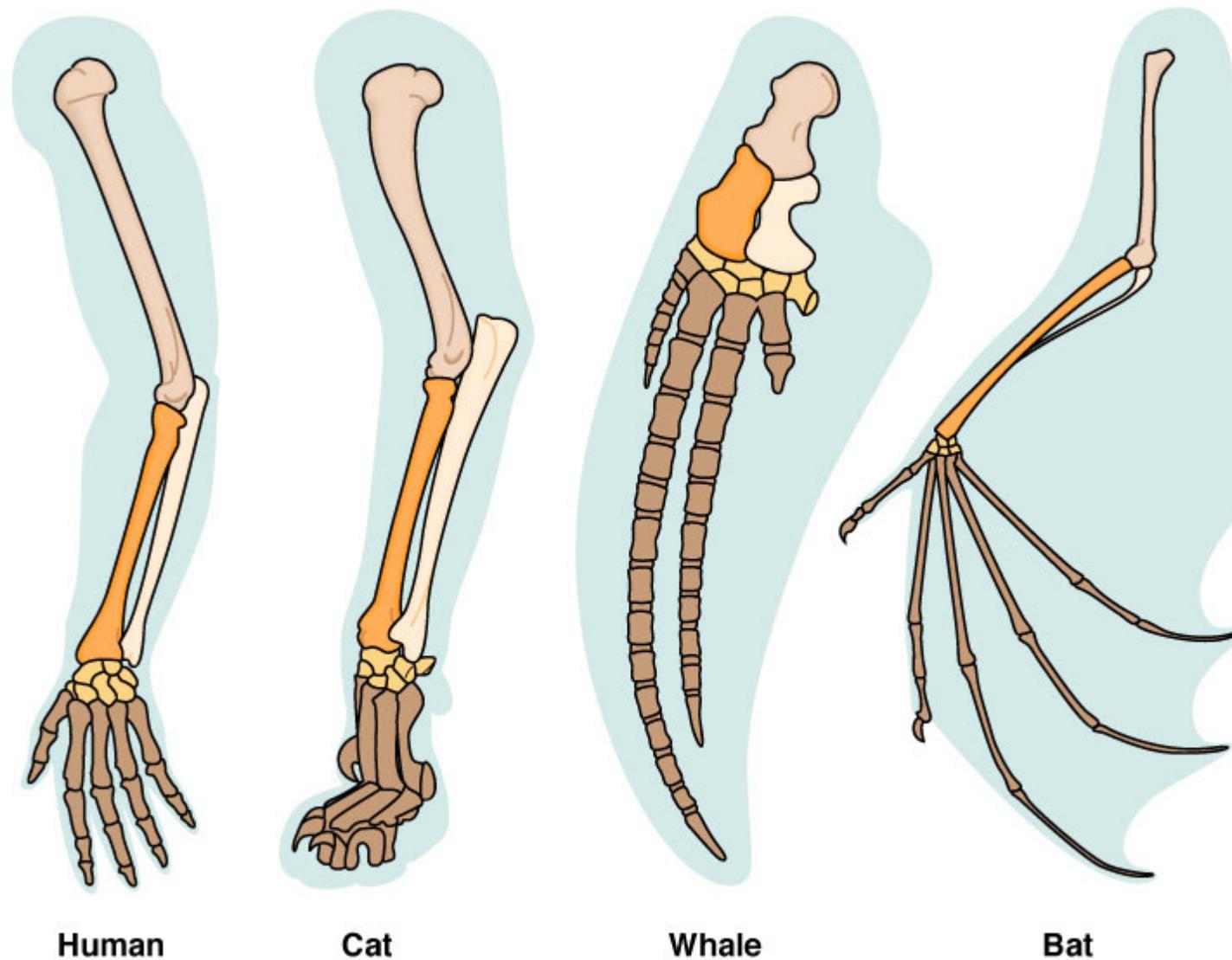
*Darwin's hand-made proof of the famous diagram in his Origin of Species;  
Maderspacher (2006) Curr. Biol.*

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-

# *Comparative Morphology of Extant Organisms*



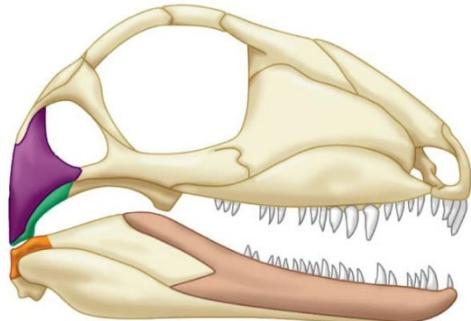
©1999 Addison Wesley Longman, Inc.



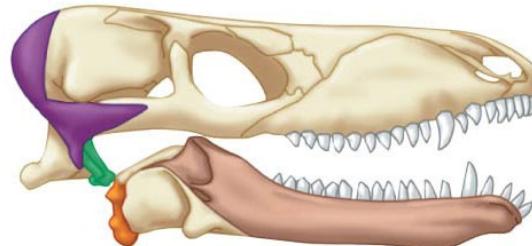
[http://www.mun.ca/biology/scarr/139393\\_forelimb\\_homology.jpg](http://www.mun.ca/biology/scarr/139393_forelimb_homology.jpg)

# *Comparative Anatomy of Fossils*

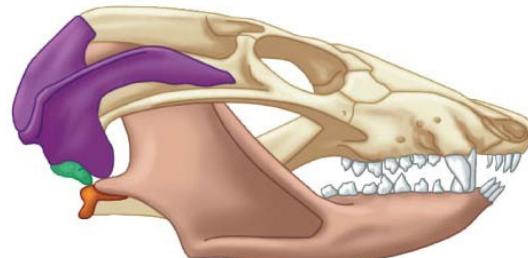
**Synapsid (300 mya)**



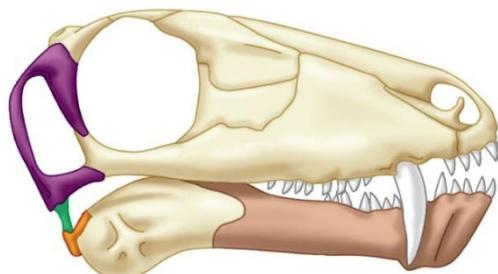
**Early cynodont (260 mya)**



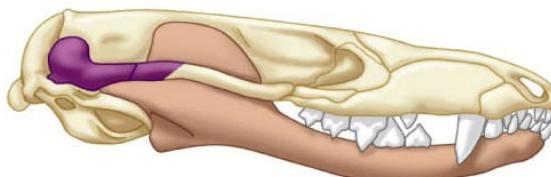
**Later cynodont (220 mya)**



**Therapsid (280 mya)**



**Very late cynodont (195 mya)**



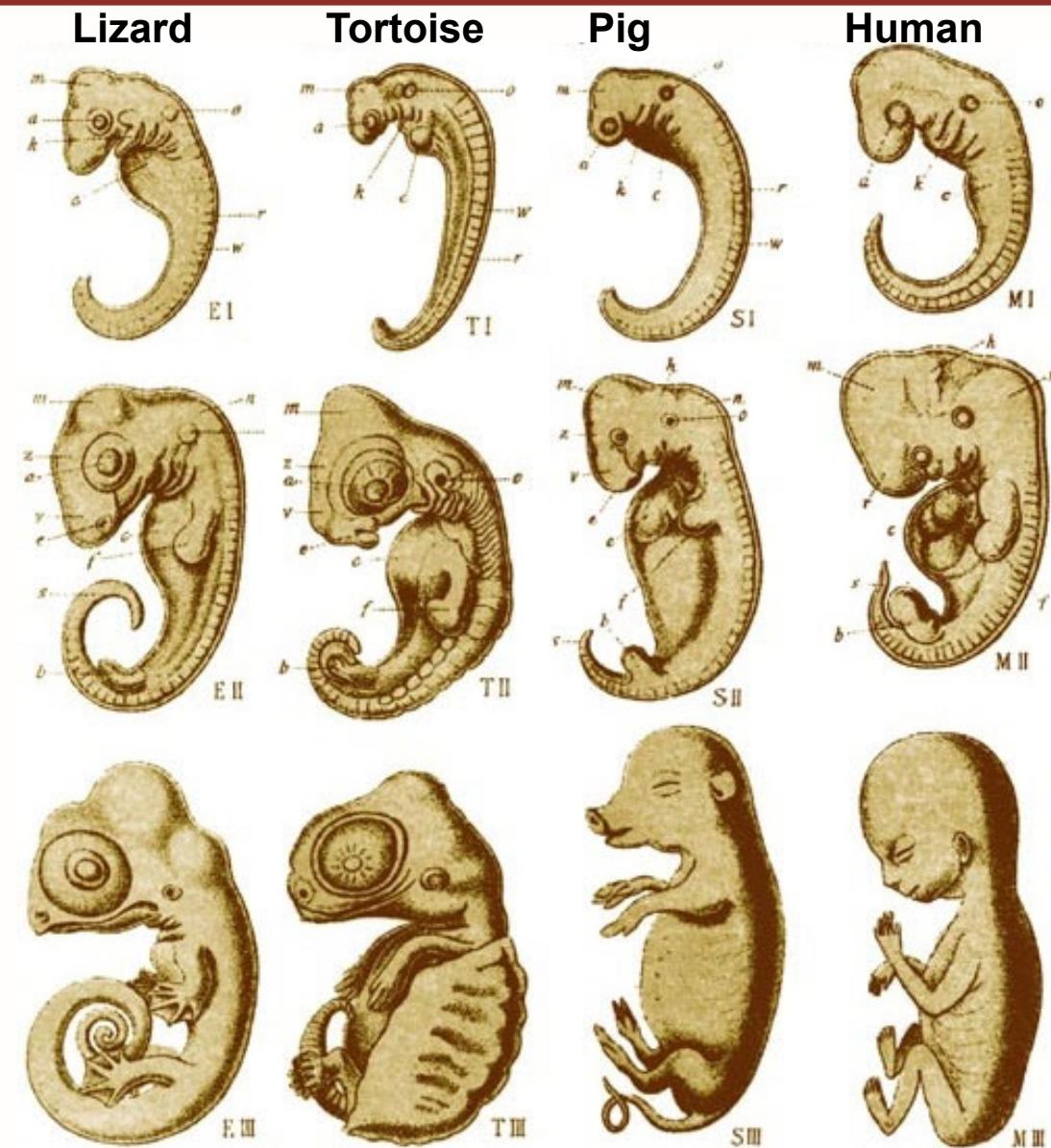
**Key to skull bones**

- █ Articular
- █ Quadrate
- █ Dentary
- █ Squamosal



*Campbell (2016) Biology, 10<sup>th</sup> Ed., Fig. 25.7*

# *Comparative Embryology*

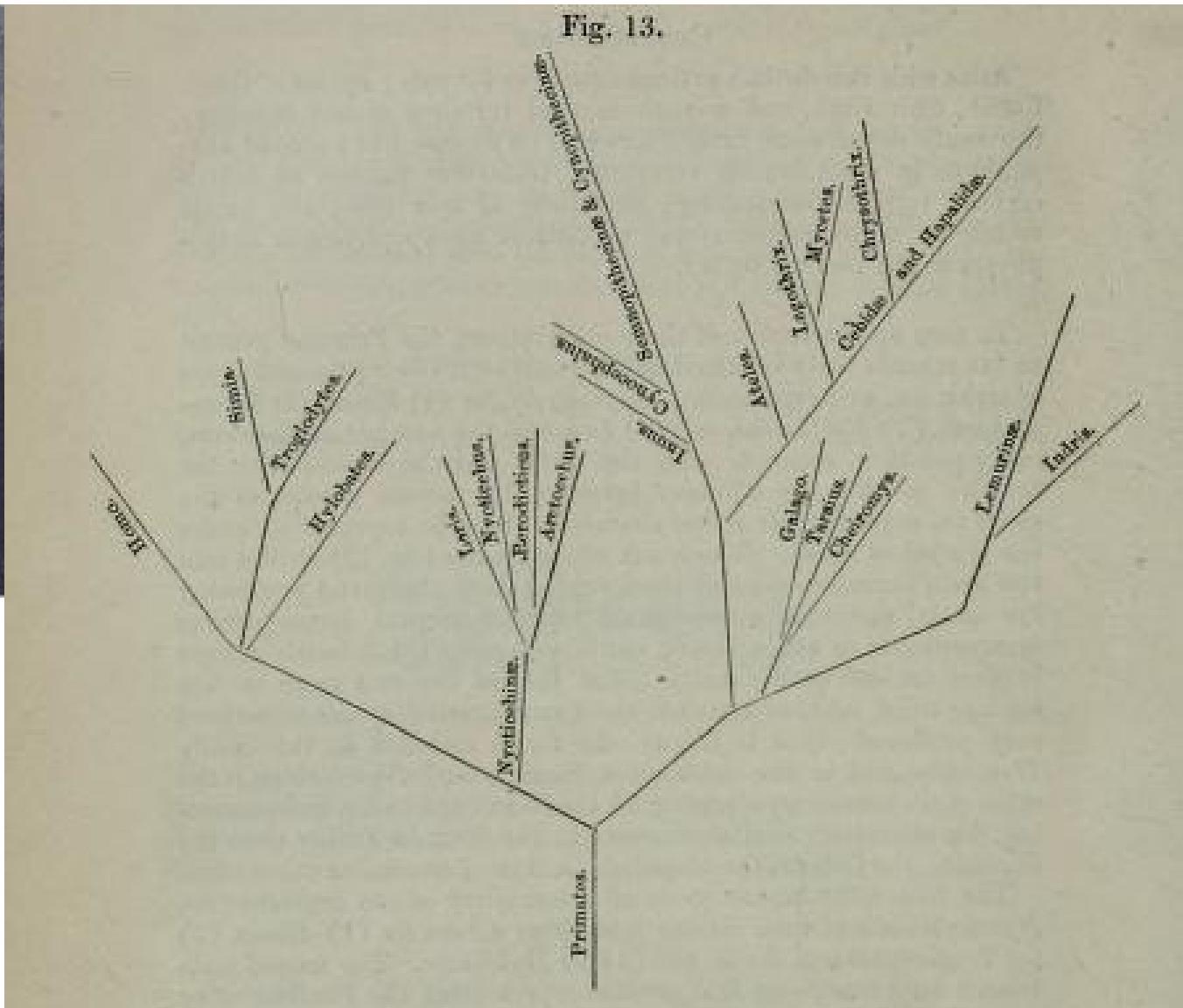


<http://www.nature.com/nrg/journal/v7/n11/images/nrg1918-f2.jpg>

# *The First Published Phylogeny*



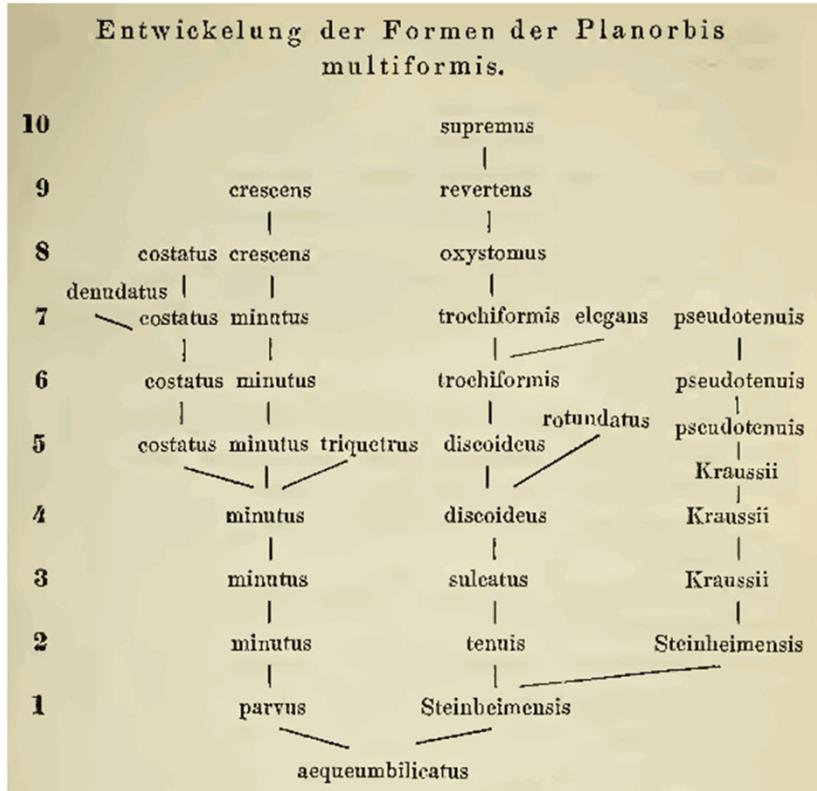
**St. George Jackson  
Mivart**



*Mivart (1865) Proc. Zool. Soc. London*

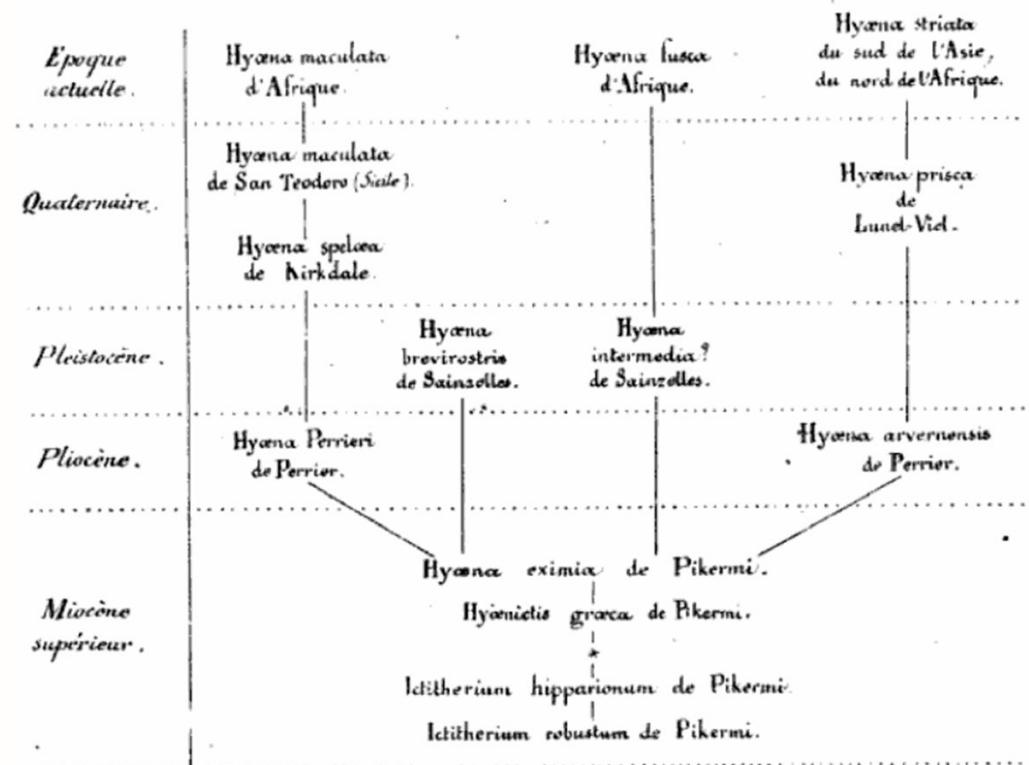
# *Inferring Phylogenies Becomes a Cottage Industry*

# Fossil gastropods



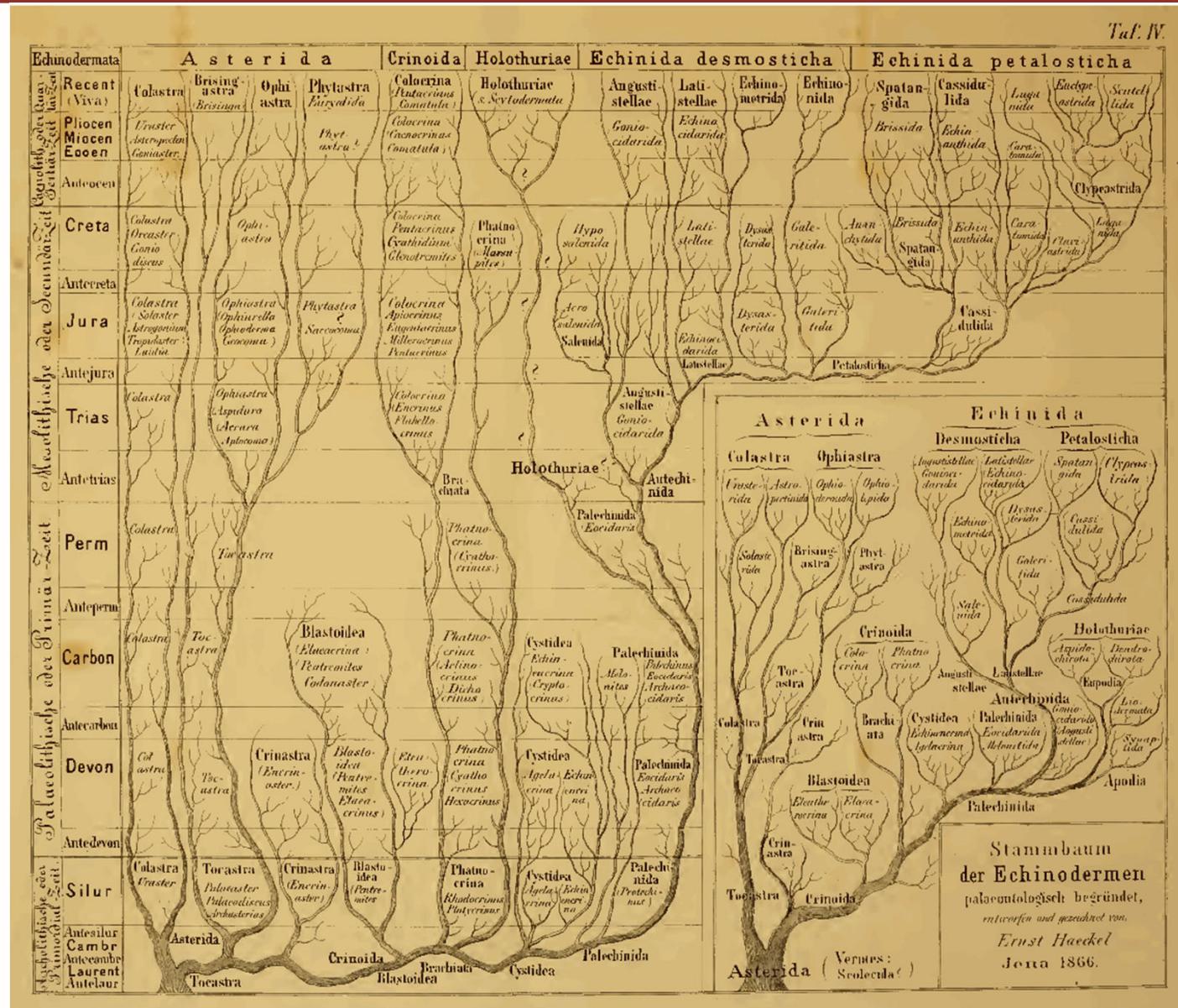
# Hilgendorf, 1867

# Extant and extinct mammals



# Gaudry, 1866

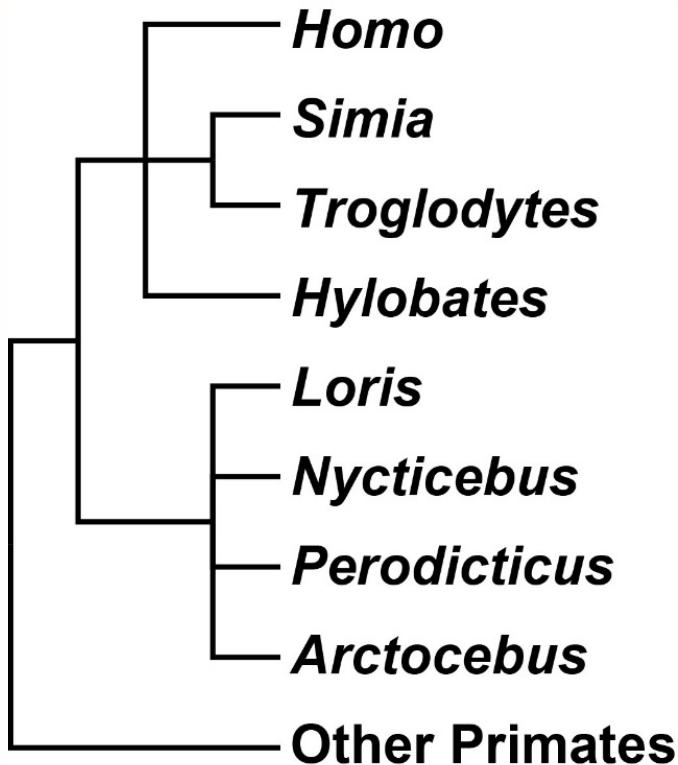
# Haeckel's Phylogenies



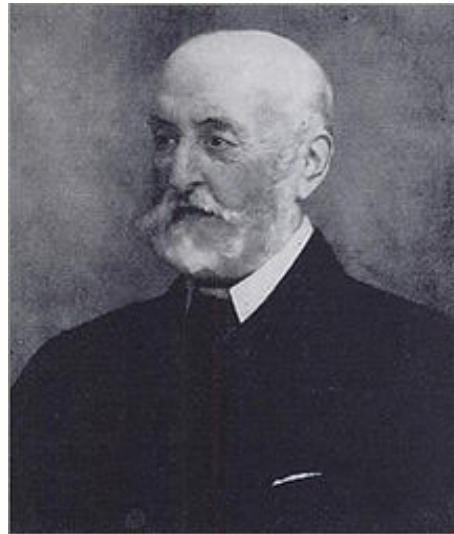
Haeckel (1866)

# *Disagreement Between Phylogenies*

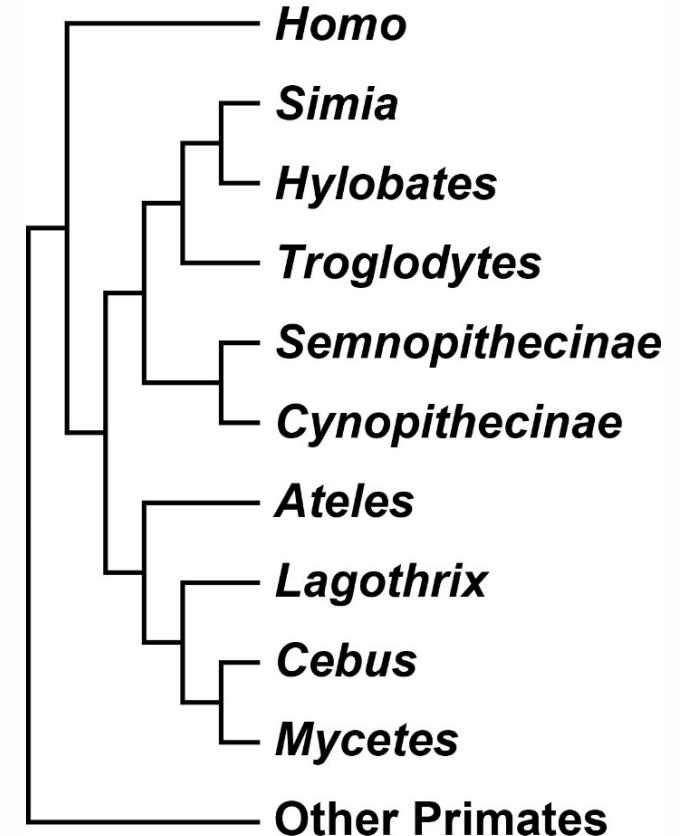
## 1865: SPINAL COLUMN

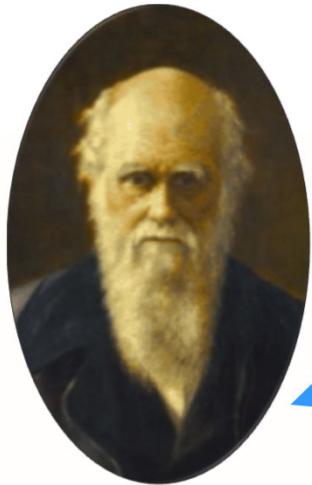


St. George Jackson Mivart



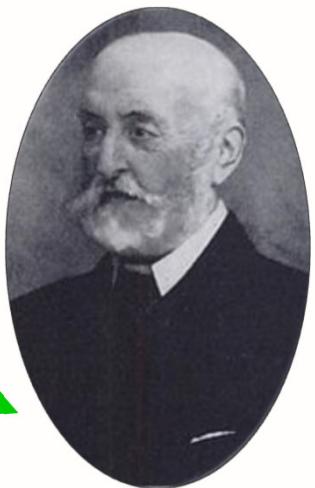
## 1867: LIMBS





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 spinal column *only*. The [1867] diagram expresses what I believe to be the degree of resemblance as regards the appendicular skeleton *only*



# *Comparative Morphology & Embryology in Trouble*

**By the turn of the century, the conflicting phylogenies produced by comparative morphology and embryology data have given rise to a sense of despair among the community**

**“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”**

**William Bateson (1894)**

***Materials for the Study of Variation***



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



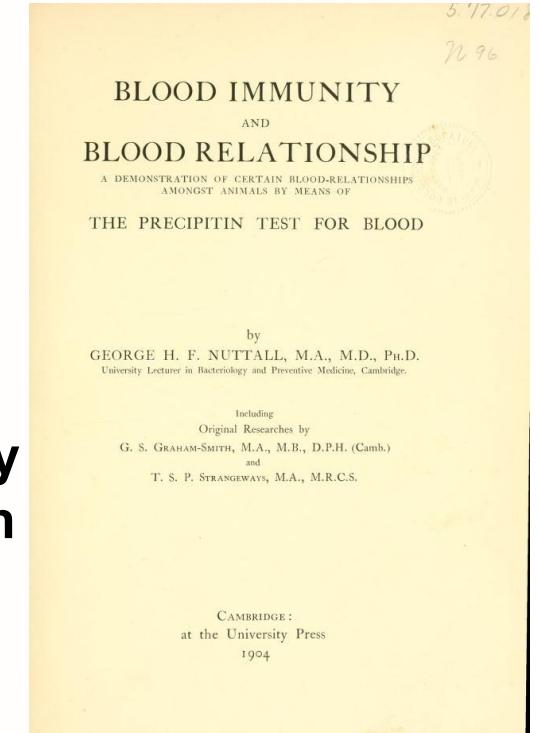
<https://www.dnalc.org/view/16197-Gallery-5-William-Bateson-Portrait.html>

# *The Origins of “Molecular” Phylogenetics*



**Studies in immunochemistry  
were showing that serological  
cross-reactions were stronger  
for more closely related  
organisms**

**Nuttall, realizing the evolutionary  
implications, used this approach  
to reconstruct the phylogenetic  
relationships among various  
groups of animals**



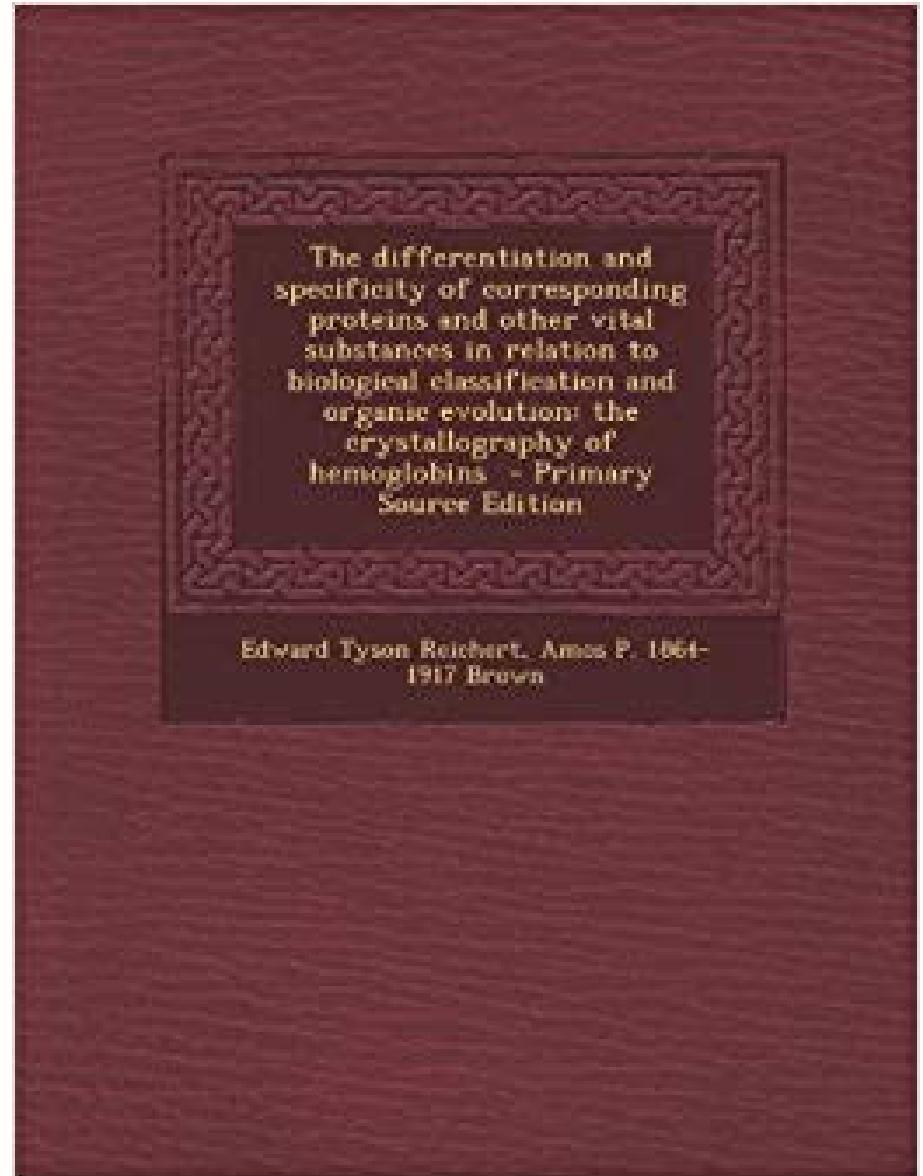
**He determined that humans' closest relatives were the apes, followed, in order of relatedness, by Old World monkeys, New World monkeys, and prosimians (lemurs and tarsiers)!**



*Nuttall (1904) Blood Immunity and Blood Relationship*

## *The First Large-Scale Molecular Investigation of Species Differences*

- ❖ Different crystals of hemoglobin from the same species differed in size & shape, but angles between faces constant
- ❖ But interfacial angles differed from species to species -> similarities in angle values were consistent with taxonomy-based phylogeny
- ❖ 600 photomicrographs of crystals of hemoglobin from >100 species
- ❖ All this before discoveries of X-ray diffraction / protein sequencing / DNA & RNA sequencing



*Reichert & Brown (1909) The Crystallography of Hemoglobins*

# *“Molecular” Phylogenetics of Drosophila*



**Theodosius Dobzhansky**

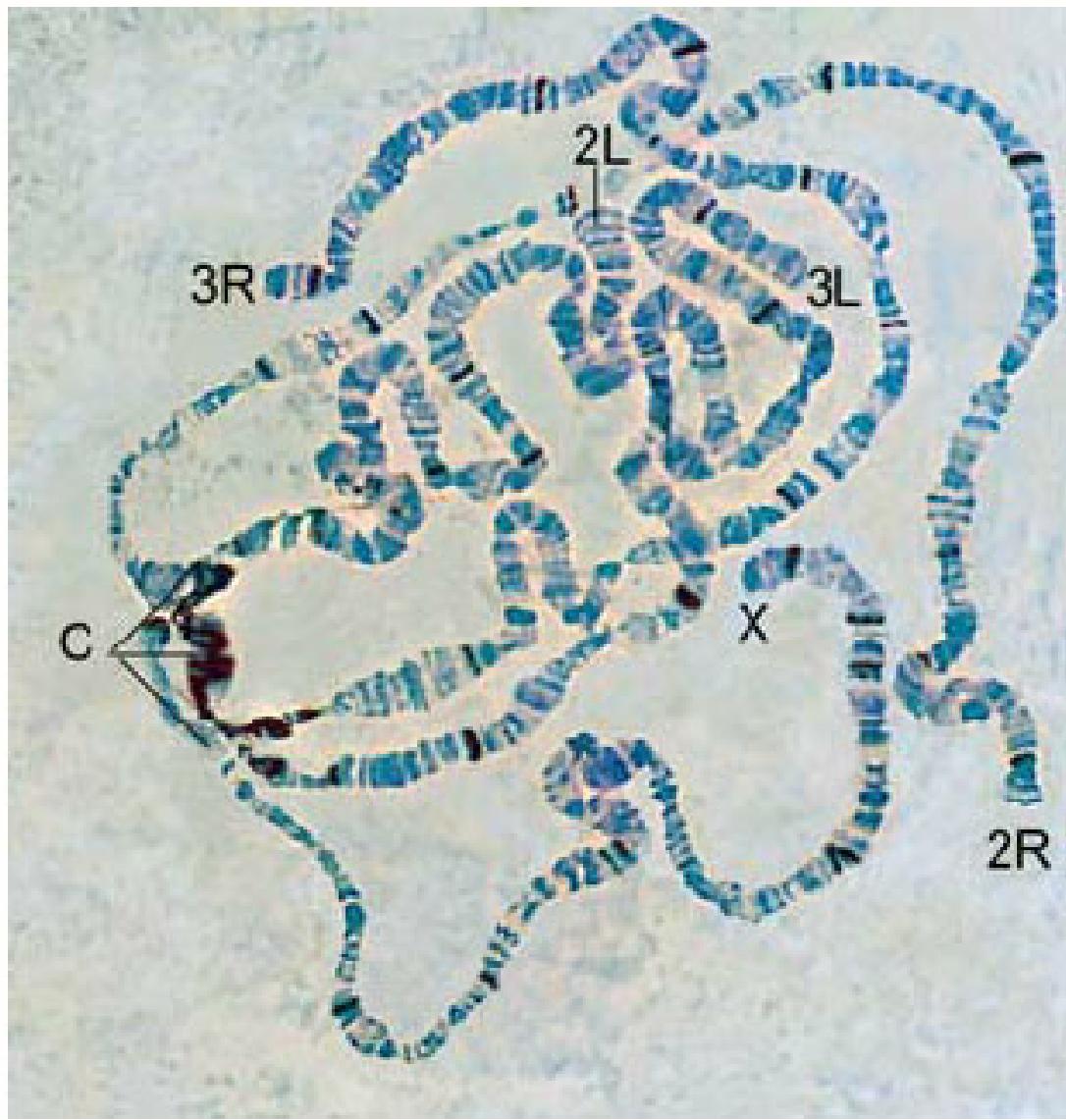


**Alfred Sturtevant**



[https://www-tc.pbs.org/wgbh/evolution/library/06/2/images/l\\_062\\_04\\_l.jpg;](https://www-tc.pbs.org/wgbh/evolution/library/06/2/images/l_062_04_l.jpg;)  
<http://www.caltech.edu/news/first-genetic-linkage-map-38798>

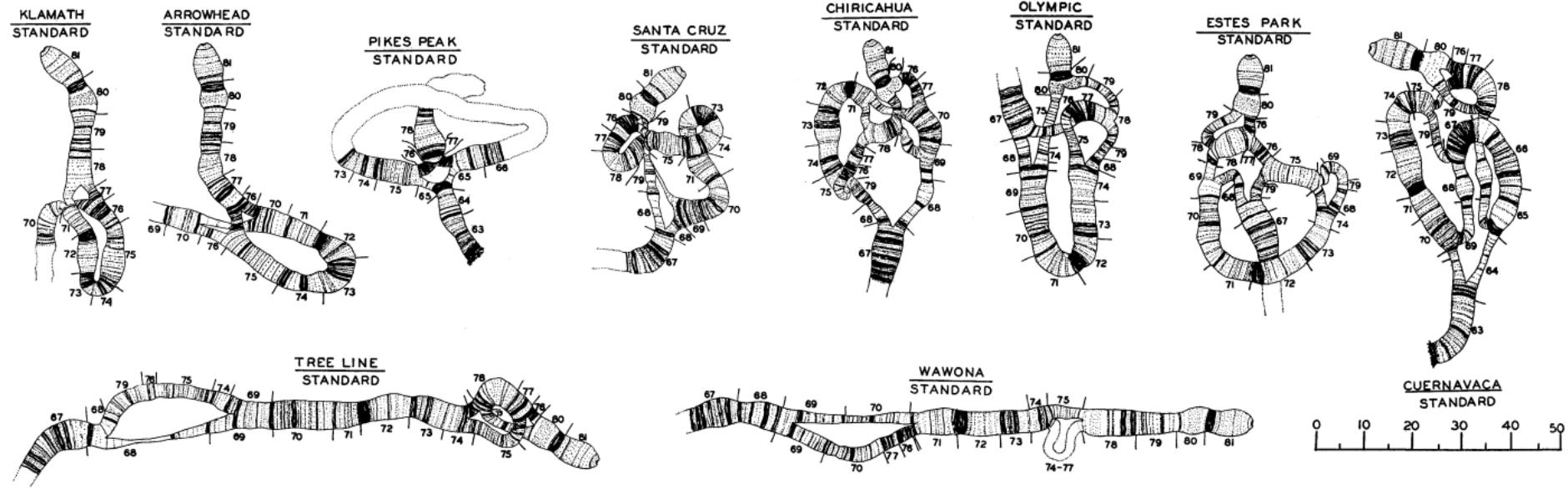
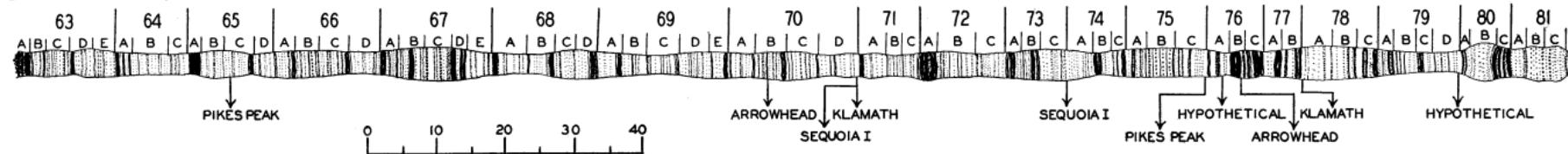
# *Polytene Chromosomes*



