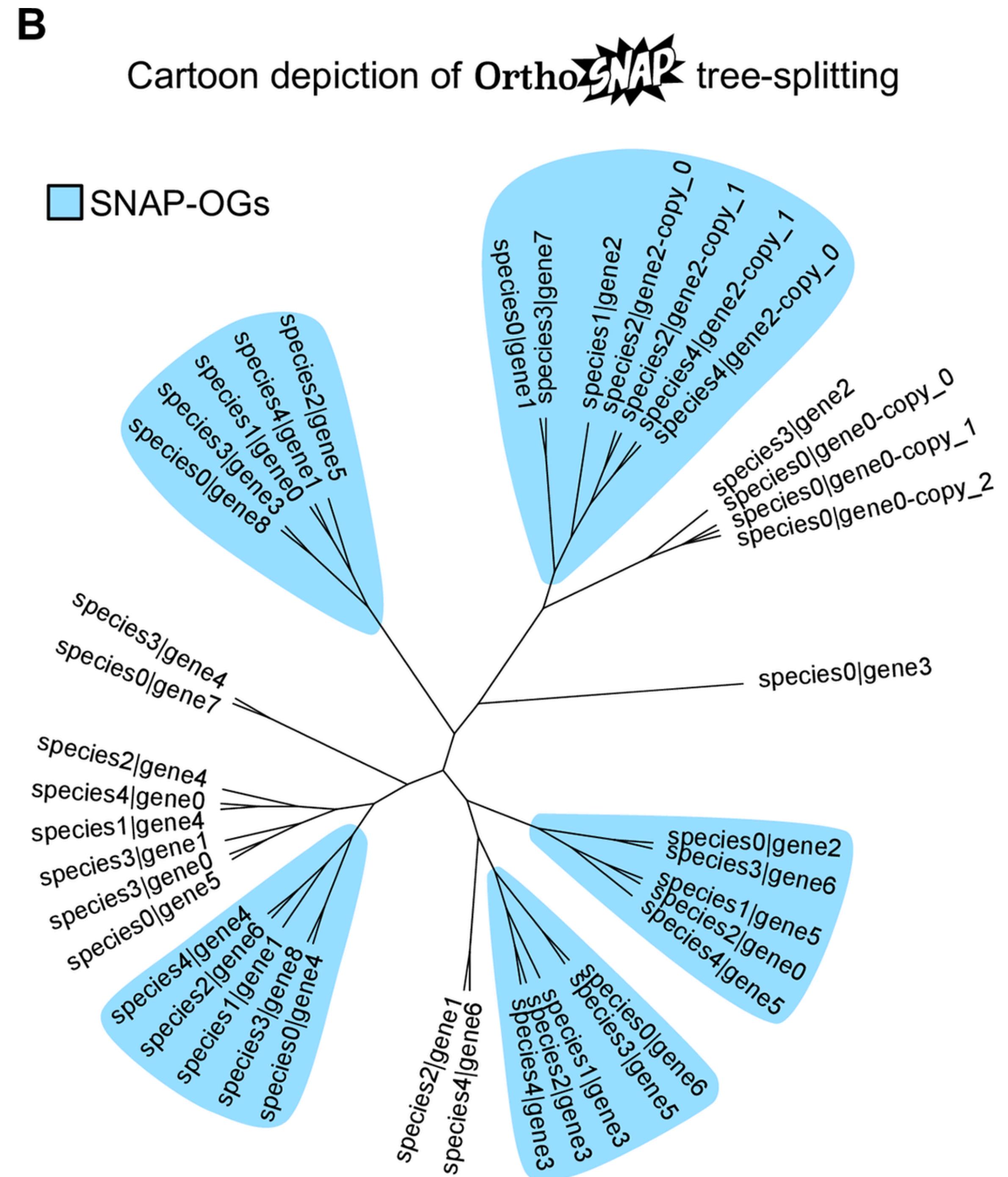




- Not all genes will appear in SC-OGs
- -f input can also be unaligned sequences
  - Enables alignment of SNAP-OGs
- If you still have questions, please feel to ask me to draw a worked example
- You may finish this session early, you can certainly work on previous unfinished practicals
- At 9:30, we will discuss phylogenetic lingo (Gemma & Karin)



# Concatenation and partitioning



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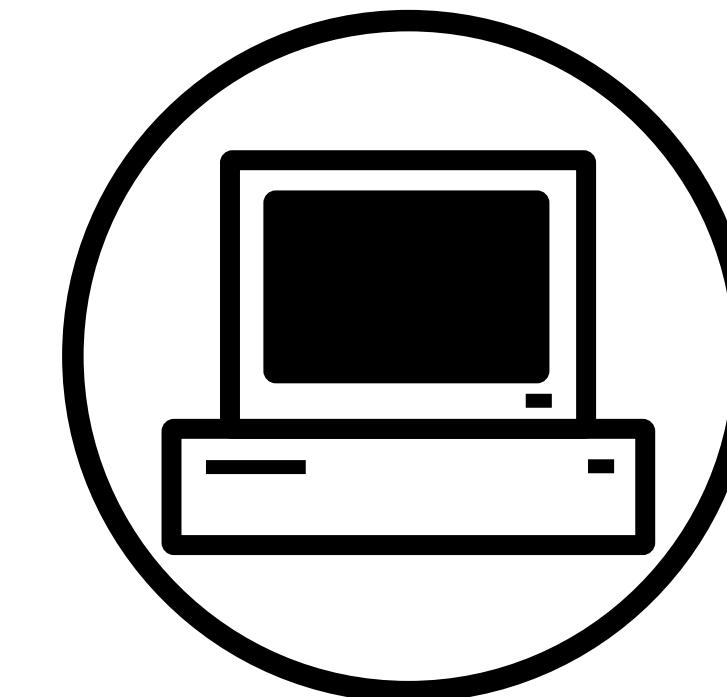
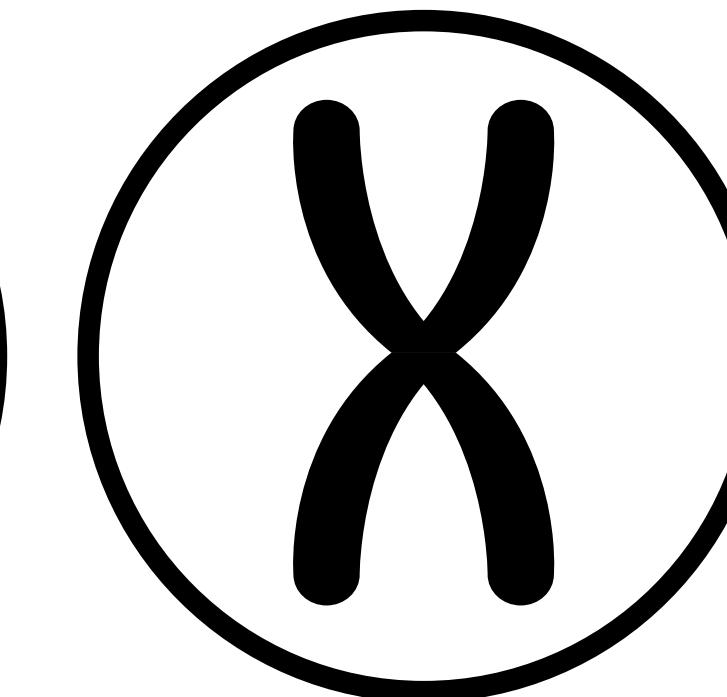
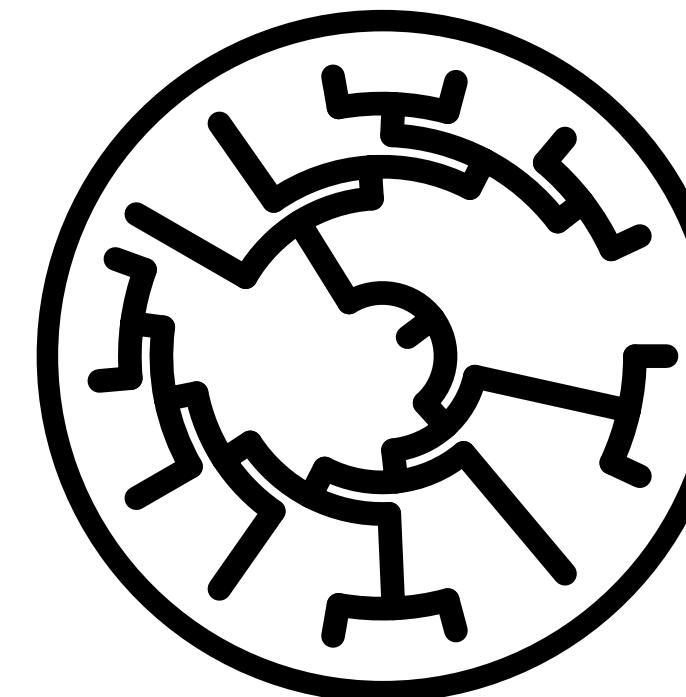