*Viera et al. (2009) Transposons and the Dynamic Genome*

# Using Chromosomal Rearrangements as Markers...

DOBZHANSKY AND STURTEVANT, CHROMOSOMES OF *DROSOPHILA PSEUDODORSICA*



GENETICS 23: 28 JAN. 1938



Dobzhansky & Sturtevant (1938) Genetics

## ...To Infer the History of Species

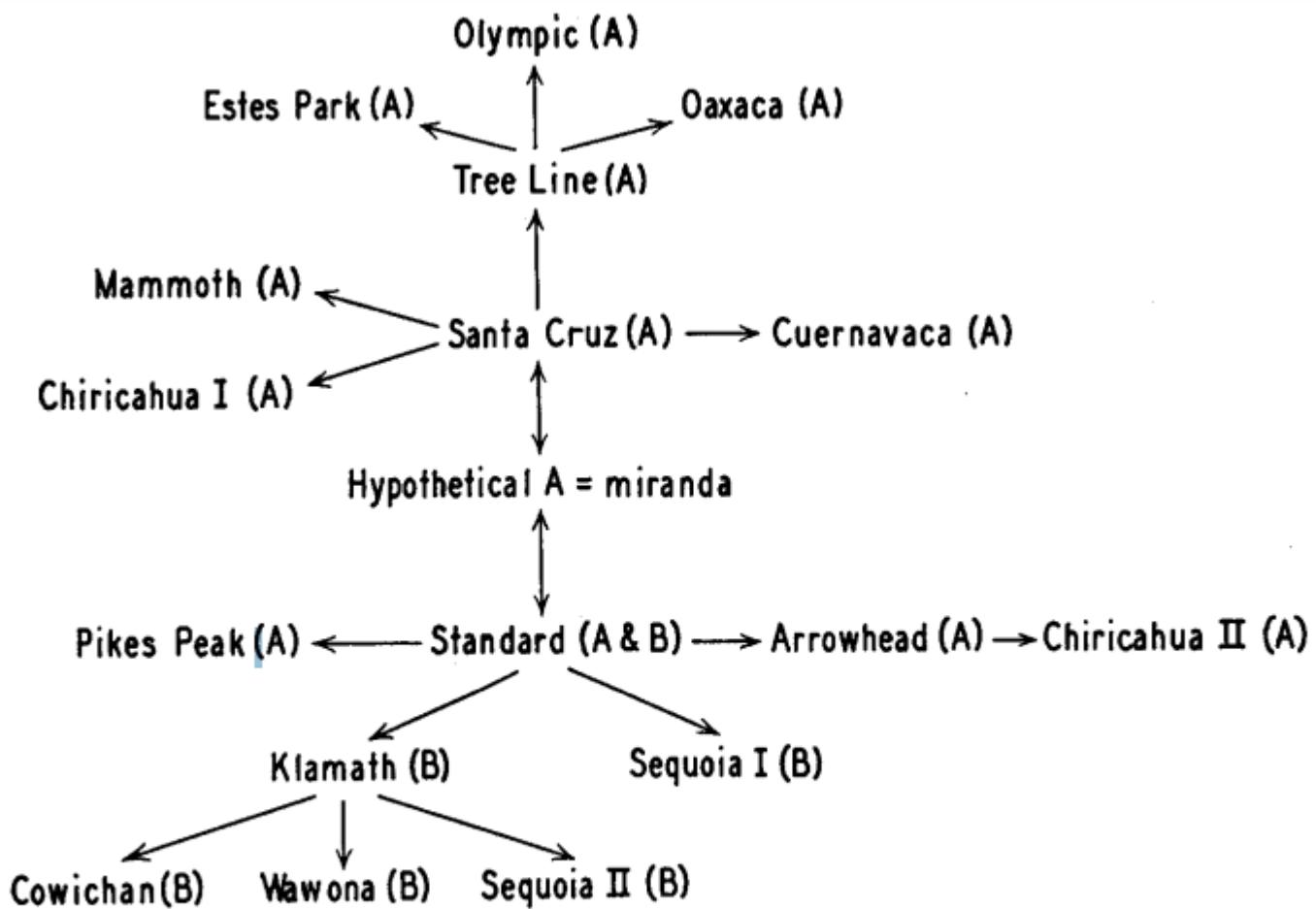
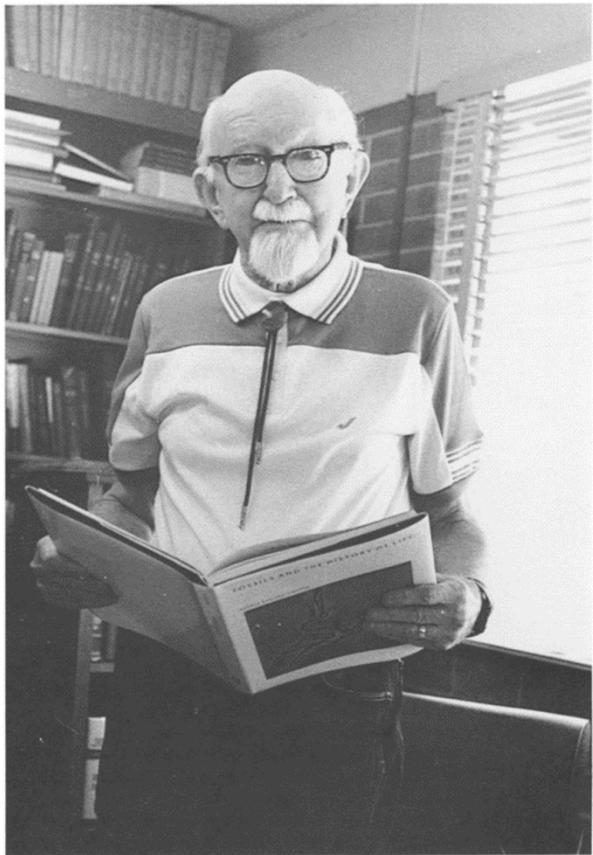
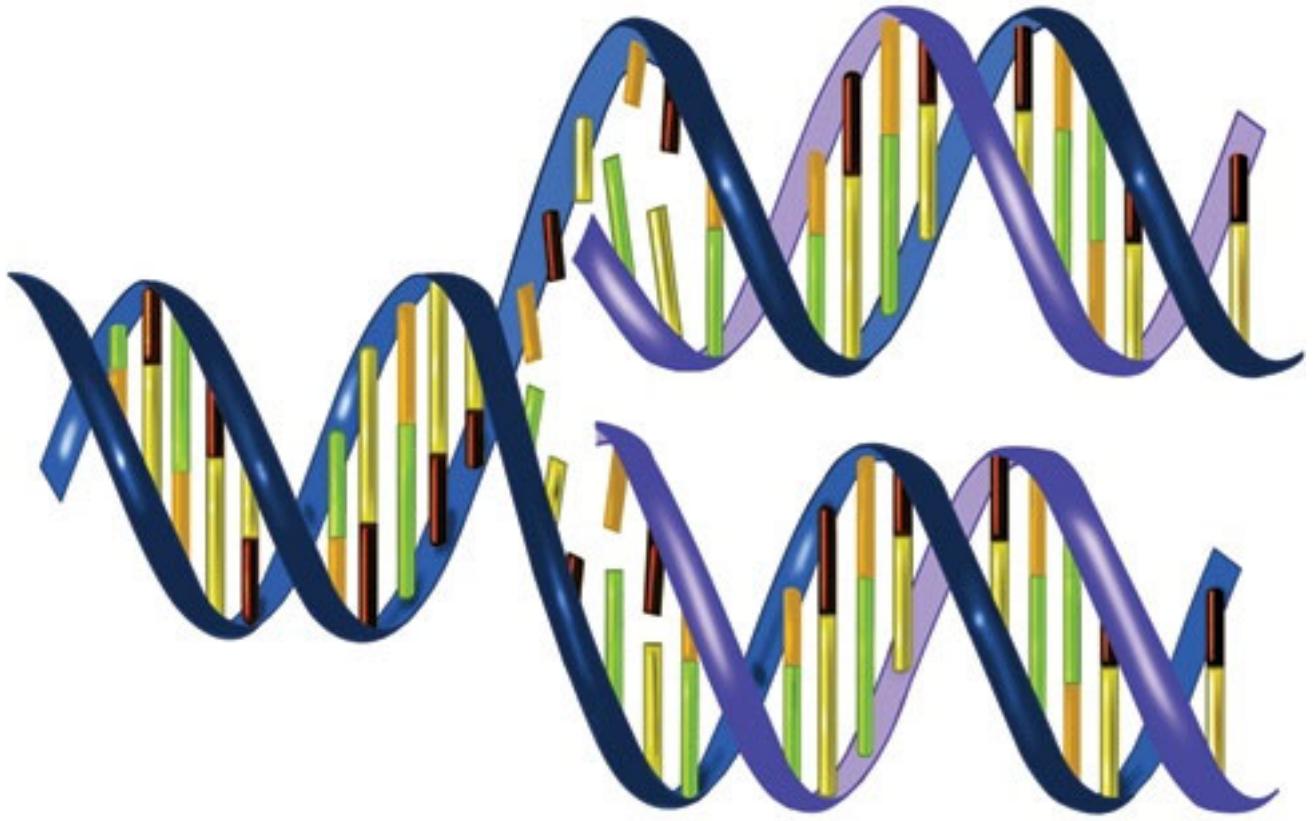


FIGURE 3.—Phylogeny of the gene arrangements in the third chromosome of *Drosophila pseudobscura*. Any two arrangements connected by an arrow in the diagram differ by a single inversion. Further explanation in text.





*George Gaylord Simpson*



**“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**

# *Early '50s: Discovery of Protein Sequencing*

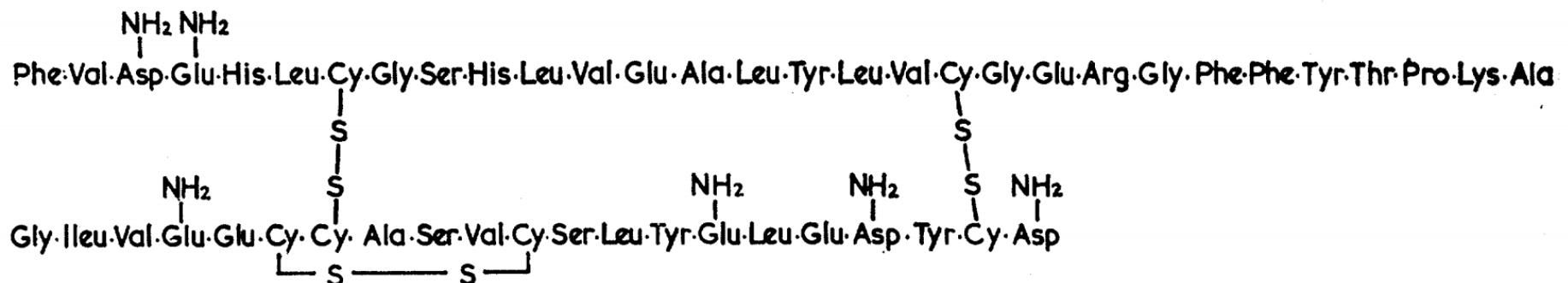


Fig. 2. Structure of insulin.



Frederick Sanger

The Nobel Prize in Chemistry 1958

Born: 13 August 1918, Rendcombe, United Kingdom

Died: 19 November 2013, Cambridge, United Kingdom

Affiliation at the time of the award: University of Cambridge, Cambridge, United Kingdom

Prize motivation: "for his work on the structure of proteins, especially that of insulin."

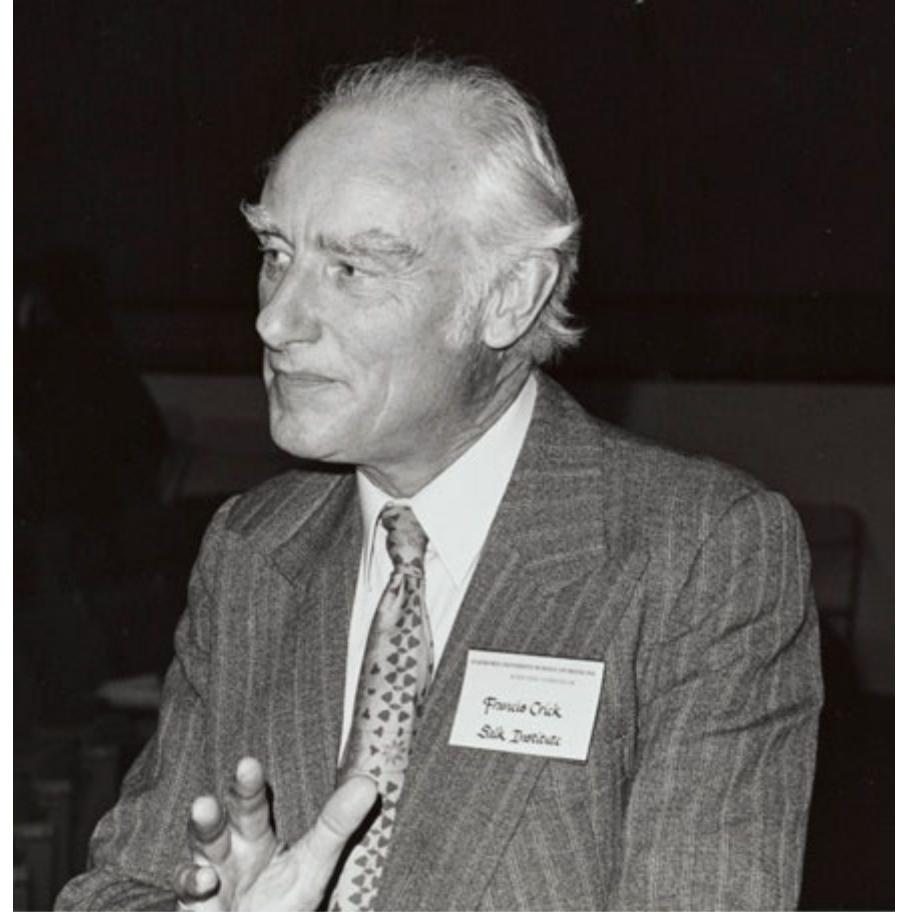
Prize share: 1/1



Sanger (1959) Science

**“...before long we shall have a subject which might be called “protein taxonomy”; the study of amino acid sequences of the proteins of an organism and the comparison of them between species. It can be argued that these sequences are the most delicate expression possible of the phenotype of an organism and that vast amounts of evolutionary information may be hidden away within them”**

*Francis Crick (1957) Nature*



# *Elucidating the Sequence of Proteins*

N A T U R E

March 4, 1961 VOL. 189

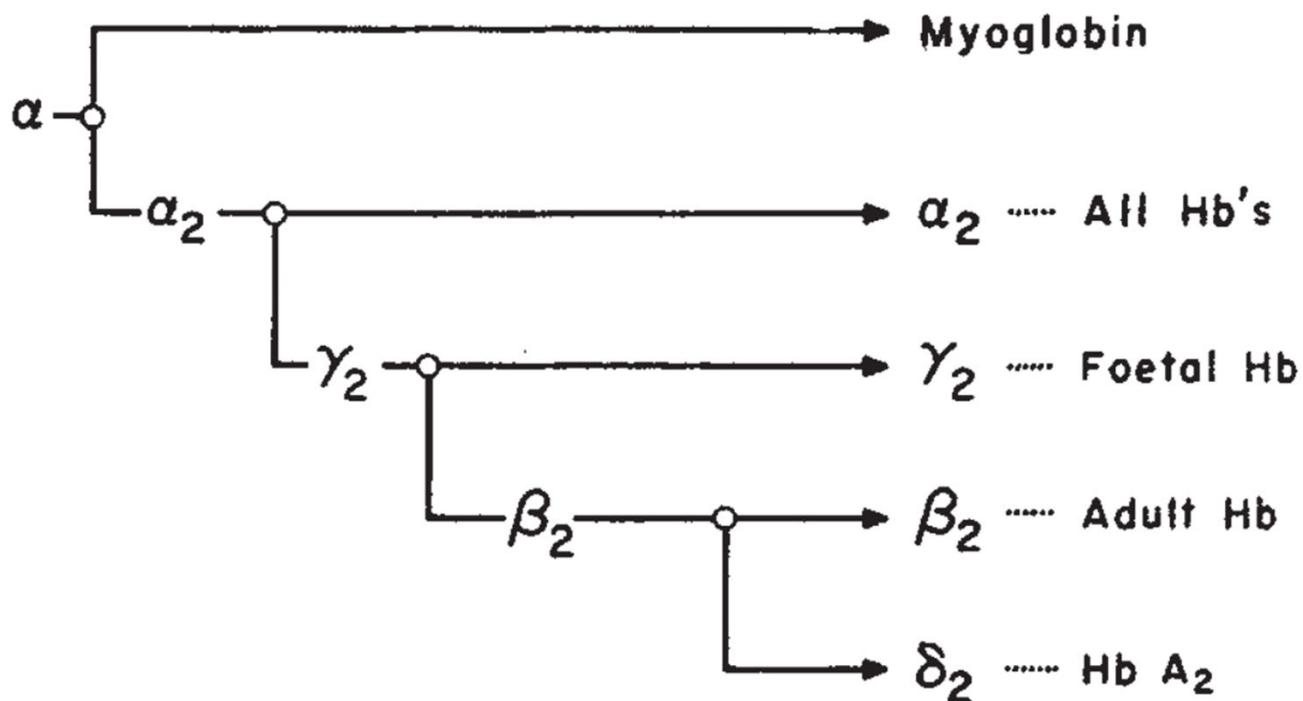


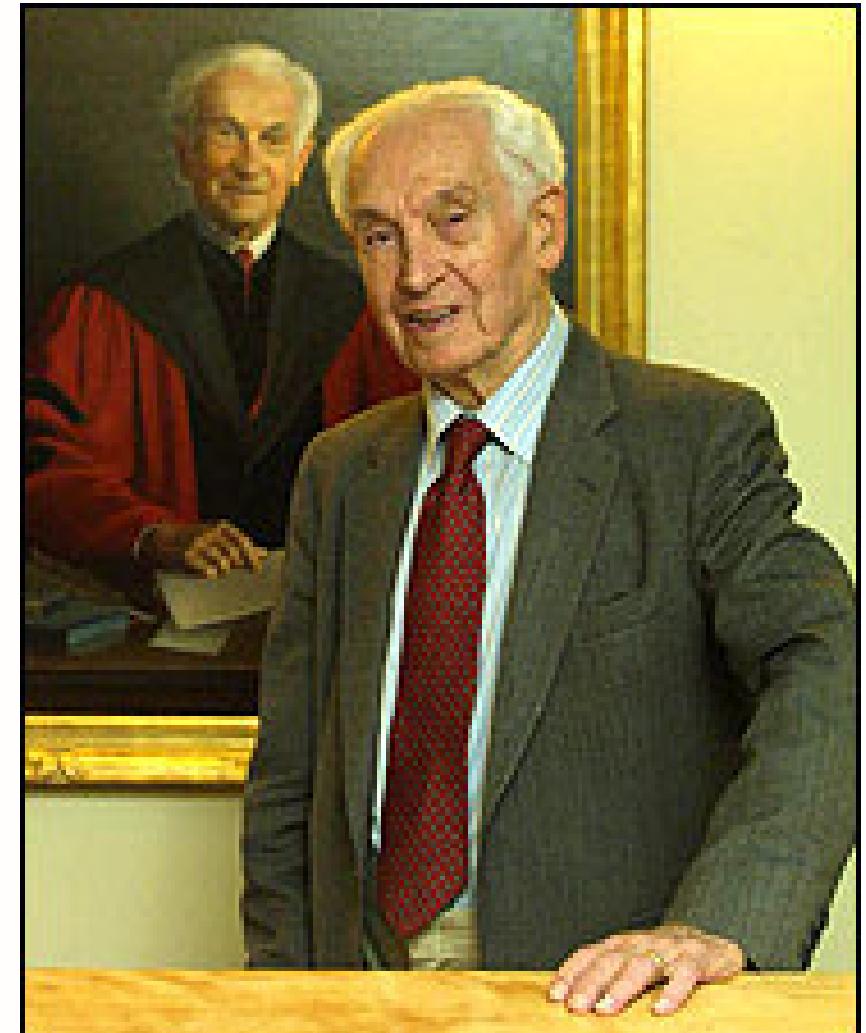
Fig. 1. Evolution of the haemoglobin chains. The  $\alpha$ -chain is the ancestral peptide chain. —○— indicates a point of gene duplication followed by translocation of the new gene



*Ingram (1961) Nature*

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

**Ernst Mayr, 1963**



# **DNA & Protein Sequences Record Evolutionary History**

## **Molecules as Documents of Evolutionary History**

EMILE ZUCKERKANDL AND LINUS PAULING

*Gates and Crellin Laboratories of Chemistry,  
California Institute of Technology, Pasadena, California, U.S.A.*

*(Received 17 September 1964)*

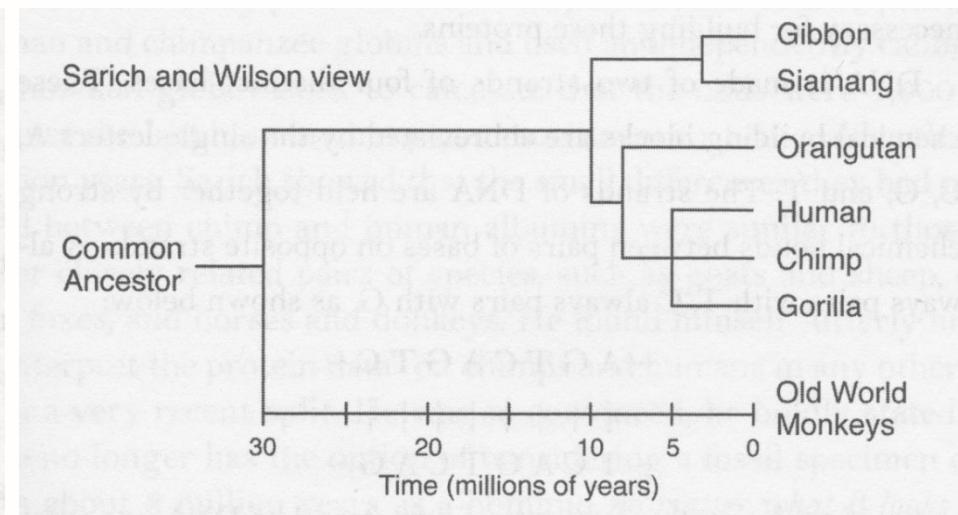
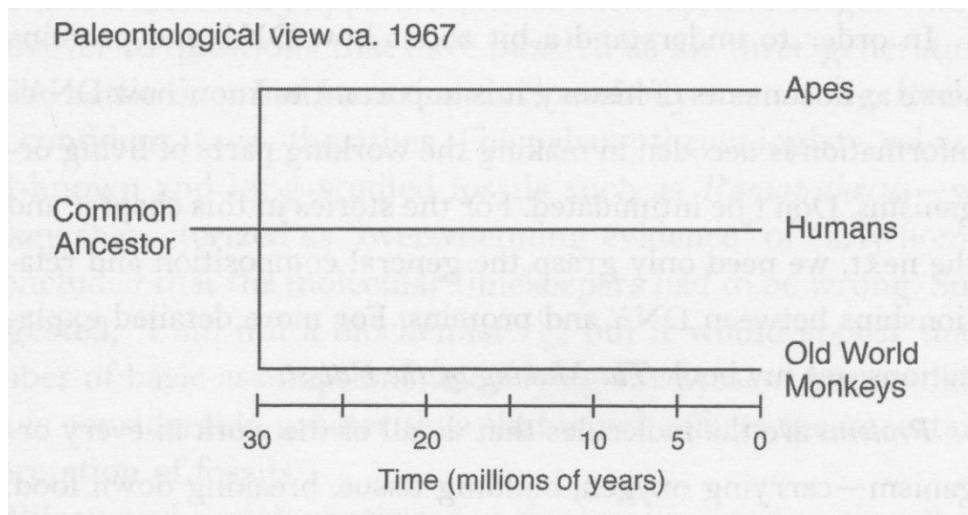
Different types of molecules are discussed in relation to their fitness for providing the basis for a molecular phylogeny. Best fit are the "semantides", i.e. the different types of macromolecules that carry the genetic information or a very extensive translation thereof. The fact that more than one coding triplet may code for a given amino acid residue in a polypeptide leads to the notion of "isosemantic substitutions" in genic and messenger polynucleotides. Such substitutions lead to differences in nucleotide sequence that are not expressed by differences in amino acid sequence. Some possible consequences of isosemanticism are discussed.



*Zuckerkandl & Pauling (1965) J. Theoret. Biol.*

# *Estimating the Divergence of Humans and Chimps*

Divergence times were estimated by measuring the immunological cross-reaction of blood serum albumin between pairs of primates



**“no fuss, no muss, no dishpan hands. Just throw some proteins into a laboratory apparatus, shake them up, and bingo! – we have an answer to questions that have puzzled us for three generations.”**



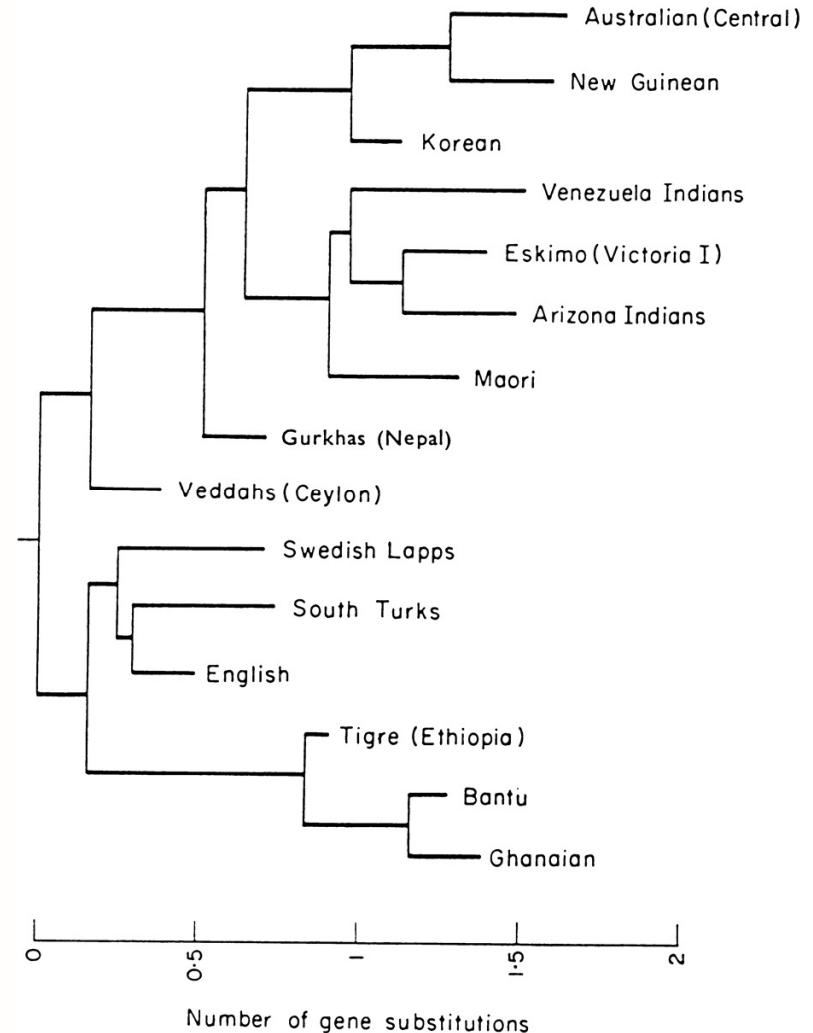
*Sarich & Wilson (1967) Science*

# *The Phylogeny of Human Populations*



**Phylogeny inferred from blood group allele frequencies from 15 populations**

L. L. Cavalli-Sforza and A. W. F. Edwards

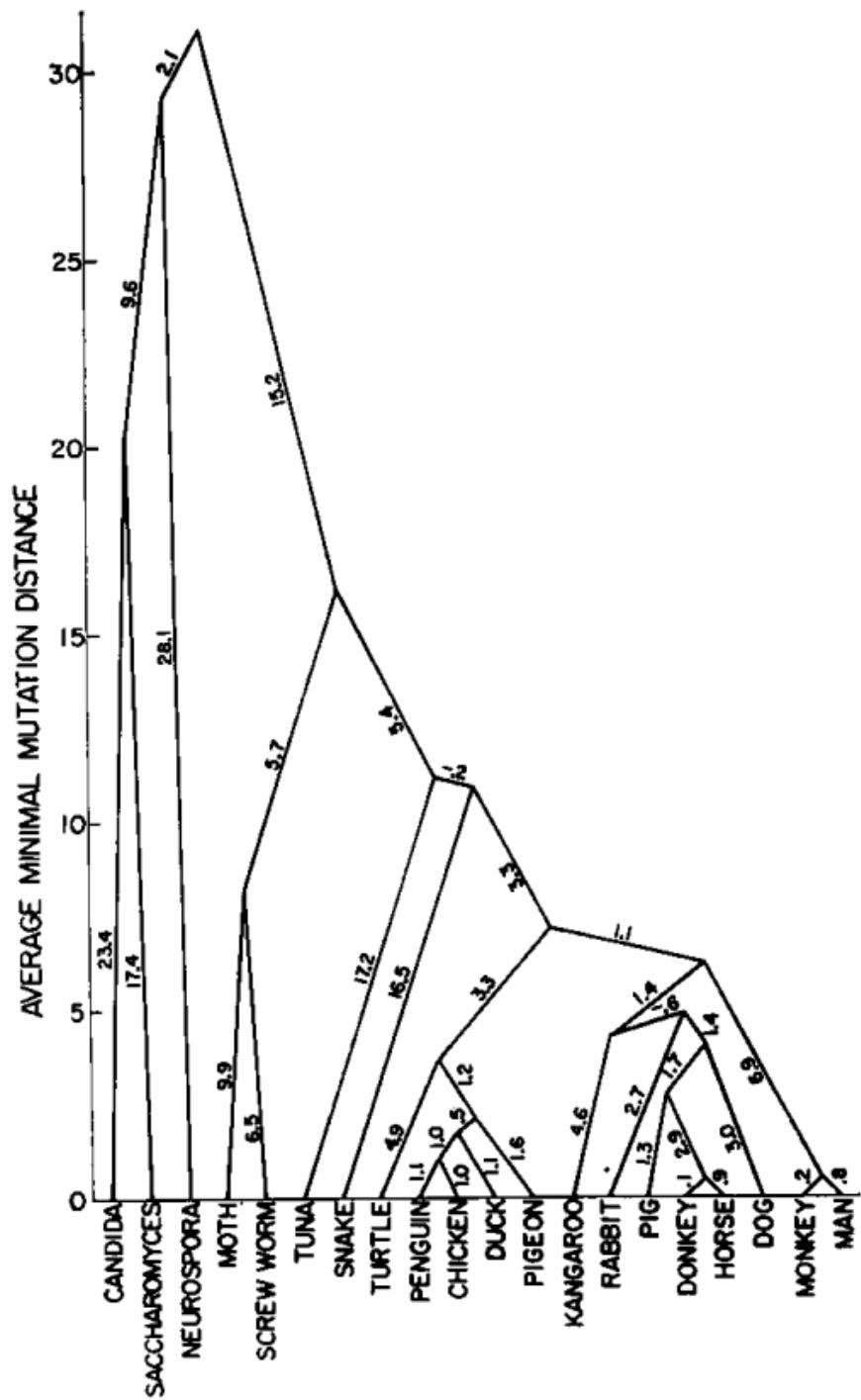


*Cavalli-Sforza & Edwards (1965) Genetics Today*

# *Sequence-based Phylogenies*

Used protein sequences from a large number of organisms

Developed a computational approach for efficient analysis of large numbers of taxa (distance matrix method)



Fitch & Margoliash (1967) Science

# Phylogenetic structure of the prokaryotic domain: The primary kingdoms

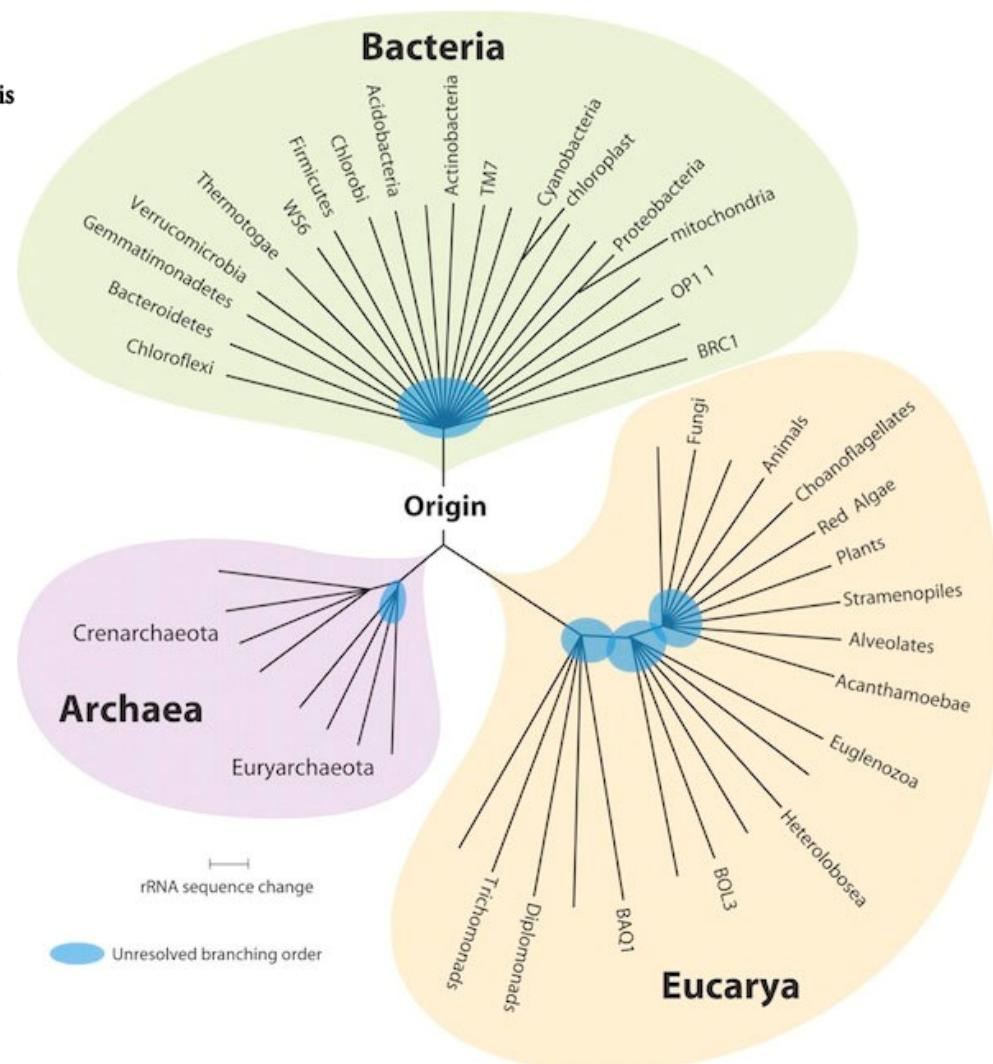
(archaeabacteria/eubacteria/urkaryote/16S ribosomal RNA/molecular phylogeny)

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 archaeabacteria, containing methanogenic bacteria; and (iii) the urkaryotes, now represented in the cytoplasmic component of eukaryotic cells.





**Gene tree  $\approx$  Species phylogeny**

**Gene tree  $\neq$  Species phylogeny**

## *Two Types of Factors Influence the Relationship*

### **Analytical factors**

They lead to failure in accurately inferring a gene tree; these can be either due to **stochastic error** (e.g., insufficient sequence length or taxon samples) or due to **systematic error** (e.g., observed data far depart from model assumptions)

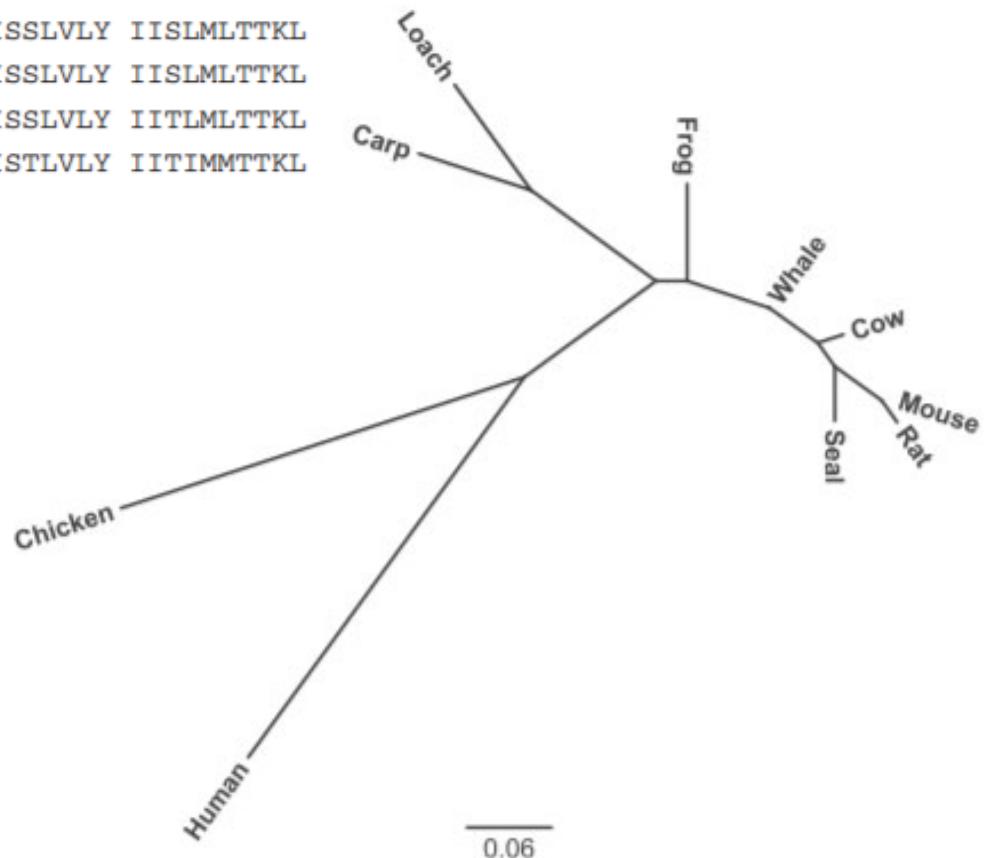
### **Biological factors**

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 and natural selection**

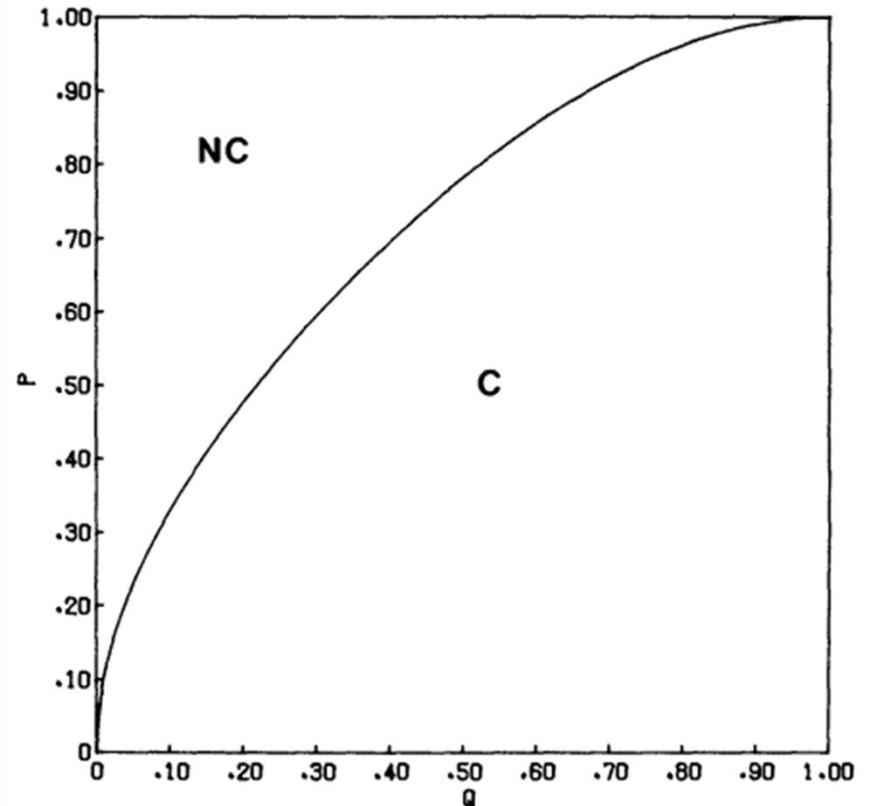
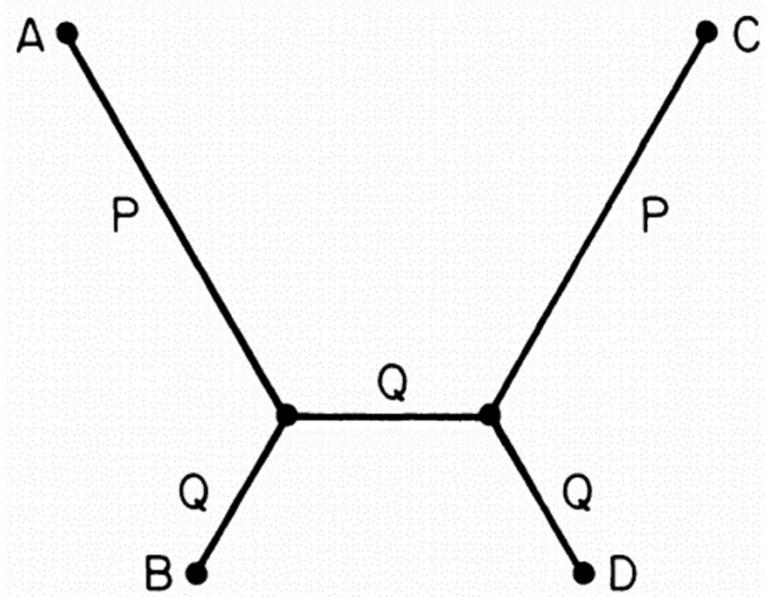
# *Sampling Error*

10 50

Cow	MAYPMQLGFQ DATSPIMEEL LHFHDHTLMI VFLISSLVLY IISLMLTTKL
Carp	MAHPTQLGFK DAAMPVMEEL LHFHDHALMI VLLISTLVLY IITAMVSTKL
Chicken	MANHSQSQLGFQ DASSPIMEEL VEFHDHALMV ALAICSLVLY LLTLMLEKL
Human	MAHAAQVGLQ DATSPIMEEL ITFHDHALMI IFLICFLVLY ALFLTLTTKL
Loach	MAHPTQLGFQ DAASPVMEEL LHFHDHALMI VFLISALVLY VIITTVSTKL
Mouse	MAYPFQLGLQ DATSPIMEEL MNFHDHTLMI VFLISSLVLY IISLMLTTKL
Rat	MAYPFQLGLQ DATSPIMEEL TNFHDHTLMI VFLISSLVLY IISLMLTTKL
Seal	MAYPLQMGLQ DATSPIMEEL LHFHDHTLMI VFLISSLVLY IISLMLTTKL
Whale	MAYPFQLGFQ DAASPIMEEL LHFHDHTLMI VFLISSLVLY IITLMLTTKL
Frog	MAHPSQLGFQ DAASPIMEEL LHFHDHTLMA VFLISTLVLY IITIMMMTKL



# *Systematic Error*

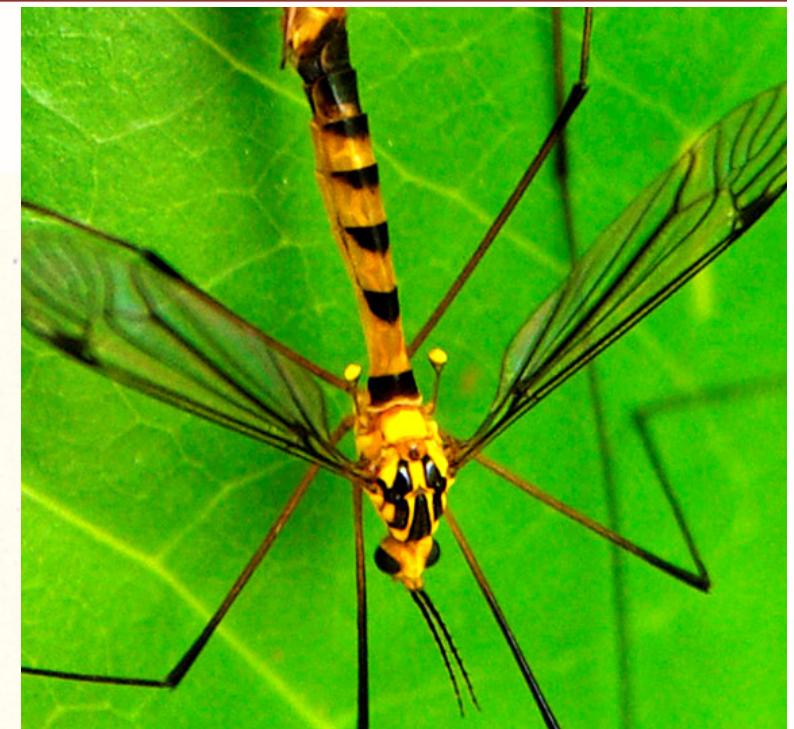
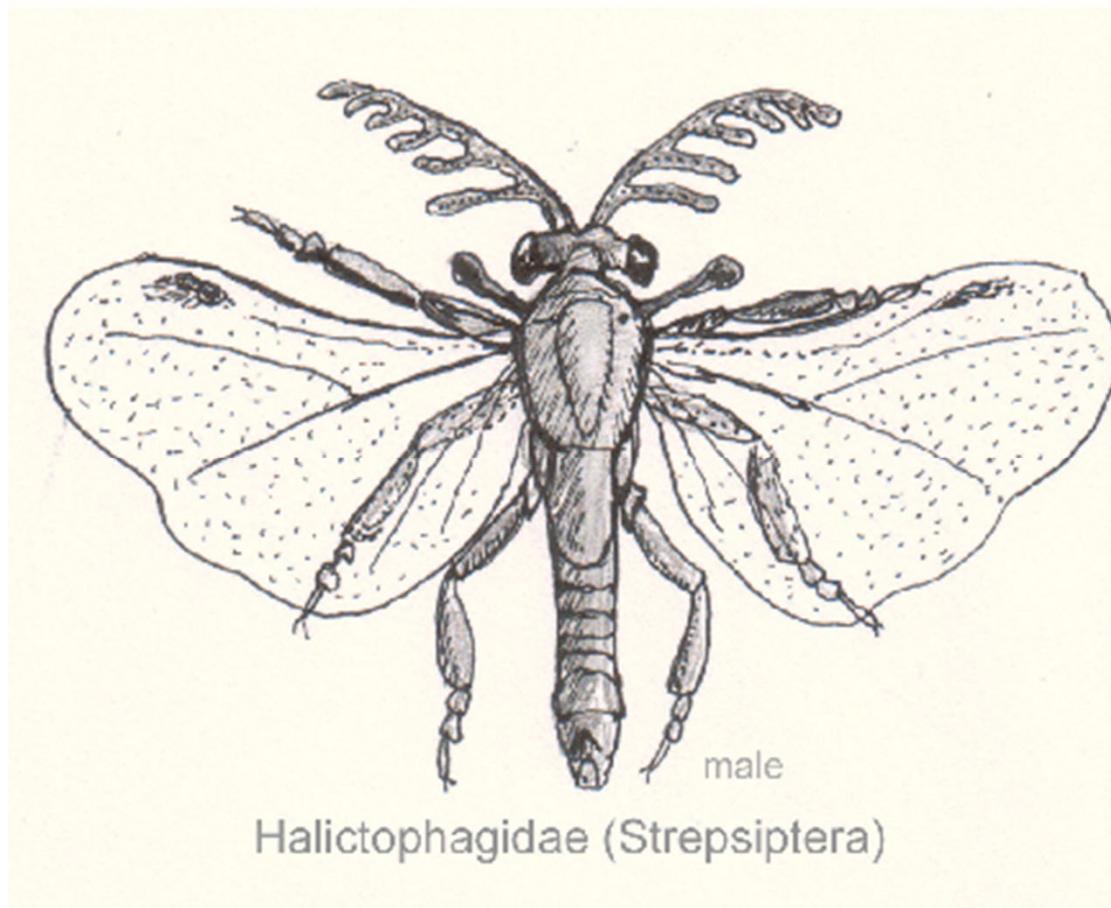


**Long branch attraction**

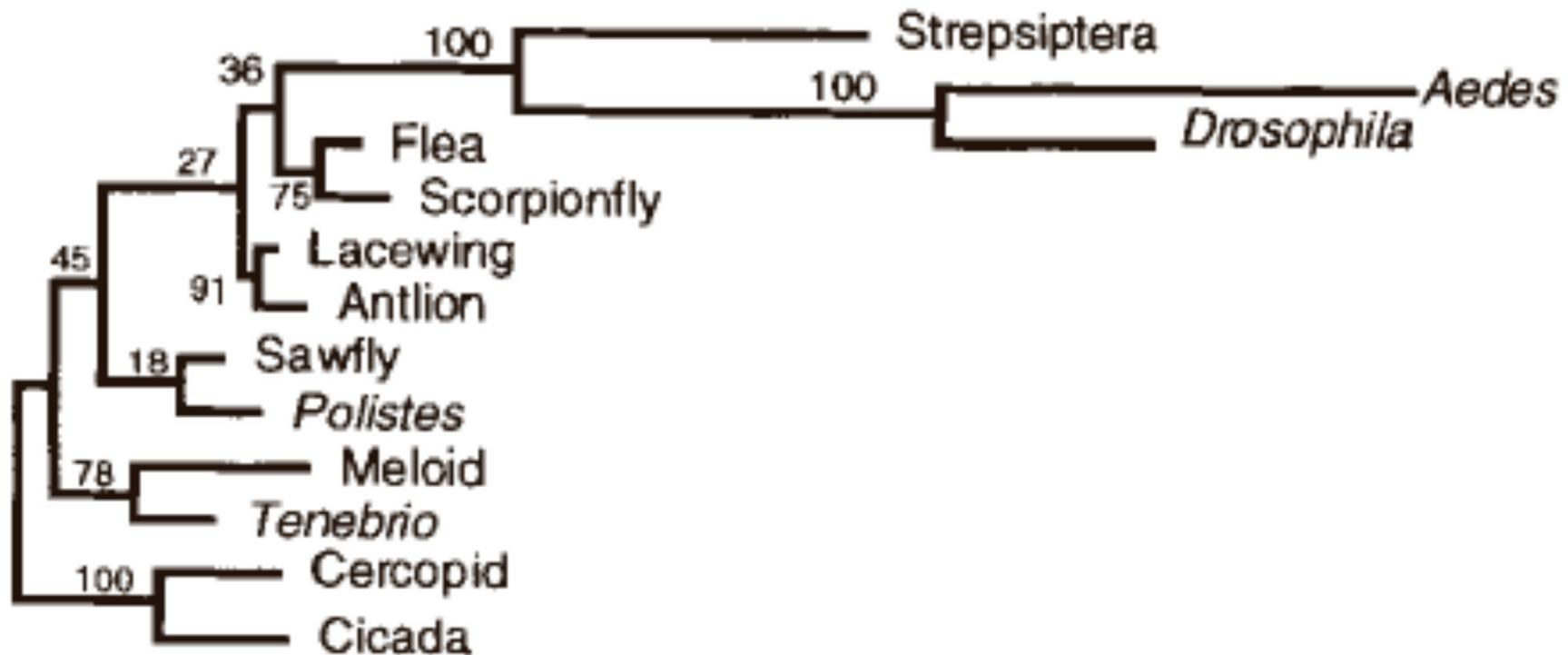


*Felsenstein (1978) Syst. Zool.*

## *“The Strepsiptera Problem” is a Classic Example of LBA*

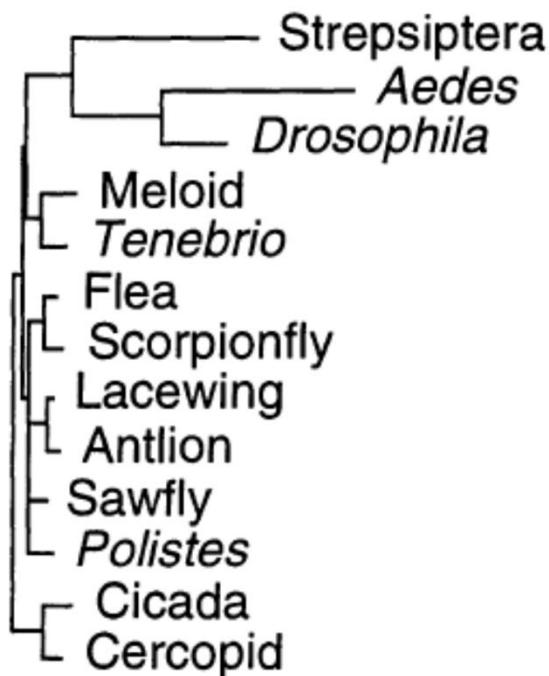


# *The Strepsiptera Problem*

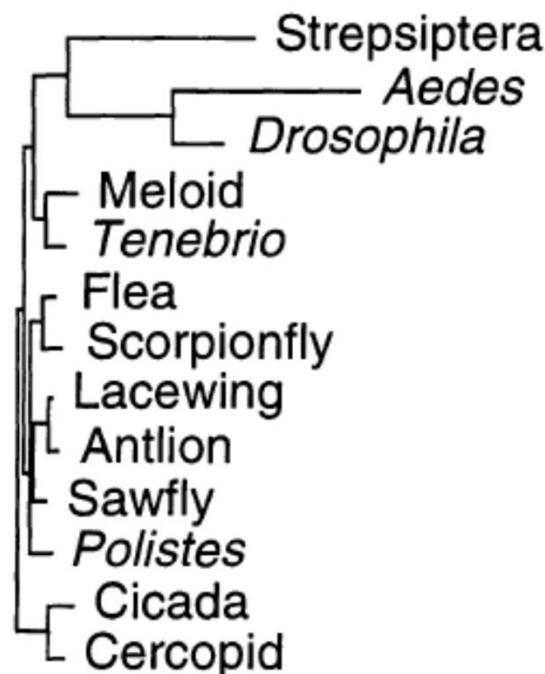


Carmean & Crespi (1995) Nature

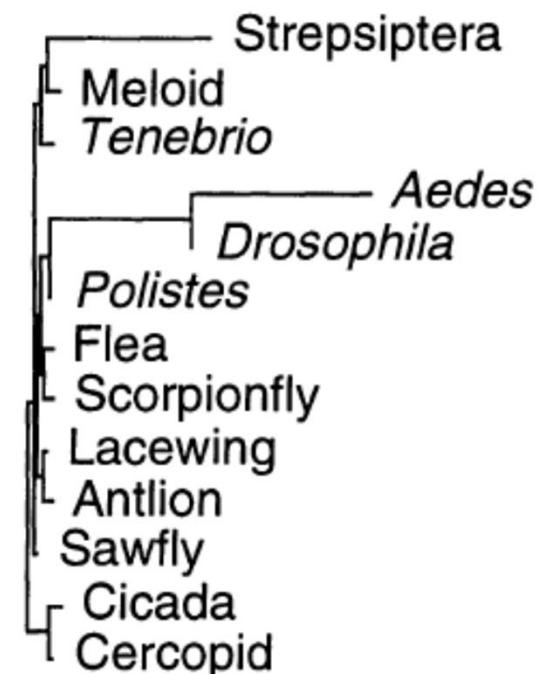
# The Strepsiptera Problem



p distance



HKY85

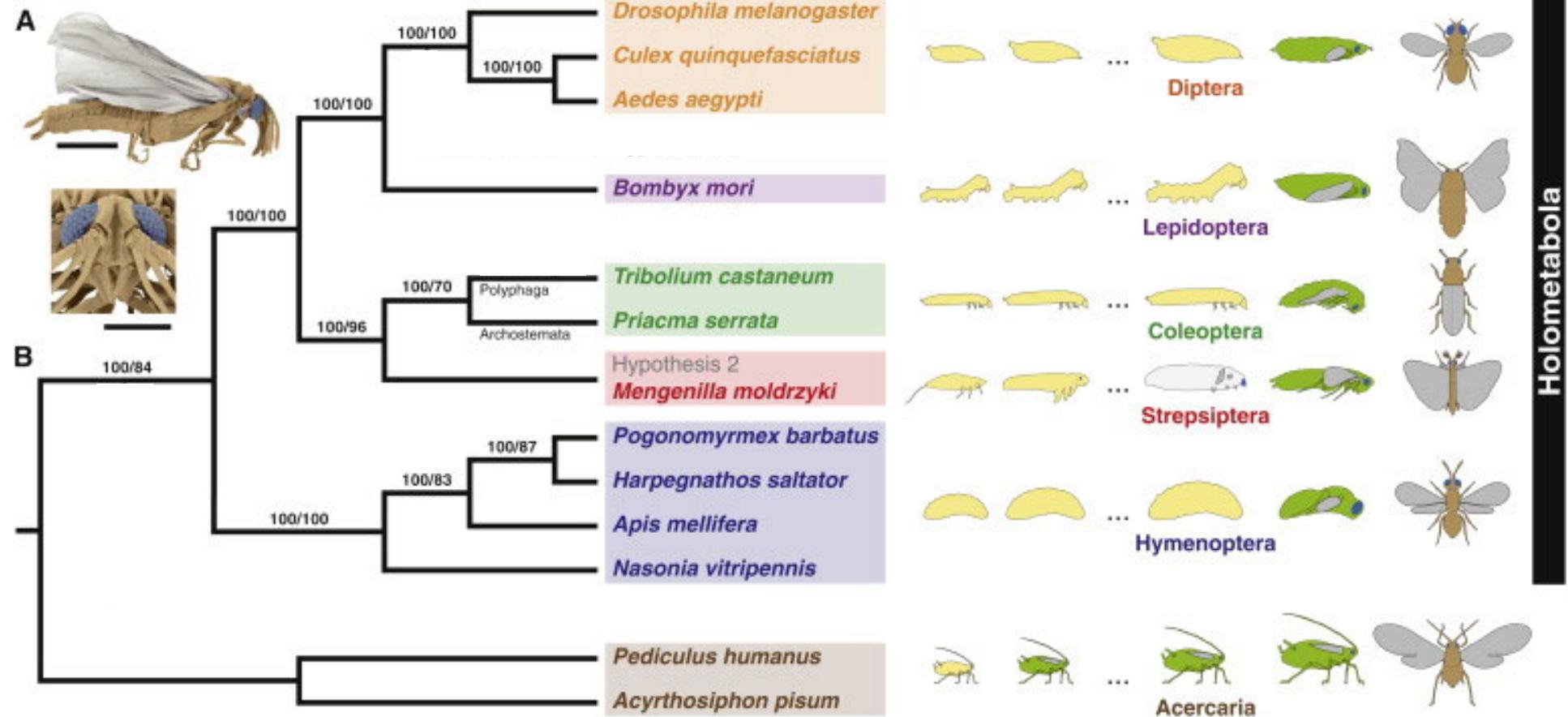


HKY85+GAMMA



Huelsenbeck (1997) *Syst. Biol.*

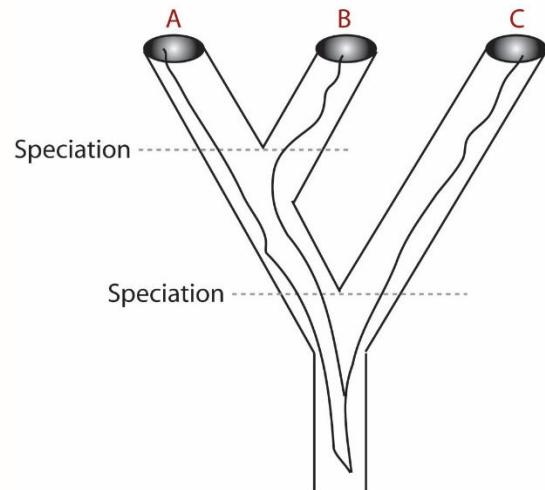
# Solving the Strepsiptera Problem with More Genes and Better Models



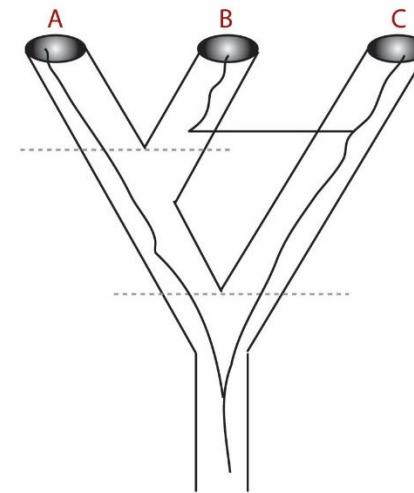
Niehuis et al. (2012) Curr. Biol.

# *Biological Factors*

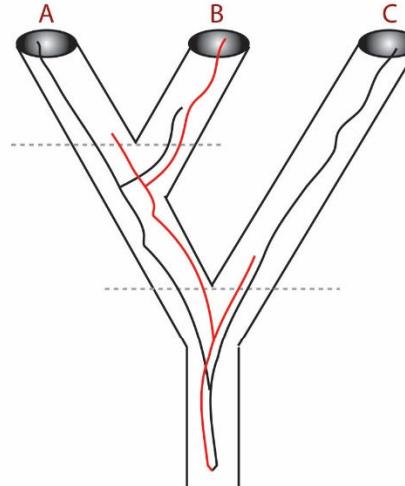
**Lineage Sorting**



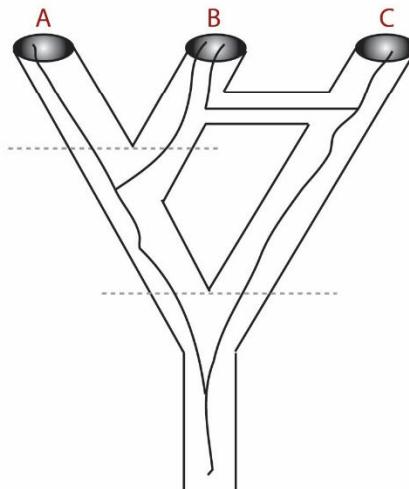
**Horizontal Gene Transfer**



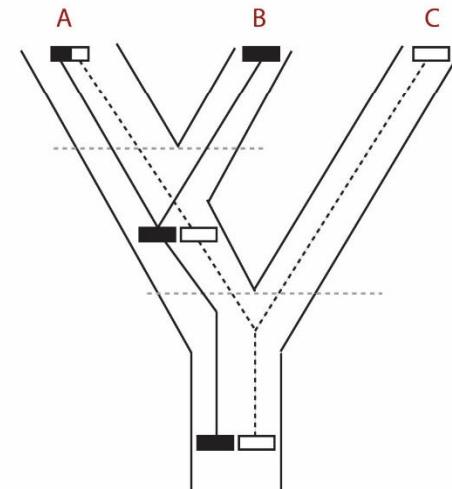
**Gene Duplication and Loss**



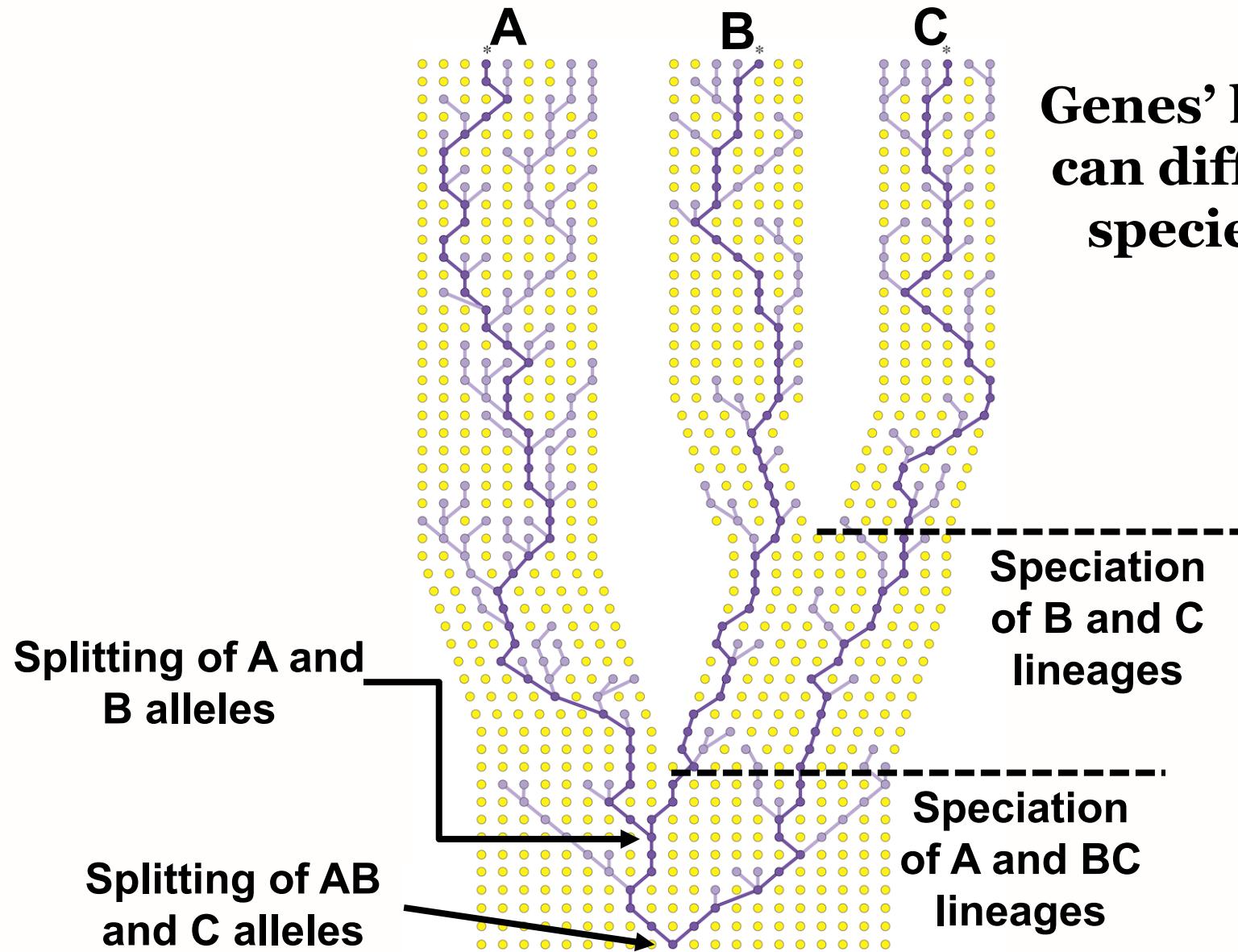
**Hybridization**



**Recombination**



# *Stochastic Lineage Sorting of Ancestral Polymorphisms*

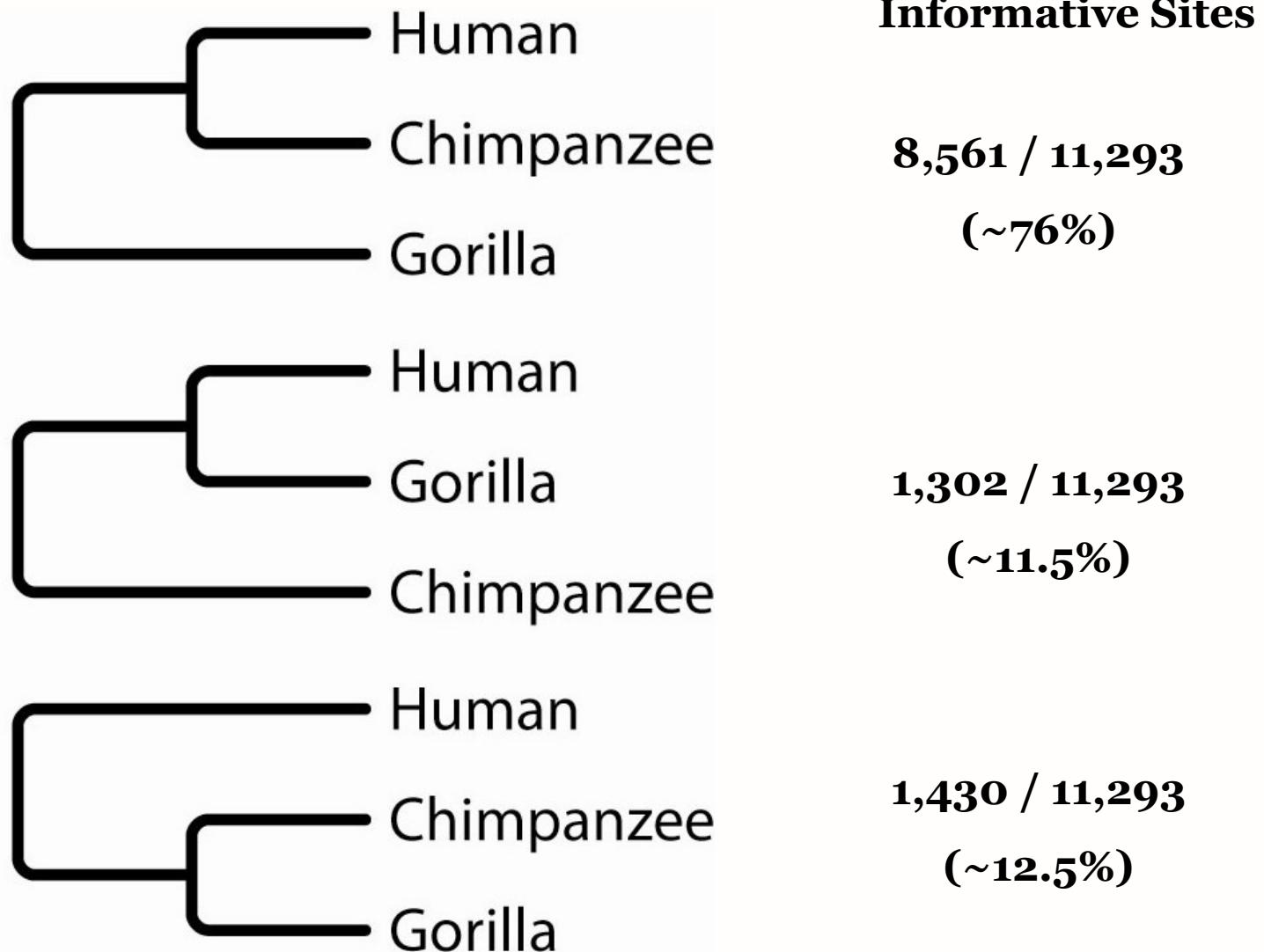


Genes' histories  
can differ from  
species ones



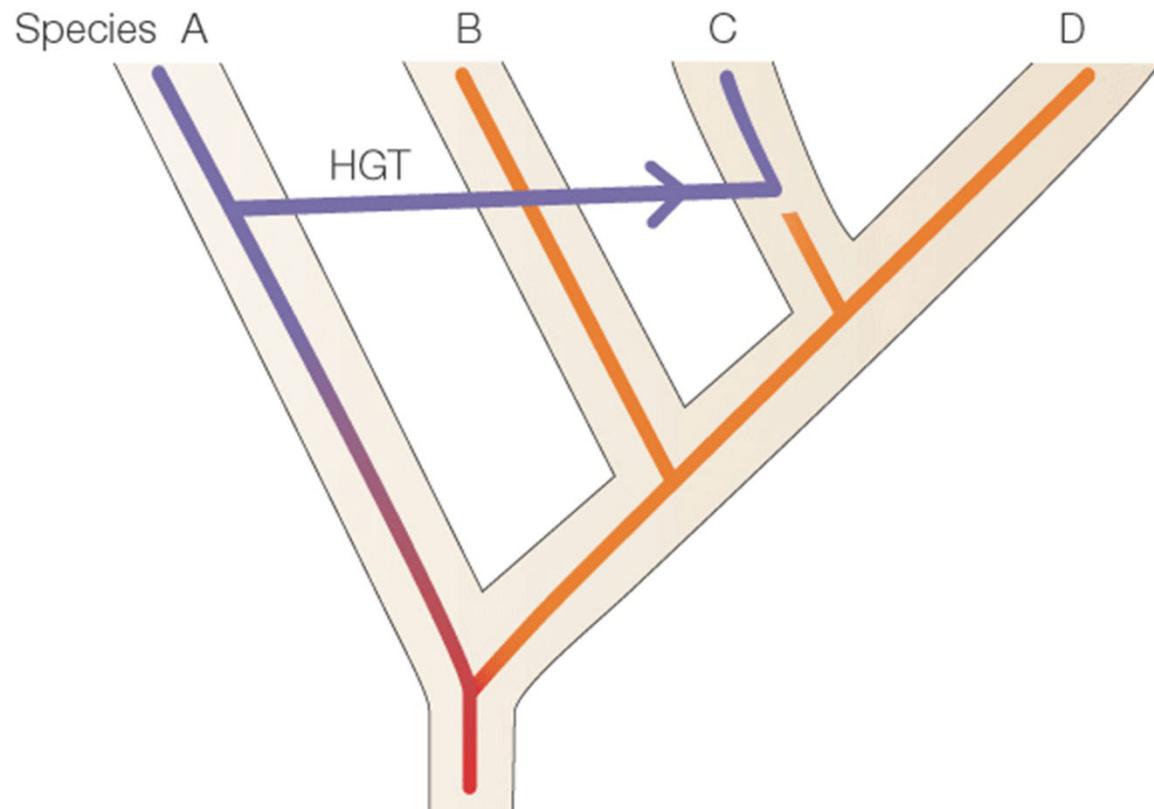
Nei (1987) *Mol. Evol. Genet.*; Maddison (1997) *Syst. Biol.*

# *Lineage Sorting in Primates*



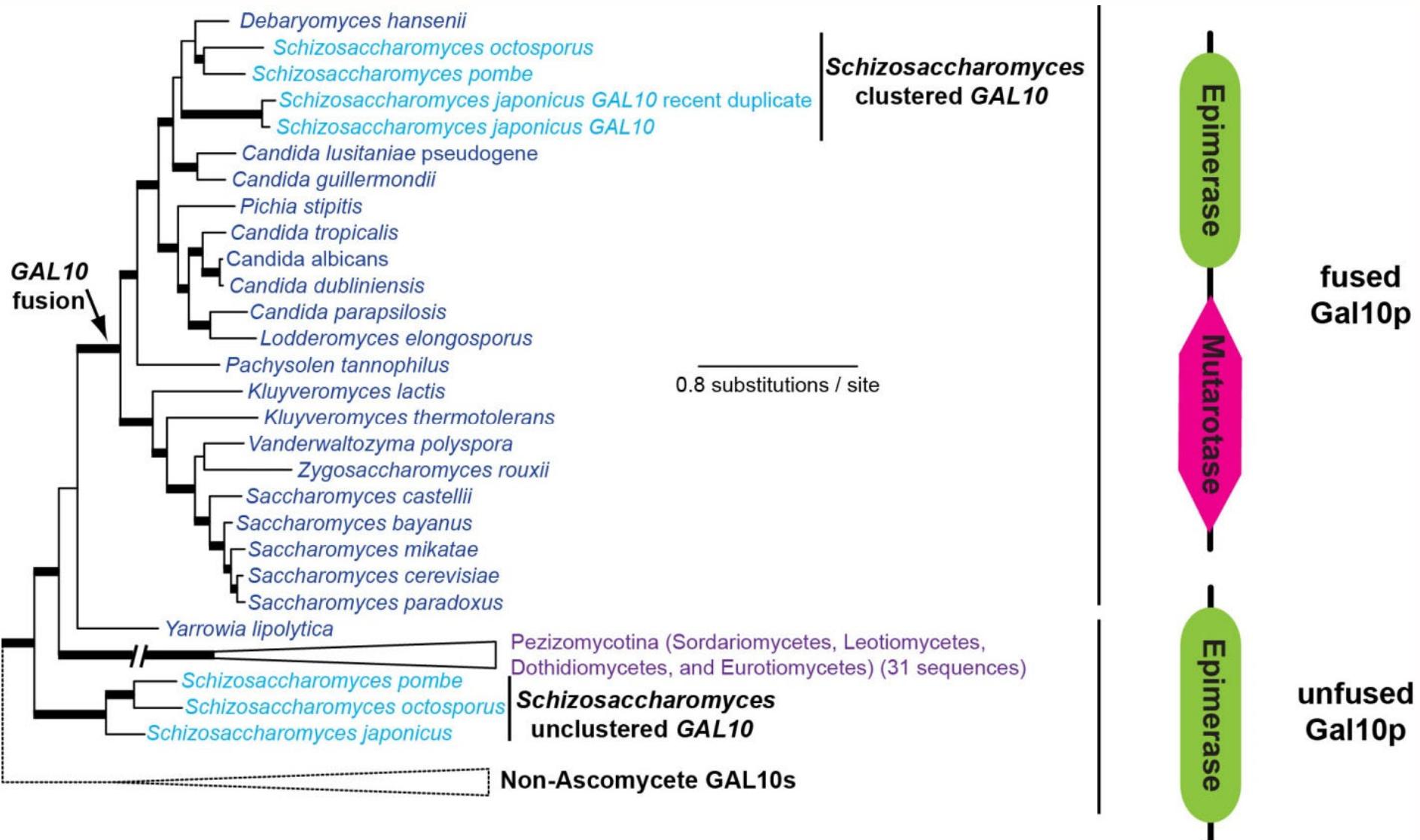
# *Horizontal Transfer of Genes*

Exchange of genes between organisms other than through reproduction



Gogarten & Townsend (2005) Nature Rev. Genet.

# Horizontal Gene Transfer in Fungi



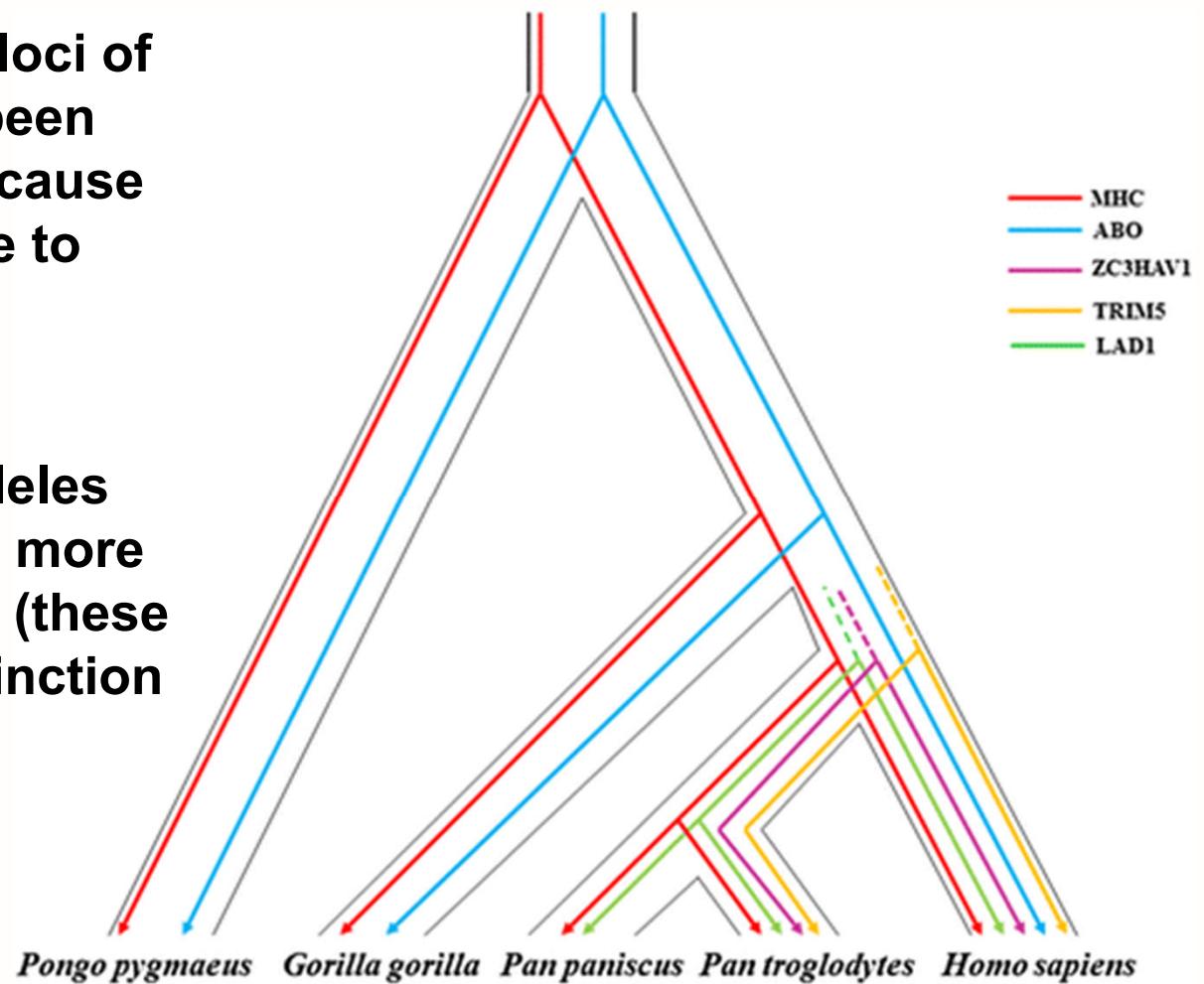
Slot & Rokas (2010) PNAS

## Balancing Selection

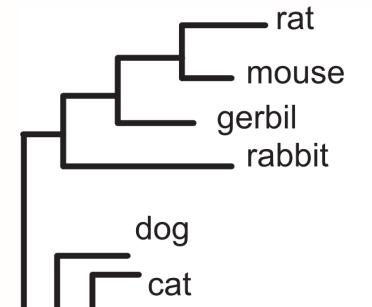
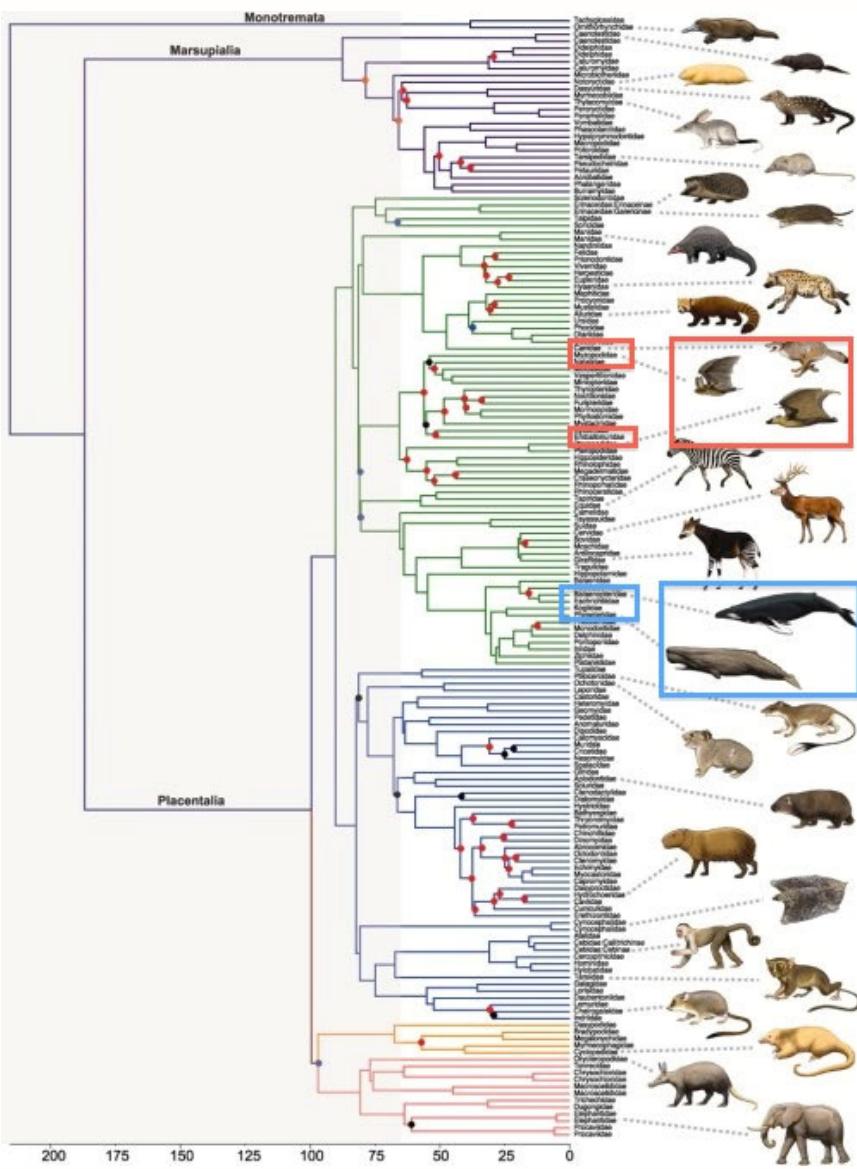
Balancing selection can maintain “trans-species polymorphisms”, in which the alleles are more ancient than the species

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

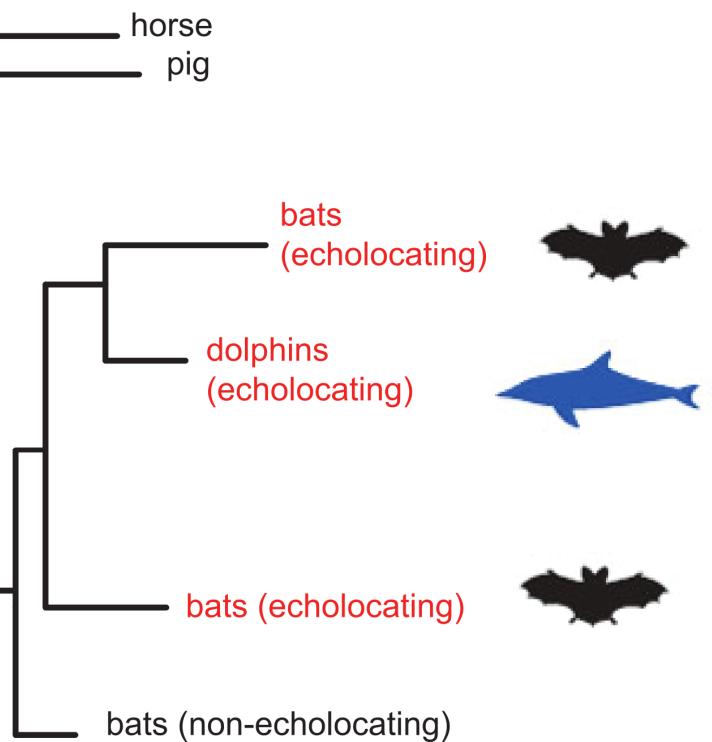
Certain human MHC alleles appear to have diverged more than 65 million years ago (these alleles witnessed the extinction of dinosaurs!!!)