<https://jlsteenwyk.com/>



@JLSteenwyk

# Outline

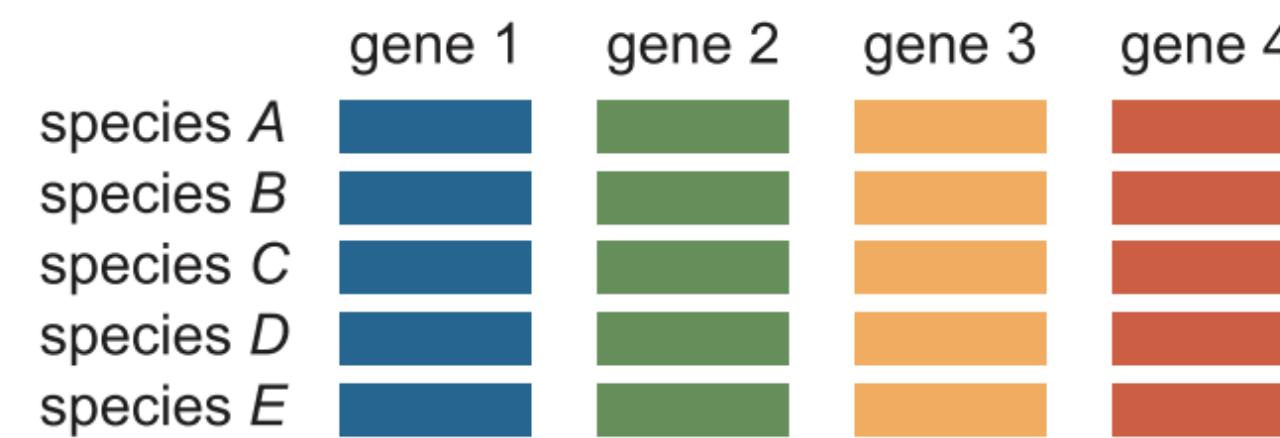


- Major methods in phylogenomics
- Substitution models, in (very) brief
- Methods to concatenate sequences
- Phylogenomic subsampling



@JLSteenwyk

# Major methods in phylogenomics



# Major methods in phylogenomics

	gene 1	gene 2	gene 3	gene 4
species A	blue	green	orange	red
species B	blue	green	orange	red
species C	blue	green	orange	red
species D	blue	green	orange	red
species E	blue	green	orange	red



**concatenation**



**supermatrix**



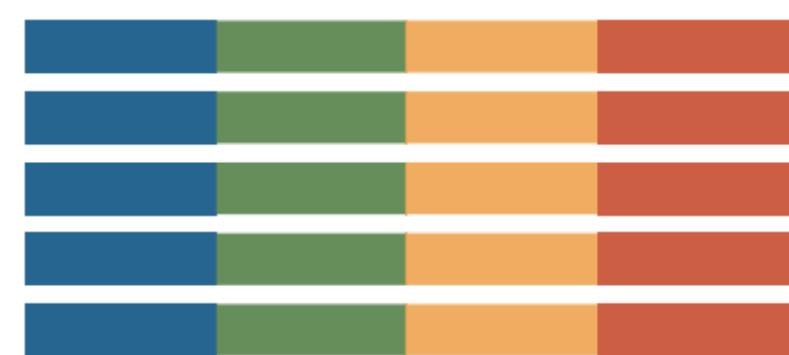
@JLSteenwyk

# Major methods in phylogenomics

	gene 1	gene 2	gene 3	gene 4
species A	blue	green	orange	red
species B	blue	green	orange	red
species C	blue	green	orange	red
species D	blue	green	orange	red
species E	blue	green	orange	red



**concatenation**

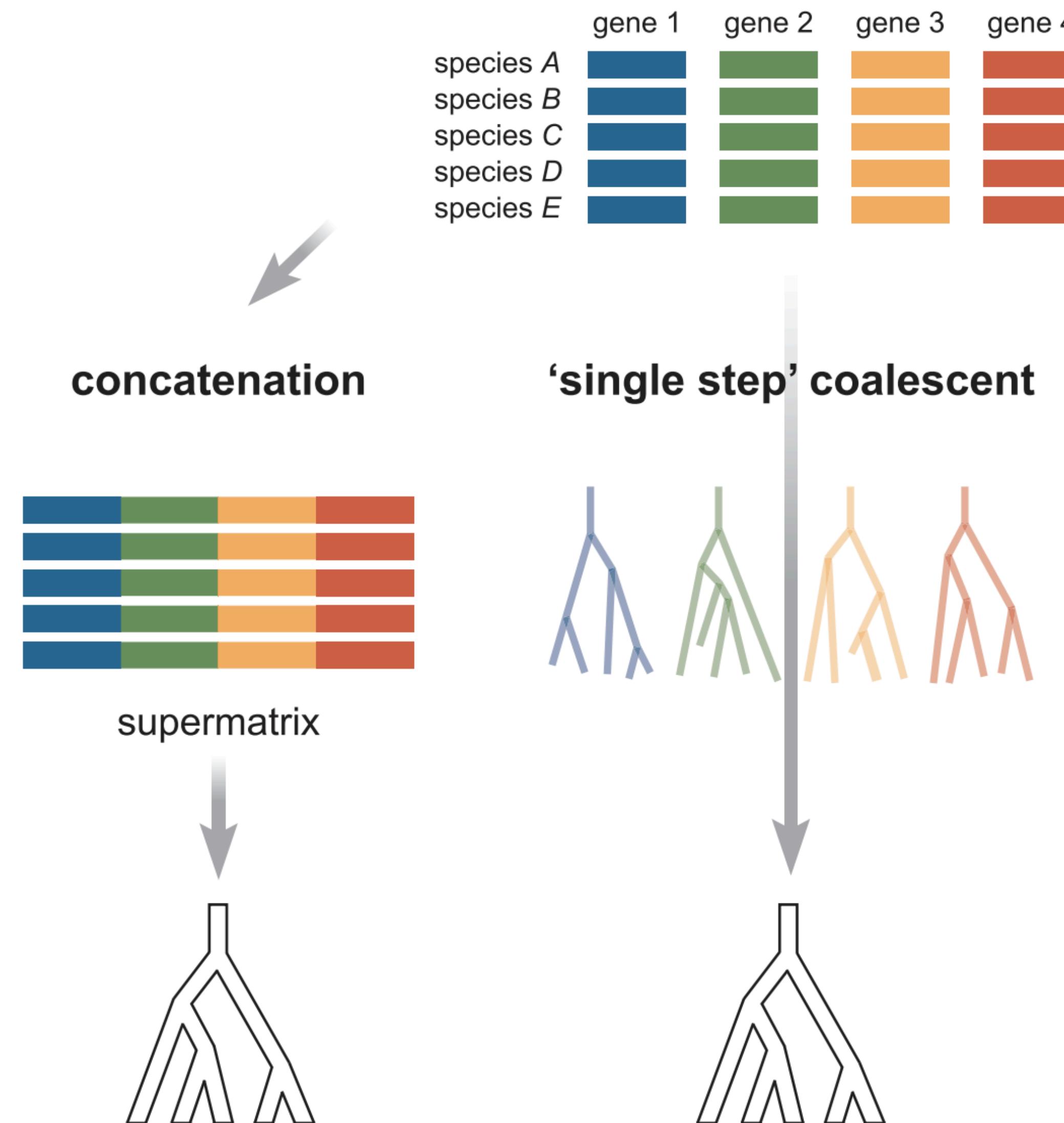


**supermatrix**

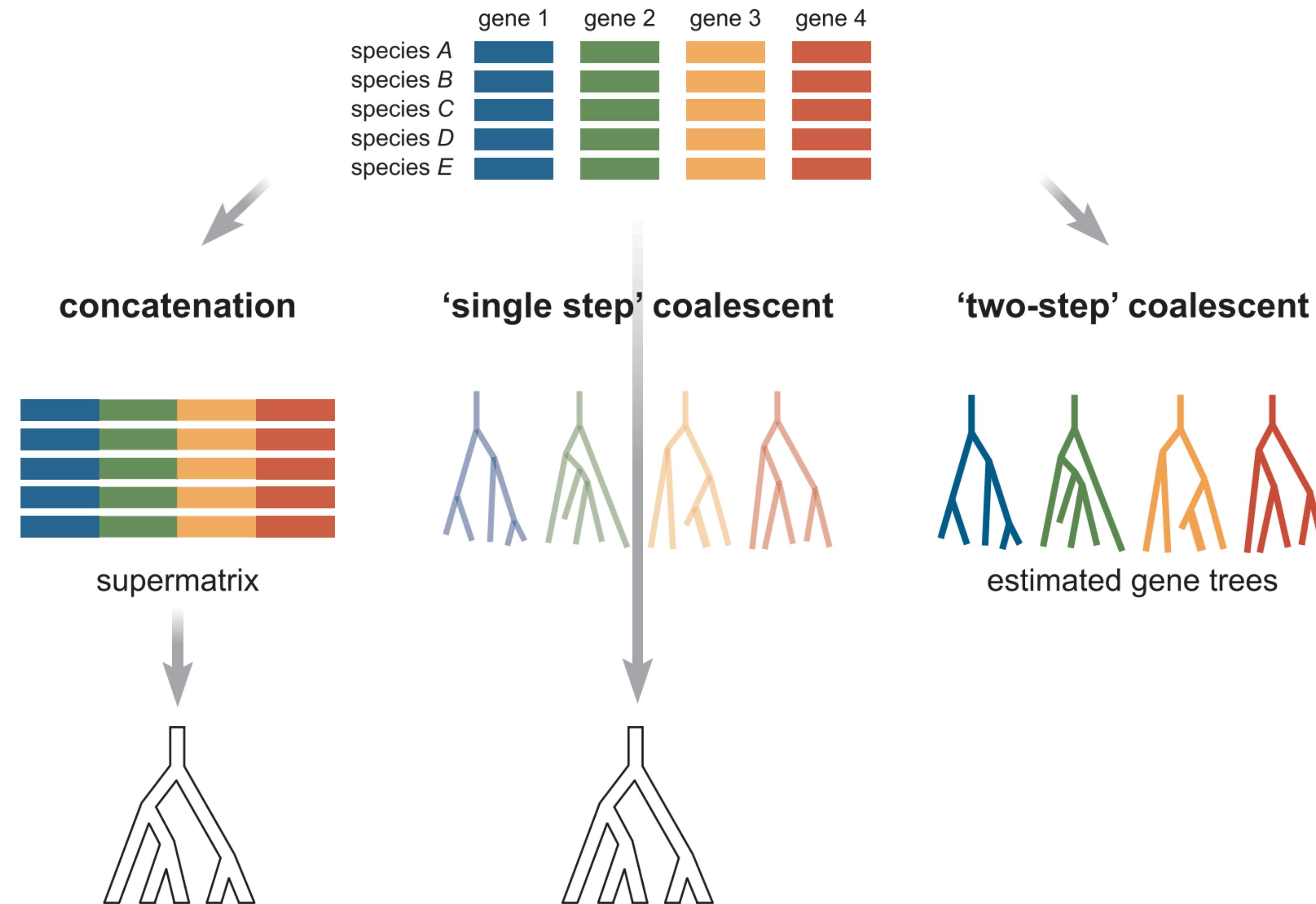


@JLSteenwyk

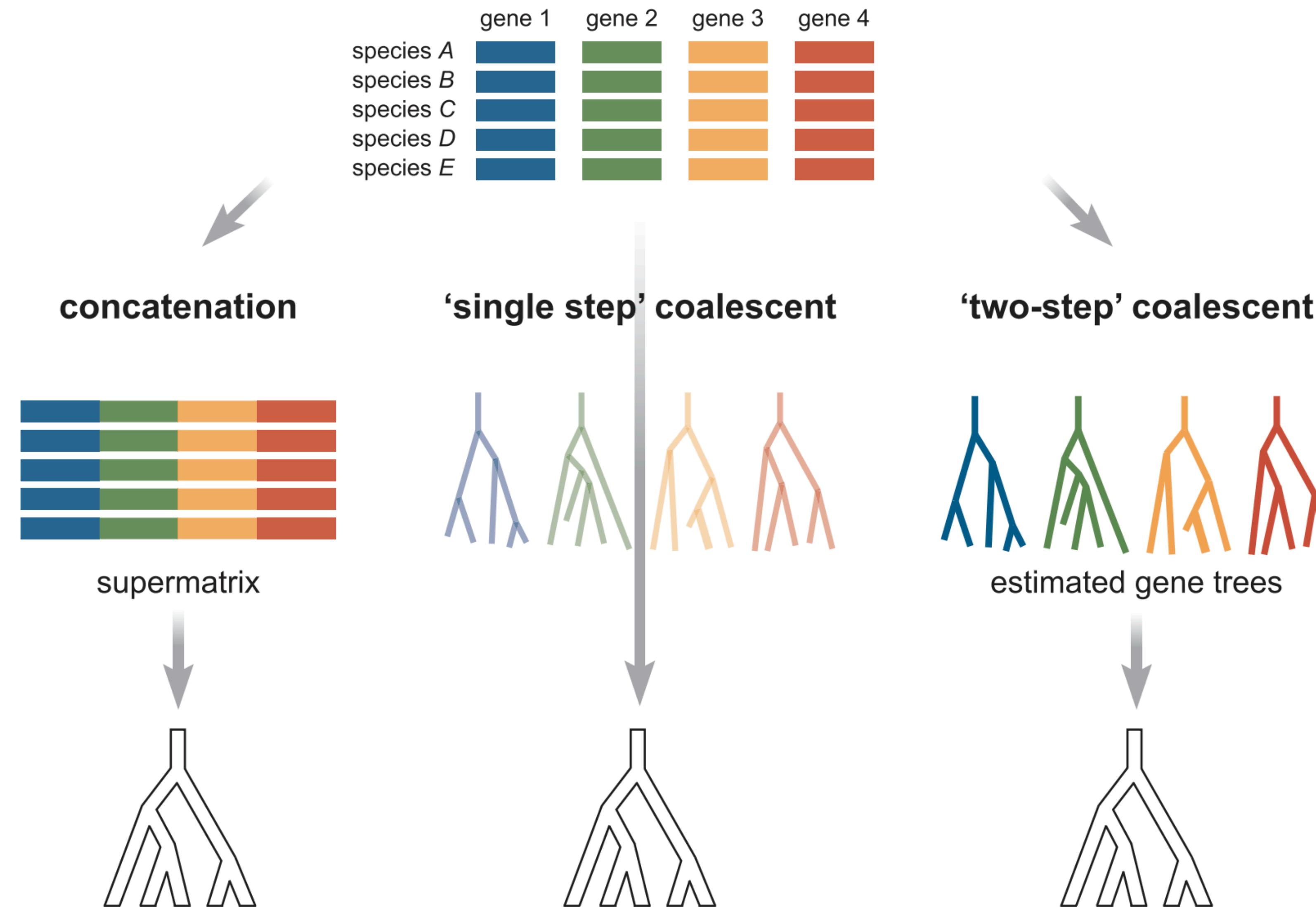
# Major methods in phylogenomics



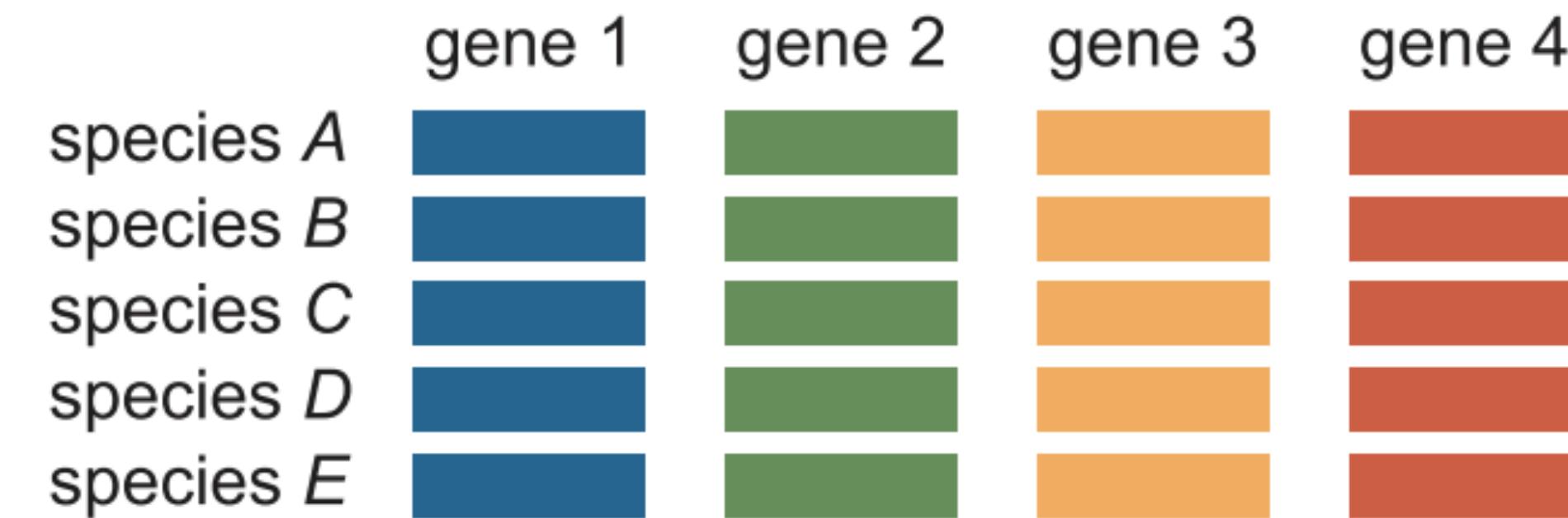
# Major methods in phylogenomics



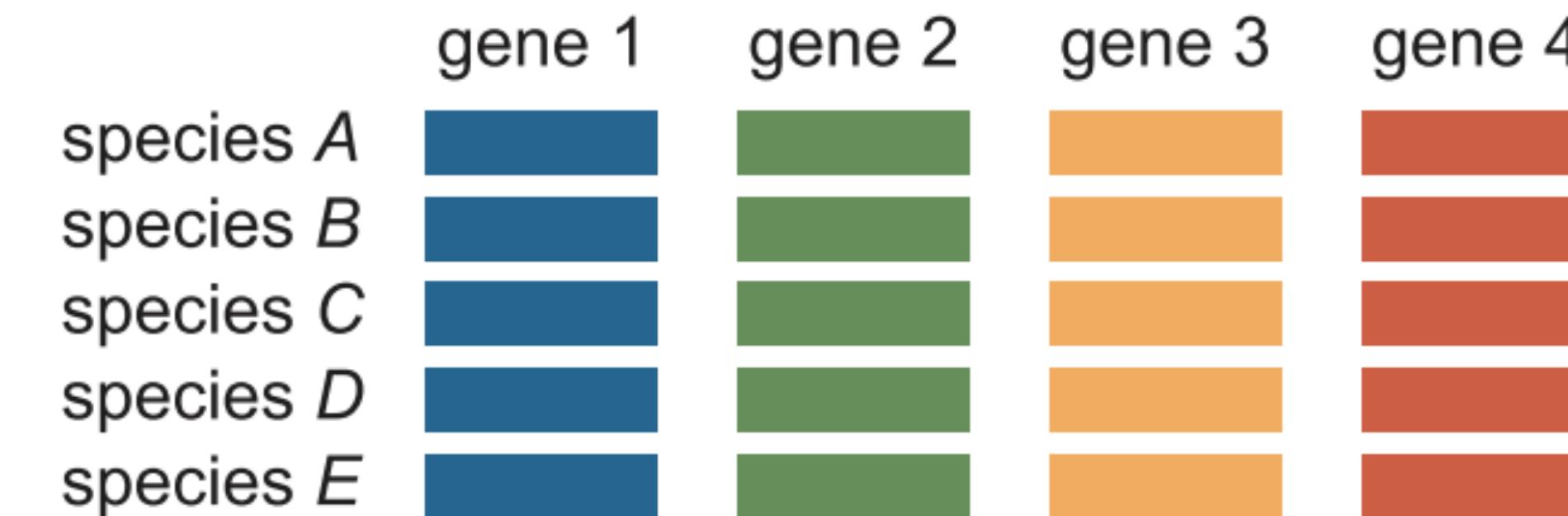