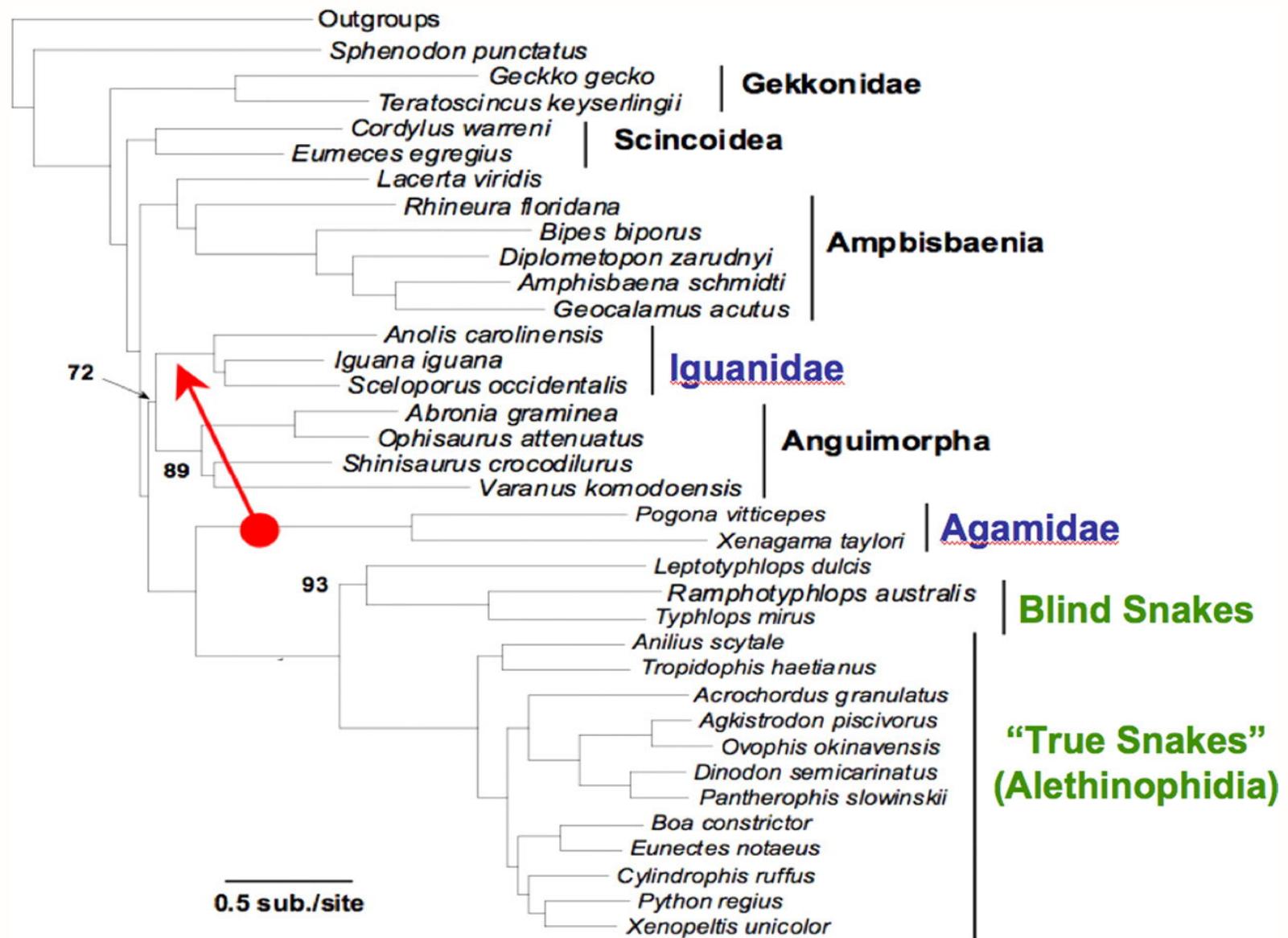
# Positive Selection



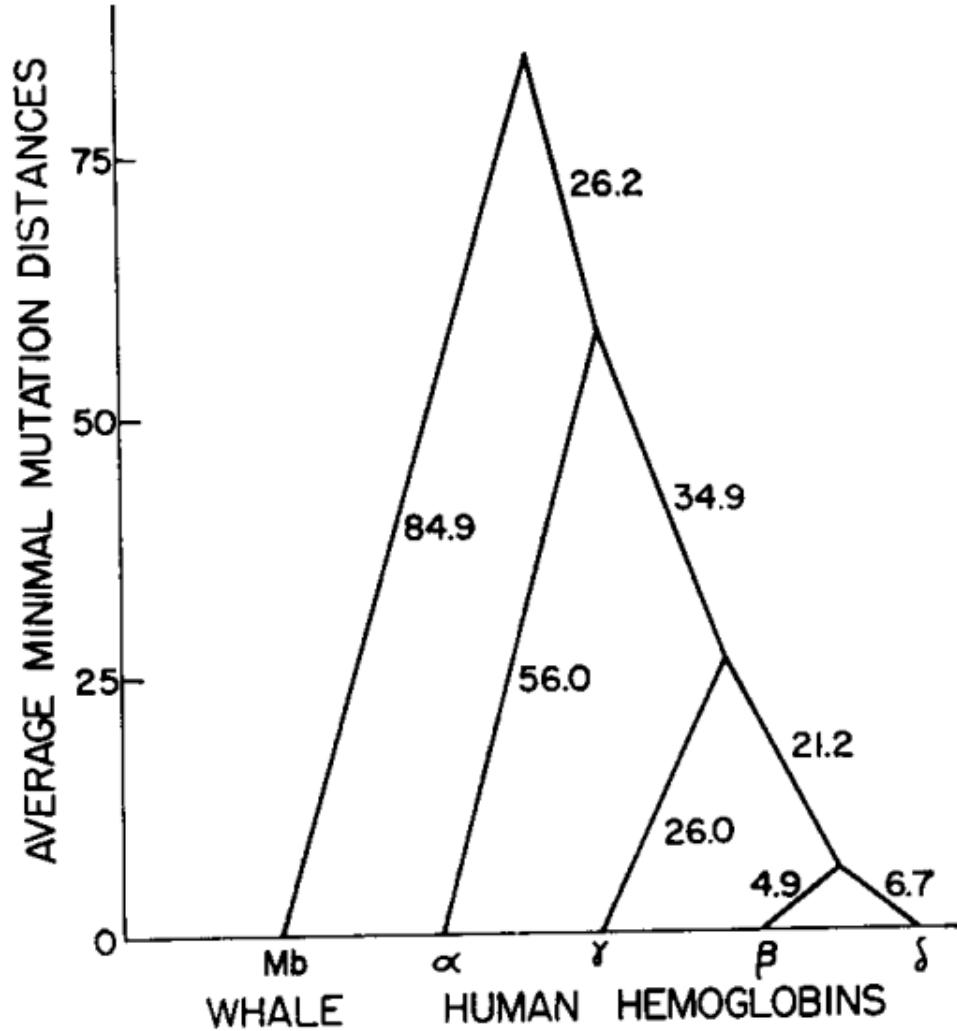
**Phylogeny of *prestin*, a gene involved in echolocation**



# Positive Selection



# *Gene Duplication Can Confound Phylogeny*



(15). A cautionary note may be derived from this. A wildly incorrect result could easily be obtained if the presence of multiple, homologous genes were not recognized and a phylogeny were constructed from sequences which were coded for, say, half by genes for alpha hemoglobin chains and half by genes for beta hemoglobin chains. This results from the speciation having occurred more recently than the gene duplication which permitted the separate evolution of the alpha and beta genes.



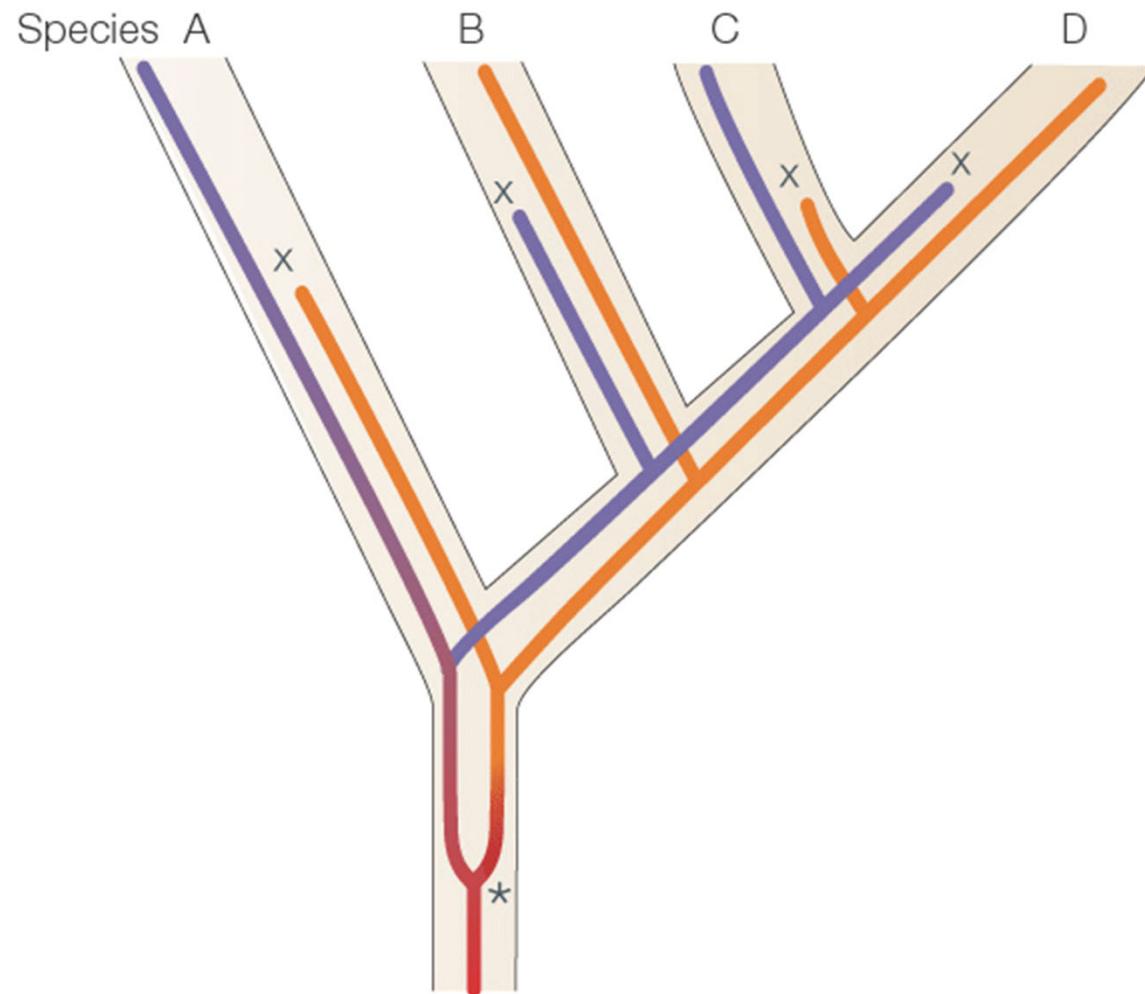
# *Gene Duplication Can Confound Phylogeny*

homologous. It has been pointed out before that a phylogeny of birds and mammals based upon a haphazard mixture of  $\alpha$  and  $\beta$  hemoglobins would be biological nonsense since the initial dichotomy would be on the distinction between the  $\alpha$  and  $\beta$  genes rather than between the birds and the mammals (Fitch and Margoliash, 1967). Therefore, there should be two subclasses of homology. Where the homology is the result of gene duplication so that both copies have descended side by side during the history of an organism, (for example,  $\alpha$  and  $\beta$  hemoglobin) the genes should be called *paralogous* (para = in parallel). Where the homology is the result of speciation so that the history of the gene reflects the history of the species (for example  $\alpha$  hemoglobin in man and mouse) the genes should be called *orthologous* (ortho = exact). Phylogenies require orthologous, not paralogous, genes. Note



*Fitch (1970) Syst. Zool.*

# *Gene Duplication and Loss*



*Gogarten & Townsend (2005) Nature Rev. Genet.*

# Gene Duplication and Loss

0 Losses  
210 Loci

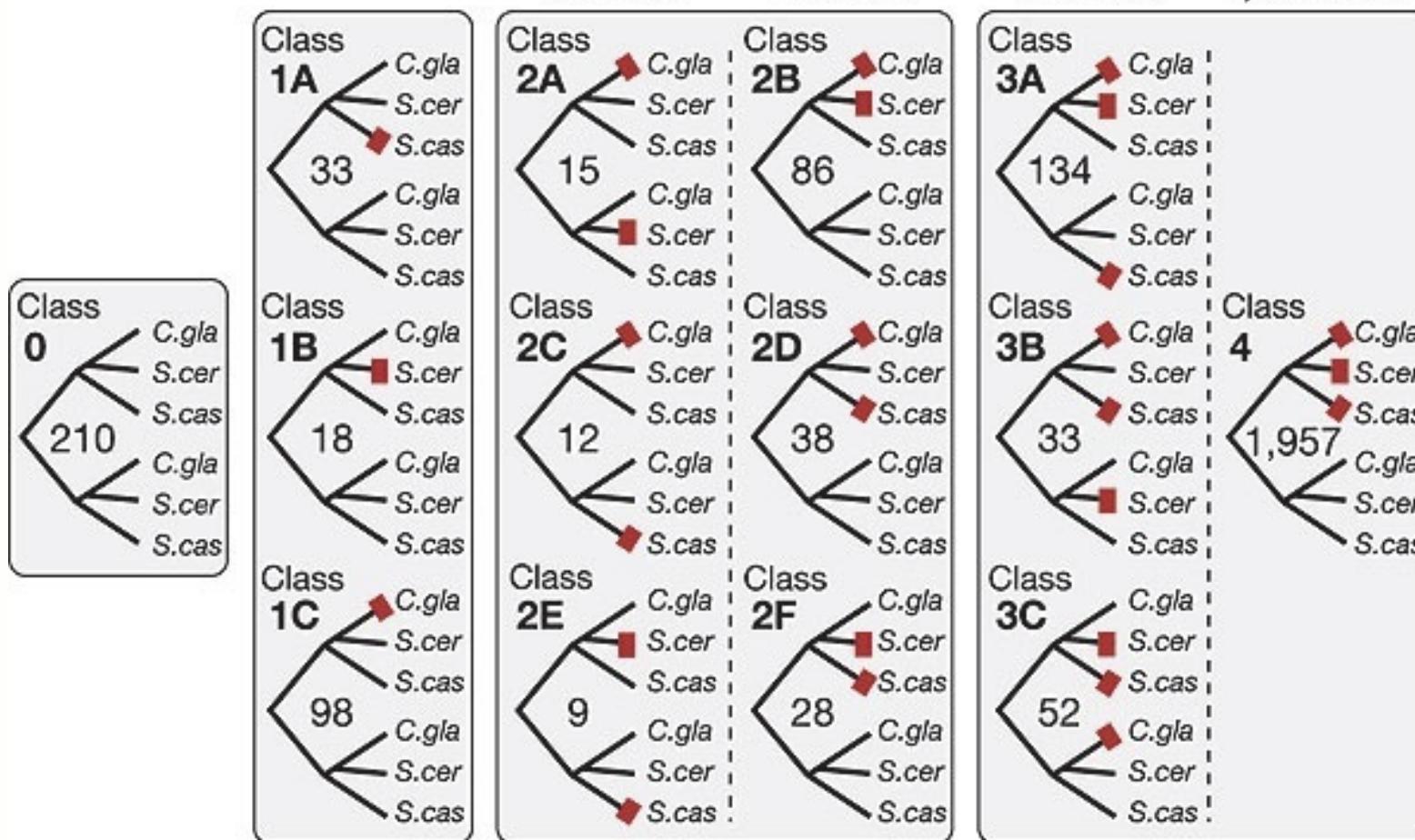
1 Loss  
149 Loci

2 Losses  
188 Loci

3 Losses  
2,176 Loci

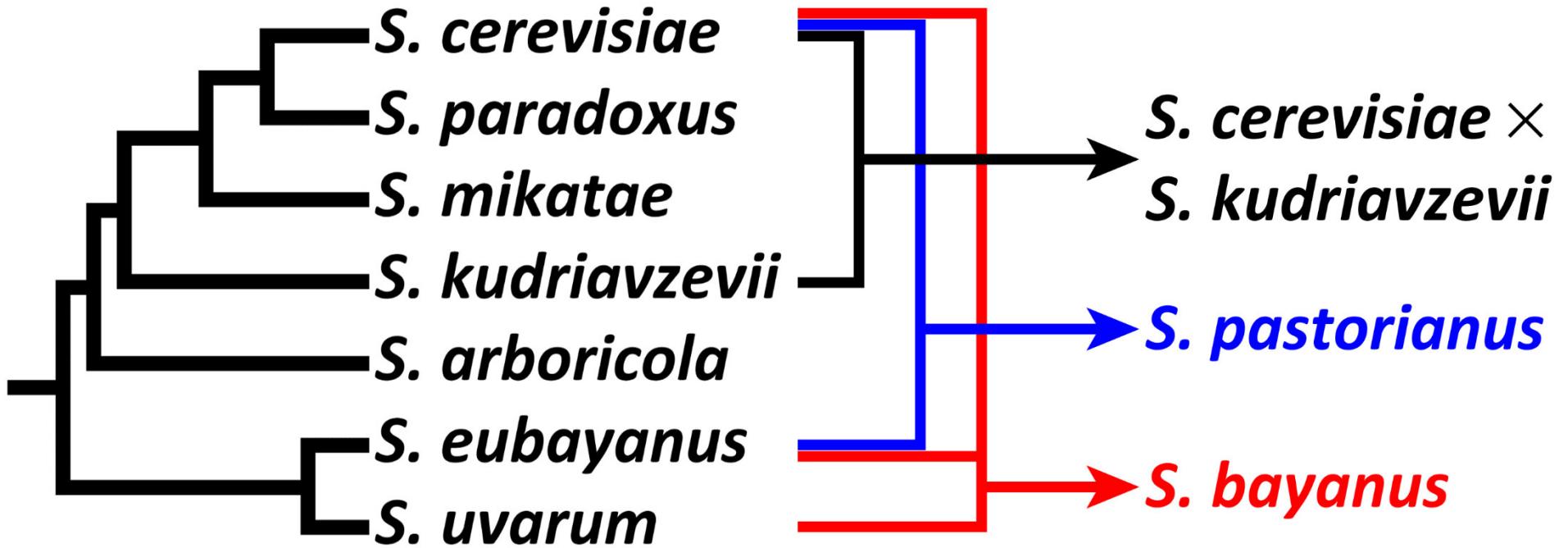
Divergent  
36 Loci      Convergent  
152 Loci

Divergent  
219 Loci      Convergent  
1,957 Loci



Scannell et al. (2006) Nature

## Hybridization / Introgression



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

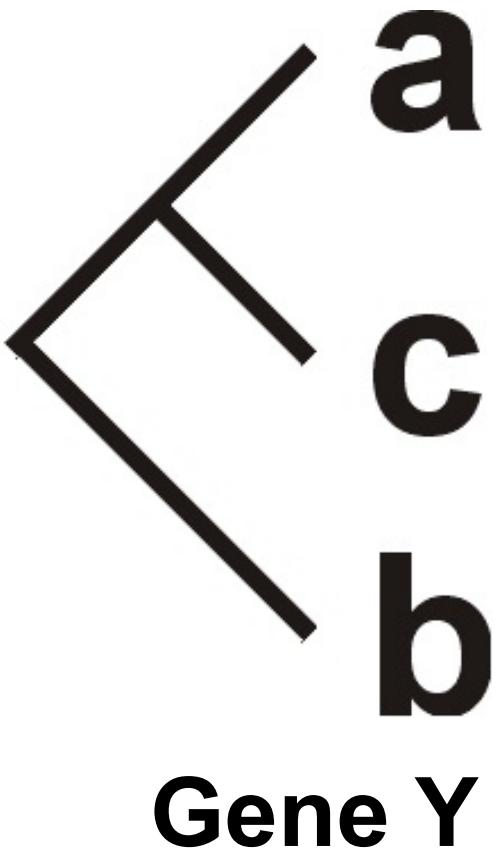
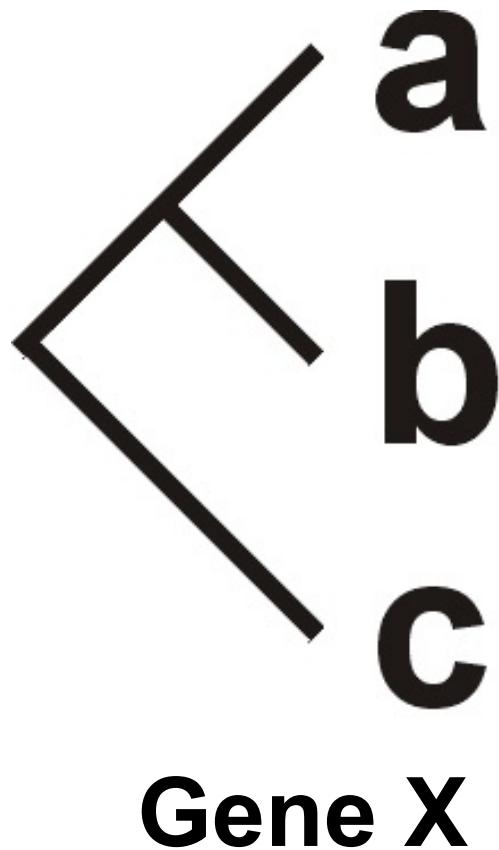
*S. cerevisiae* – *S. paradoxus* divergence ≈ human – mouse divergence  
*S. cerevisiae* – *S. uvarum* divergence ≈ human – chicken divergence



**OK, I now get why  
gene trees ≠ species trees**

**What does this have to do with  
phylogenomics?**

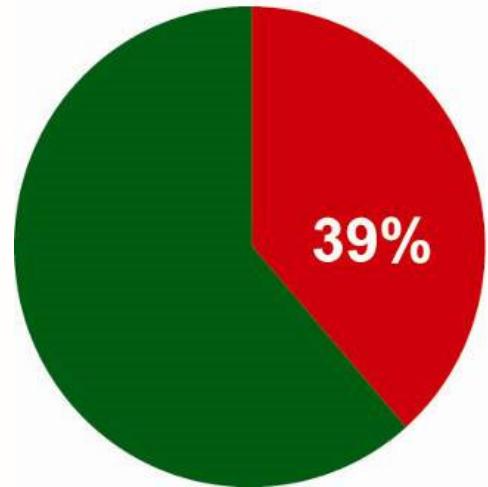
*All this Manifests Itself as Incongruence*



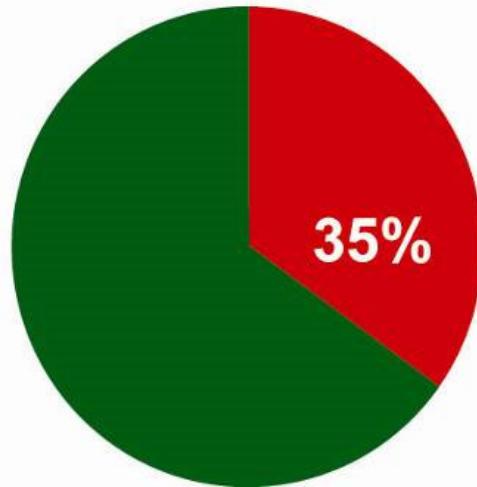
Species  
phylogeny?

# *Incongruence is Pervasive in the Phylogenetics Literature*

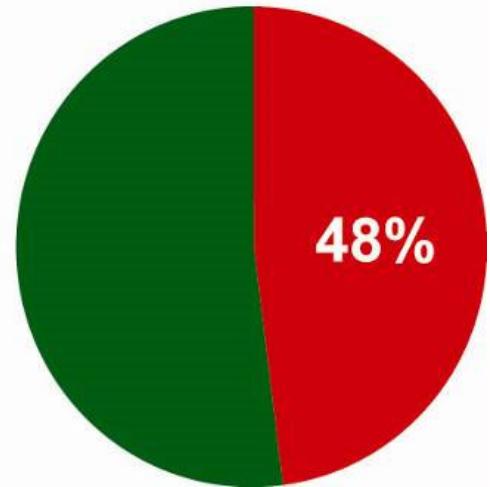
A: All organisms



B: Mammals



C: Insects

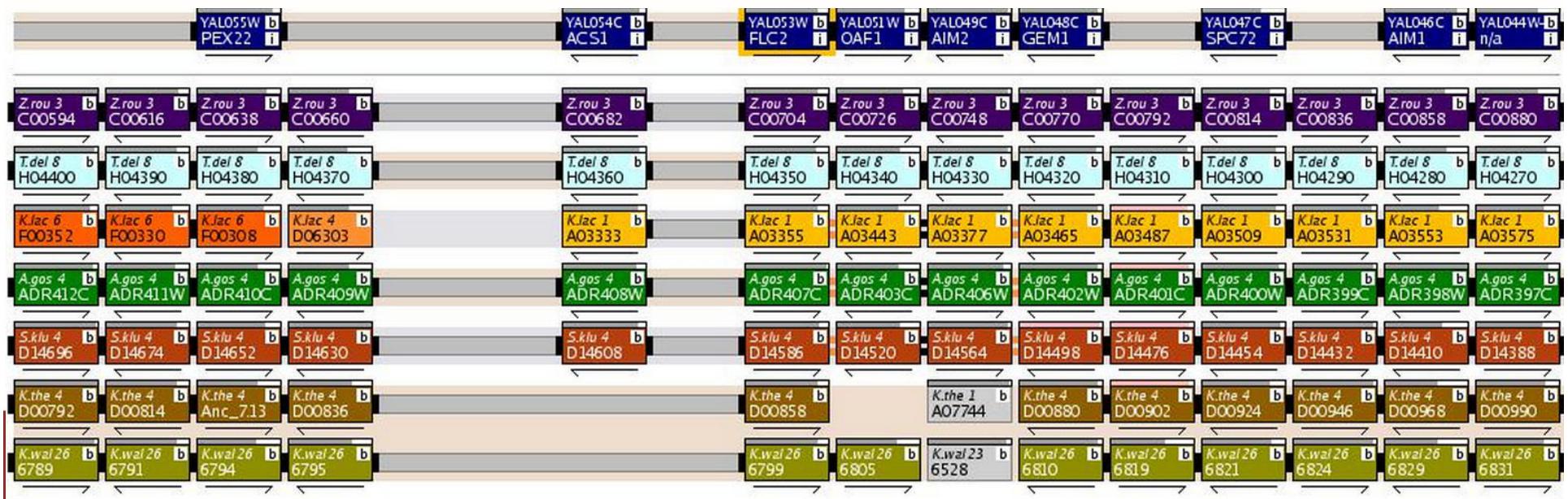


*Rokas & Chatzimanolis (2008) in Phylogenomics (W. J. Murphy, Ed.)*

# A Systematic Evaluation of Single Gene Phylogenies

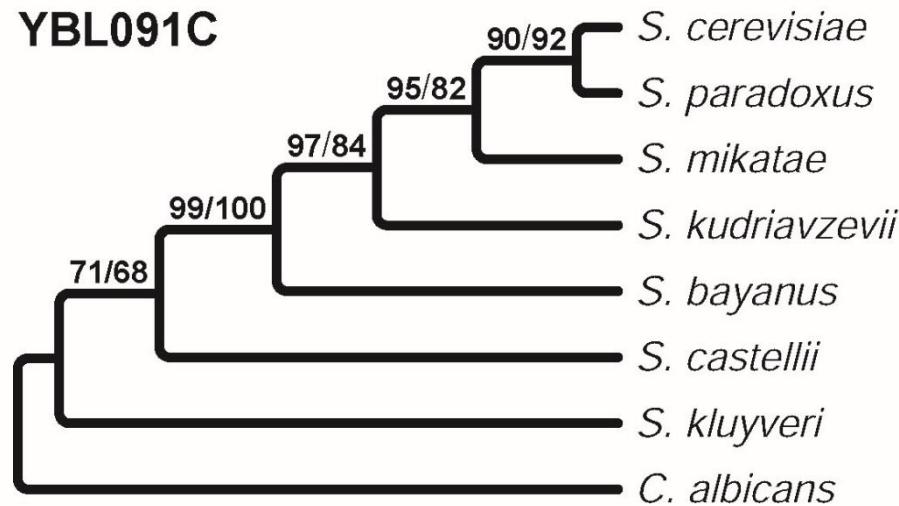


*S. cerevisiae*      *S. bayanus*  
*S. paradoxus*      *S. castellii*  
*S. mikatae*      *S. kluyveri*  
*S. kudriavzevii*      *Candida glabrata*

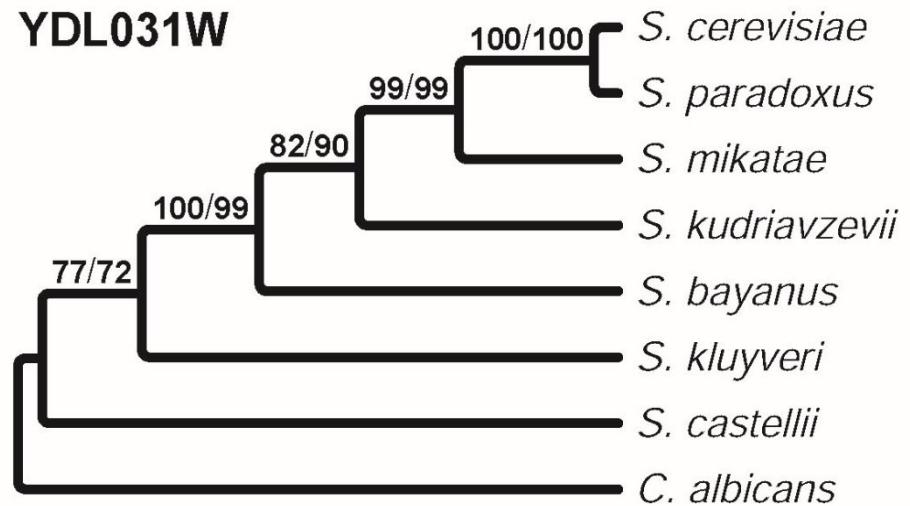


# Incongruence at the Single Gene Level

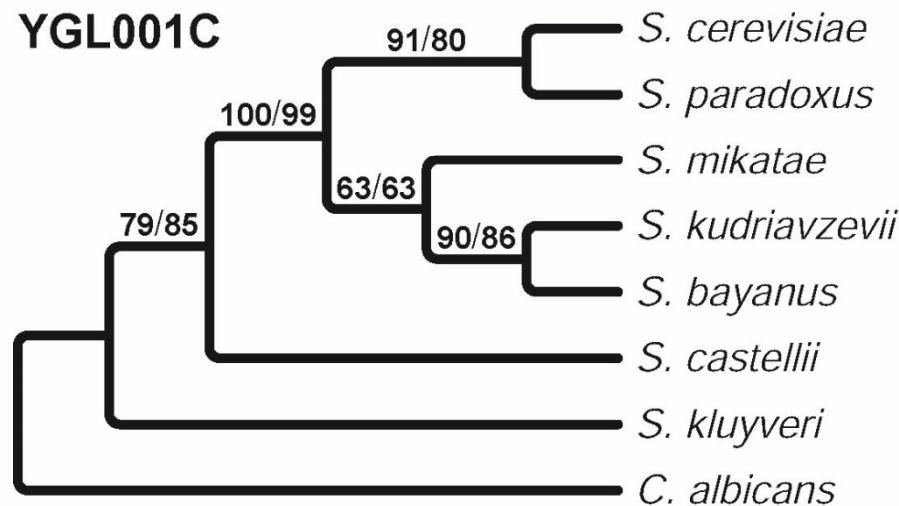
**YBL091C**



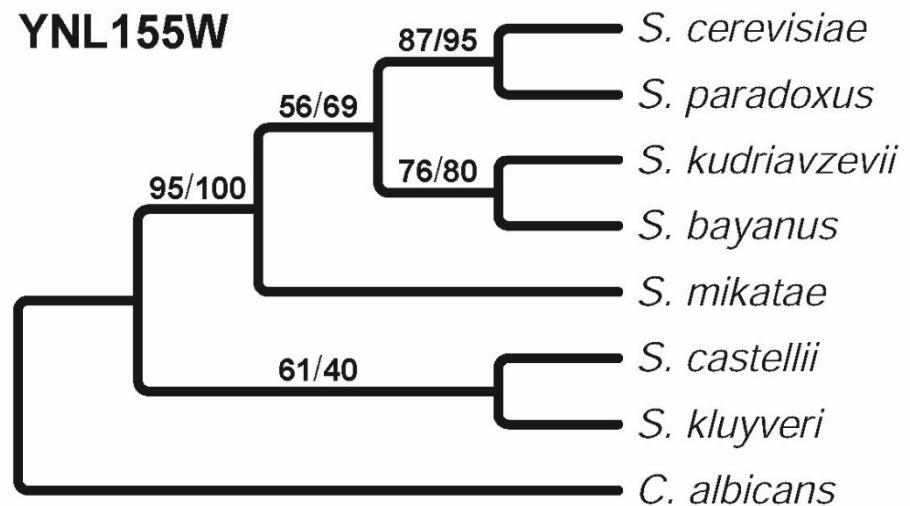
**YDL031W**



**YGL001C**



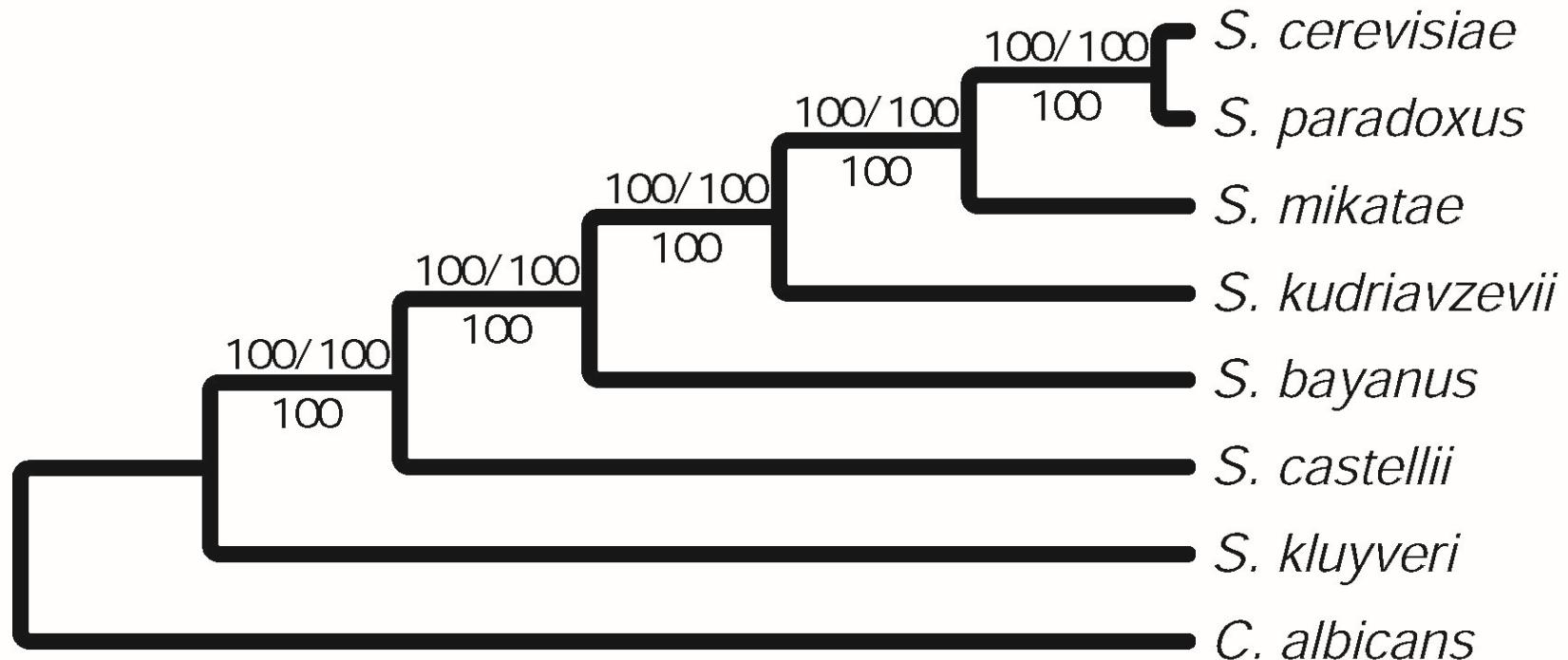
**YNL155W**



ML / MP

Anonymous Reviewer for Nature *Rokas et al. (2003) Nature*

# *Concatenation of 106 Genes Yields a Single Yeast Phylogeny*

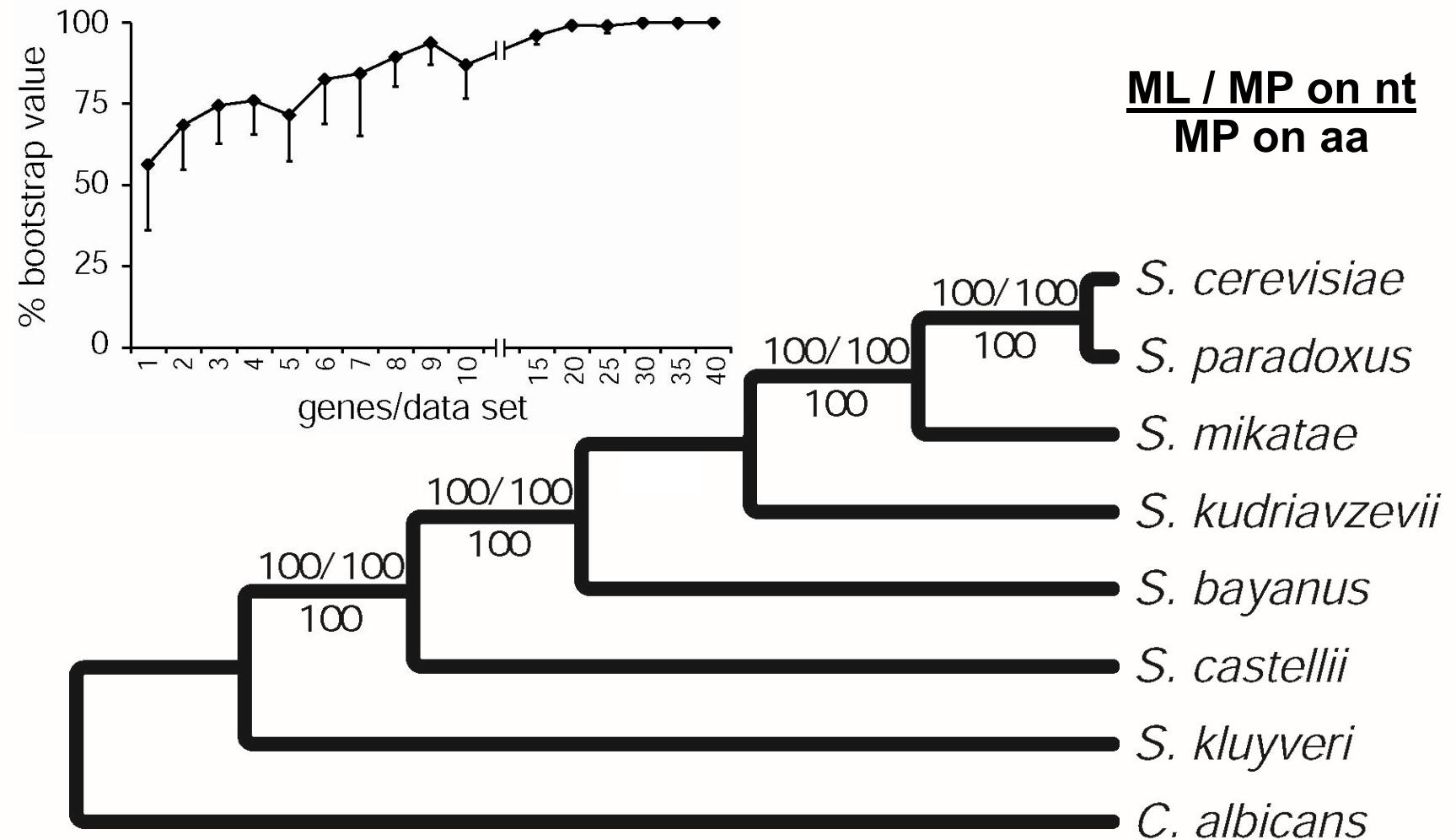


ML / MP on nt  
MP on aa



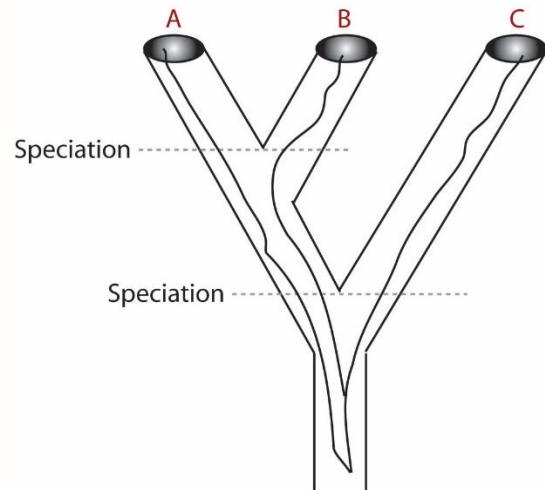
Rokas et al. (2003) Nature

# The Use of Many Genes Eliminates Stochastic Error

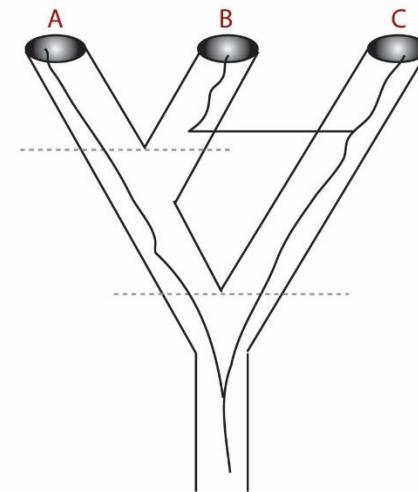


# *Gene Trees Can Differ from Species Trees*

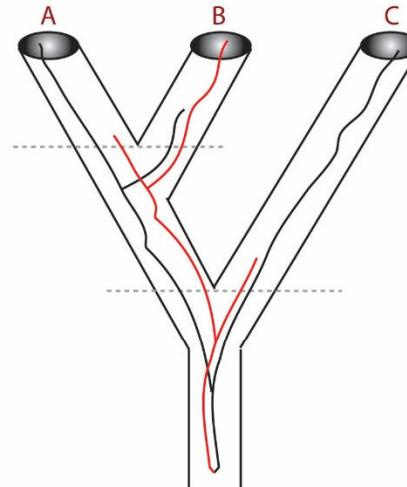
**Lineage Sorting**



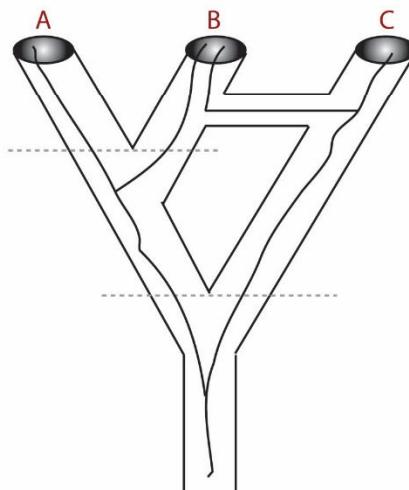
**Horizontal Gene Transfer**



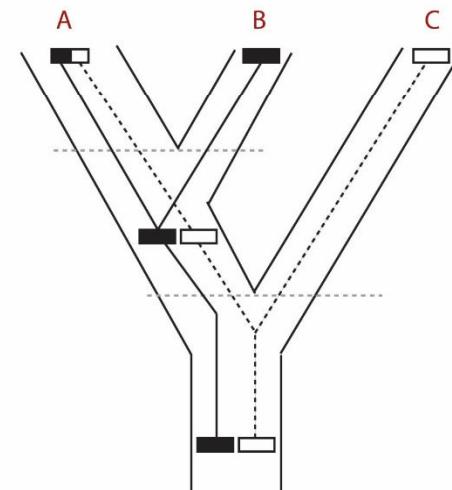
**Gene Duplication and Loss**



**Hybridization**

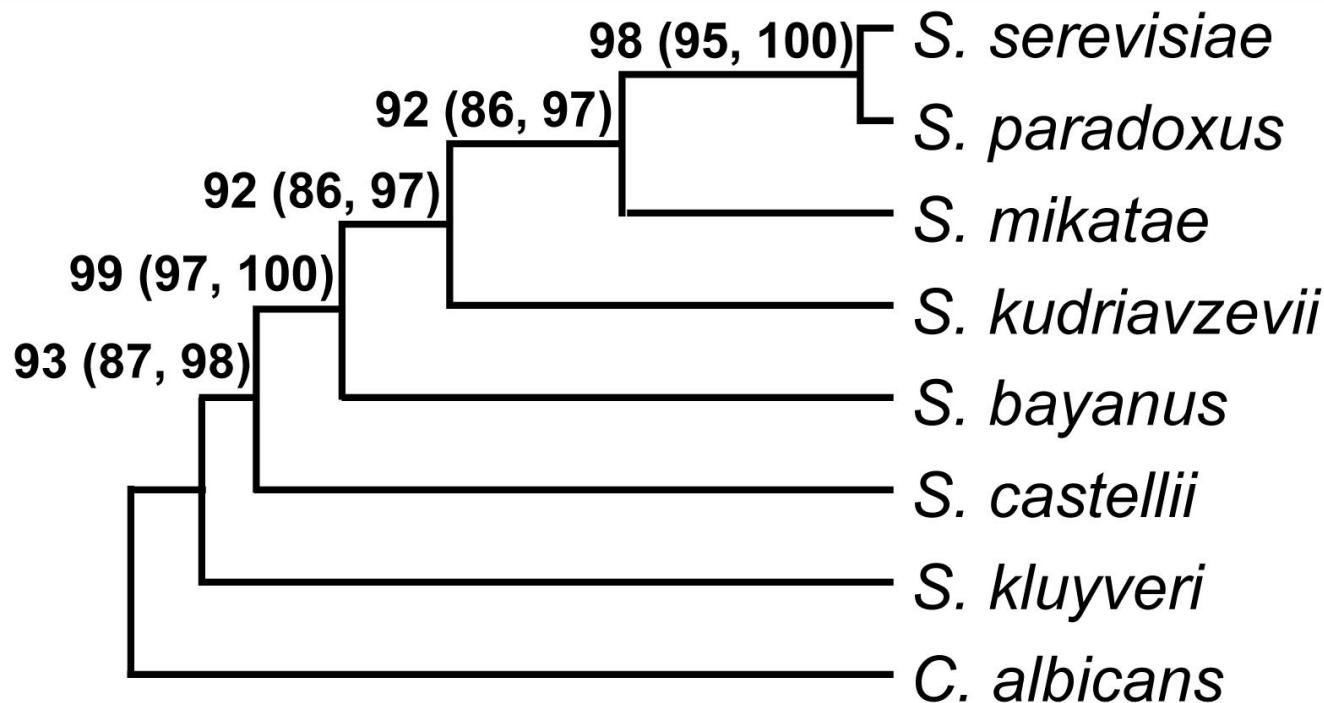


**Recombination**



# *Inferring the Species Tree from Individual Gene Histories*

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



**New methods to calculate concordance factors for phylogenomic datasets**

Bui Quang Minh, Matthew Hahn, Robert Lanfear

doi: <https://doi.org/10.1101/487801>

This article is a preprint and has not been peer-reviewed [what does this mean?].