# Major methods in phylogenomics



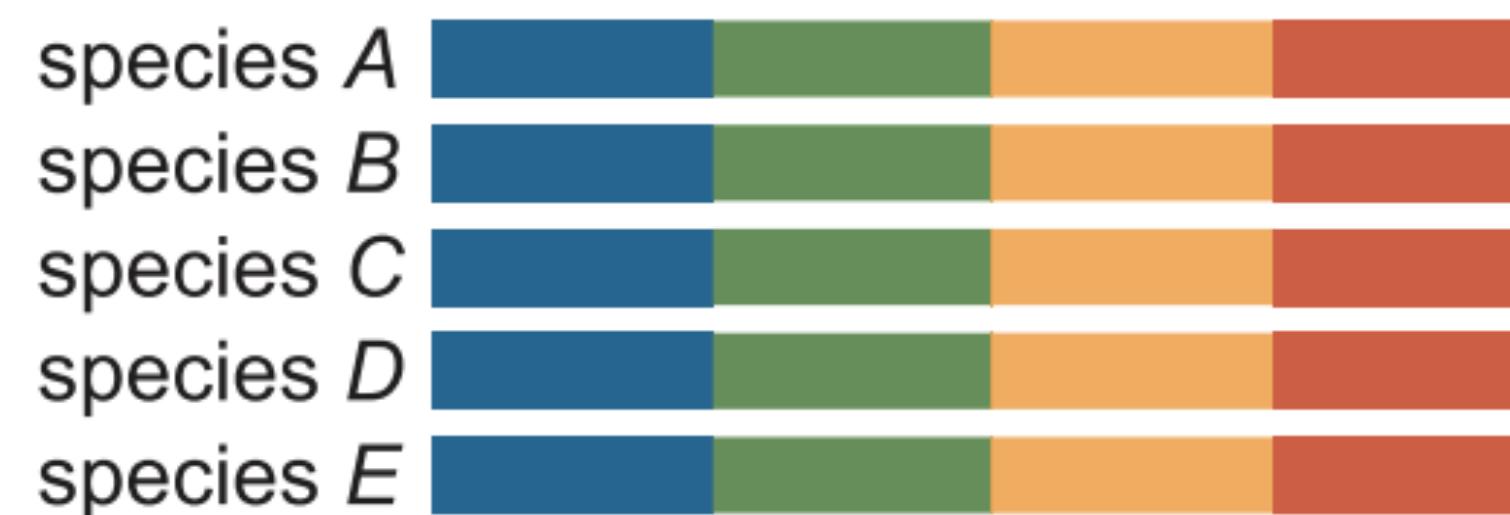
# Major methods in phylogenomics



# Major methods in phylogenomics



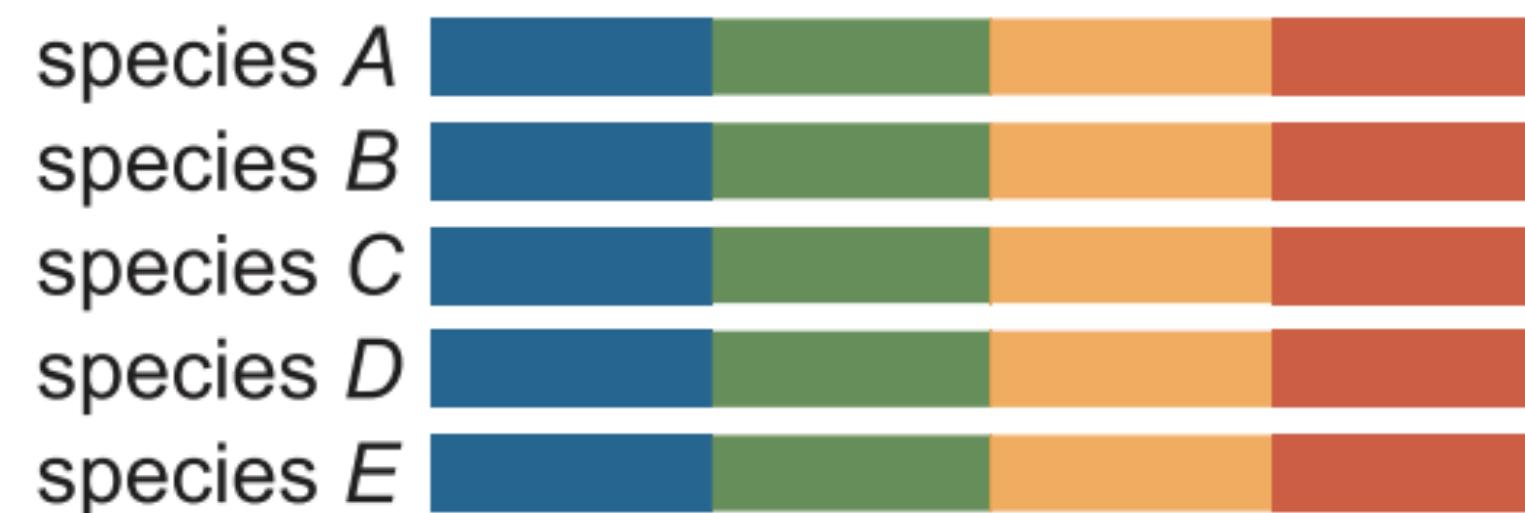
**concatenation**



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# The partition file summarizes gene boundaries

## concatenation



## Model, Partition ID = start and stop boundaries

Model, Blue = 1-481

Model, Green = 482-1054

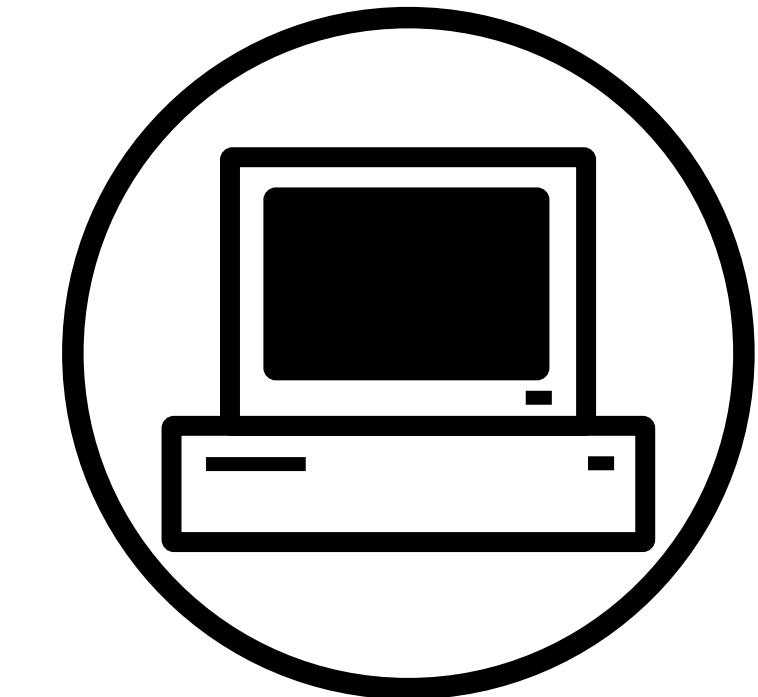
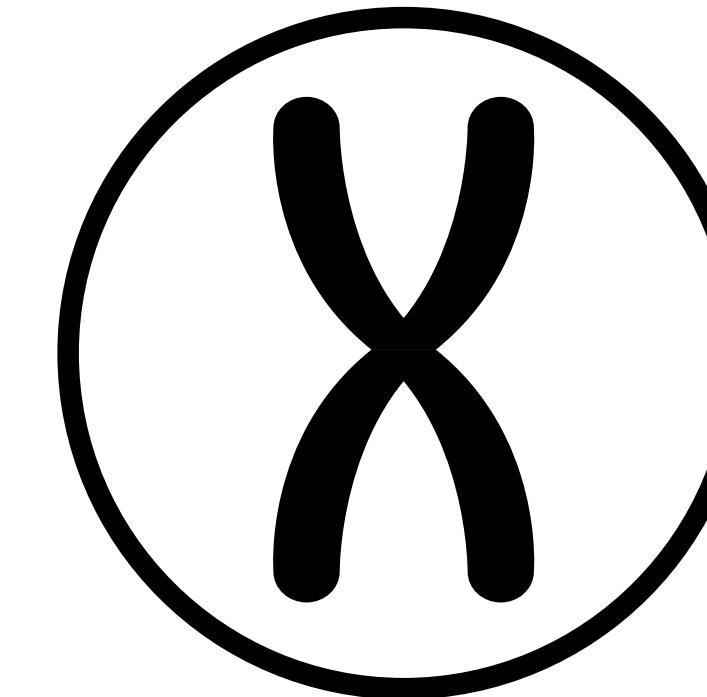
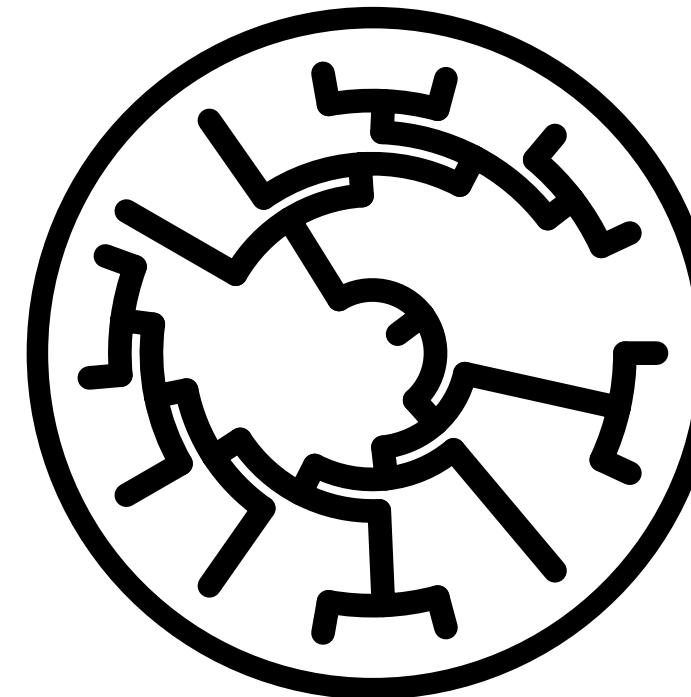
Model, Yellow = 1055-1492

Model, Red = 1493-1918



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# Outline



- Major methods in phylogenomics
- **Substitution models, in (very) brief**
- Methods to concatenate sequences
- Phylogenomic subsampling



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# Models can be applied to varying portions of the matrix

## Site-homogeneous model

Taxon 1	.....
Taxon 2	.....
Taxon 3	.....
Taxon 4	.....

# Models can be applied to varying portions of the matrix

## Site-homogeneous model

Taxon 1	.....
Taxon 2	.....
Taxon 3	.....
Taxon 4	.....

## Site-homogeneous with partitioning

Taxon 1	.....	.....	.....
Taxon 2	.....	.....	.....
Taxon 3	.....	.....	.....
Taxon 4	.....	.....	.....

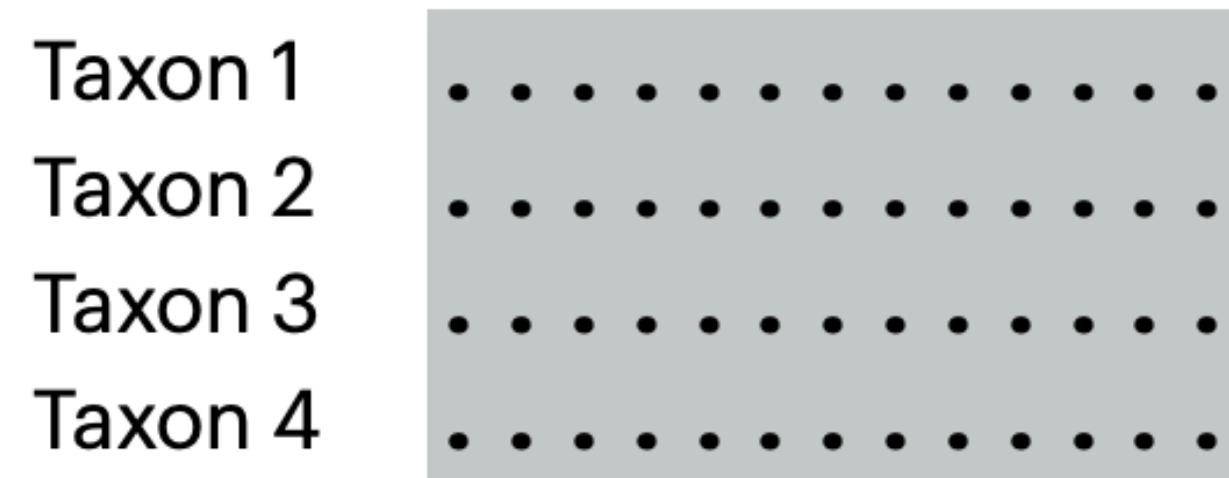
Partitions can be genes  
or algorithmically defined