**bioRxiv**  
THE PREPRINT SERVER FOR BIOLOGY



Ané et al. (2007) Mol. Biol. Evol.

# 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  
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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

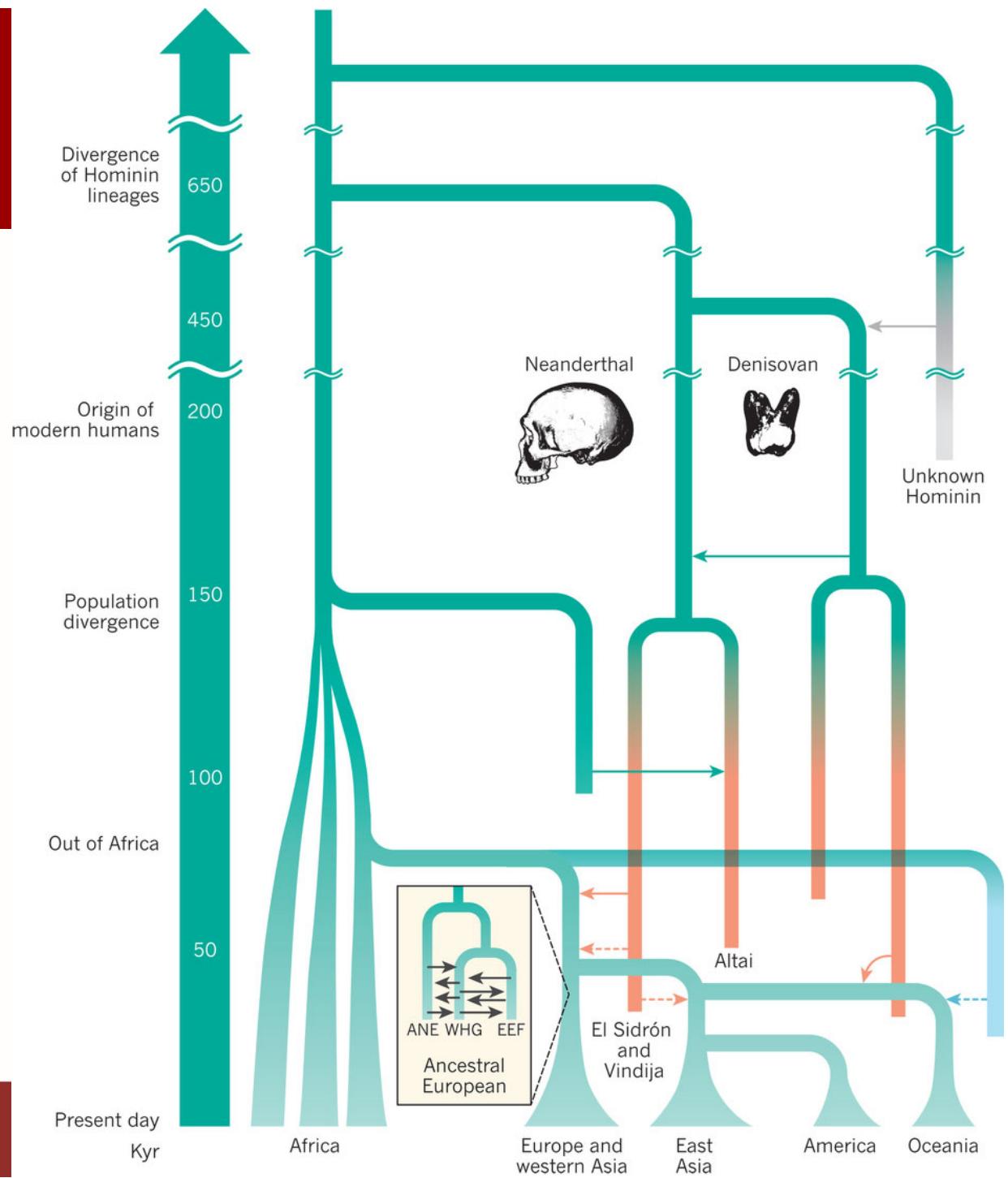
Renae C. Pratt,\* Gillian C. Gibb,\* Mary Morgan-Richards,\* Matthew J. Phillips,† Michael D. Hendy,\* and David Penny\*

\*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

**Have we eliminated  
incongruence?**

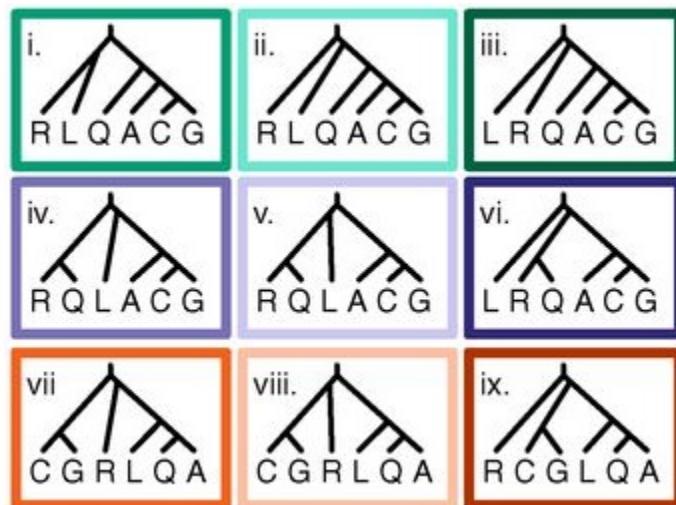
**Figuring out what's going on is  
easier at shallow depths, b/c  
systematic error is usually  
absent**

# *The Evolution of Human Populations*



Nielsen et al. (2017)  
*Nature*

# *“Easier” Doesn’t Mean “Easy”!*



**Fontaine et al. adhere to a classical view that there is a “true species tree” [...]. But given that the bulk of the genome has a network of relationships that is different from this true species tree, perhaps we should dispense with the tree and acknowledge that these genomes are best described by a network, and that they undergo rampant reticulate evolution**



*Fontaine et al. (2015) Science; Clark & Messer (2015) Science*

# *The Phylogeny of Primate Genera*

*Nomascus  
leucogenys*



NLE

*Hoolock  
leuconedys*



HLE

*Sympalangus  
syndactylus*



SSY

*Hylobates  
pileatus*



HPI

*Hylobates  
moloch*

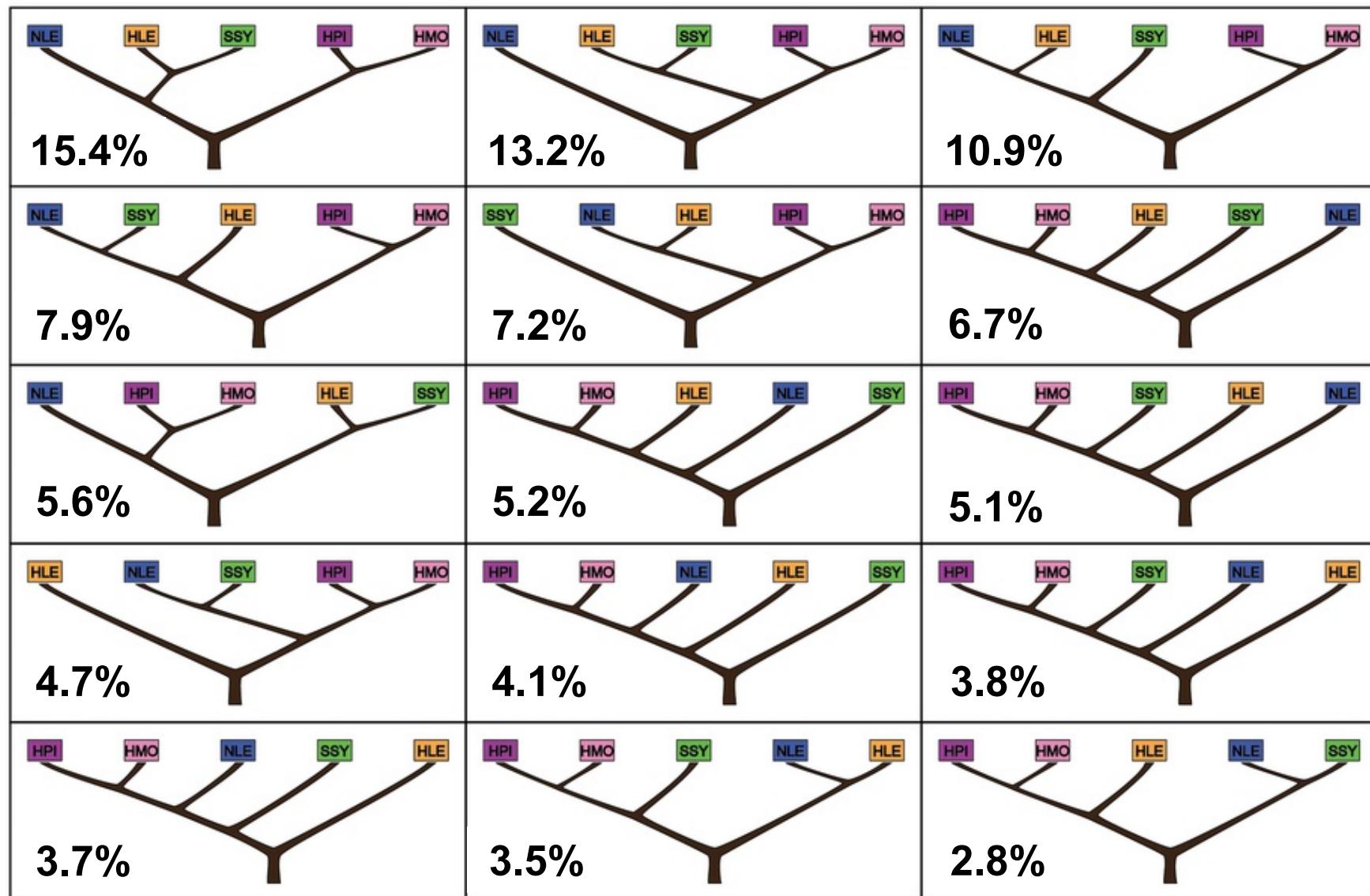


HMO

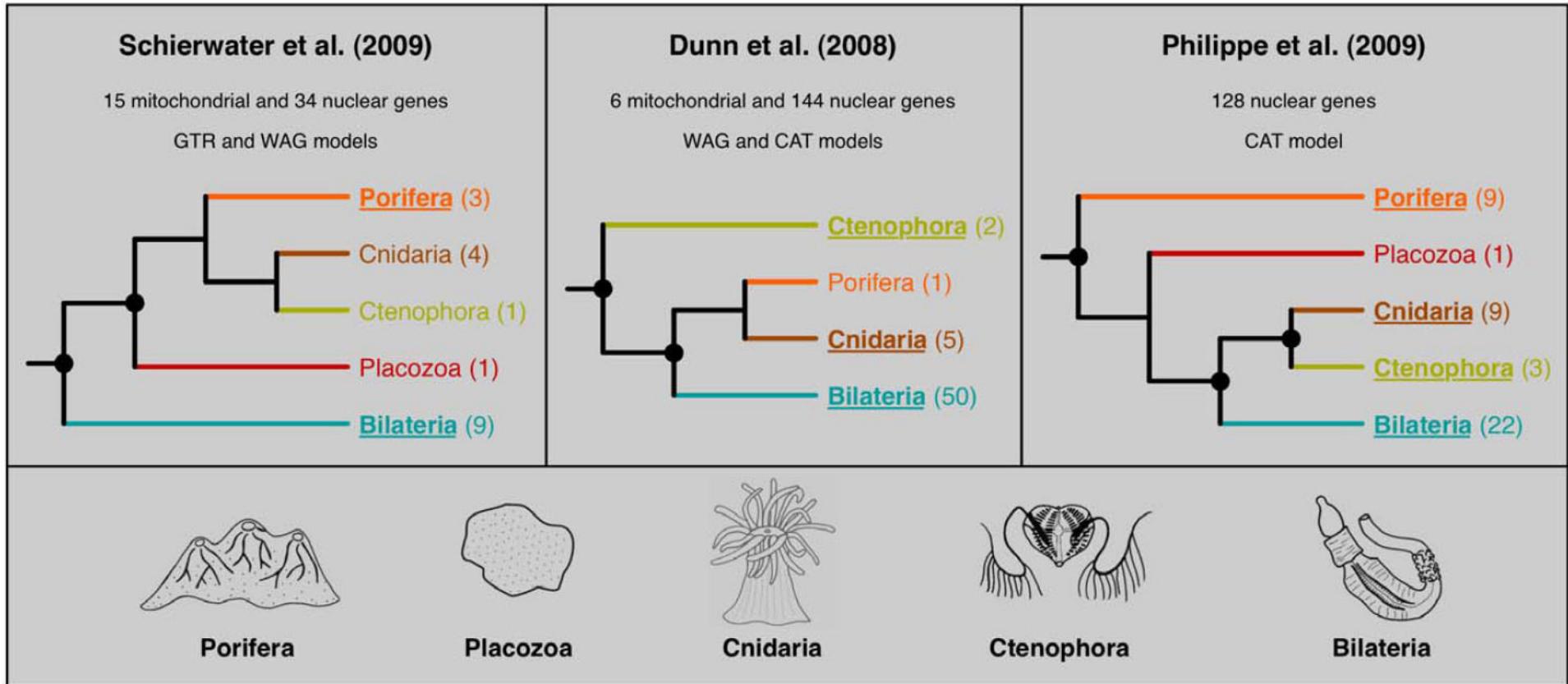


*Carbone et al. (2014) Nature*

# *“Easier” Doesn’t Mean “Easy”!*



# Incongruence in Deep Time is More Challenging



Philippe et al. (2011) PLoS Biol.

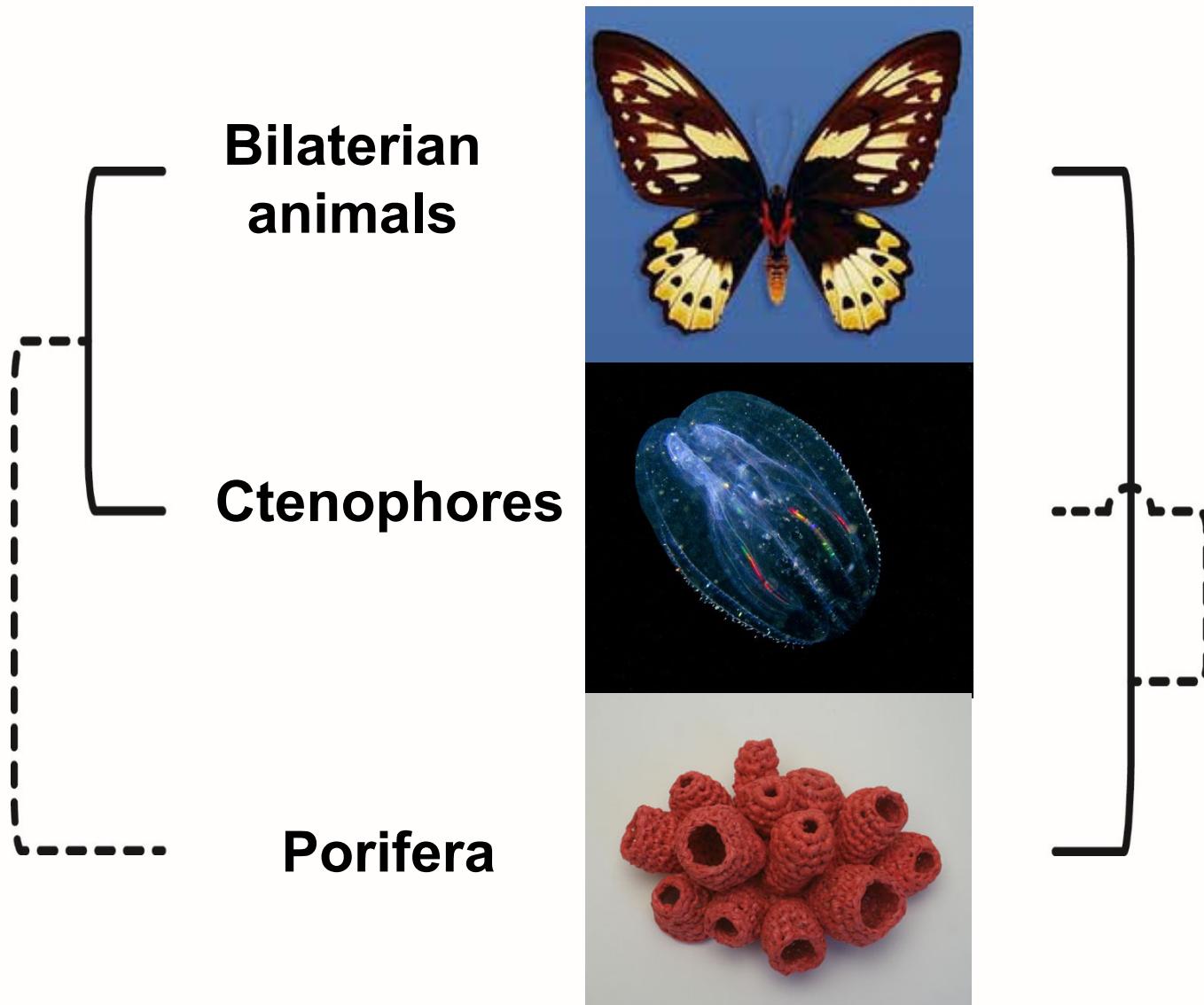
# *Incongruence in Deep Time is More Challenging*



*Kocot et al. (2011) Nature*

*Smith et al. (2011) Nature*

# *Incongruence in Deep Time is More Challenging*

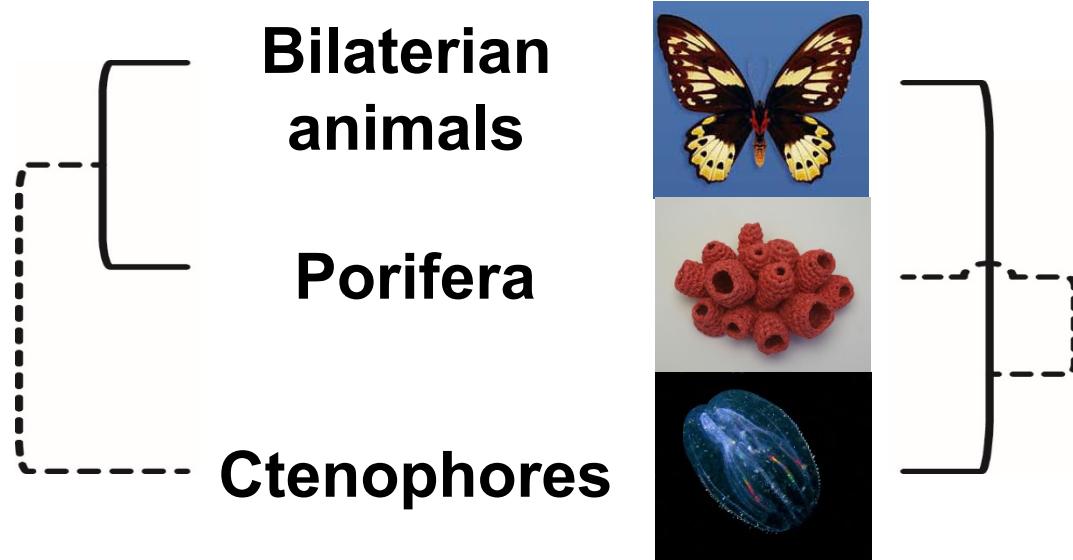


*Pisani et al. (2015) PNAS*

*Chang et al. (2015) PNAS*

# **Why the disconnect?**

# Coffee Break



## Why are deep branches incongruent? (How) can we resolve them?



# *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**

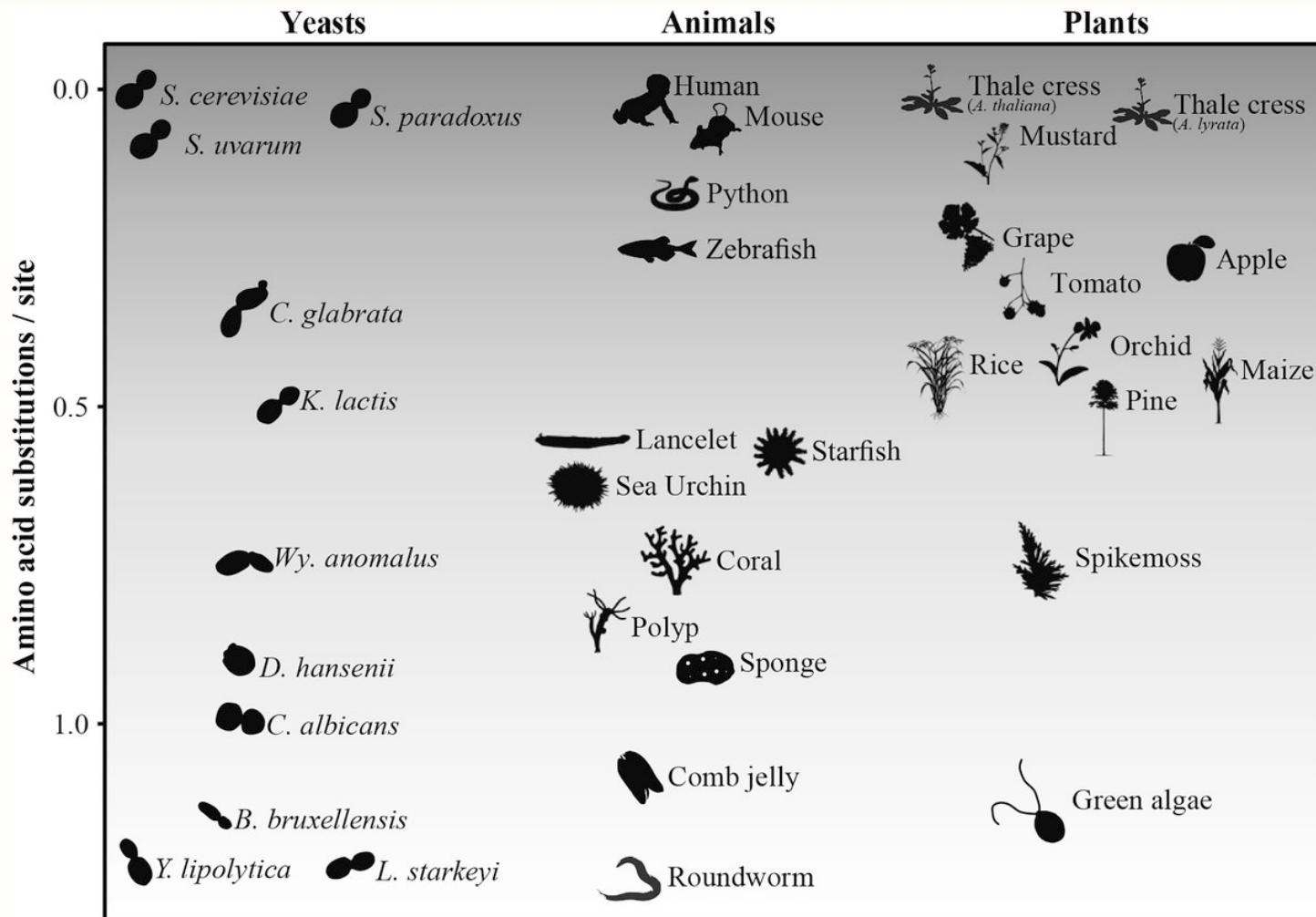
# *Candida* lineage



Byrne & Wolfe (2005) Genome Res.

Fitzpatrick et al. (2010) BMC Genom.

# Budding Yeasts Exhibit Striking Genomic Diversity

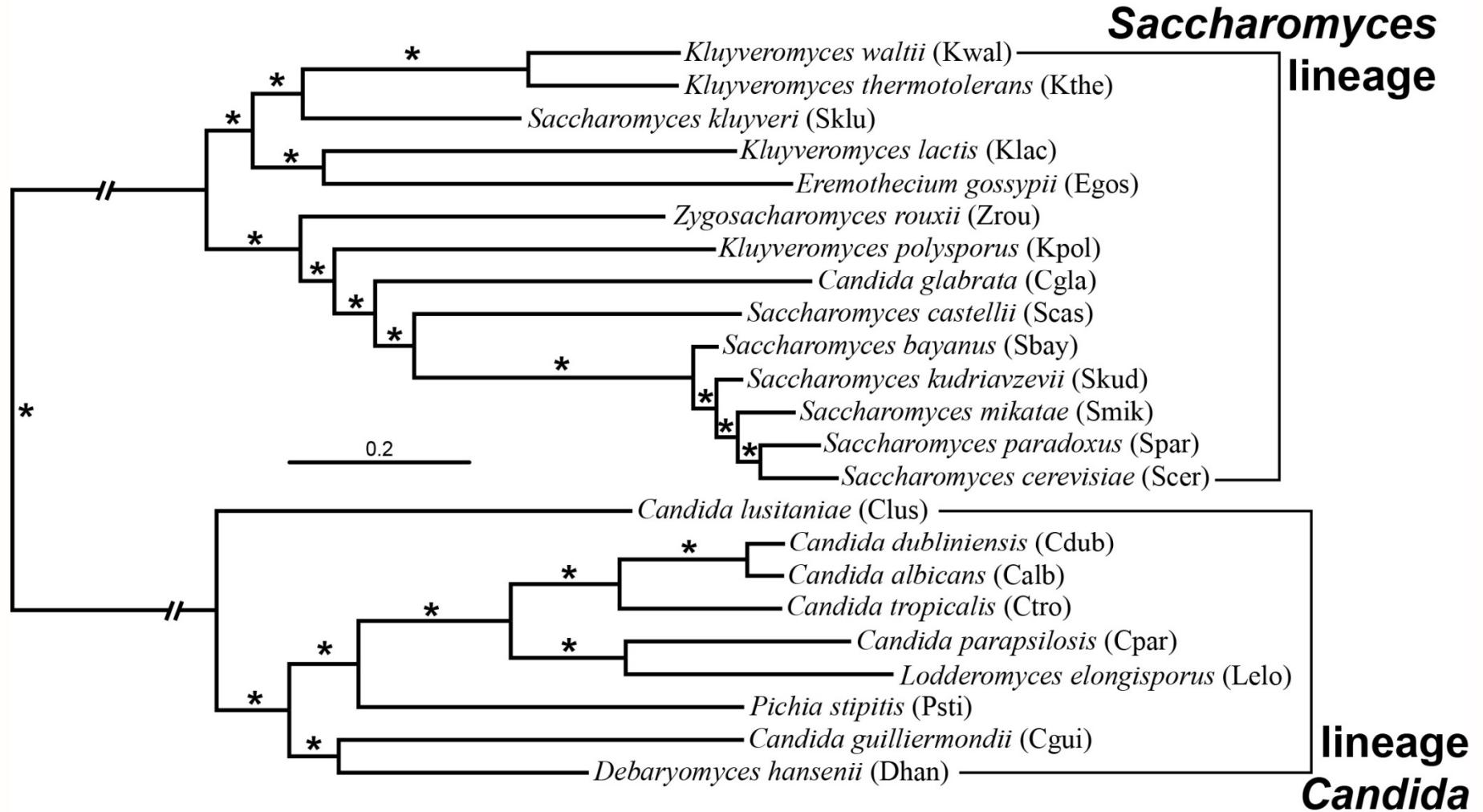


***Saccharomyces*, *Candida*, *Kluyveromyces*, etc. are all polyphyletic genera**



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

# Concatenation Yields an Absolutely Supported Phylogeny

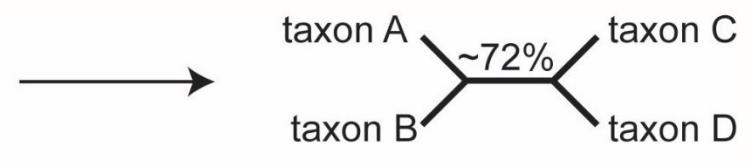


# *Bootstrap Support is Misleading When Used in Large Datasets*

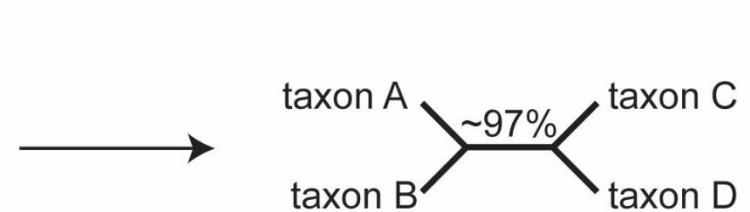
53%                  47%

taxonA	AAAAAAAATTTTTTTT
taxonB	AAAAAAAACCCCCCCC
taxonC	GGGGGGGGGGTTTTTTT
taxonD	GGGGGGGGGGCCCCCCCC

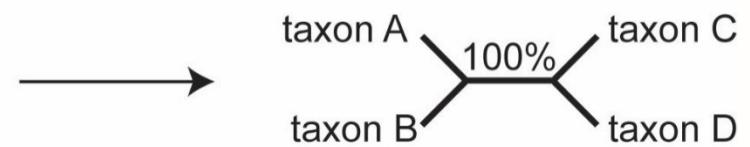
100 characters



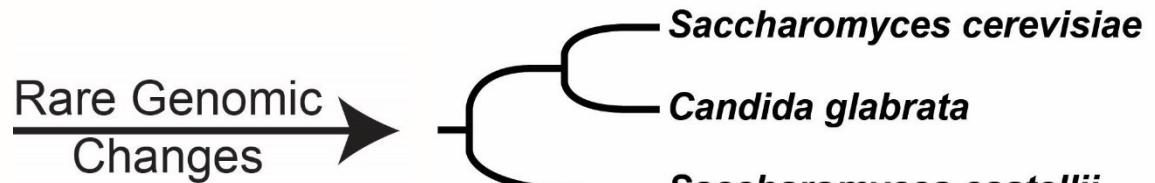
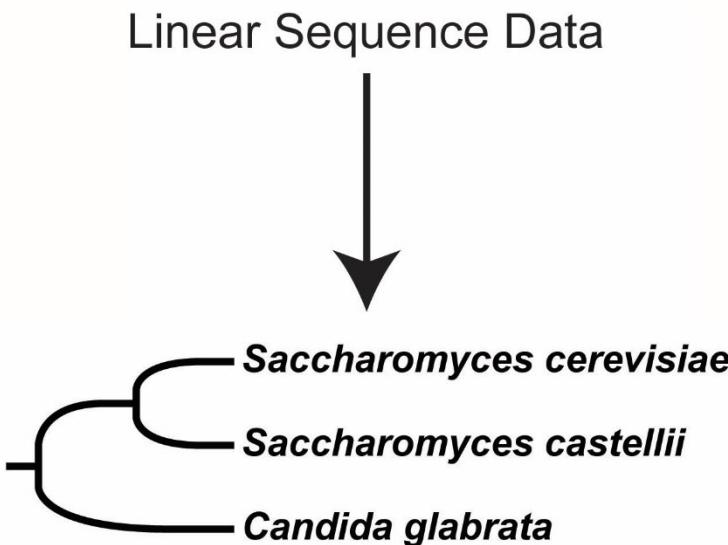
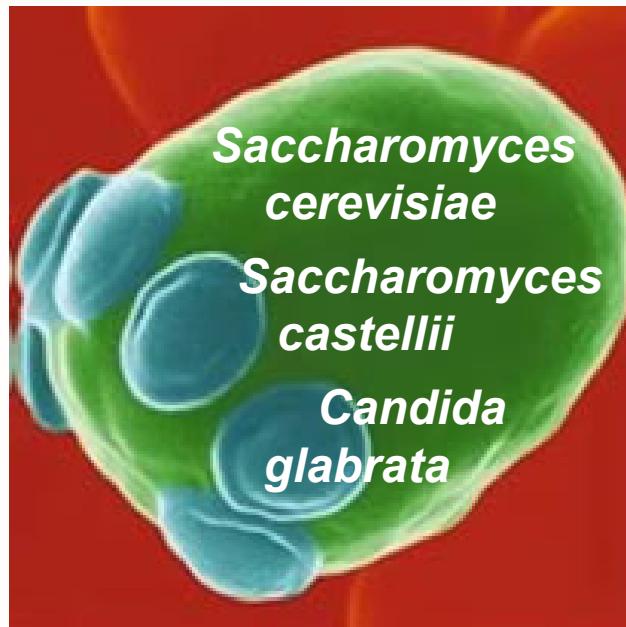
1,000 characters



10,000 characters



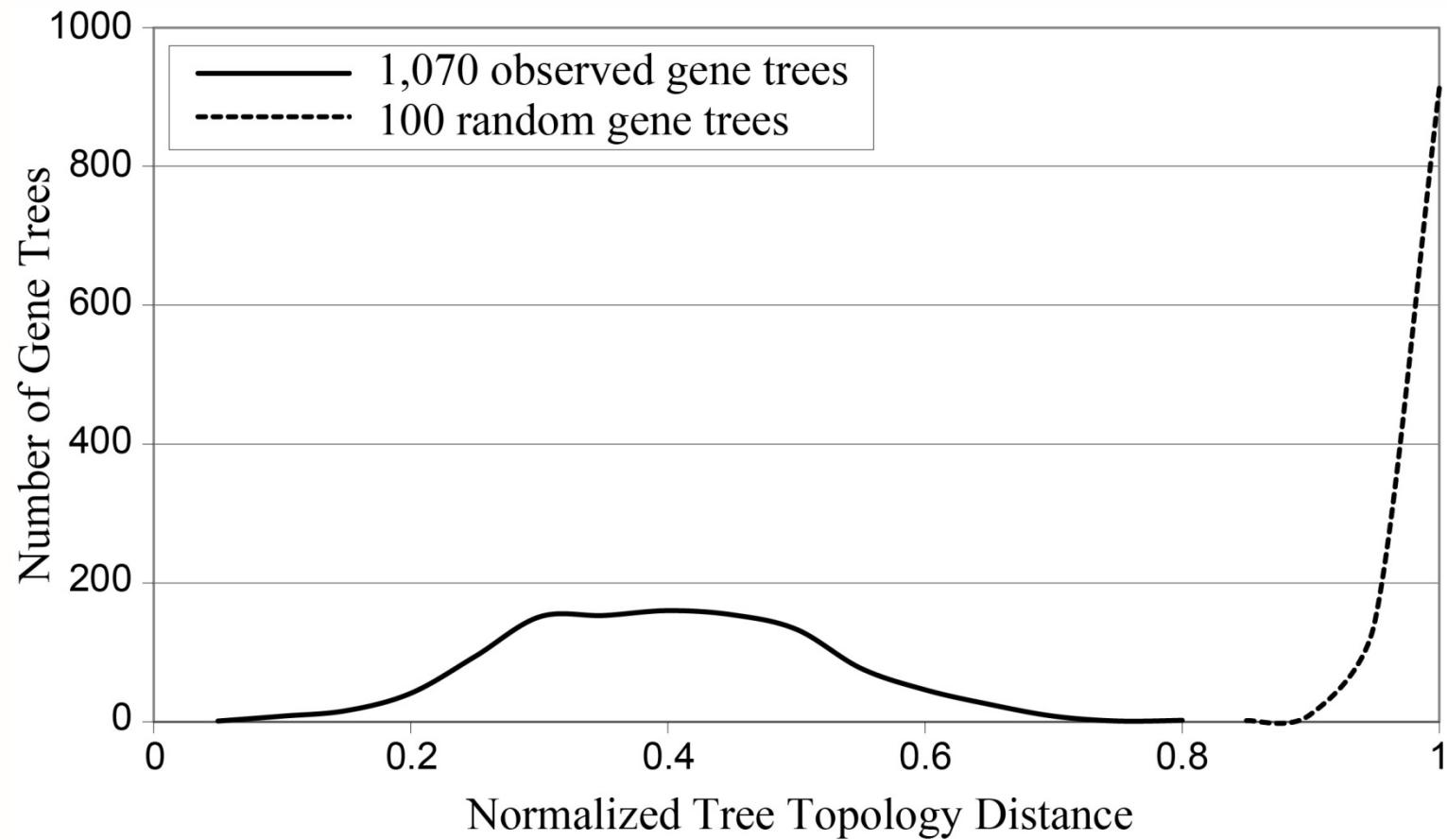
# The Concatenation Phylogeny is at Least Partly Wrong



- ❖ 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*



# *All Gene Trees Differ from the Concatenation Phylogeny*



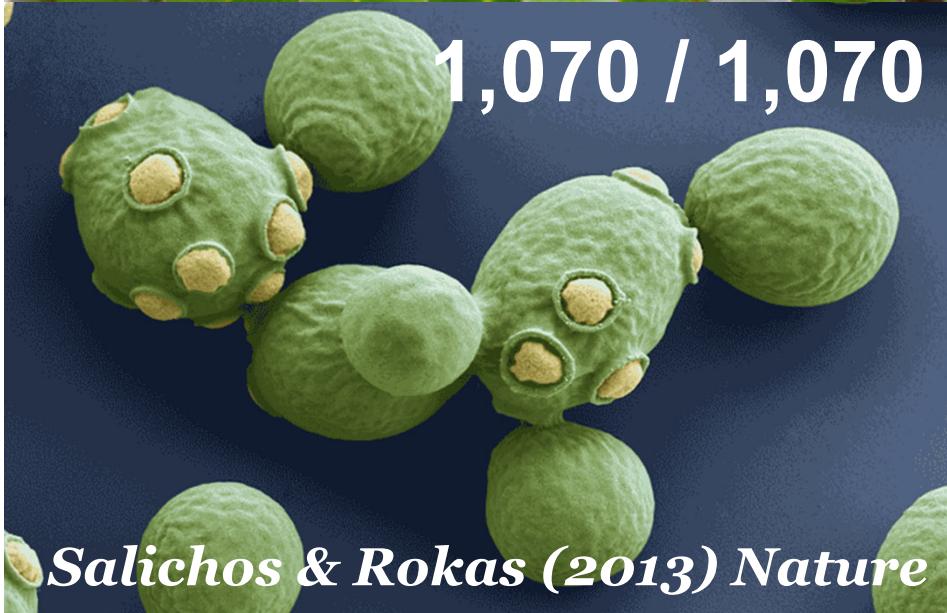
## *Gene Trees are Incongruent in Most Datasets*