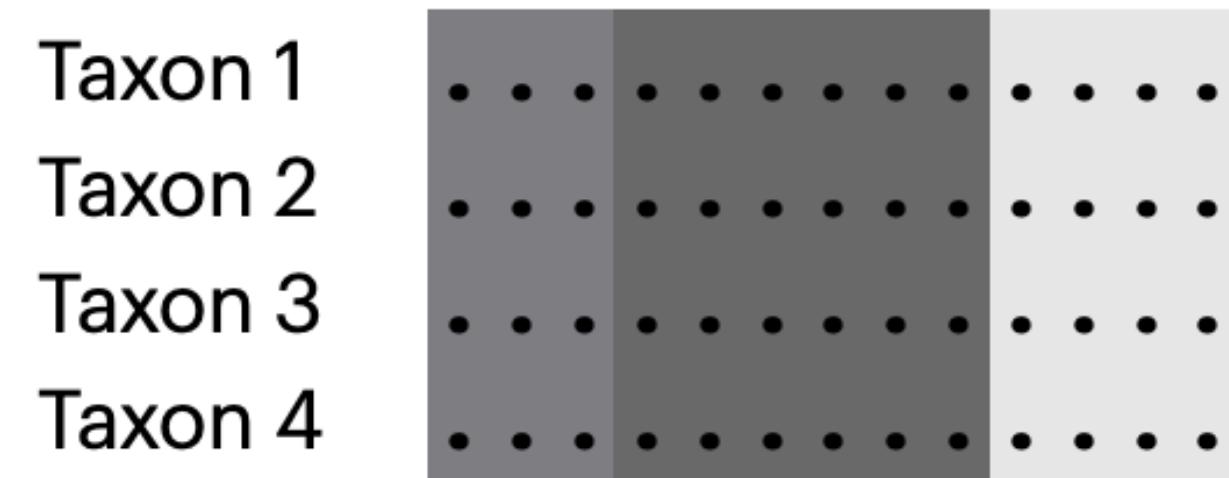
@JLSteenwyk

# Models can be applied to varying portions of the matrix

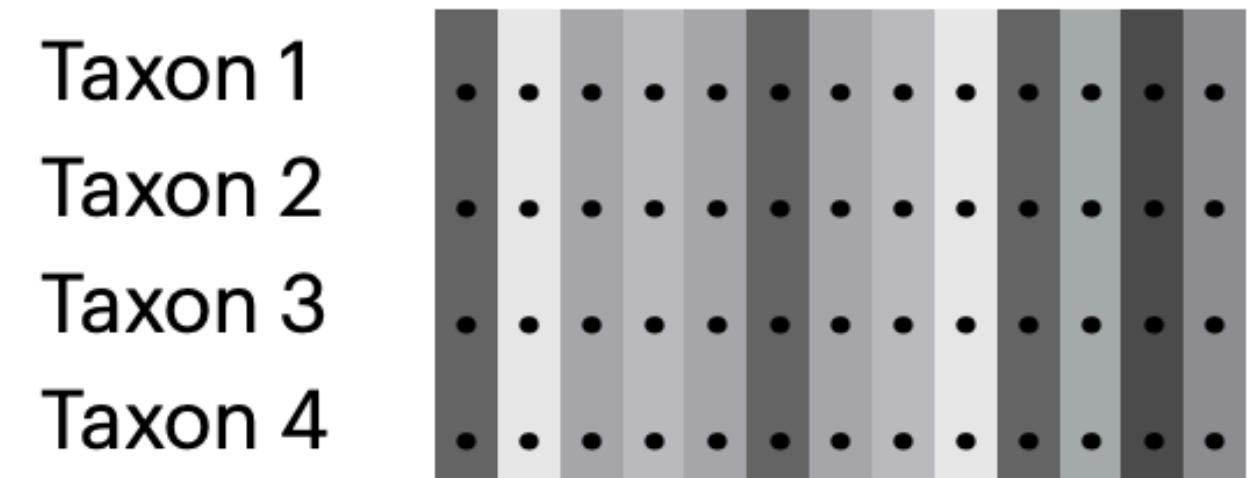
**Site-homogeneous model**



**Site-homogeneous with partitioning**



**Site-heterogeneous model**



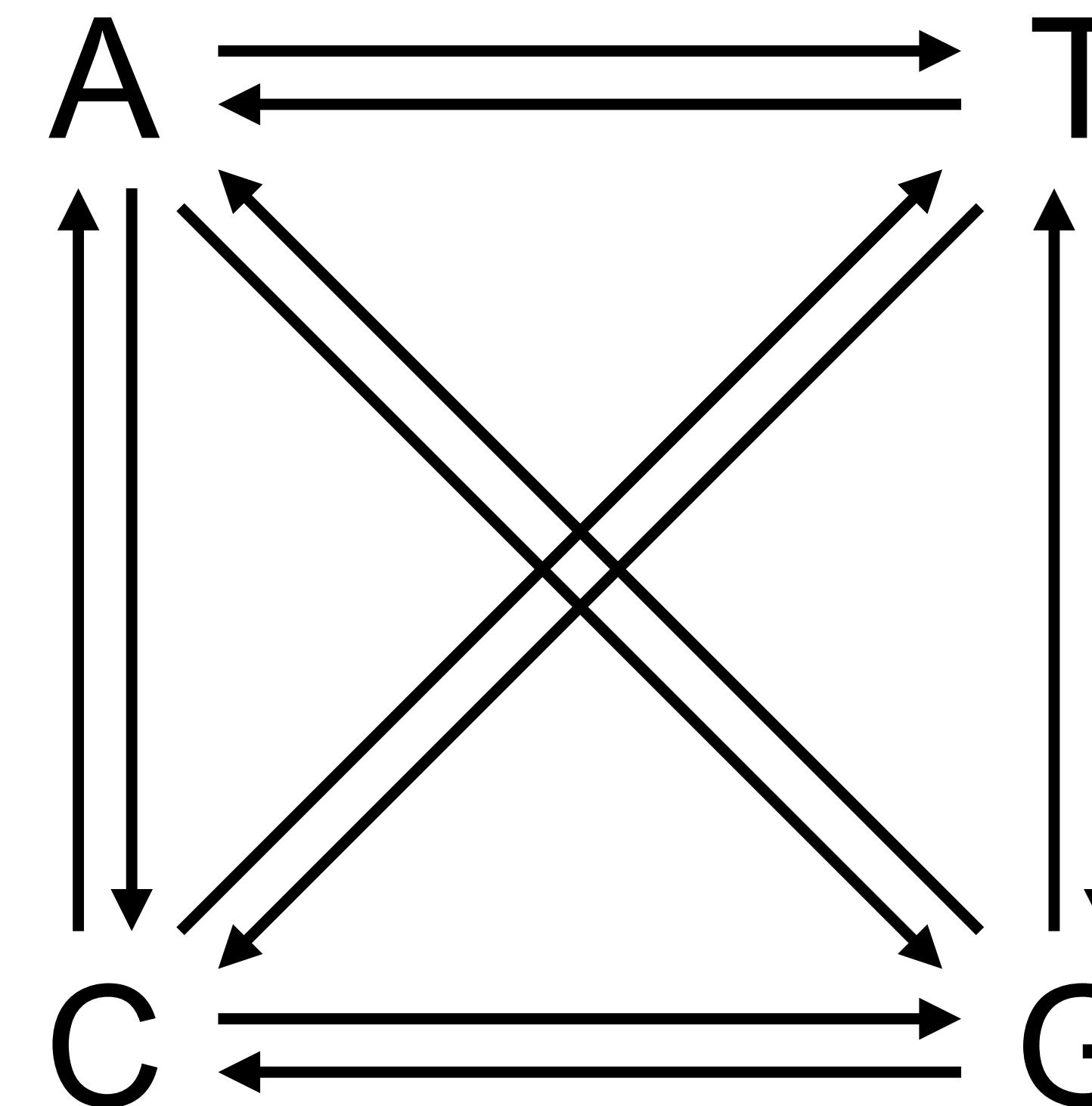
Partitions can be genes  
or algorithmically defined



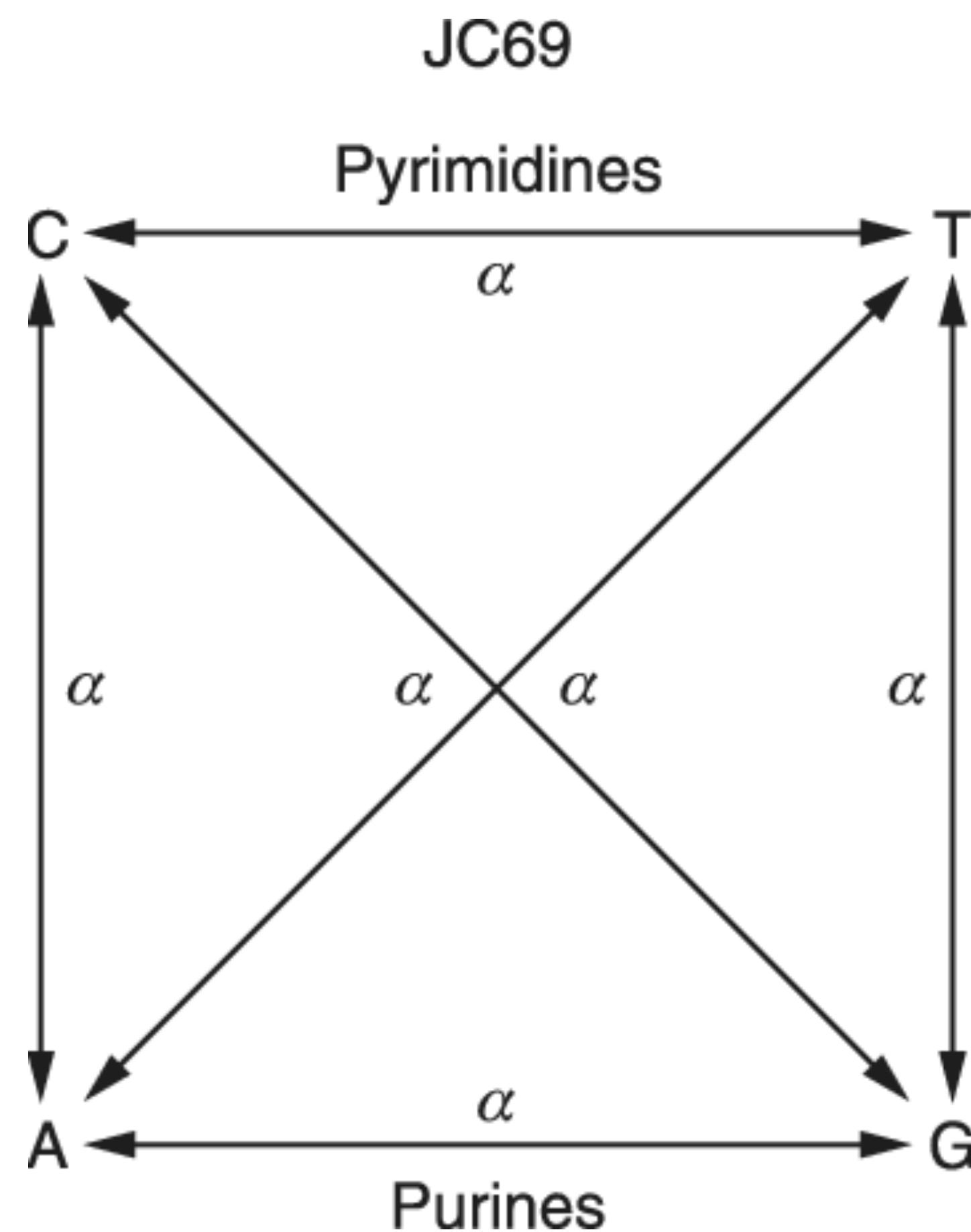
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# A (very) brief mention of substitution models

Markov models that describe rates of nucleotide or amino acid substitutions in a locus during evolution

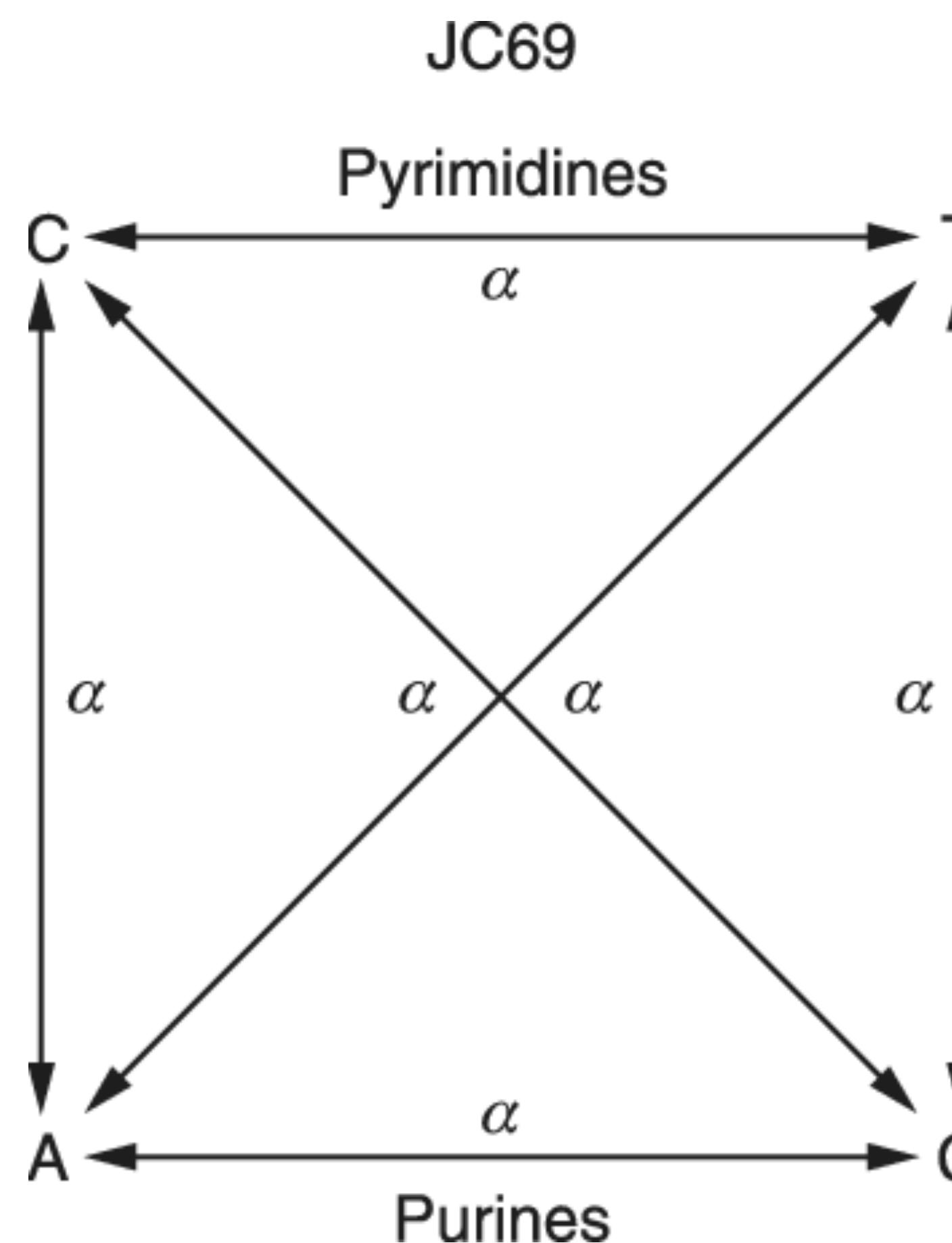


# The simplest model: Jukes Cantor

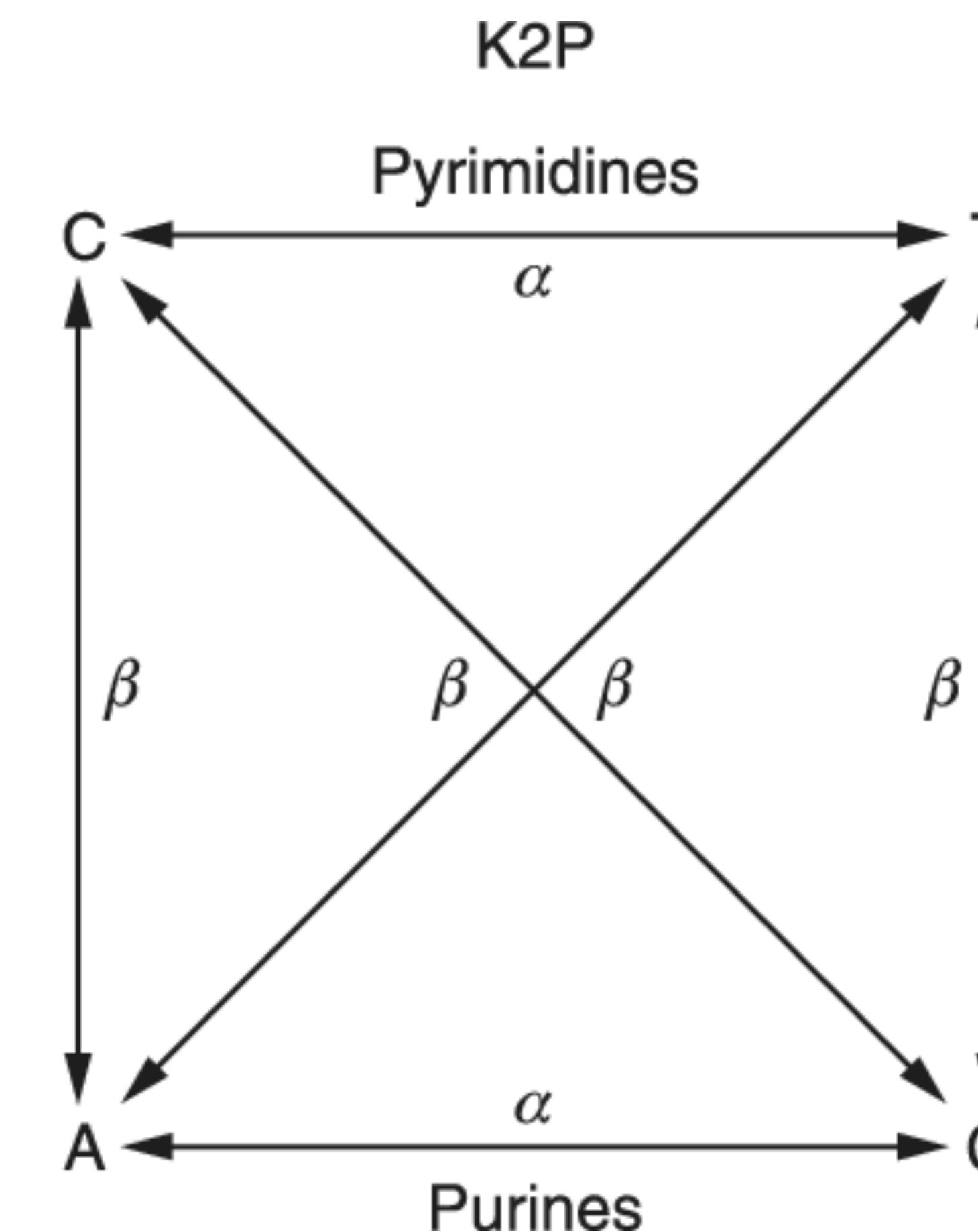


Equal substitution rates  
& equal base frequencies

# The slightly complex model: K2P



Equal substitution rates  
& equal base frequencies



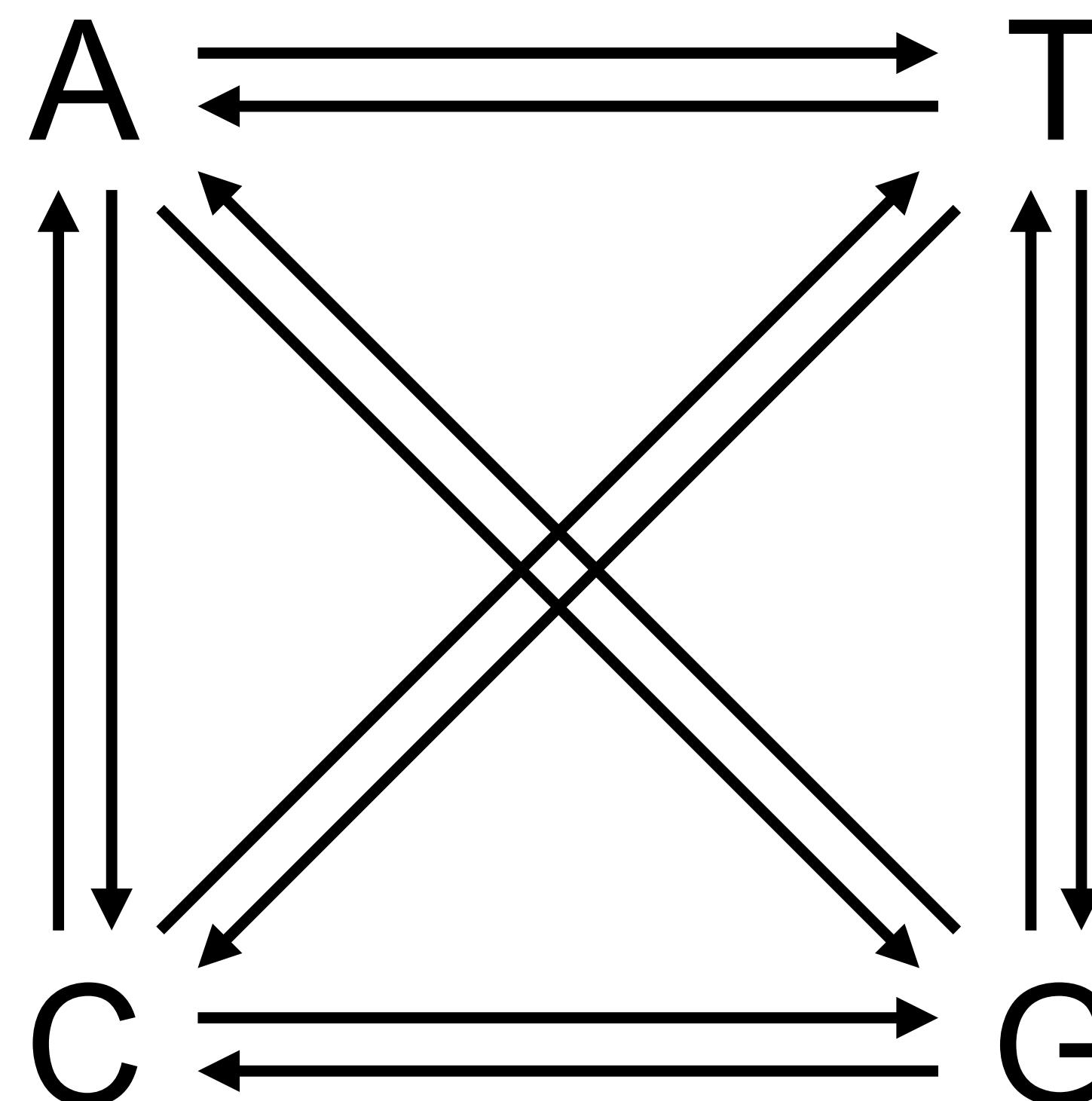
Unequal transition/transversion  
rates and equal base freq.



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# The most complex model: GTR

General time reversible model  
with unequal rates and unequal base freq.



# IQ-TREE docs has great explanations

IQ-TREE

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Web server ▾

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Workshop

About

## Protein models

<http://www.iqtree.org/doc/Substitution-Models>

### Amino-acid exchange rate matrices

IQ-TREE supports all common empirical amino-acid exchange rate matrices (alphabetical order):

Model	Region	Explanation
Blosum62	nuclear	BLOcks SUbsitution Matrix ( <a href="#">Henikoff and Henikoff, 1992</a> ). Note that <code>BL0SUM62</code> is not recommended for phylogenetic analysis as it was designed mainly for sequence alignments.