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



*Song et al. (2012) PNAS*

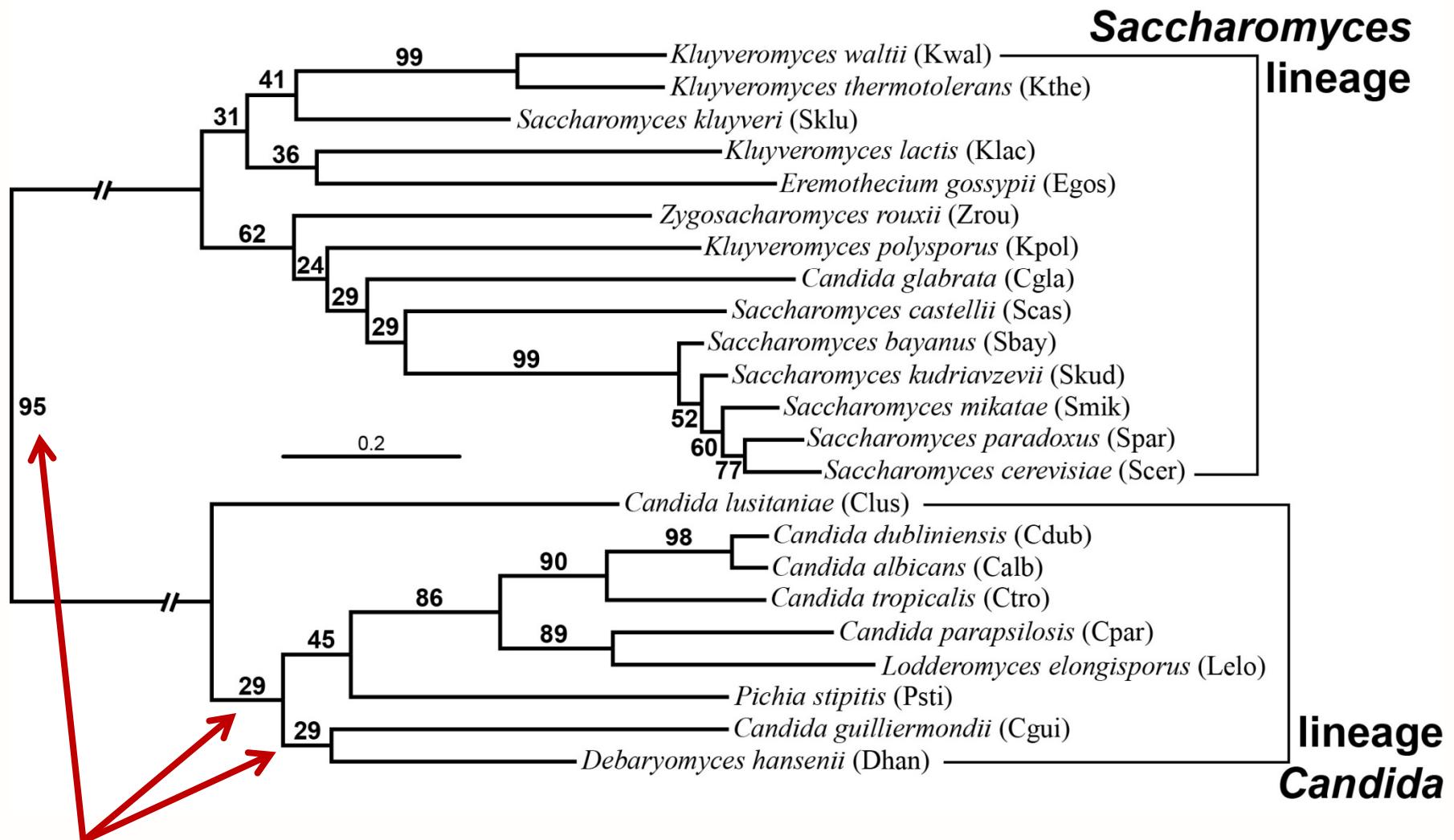


*Salichos & Rokas (2013) Nature*



*Jarvis et al. (2014) Science*

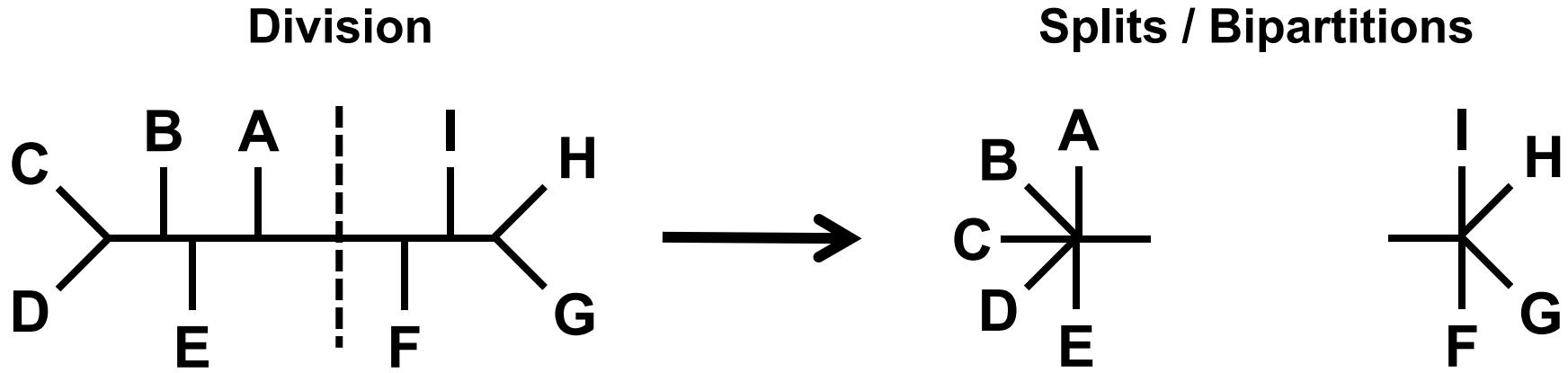
# The Yeast Phylogeny Inferred by Majority-Rule Consensus



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

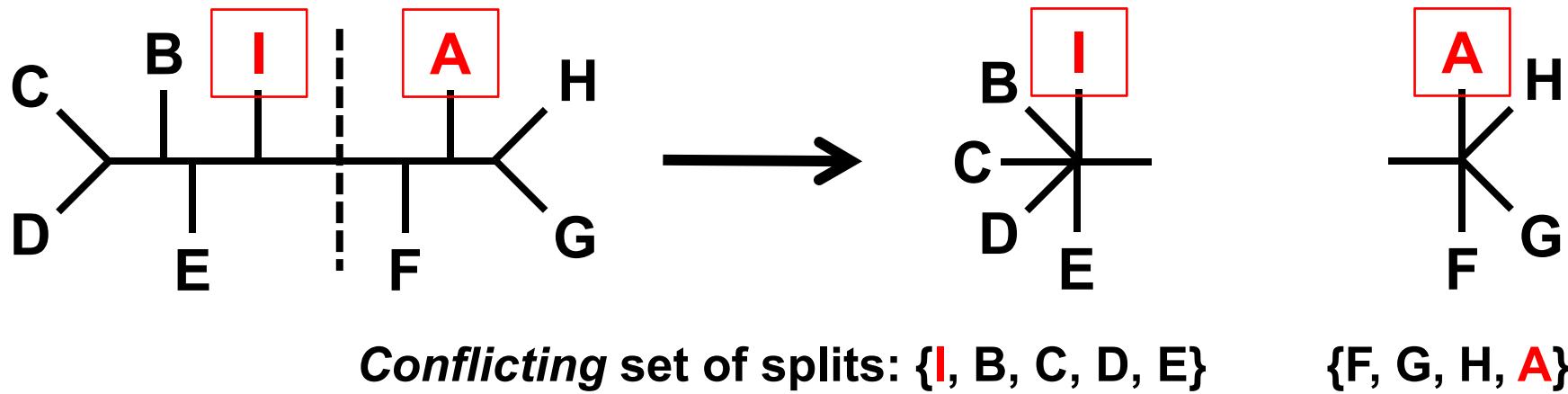


# *Phylogenetic Trees are Sets of Splits / Bipartitions*



Set of splits in reference tree: {A, B, C, D, E}

{F, G, H, I}

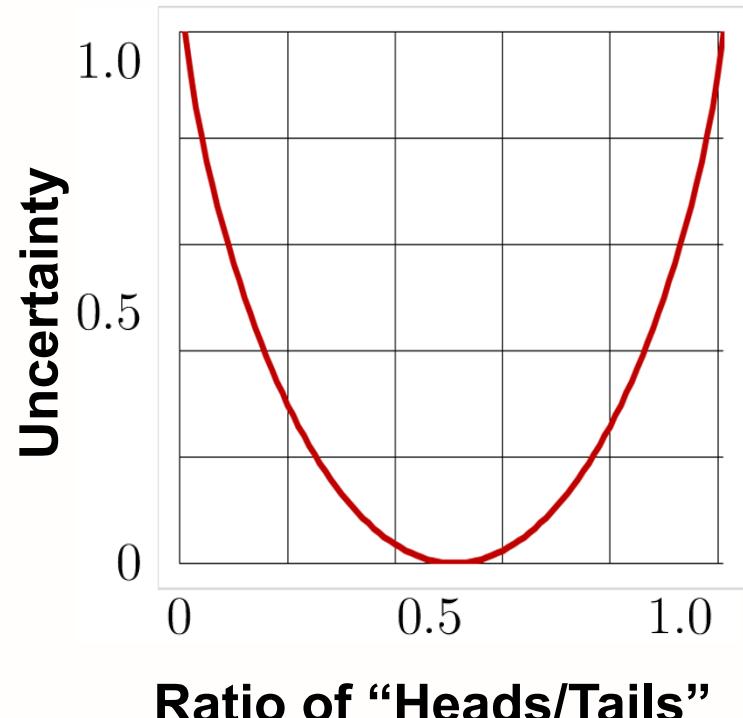


# *Quantifying Incongruence*

**Internode Certainty (IC):** a measure 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 internode in the same set of trees

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

**IC and TC are implemented in the latest versions of RAxML**

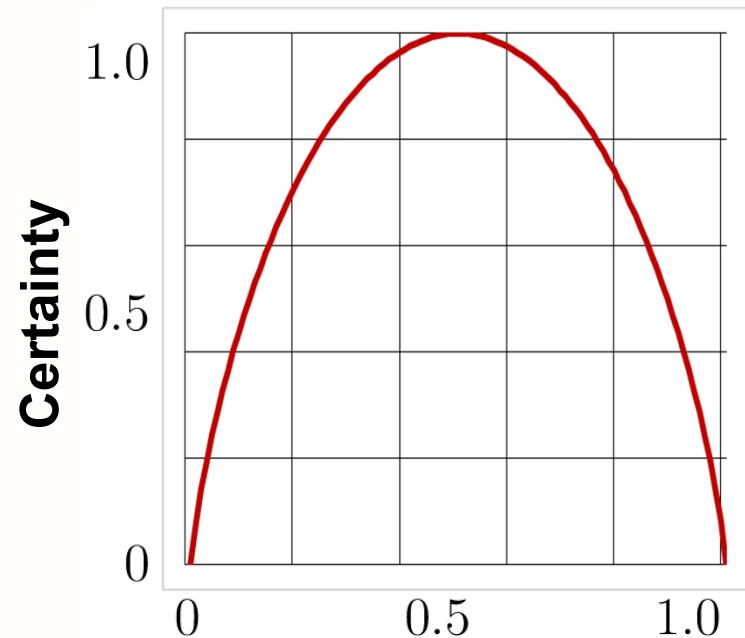


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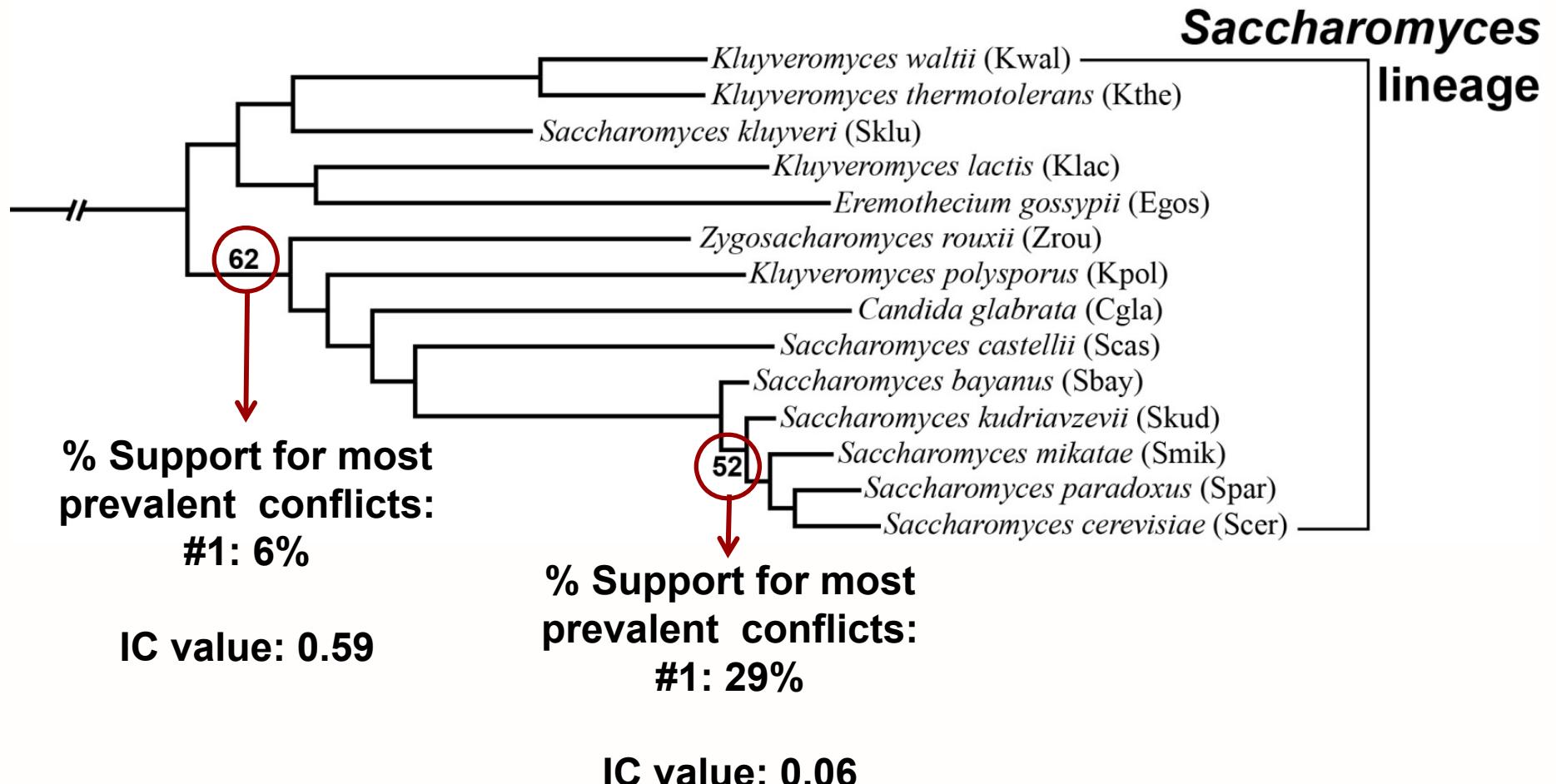


**Ratio of Support for Two Conflicting Internodes**



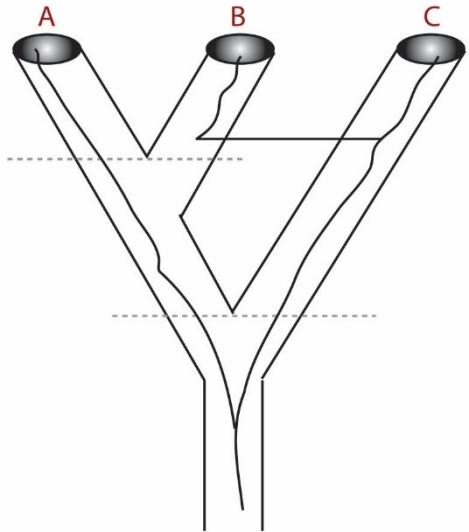
*Salichos et al. (2014) Mol. Biol. Evol.; Kober et al. (2016) Mol. Biol. Evol.; Zhou et al. (2018) bioRxiv*

# *IC* Can Be More Informative Measure of Internode Support

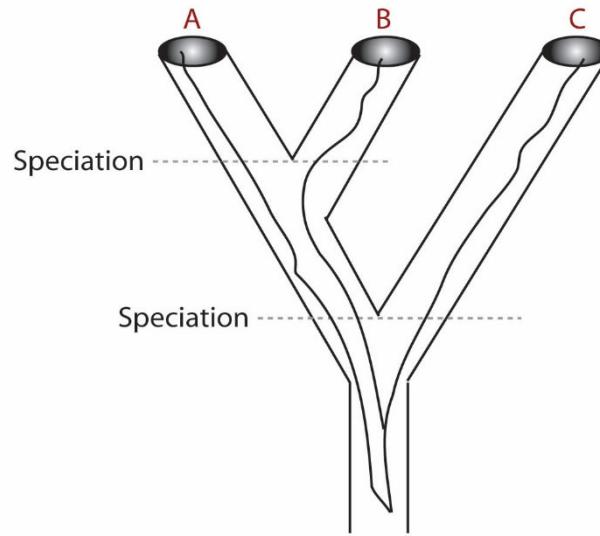


# Why So Much Incongruence? Biological Factors

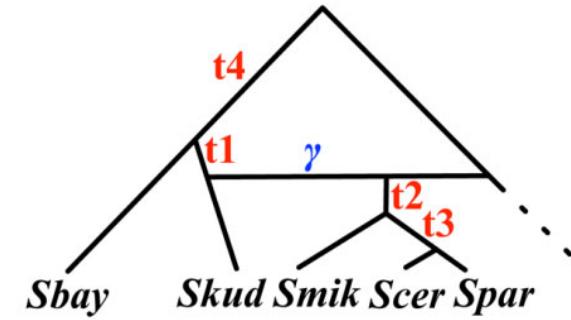
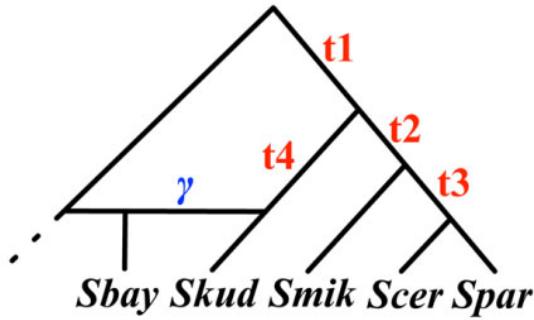
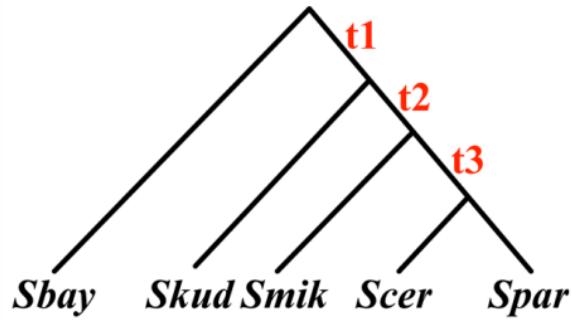
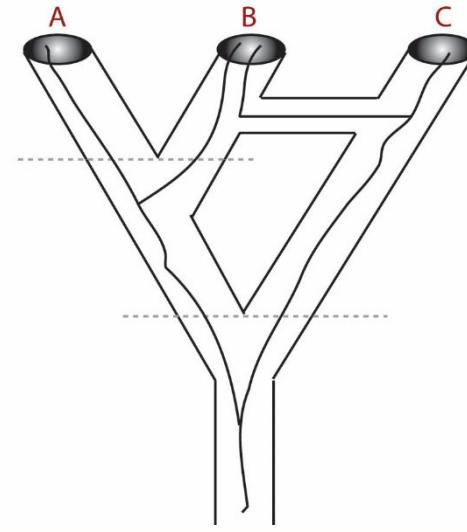
Horizontal Gene Transfer



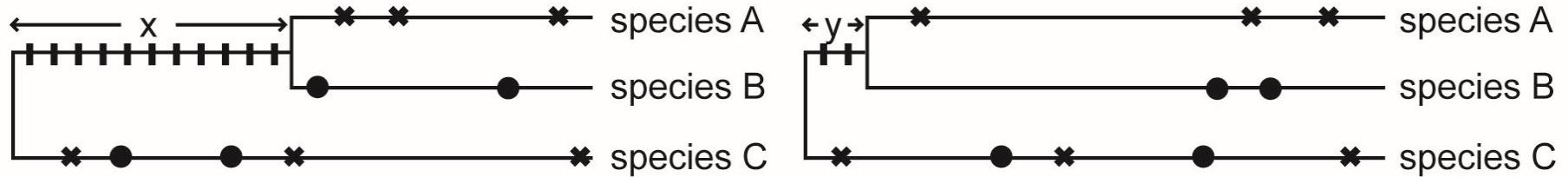
Lineage Sorting



Hybridization

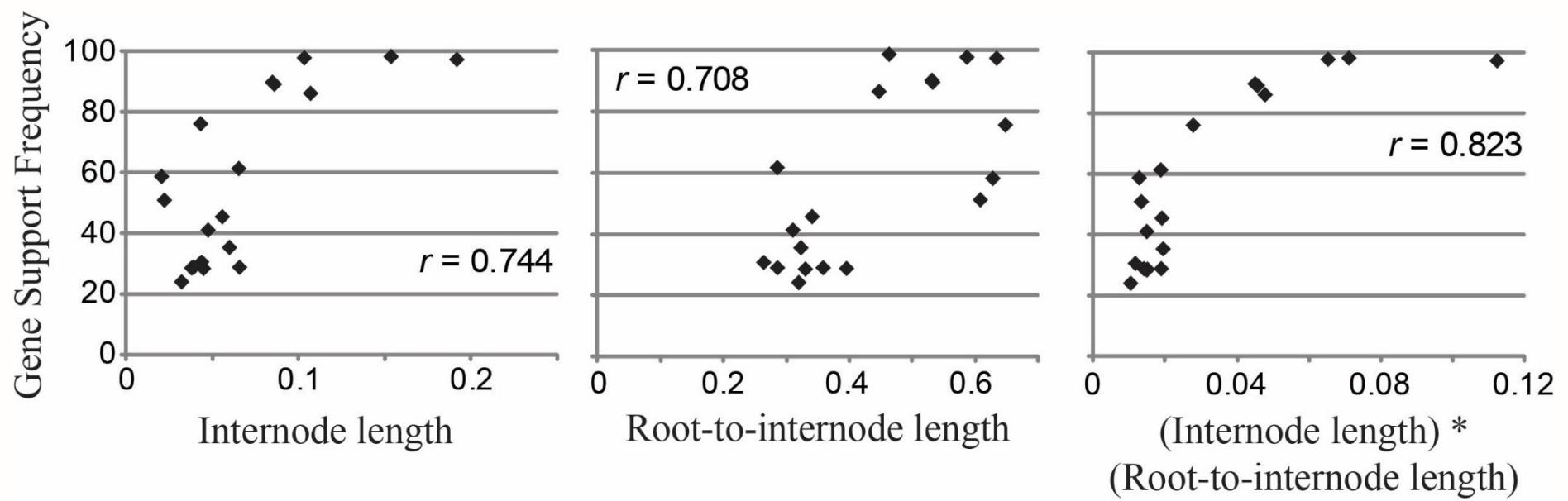


## Why So Much Incongruence? Analytical Factors



**Internode length: influences amount of phylogenetic signal (I)**

**Homoplasy: independent evolution of identical characters ( \*, ● )**





## Standard Recipes for Handling Incongruence Didn't Help

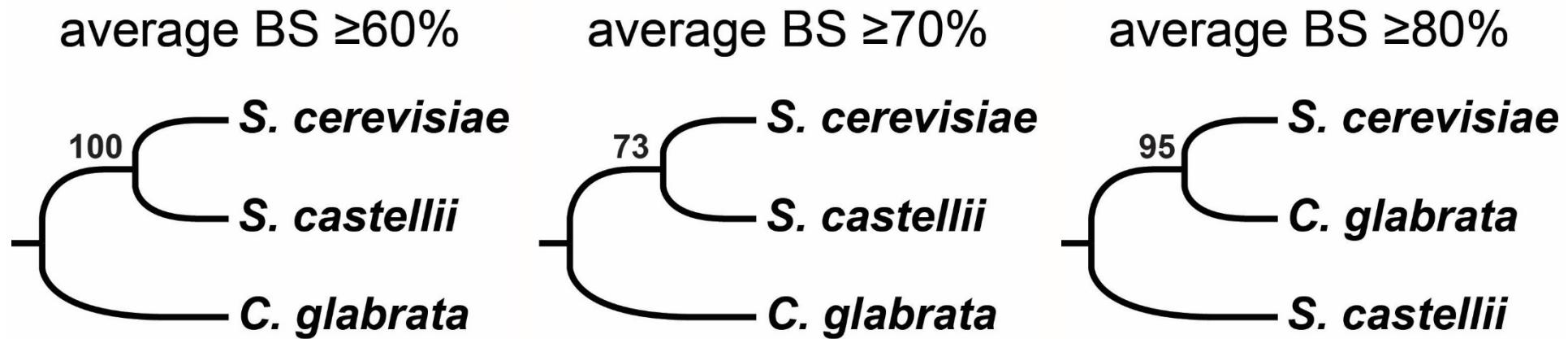
Treatment	Tree Certainty	# of Internodes where IC increased   decreased
<b>Default analysis</b>	<b>8.35</b>	n/a
<i>Removing sites containing gaps</i>		
<b>All sites with gaps excluded</b>	<b>7.91</b>	<b>0   7</b>
<i>Removing fast-evolving or unstable species</i>		
<b><i>C. lusitaniae</i></b>	<b>8.15</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>



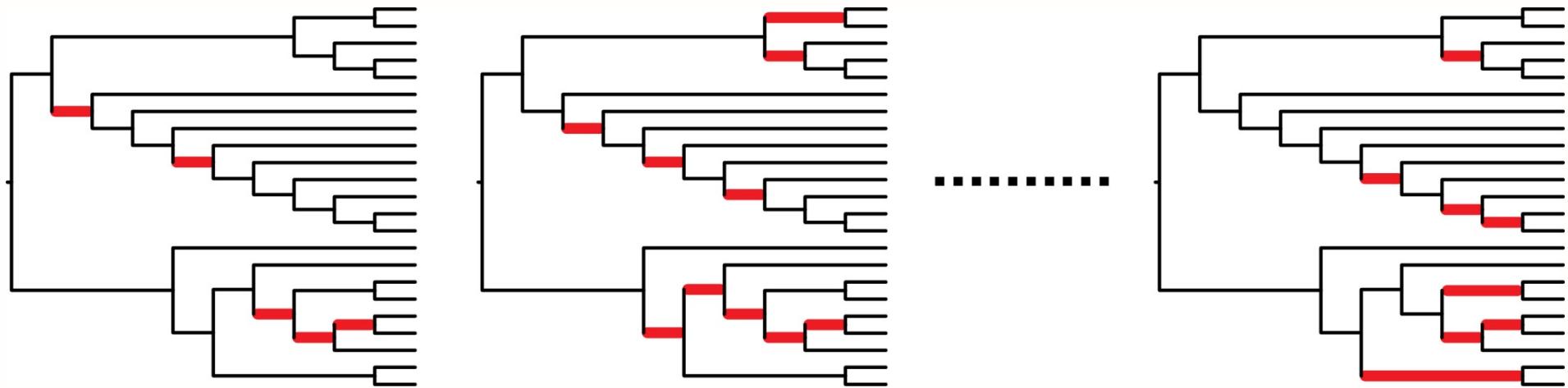


## What Do We Do Then?

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



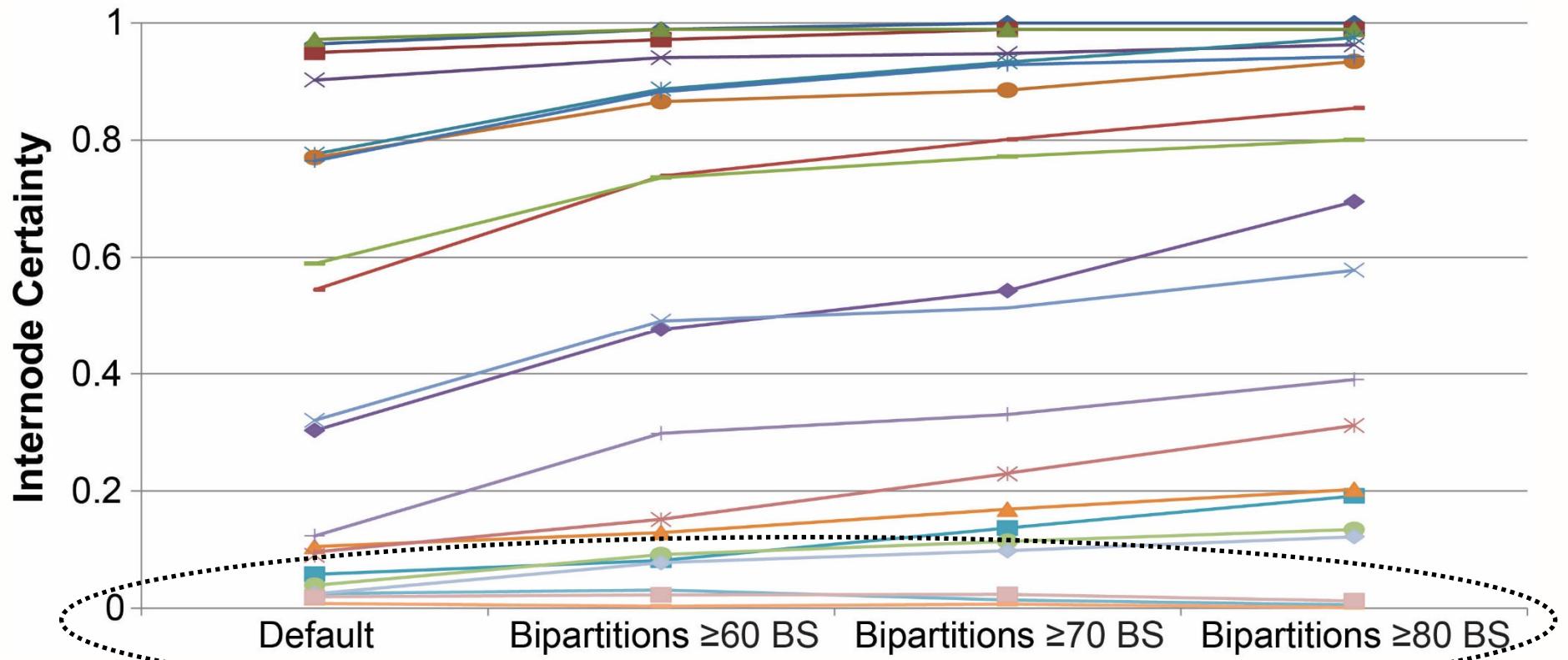
## Selecting Specific Bipartitions Dramatically Improves Phylogeny



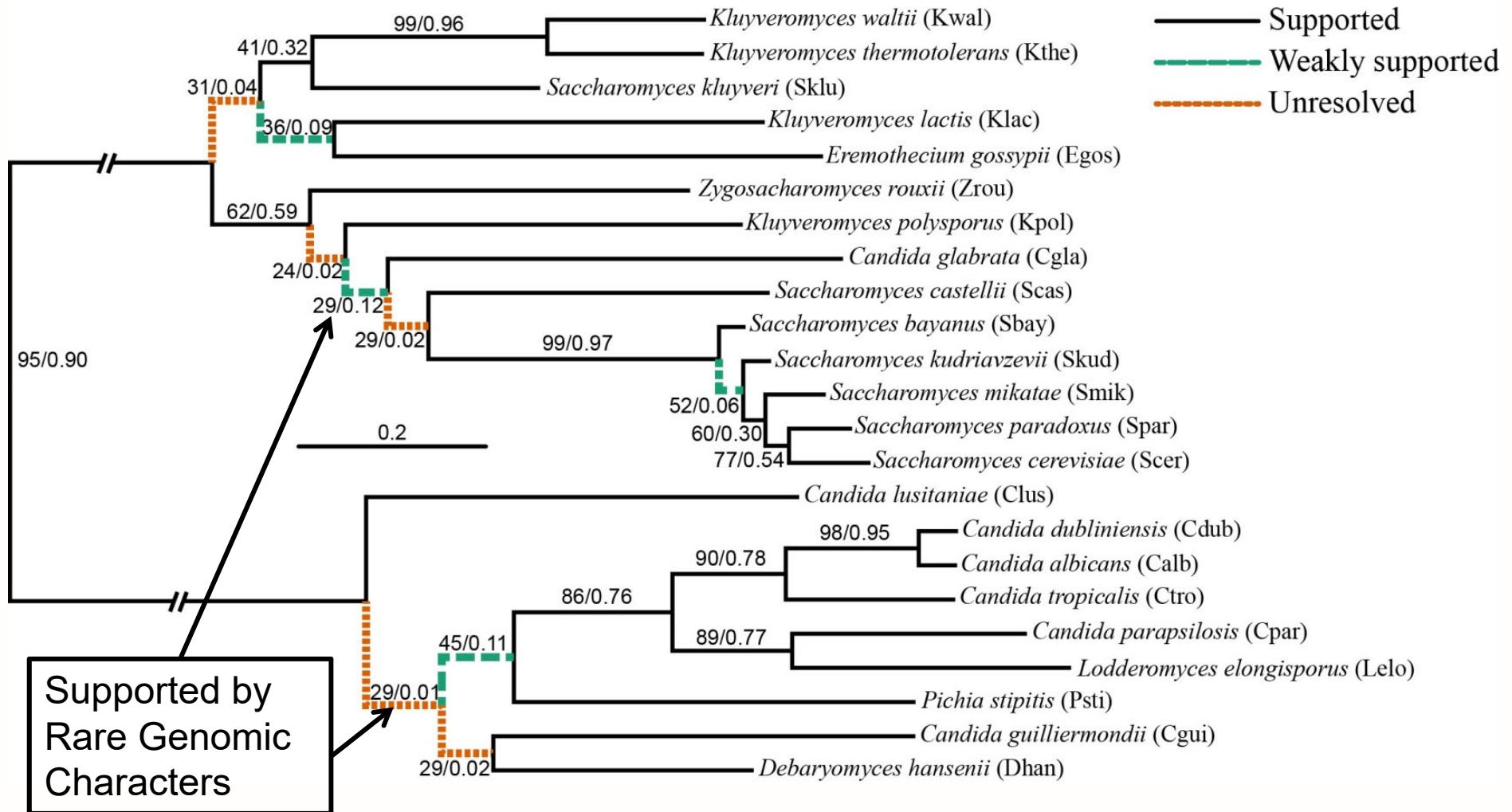
Treatment	Tree Certainty	# of Internodes where IC increased   decreased
Default analysis	8.35	n/a
<i>Selecting genes whose bootstrap consensus trees have high average support</i>		
All bipartitions with BS $\geq$ 60%	10.11	14   0
All bipartitions with BS $\geq$ 70%	10.70	16   0
All bipartitions with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

## *Similar Results in Other Lineages*

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

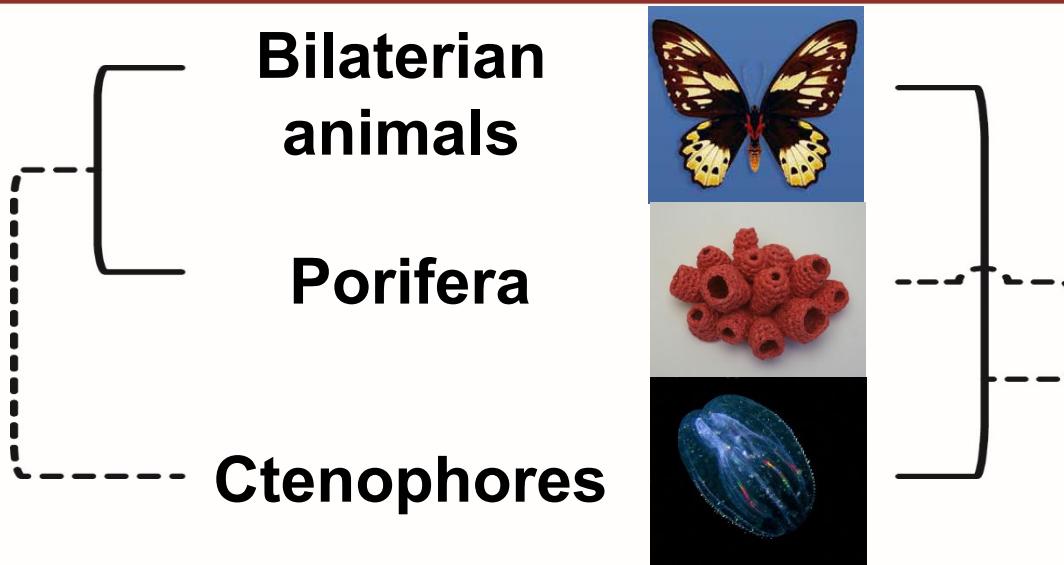
**Animals**  
(225 genes, 21 taxa)

**Mosquitoes**  
(2,007 genes, 20 taxa)



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

# Incongruence in Phylogenomic Datasets



These debates concern internodes that are poorly supported by individual gene trees



**What is the phylogenetic signal in branches of the tree of life that are challenging to resolve?**

## *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

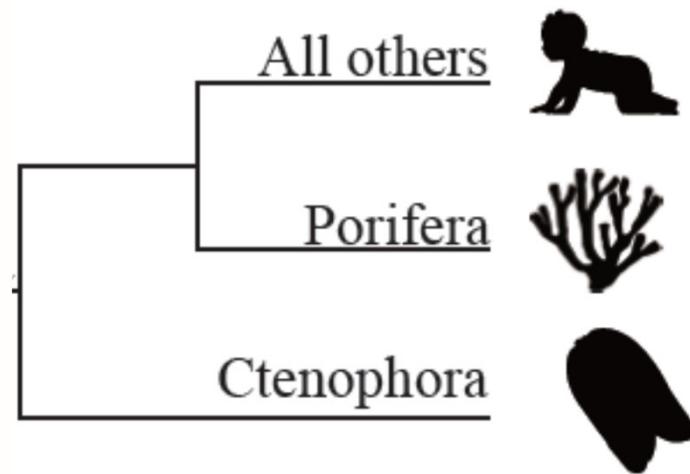
Sanderson (2008) *Science*

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.*

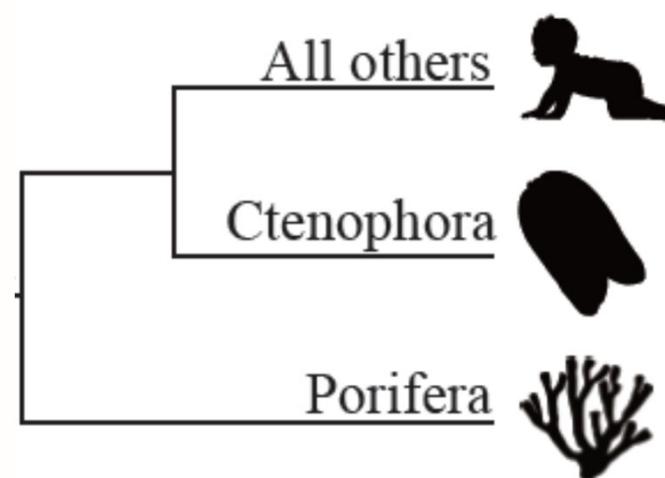
## *Our Definition*

Maximum Likelihood tree  
(T1)



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

Conflicting tree  
(T2)



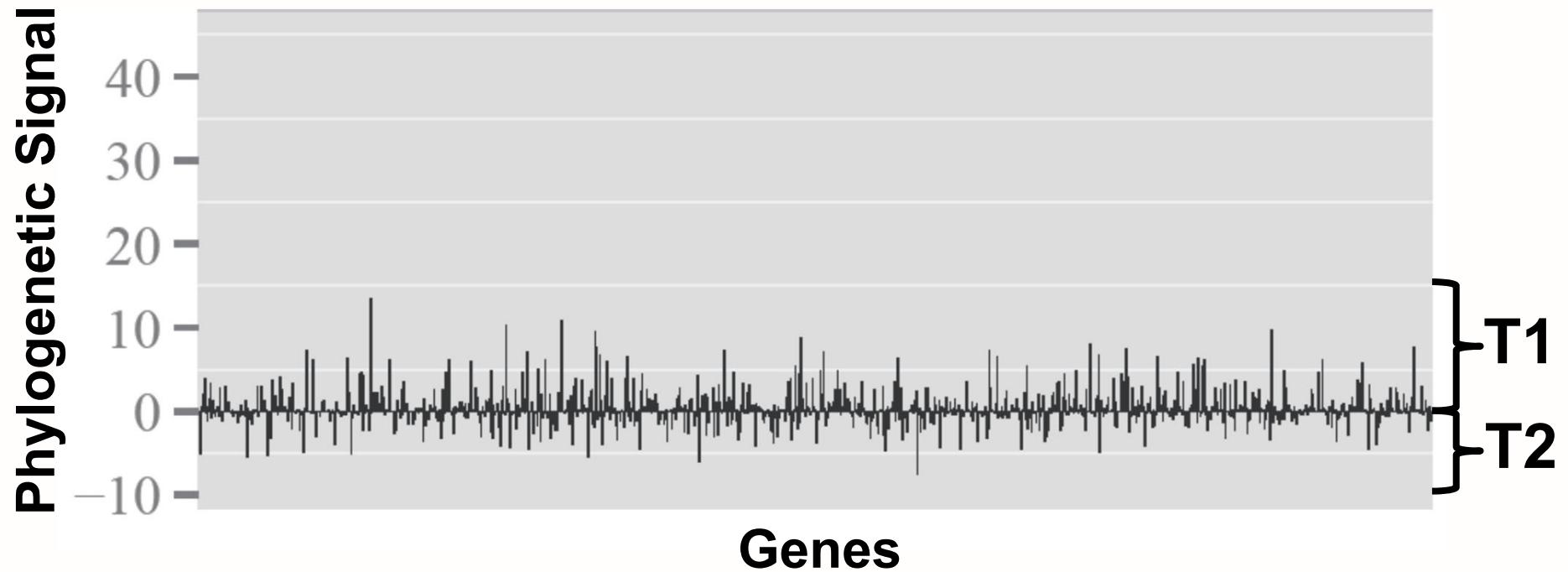
$$\ln(T_2|X_i) = -150$$

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



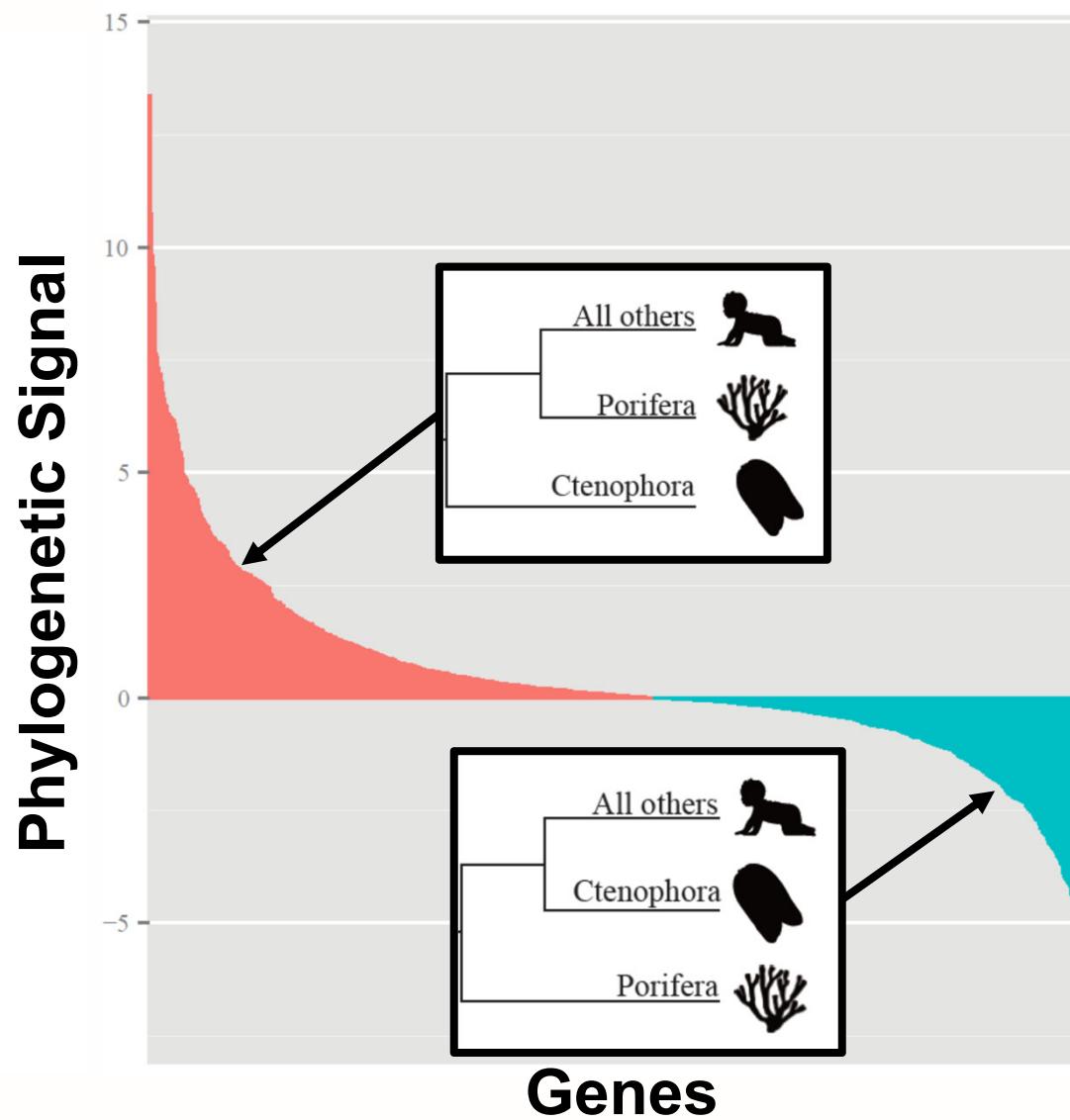
# *Signal of the Genes in a Phylogenomic Data Matrix*

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

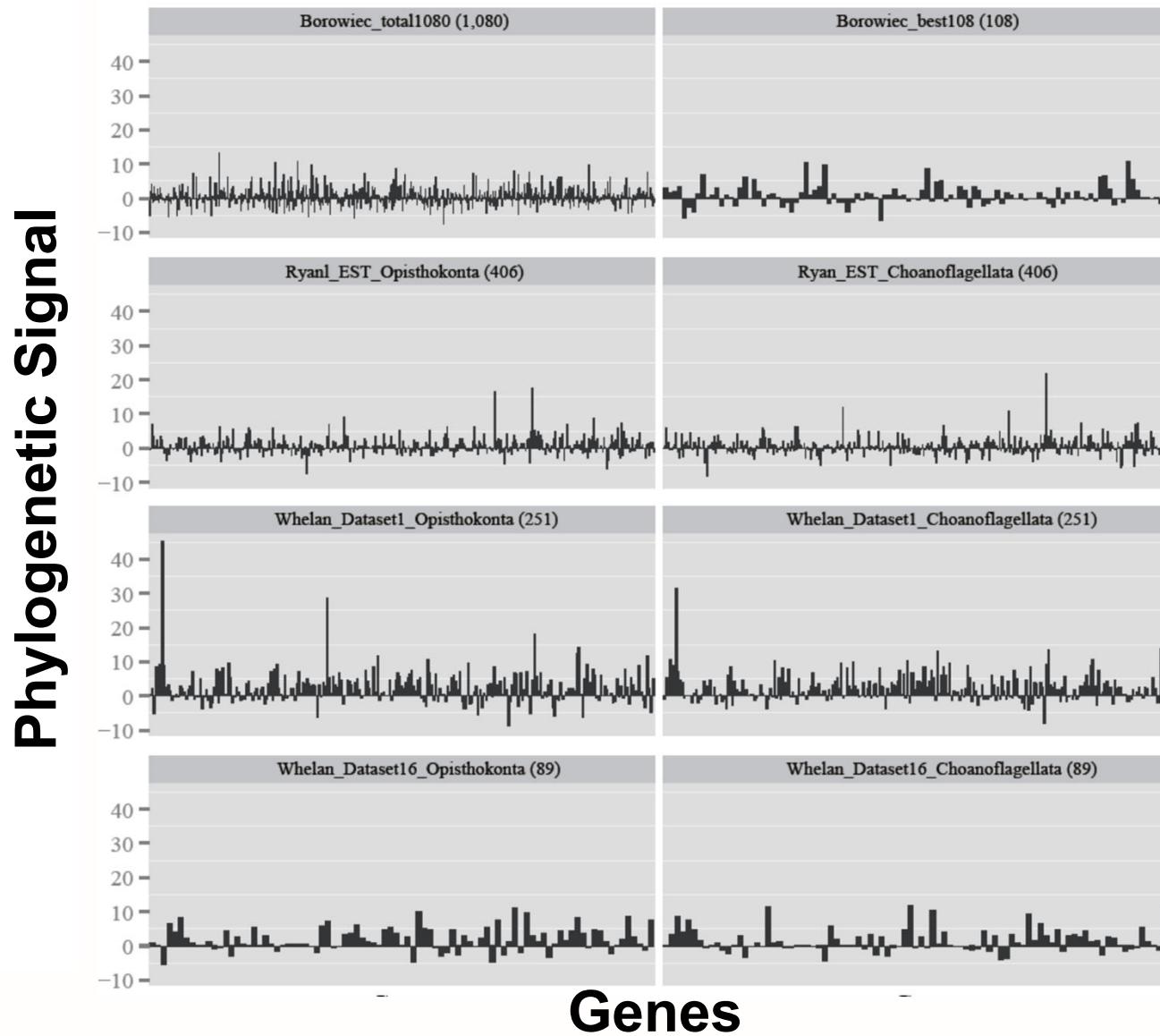


Shen et al. (2017) *Nature Ecol. Evol.*; data from Borowiec et al. (2015) *BMC Genomics*

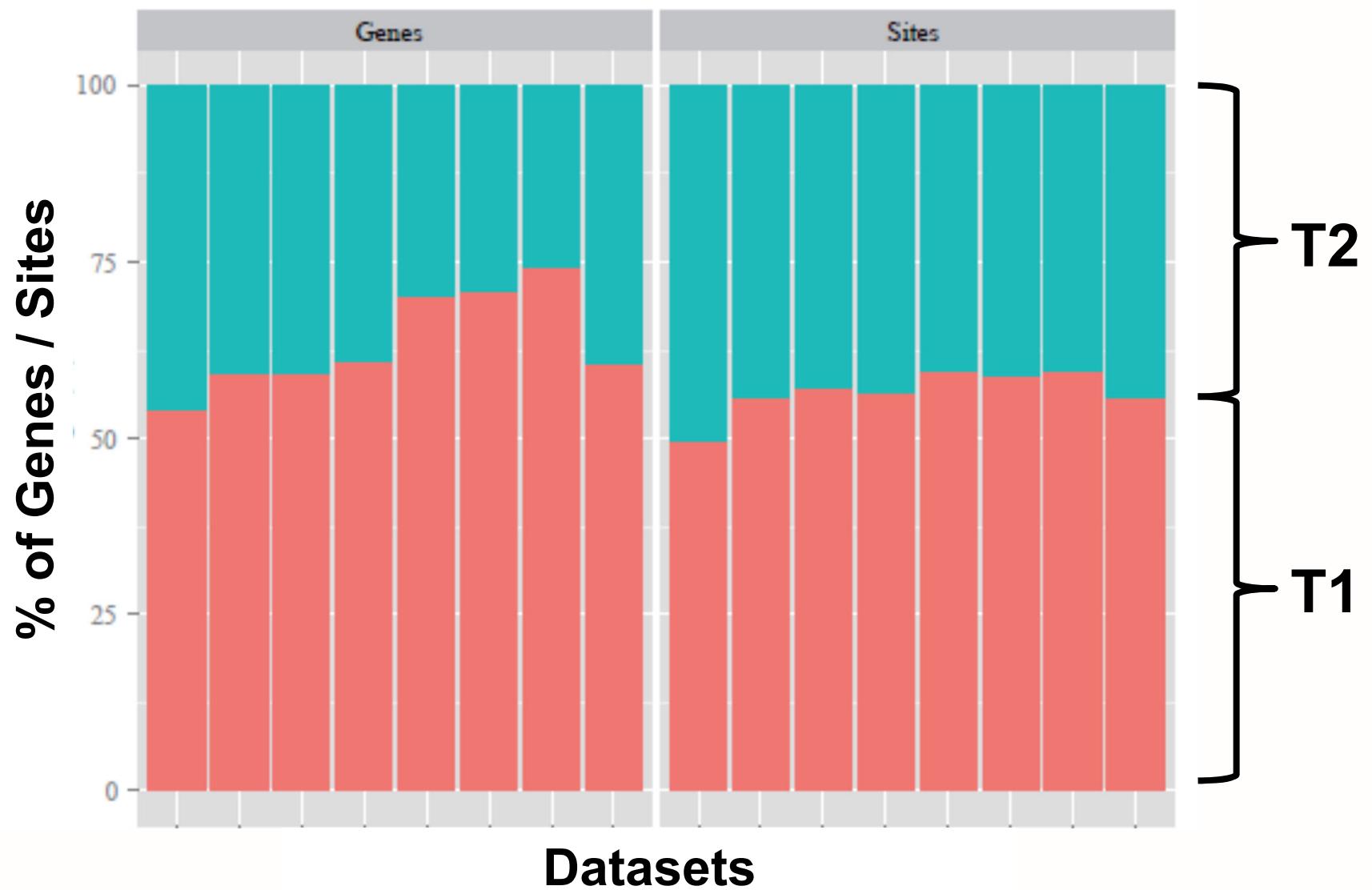
# *Signal of the Genes in a Phylogenomic Data Matrix*



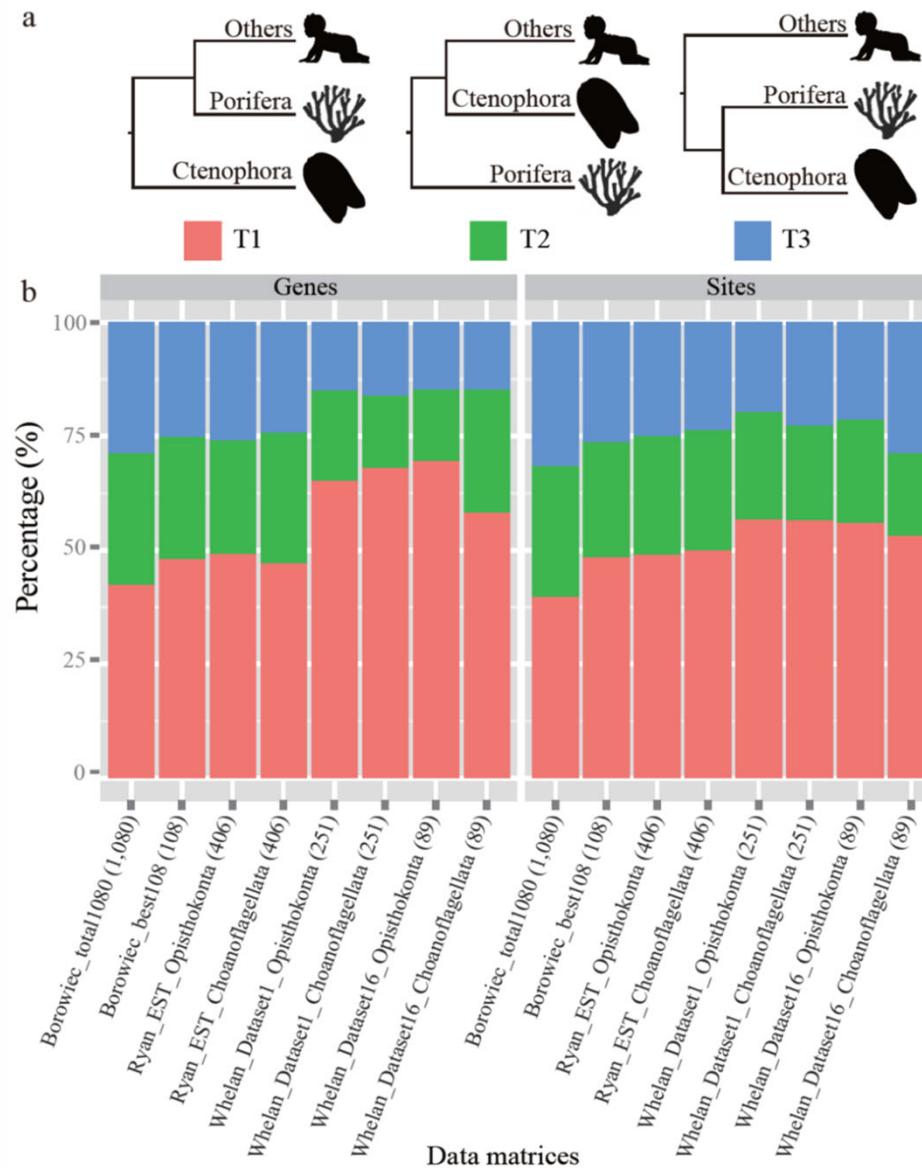
# *Signal of the Genes in Multiple Phylogenomic Data Matrices*



# *Summarizing Phylogenetic Signal Across Genes and Sites*



# Summarizing the Signal Across All 3 Possible Topologies

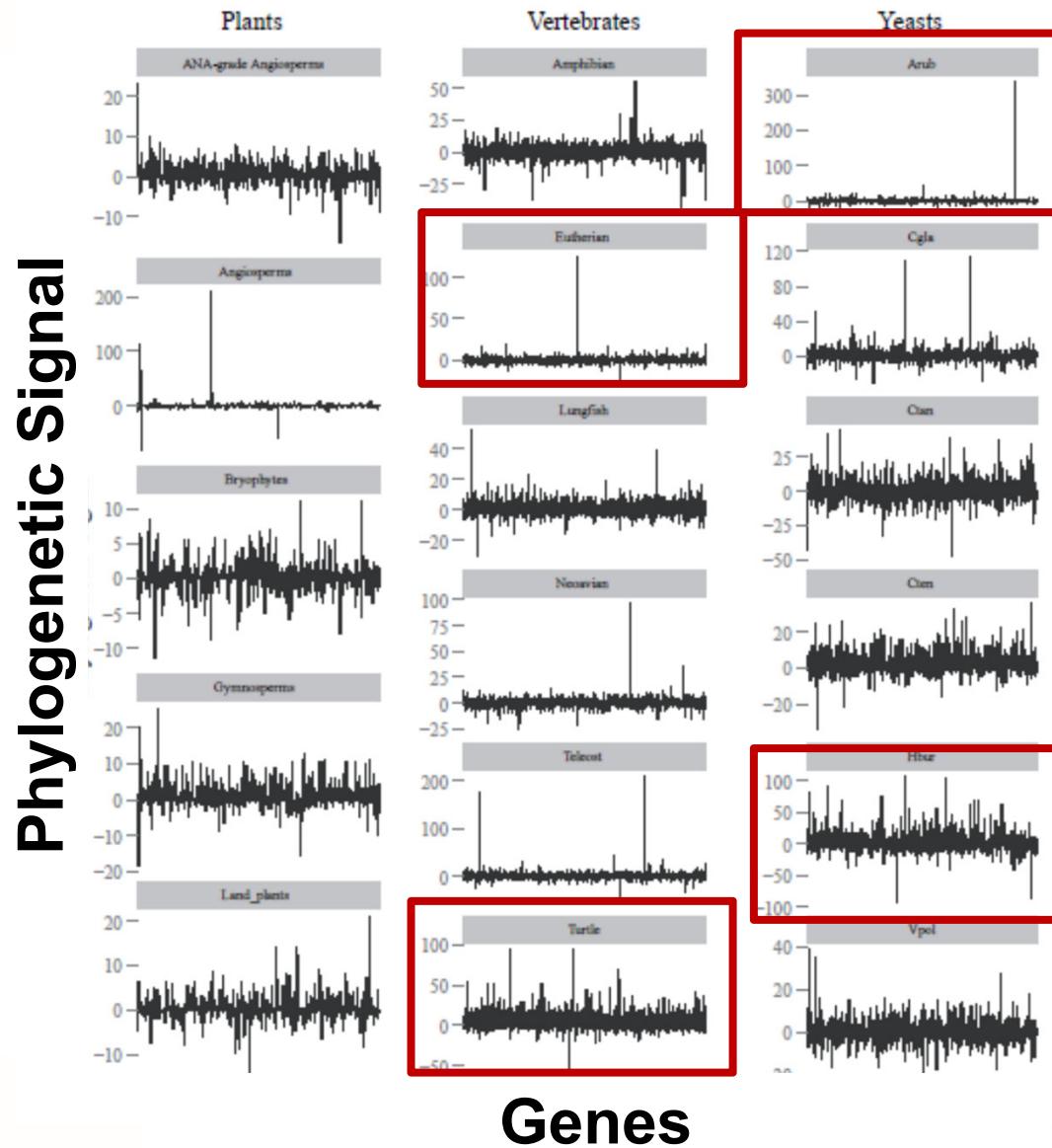


# Testing Several Contentious Branches of the Tree of Life

Clade	ML Tree (T1)	Conflicting Tree (T2)
Plants	<i>Amborella</i> as sister to all other flowering plants	<i>Amborella + Nuphar</i> 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 mosses + liverworts clade	Hornworts as sister to a mosses + liverworts clade
	Gnetales as sister to the Pinaceae, nested within the Coniferales	Gnetales as sister to the Coniferales
Vertebrates	Zygnematophyceae as sister to all land plants	Charales as sister to all land plants
	Gymnophiona as sister to all other amphibians	Anura as sister to all other amphibians
	Atlantogenata (Afrotheria + Xenarthra) as sister to all other placental mammals	Afrotheria as sister to all other 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 teleosts	Osteoglossomorpha alone as sister to all other teleosts
Yeasts	Turtles as sister to archosaurs (birds + crocodiles)	Turtles as sister to crocodiles
	Ascoideaceae as sister to Phaffomycetaceae + Saccharomycetaceae	Ascoideaceae as sister to a clade comprising Pichiaceae, Debaryomycetaceae, Phaffomycetaceae, and Saccharomycetaceae
	<i>Candida glabrata</i> rather than <i>Naumovozyma castellii</i> as sister to Saccharomyces sensu stricto yeasts	<i>Naumovozyma castellii</i> rather than <i>Candida glabrata</i> sister to Saccharomyces sensu stricto yeasts
	<i>Hyopichia burtonii</i> as sister to <i>Candida auris</i> + <i>Metschnikowia bicuspidata</i>	<i>Hyopichia burtonii</i> as sister to <i>Debaryomyces hansenii</i>
	<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
	<i>Meyerozyma guilliermondii</i> as sister to <i>Debaryomyces hansenii</i>	<i>Meyerozyma guilliermondii</i> as sister to <i>Hyopichia burtonii</i> + <i>Candida auris</i>
	<i>Candida tanzawaensis</i> as sister to <i>Pichia stipiti</i> + <i>Candida maltosa</i>	<i>Pichia stipiti</i> as sister to <i>Candida tanzawaensis</i> + <i>Candida maltosa</i>



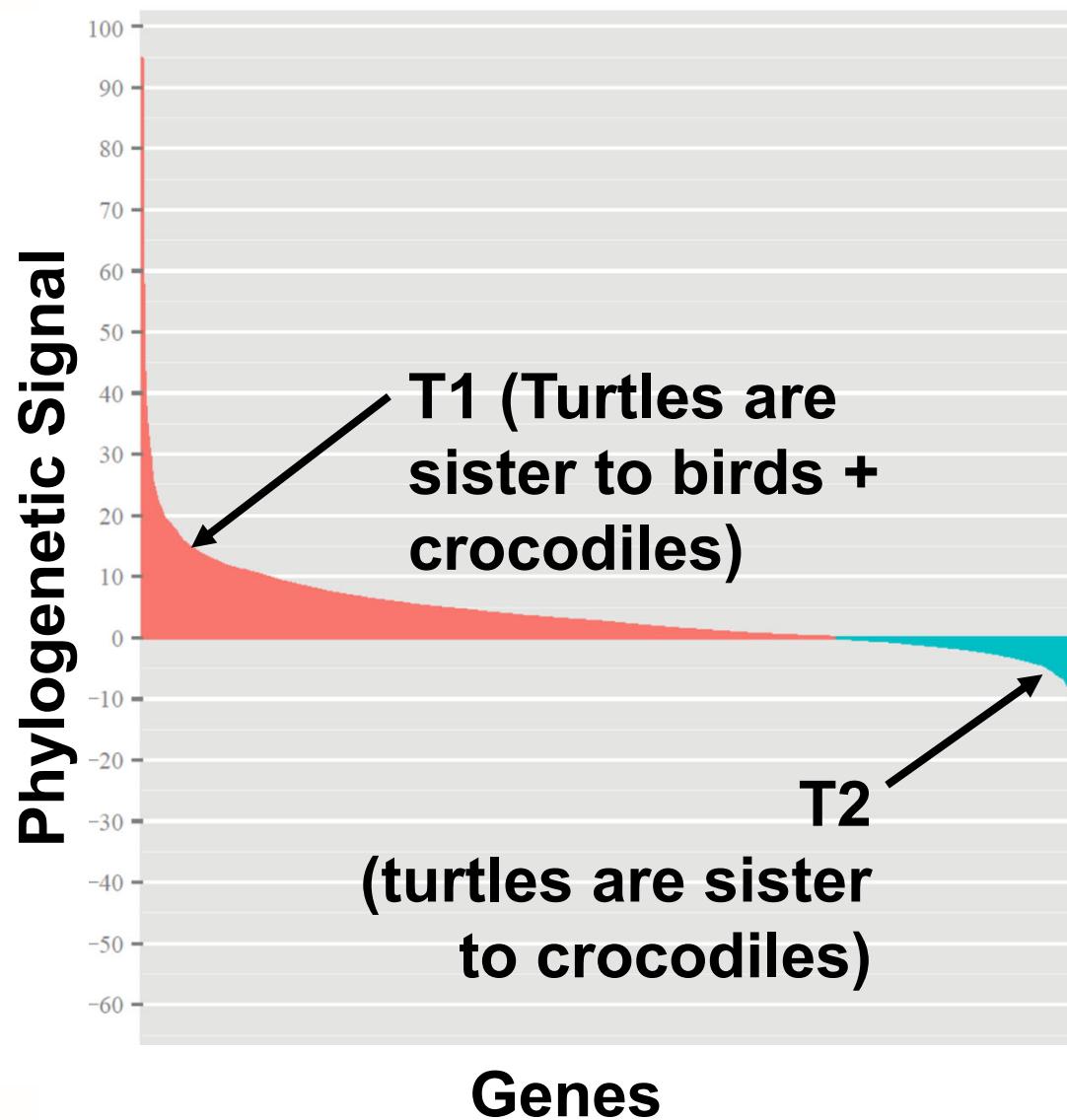
# *Phylogenetic Signal in Contentious Branches of the ToL*



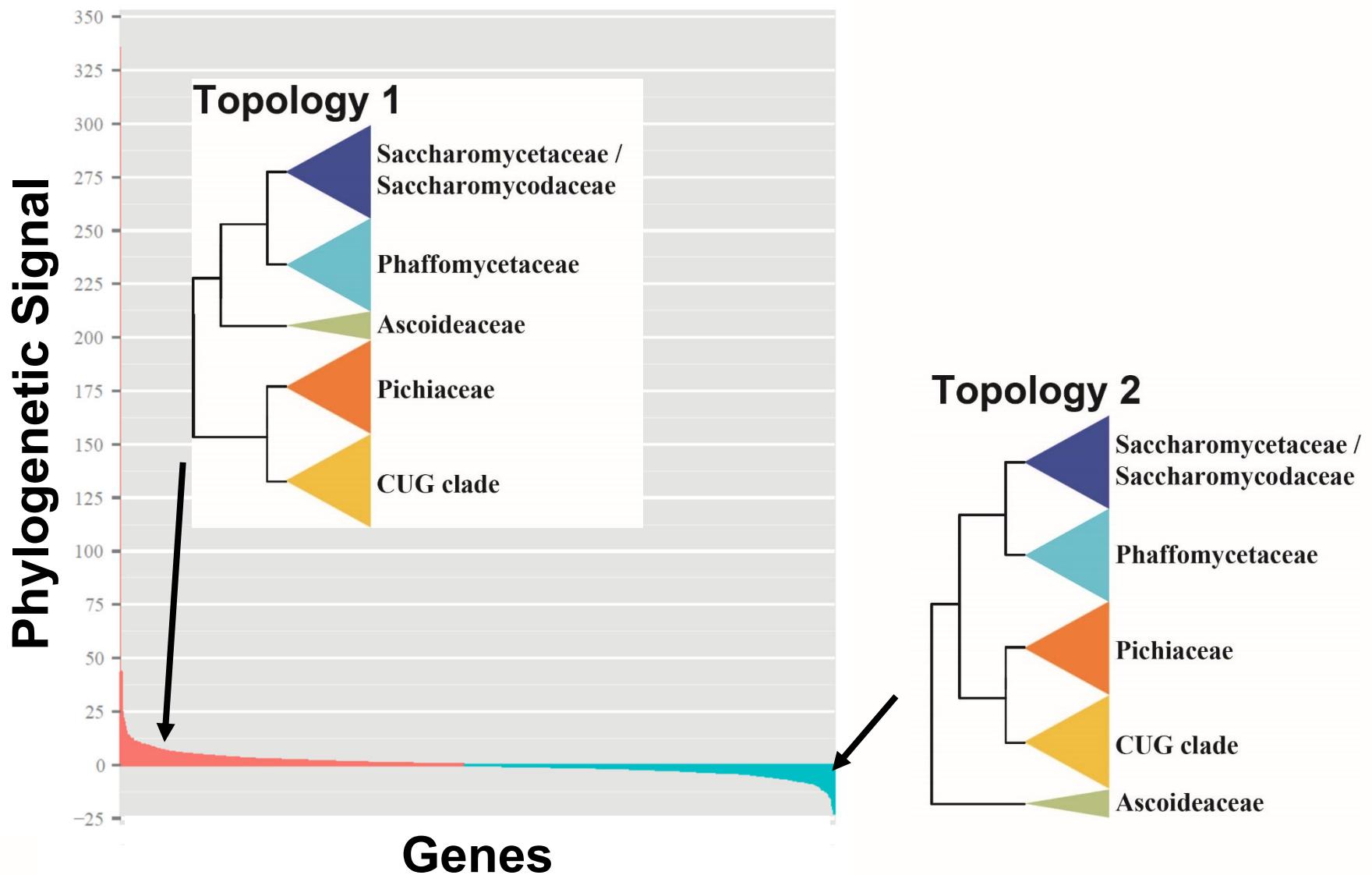
*Shen et al. (2017) Nature Ecol. Evol.*



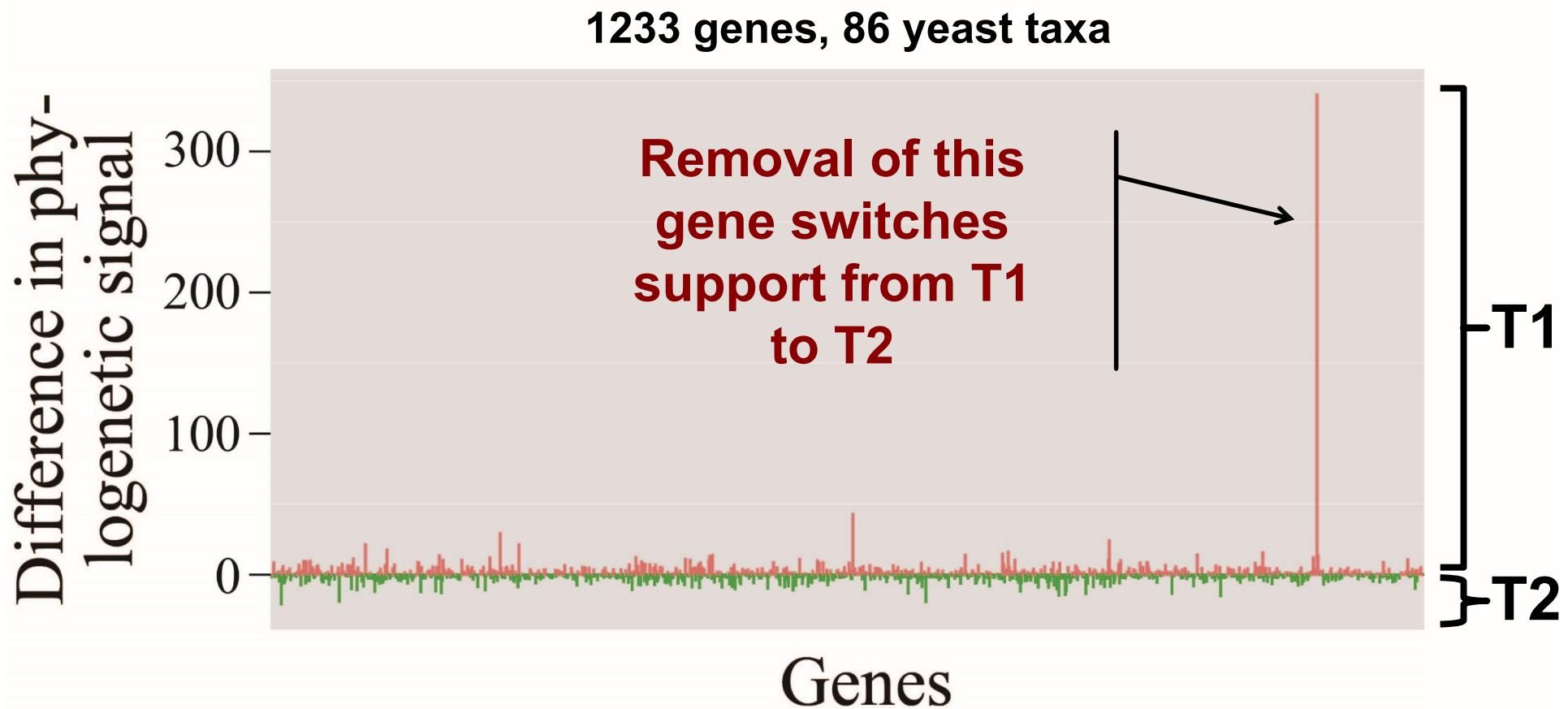
## *The Signal in Some Branches is Very Strong...*



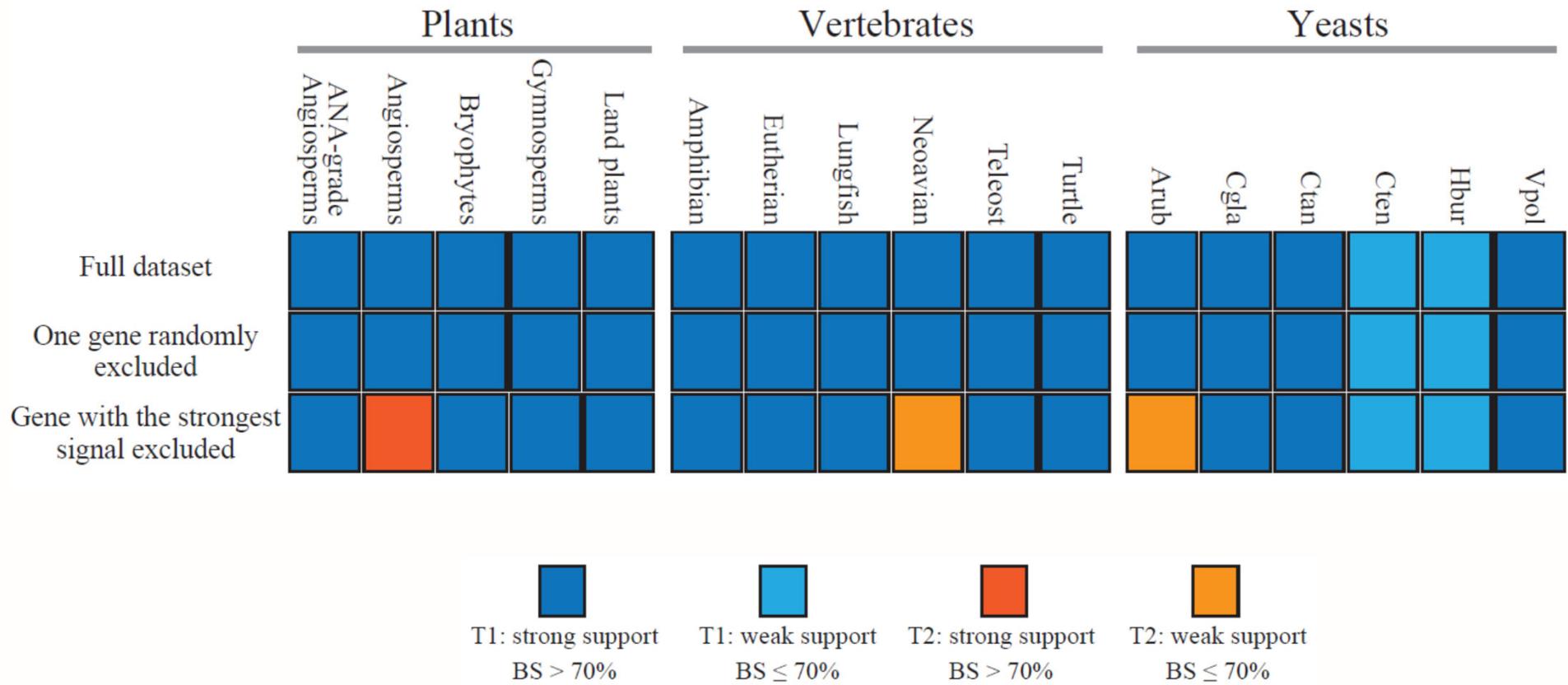
## *...But in Others It Stems from One or Two Genes*

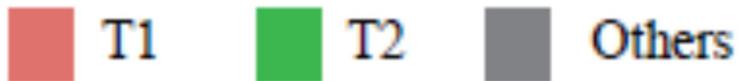


# *Phylogenetic Signal per Gene for the Two Hypotheses*



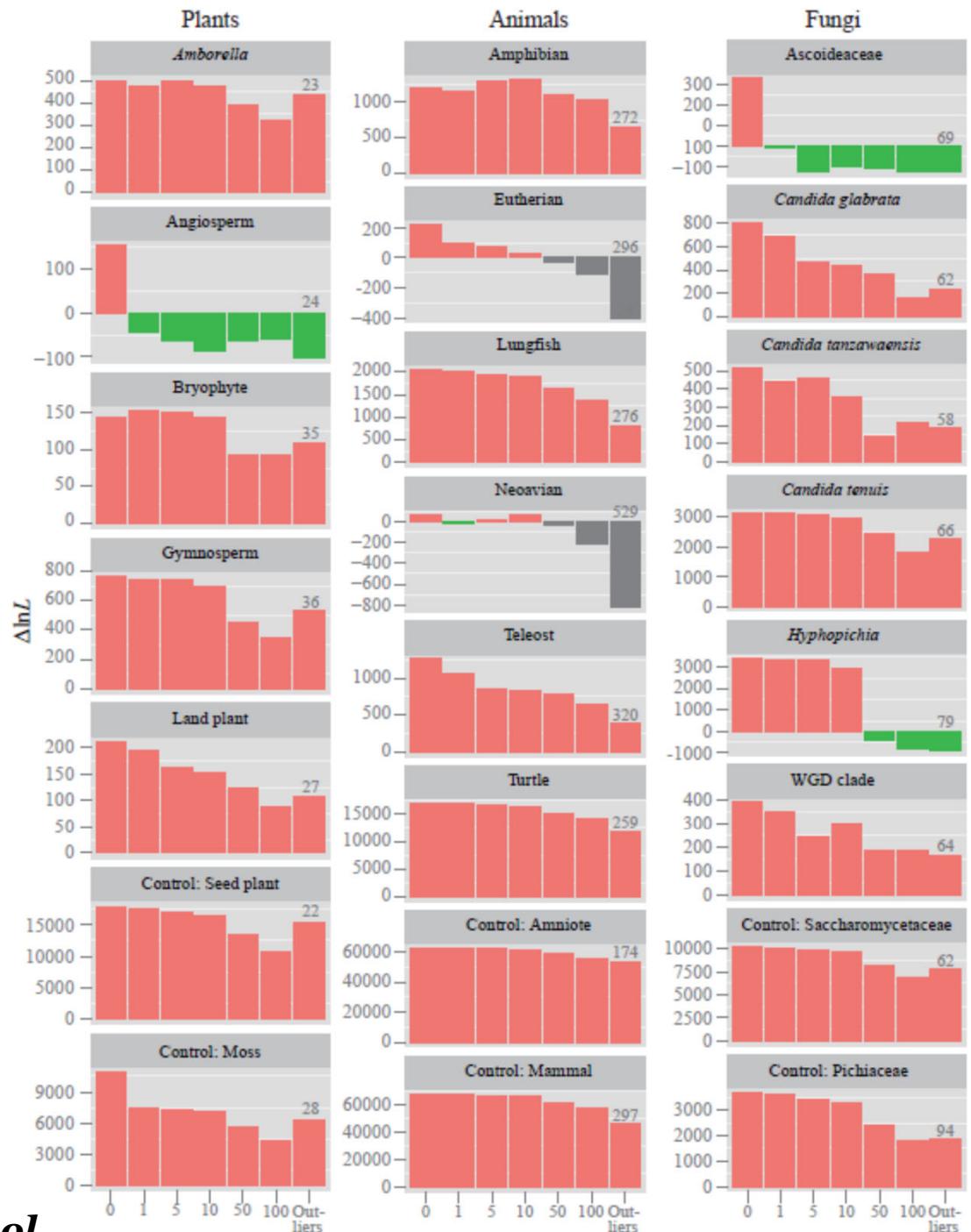
# *What Happens if we Remove That One Gene?*

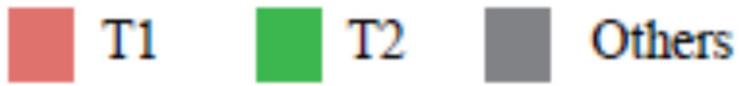




# of genes excluded

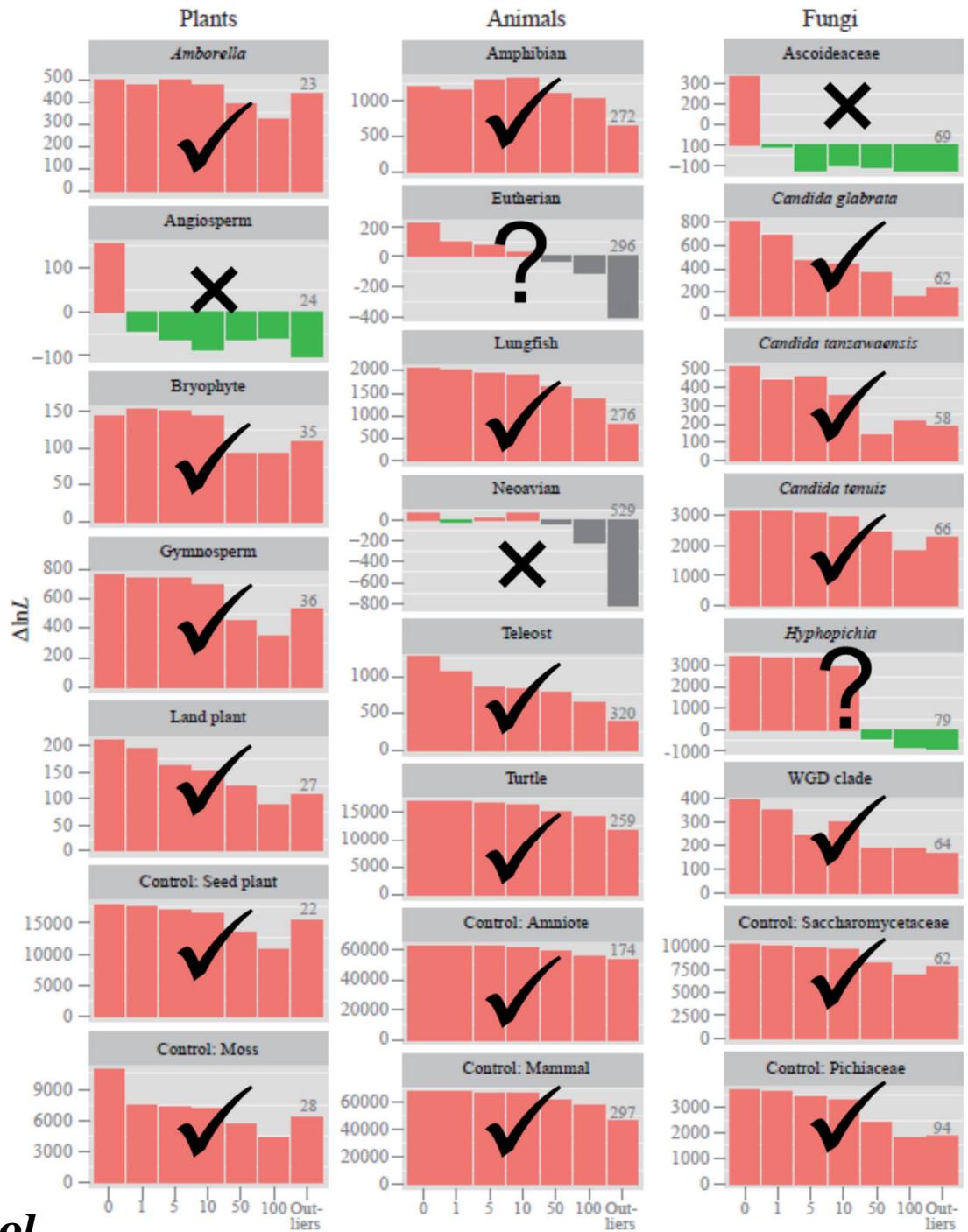
## *Quantifying the Impact of Removing Opinionated Genes*



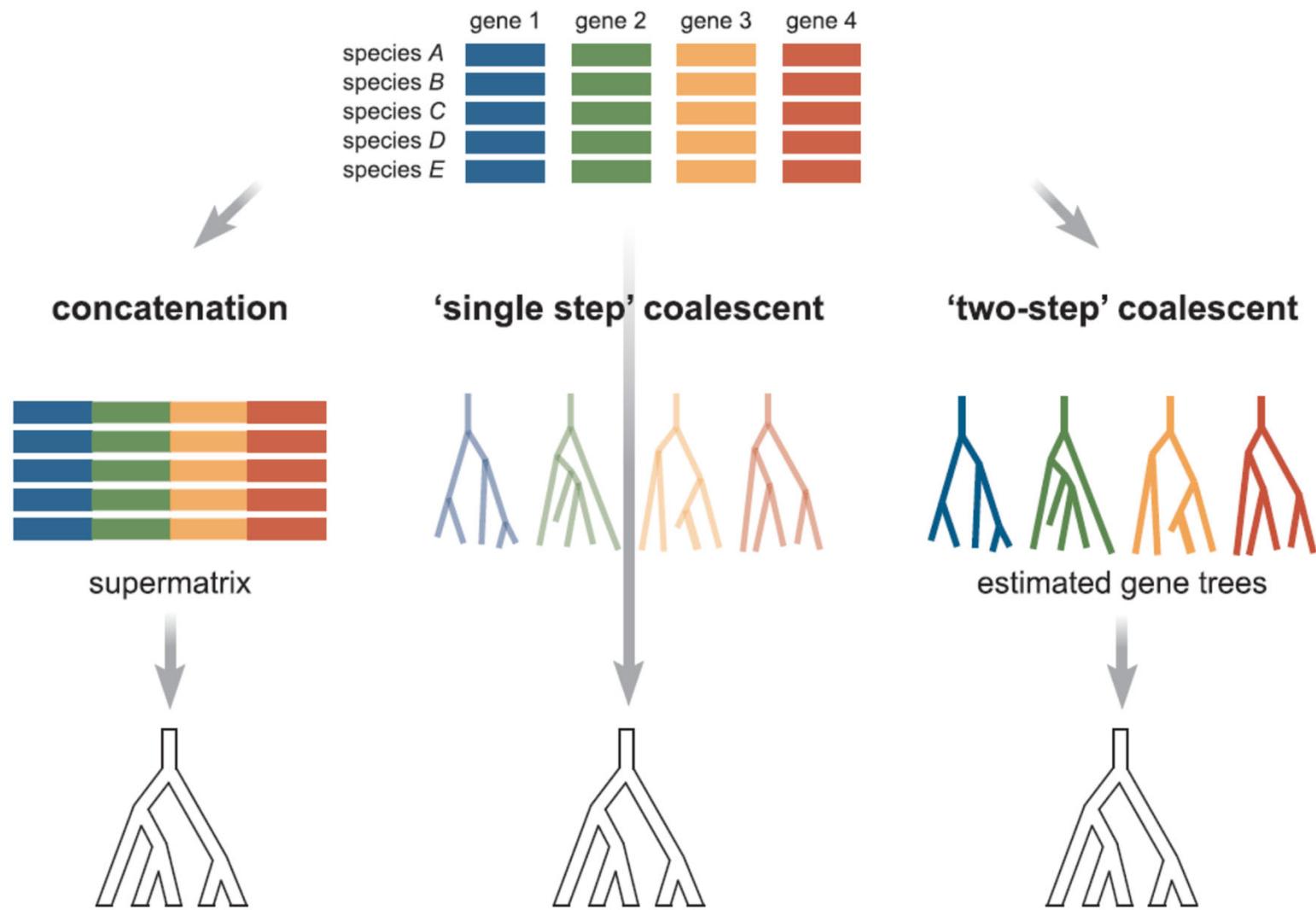


# of genes excluded

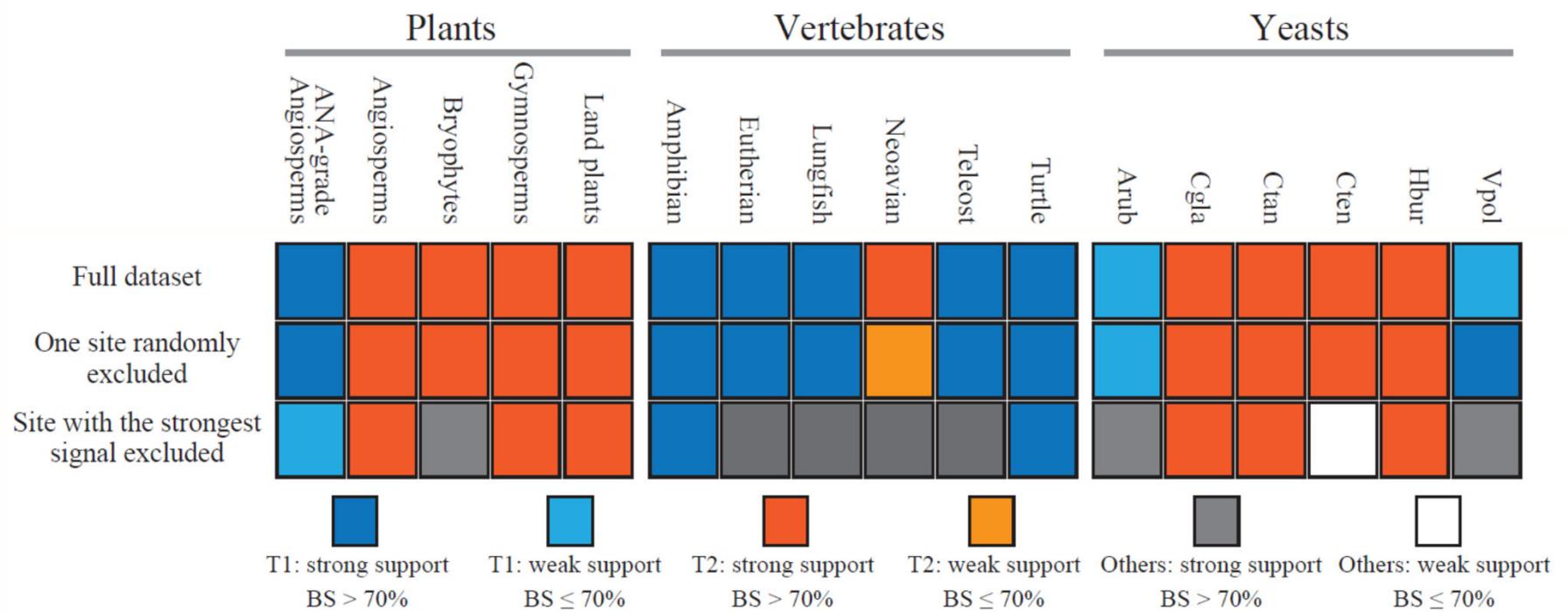
## *Which Branches are Resolved and Which are Unresolved?*



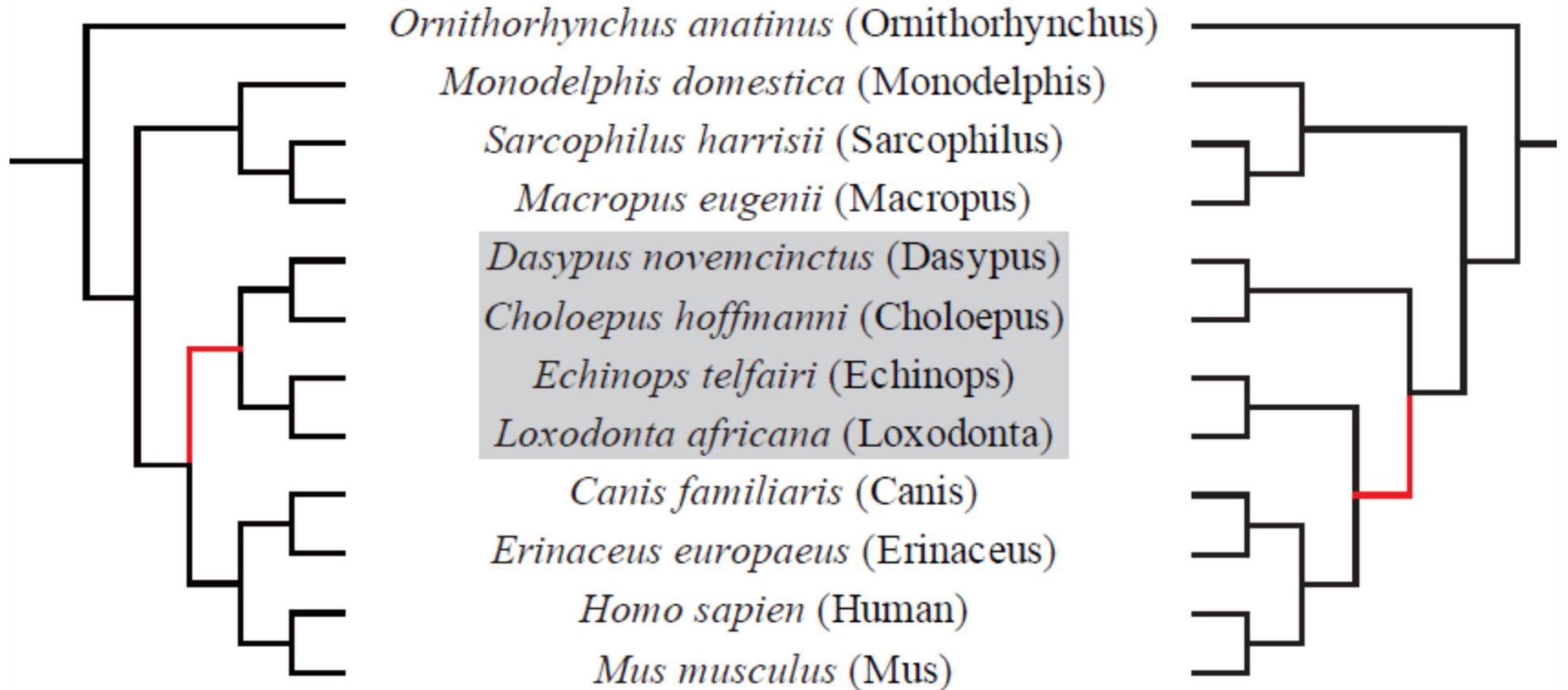
# *Methods for Phylogenomic Inference*



# What Happens if we Remove One Site from Every Gene?



# *Removing 1 Site Alters the Topology*



## *What's Going On?*

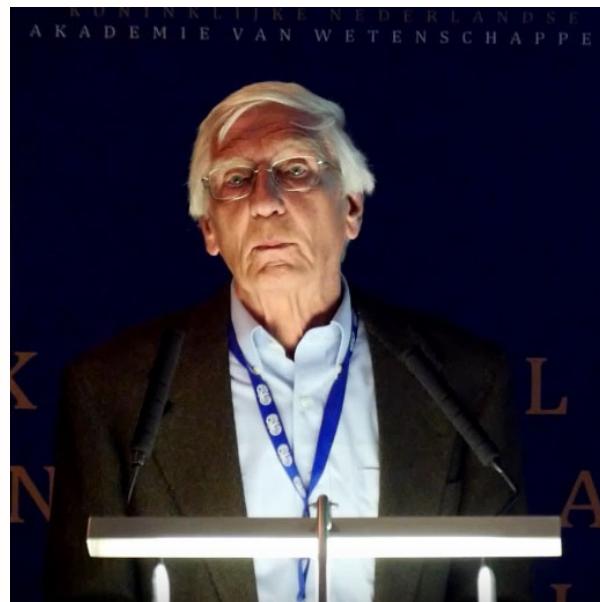
**Explanation #1: Biological factors (parts of the tree of life are bush-like / network-like rather than tree-like)**

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

# *The Making of Biodiversity across the Yeast Subphylum*



Hittinger lab



Kurtzman lab



Rokas lab

# *The Making of Biodiversity across the Yeast Subphylum*

- ❖ Sequence the genomes of all ~1,000+ known budding yeast species
- ❖ Construct their definitive phylogeny and timetree
- ❖ Examine the impact of metabolism on yeast diversification
- ❖ Revise their taxonomy

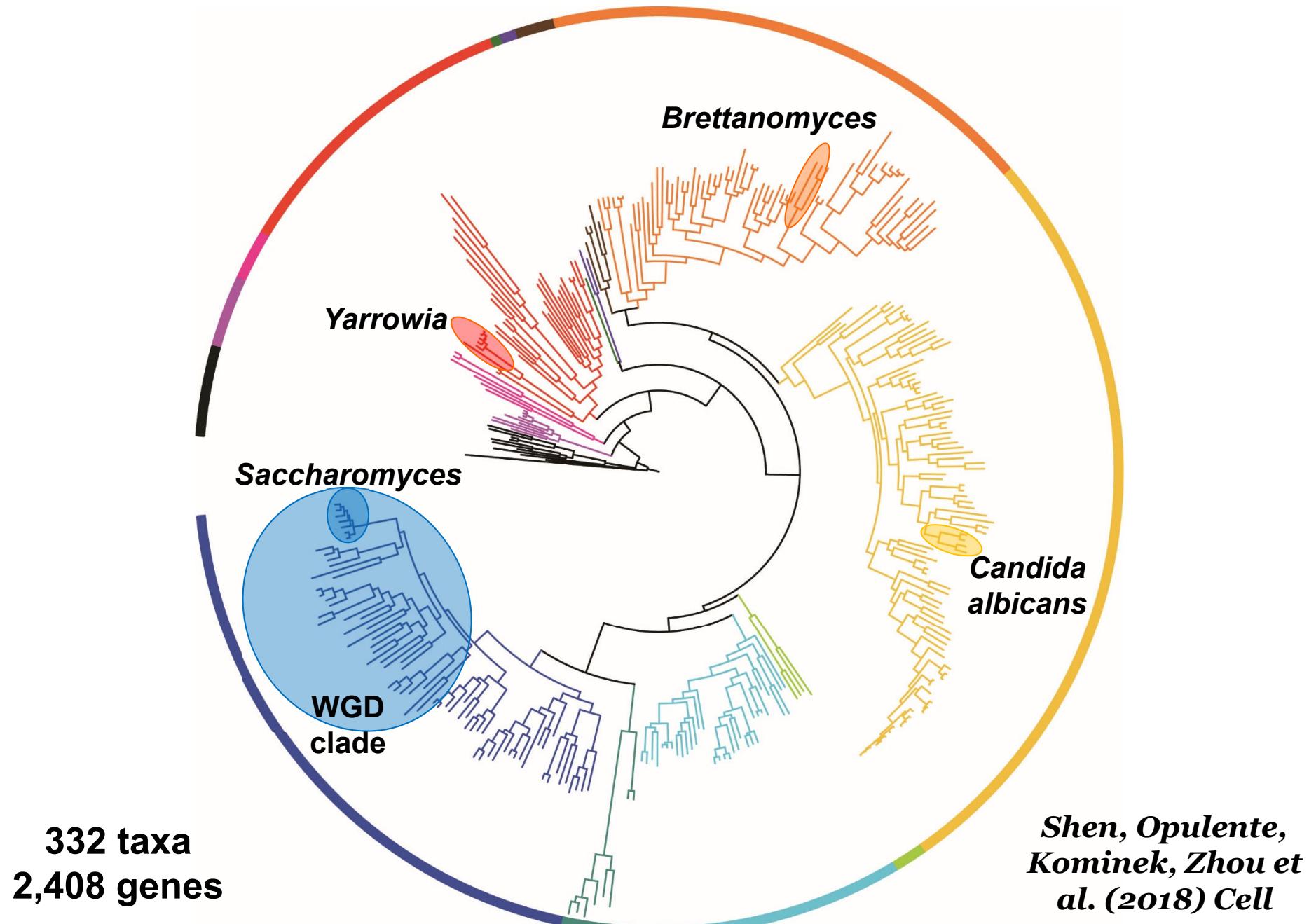


Hittinger / Kurtzman / Rokas Labs; <http://y1000plus.org>

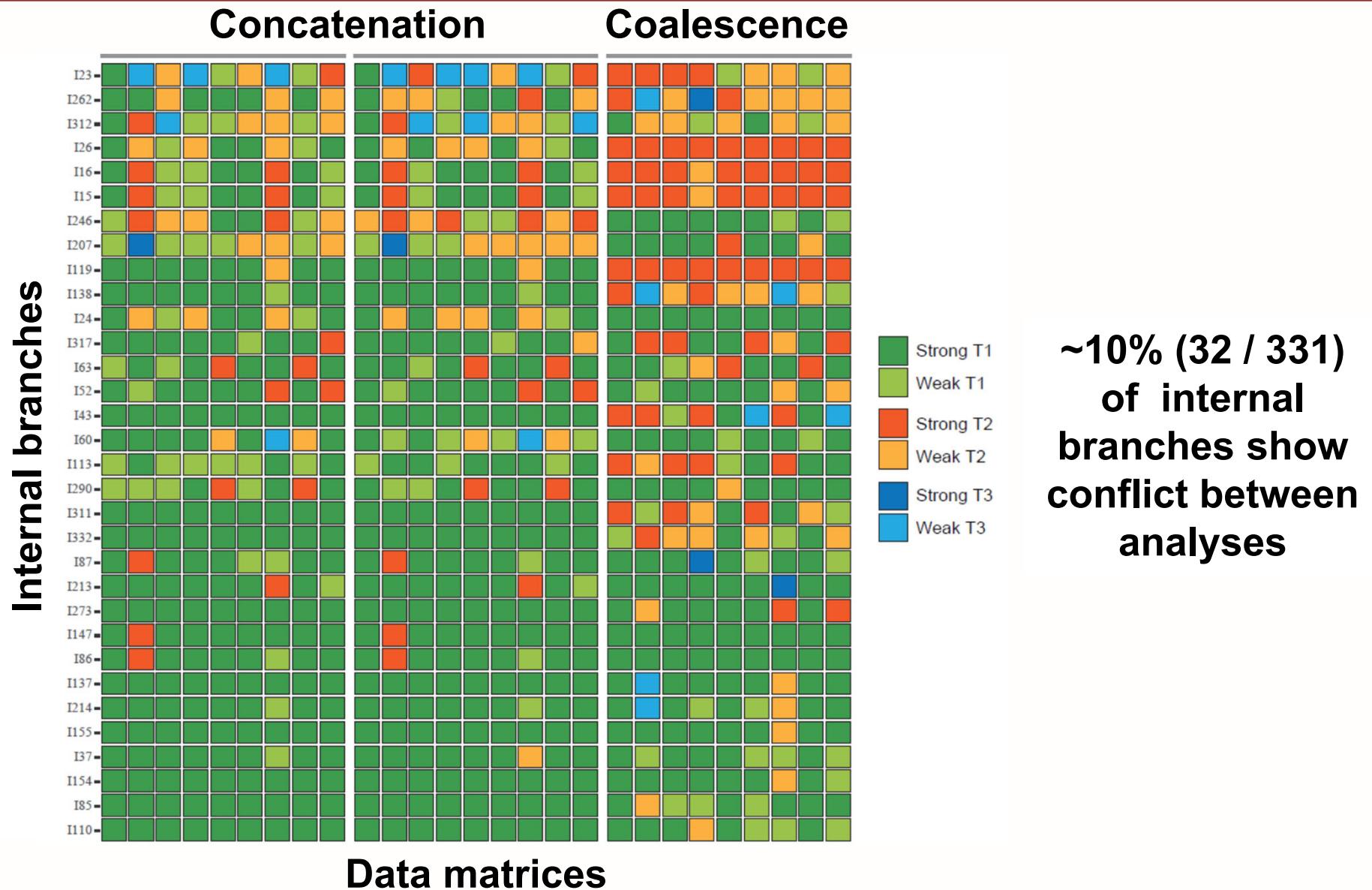
- ❖ Sequenced the genomes of 220 species (196 Y1000+ species + 24 RIKEN genomes); most of them are from type strains
- ❖ + 112 publicly available genomes -> 332 genomes
- ❖ Sampled taxa from 79 / 92 genera (~85%)

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

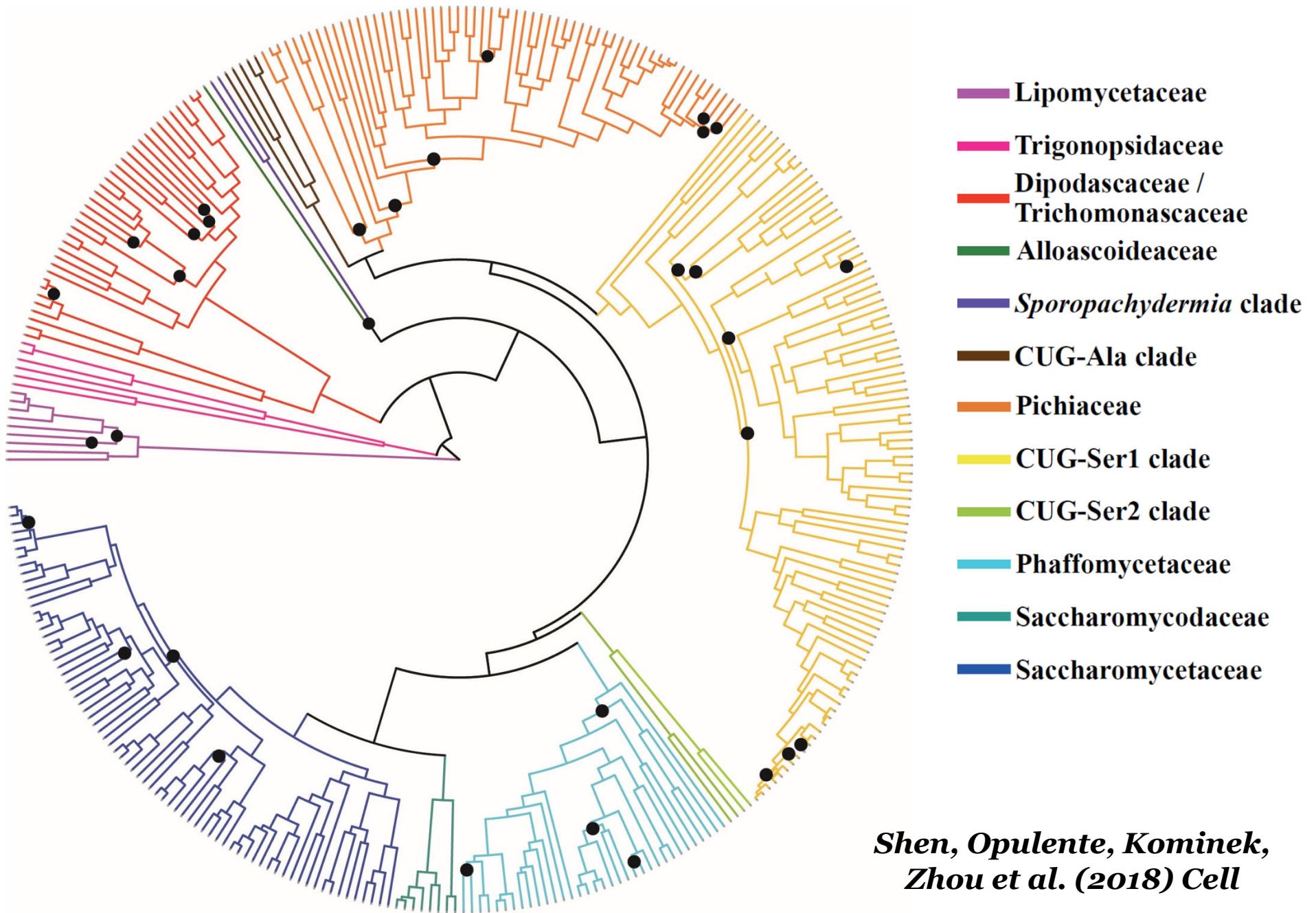
# Genome-Scale Phylogeny of Budding Yeasts



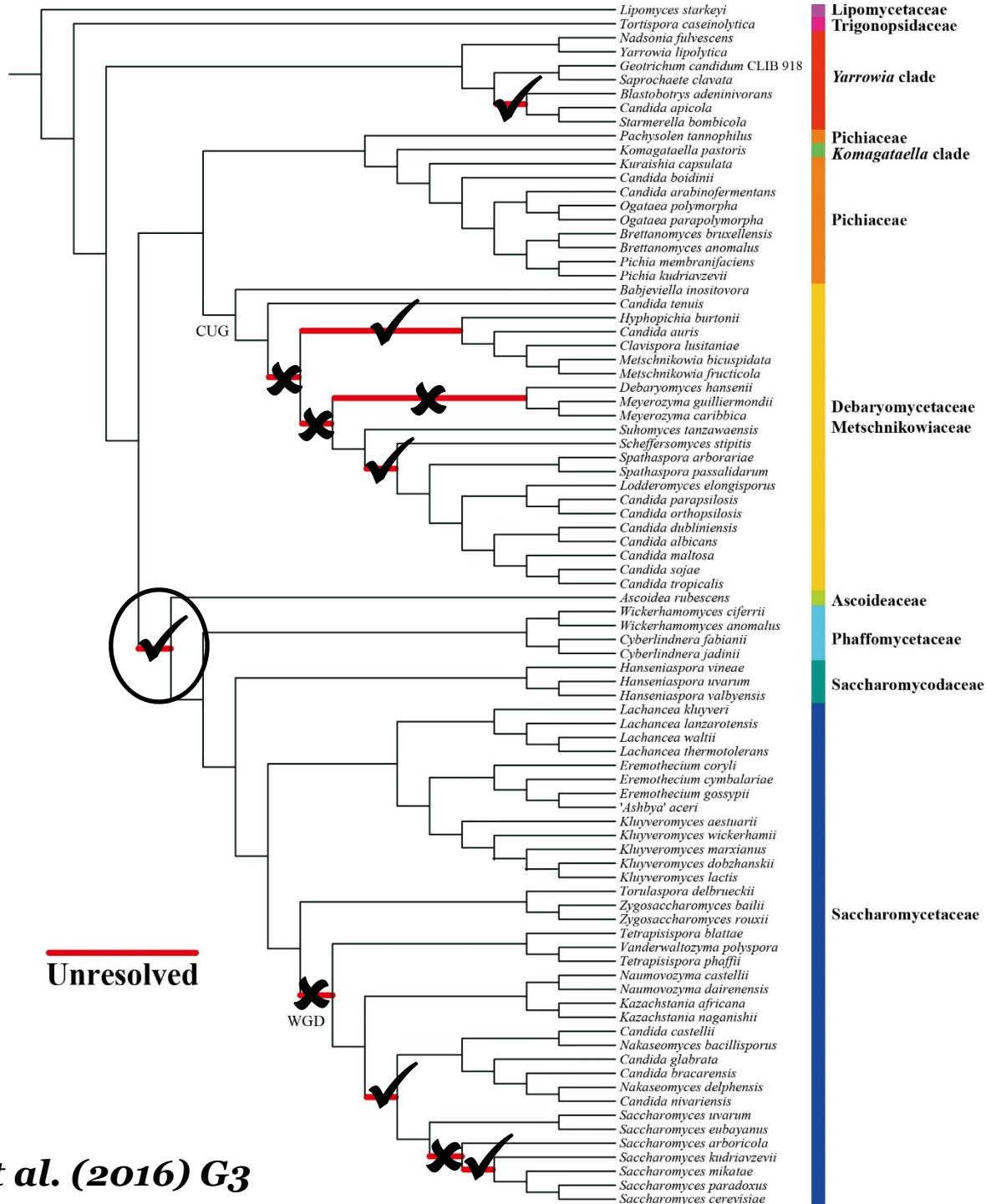
# *The 32 Conflicting Branches in the Yeast Phylogeny*



# *Distribution of Conflict on the Yeast Phylogeny*



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

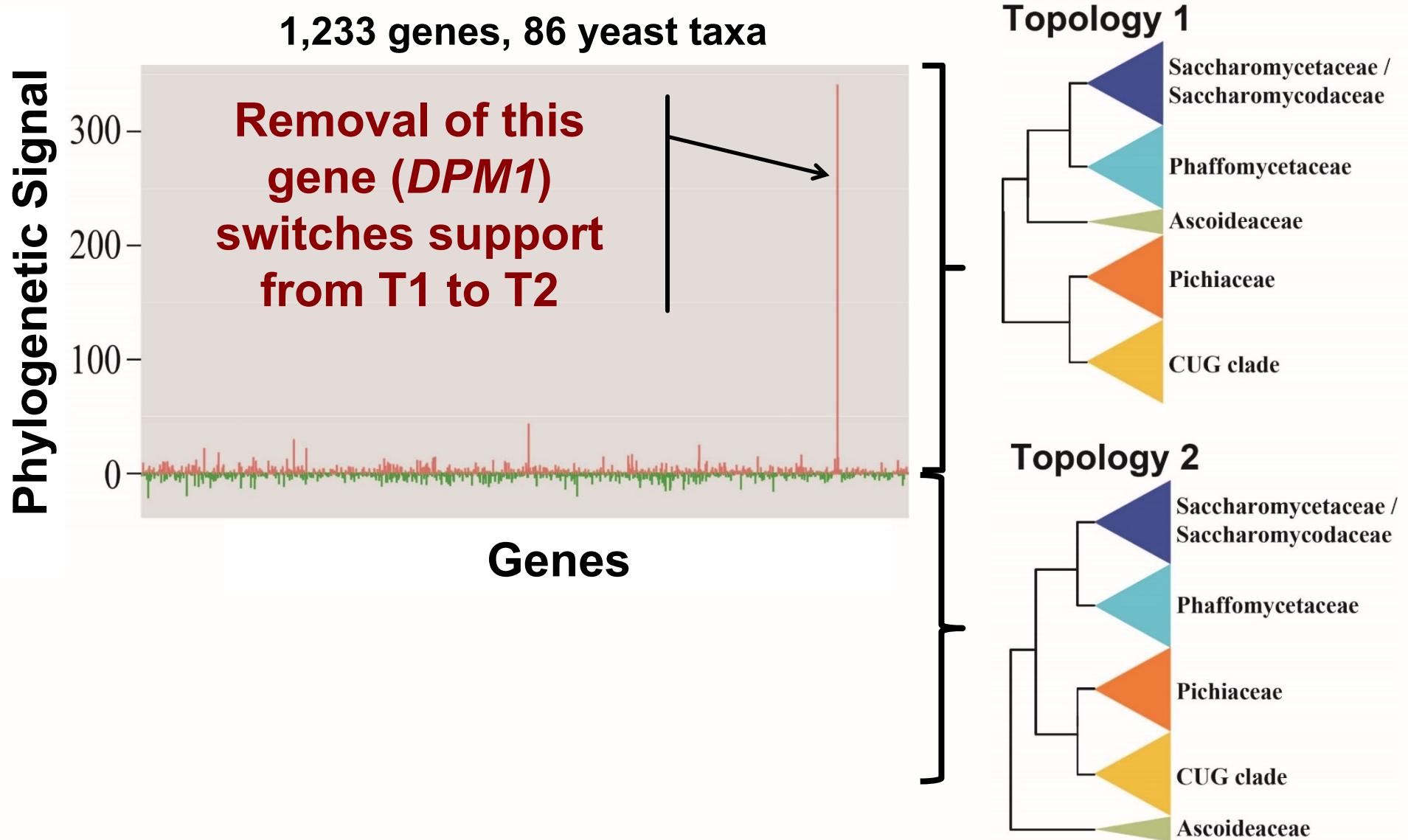


**1,233-gene, 86-taxon data matrix**

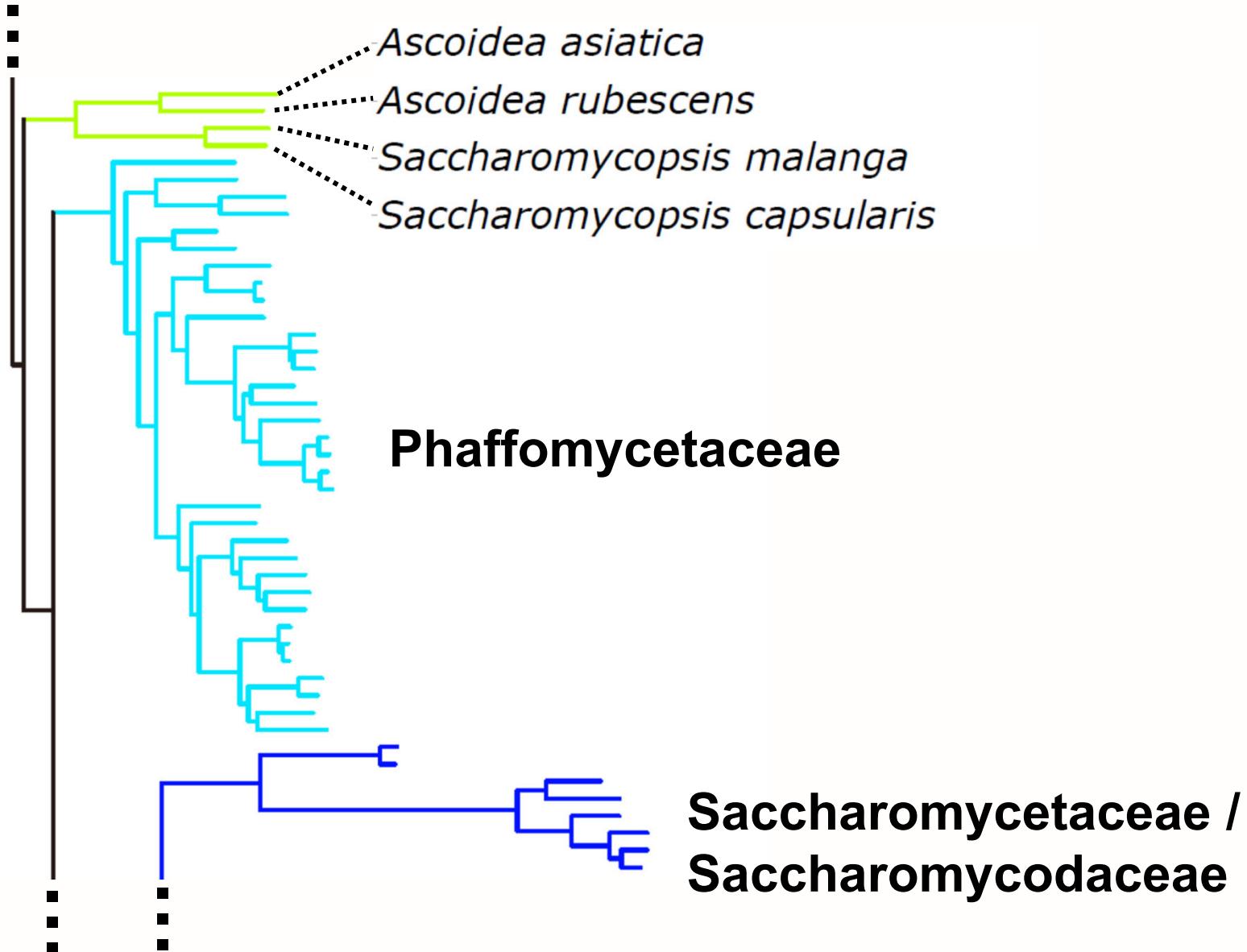
**~13% (11 / 85) of internal branches conflict between analyses**

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

# *A Single Gene Governs the Placement of Ascoideaceae*



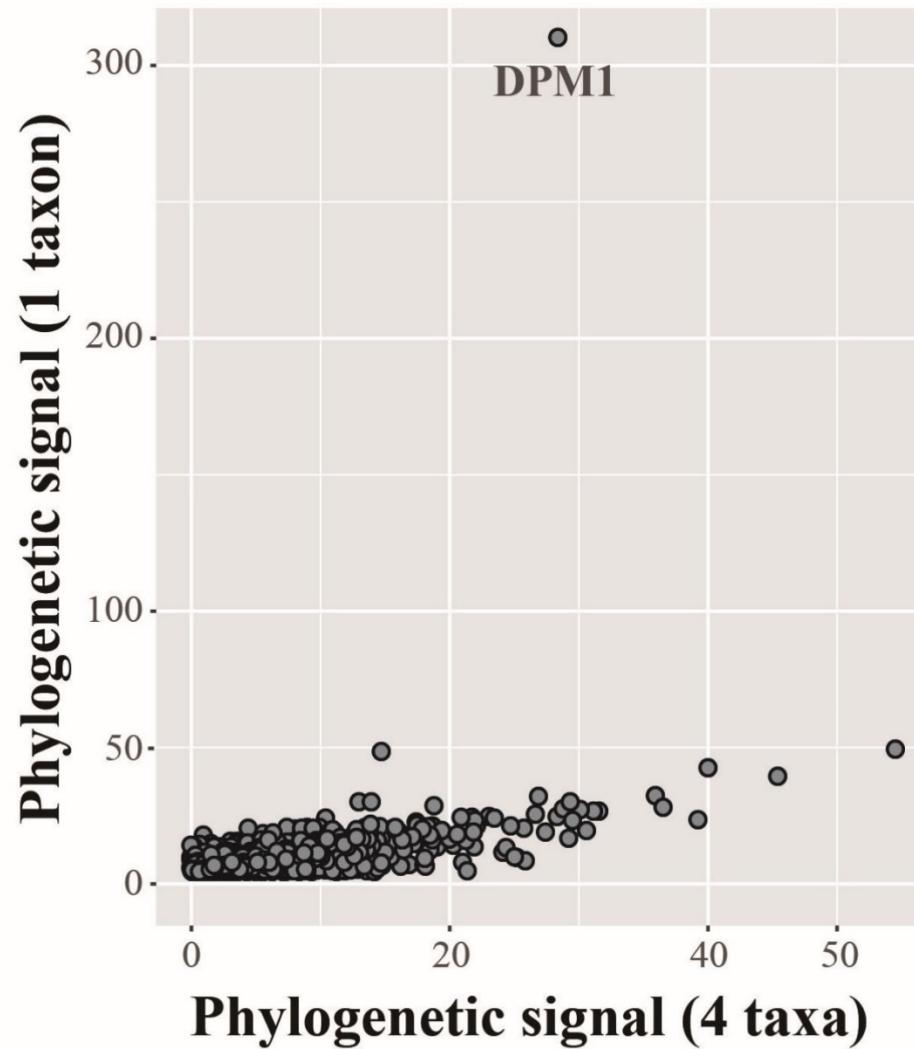
## *Sampling of 3 Additional Taxa “Breaks” the Long Branch*



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

## *Sampling of 3 Additional Taxa Decreases Gene's Signal*

**2,408 genes, 329 – 332 yeast taxa**



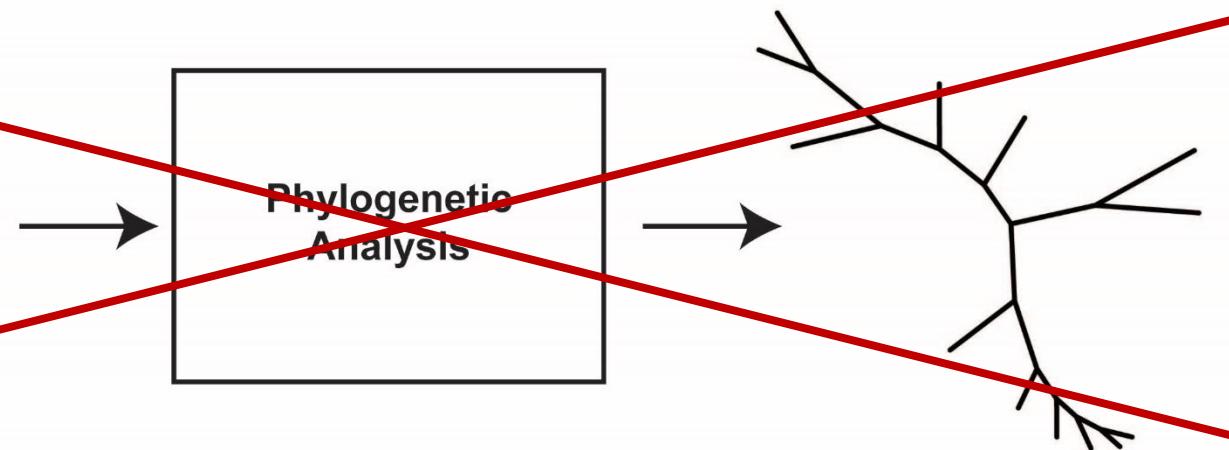
*Shen, Opulente, Kominek, Zhou et al. (2018) Cell*

# *Genomfart?*

- ❖ Parts of the tree of life are more likely to resemble a bush rather than a tree – do we expect that we can confidently infer every branch and twig?
- ❖ Bootstrap-based measures not useful in large data sets
- ❖ Methods evaluating conflict among data subsets (e.g., internode certainty among genes or sites or concordance factors) are preferable
- ❖ Explicitly identify internodes that, despite the use of genome-scale data sets, robust study designs and powerful algorithms, are poorly supported
- ❖ Taxon choice matters & more data will help!

# *The Way Forward*

taxon_1	ACCCGATAGACAA
taxon_2	. G. G.....
taxon_3	.....CT..
taxon_4	....A.....C
taxon_5	T.A.....
taxon_7	.....TT....
taxon_8	..G....TT....
taxon_9	.....G....
taxon_10	T.....
taxon_11	T.....
taxon_12	..GG.....T..
taxon_13	..GG...C..T..



Multiple sequence  
alignment / data  
matrix  
reconstruction

Apply different  
phylogenetic  
analyses (diff.  
optimality criteria /  
diff. approaches)

Assess conflict  
(e.g., use internode  
certainty /  
concordance  
factors)

Only report resolution of  
branches that you have  
support for

Investigate alternative  
hypotheses for branches  
showing conflict / assess  
sensitivity of results

## *Take Home Messages*



**“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 Lab**



**polytomies happen...**

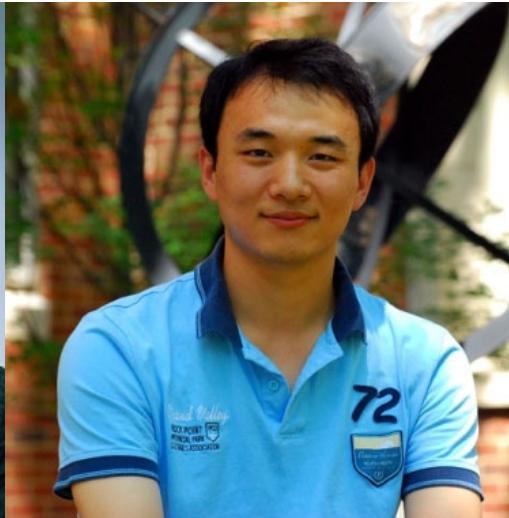
## *Acknowledgements*



**Leonidas  
Salichos**



**Xing-Xing  
Shen**



**Xiaofan  
Zhou**



**Alexis  
Stamatakis**



National Science Foundation  
WHERE DISCOVERIES BEGIN



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