cpREV	chloroplast	chloroplast matrix ( <a href="#">Adachi et al., 2000</a> ).
Dayhoff	nuclear	General matrix ( <a href="#">Dayhoff et al., 1978</a> ).
DCMut	nuclear	Revised <code>Dayhoff</code> matrix ( <a href="#">Kosiol and Goldman, 2005</a> ).
FLAVI	viral	Flavivirus ( <a href="#">Le and Vinh, 2020</a> ).
FLU	viral	Influenza virus ( <a href="#">Dang et al., 2010</a> ).
		General time reversible models with 190 rate parameters. <i>WARNING: Be careful!</i>



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# Models can be applied to varying portions of the matrix

## Site-homogeneous model

Taxon 1	.....
Taxon 2	.....
Taxon 3	.....
Taxon 4	.....

## Site-homogeneous with partitioning

Taxon 1	.....	.....	.....
Taxon 2	.....	.....	.....
Taxon 3	.....	.....	.....
Taxon 4	.....	.....	.....

## Site-heterogeneous model

Taxon 1	.....	.....	.....	.....	.....	.....	.....
Taxon 2	.....	.....	.....	.....	.....	.....	.....
Taxon 3	.....	.....	.....	.....	.....	.....	.....
Taxon 4	.....	.....	.....	.....	.....	.....	.....

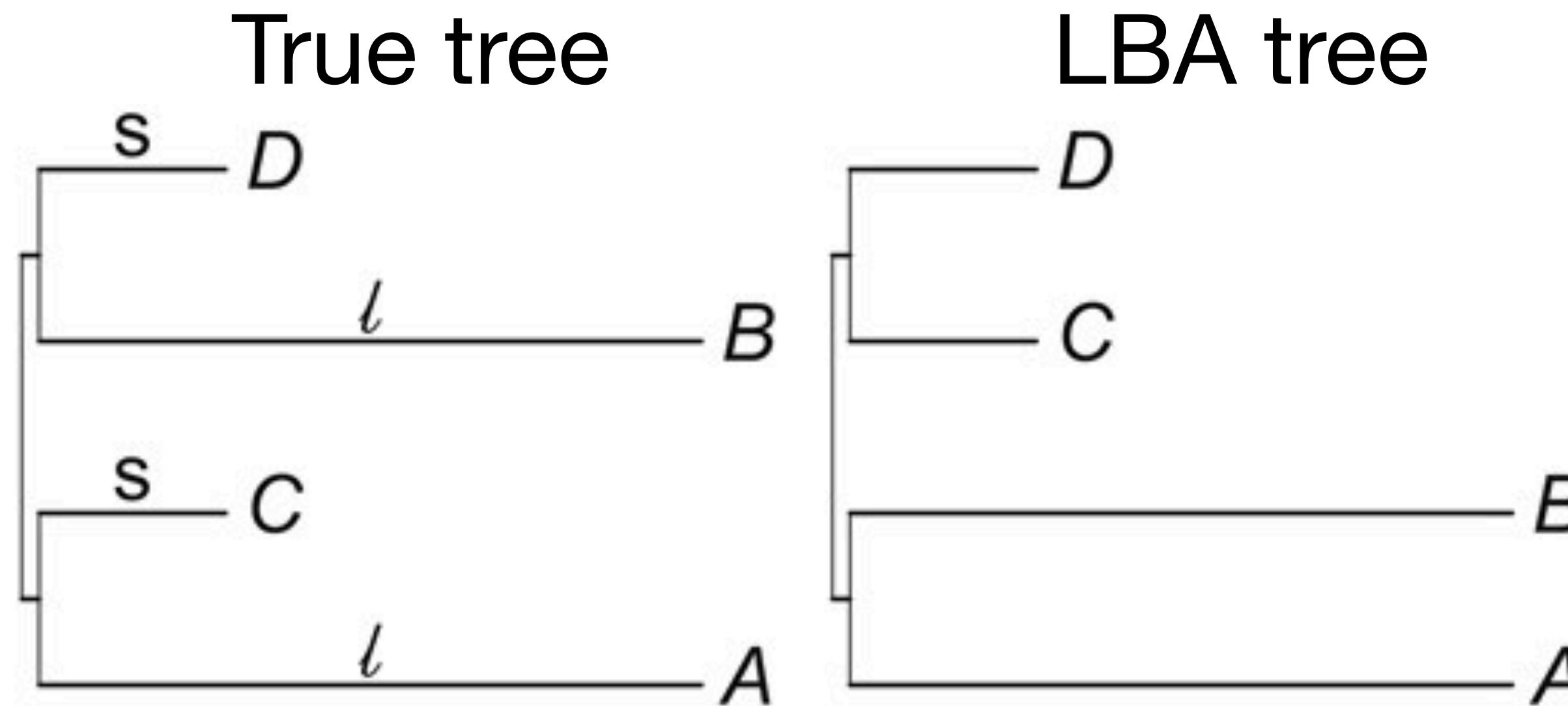
Partitions can be genes  
or algorithmically defined



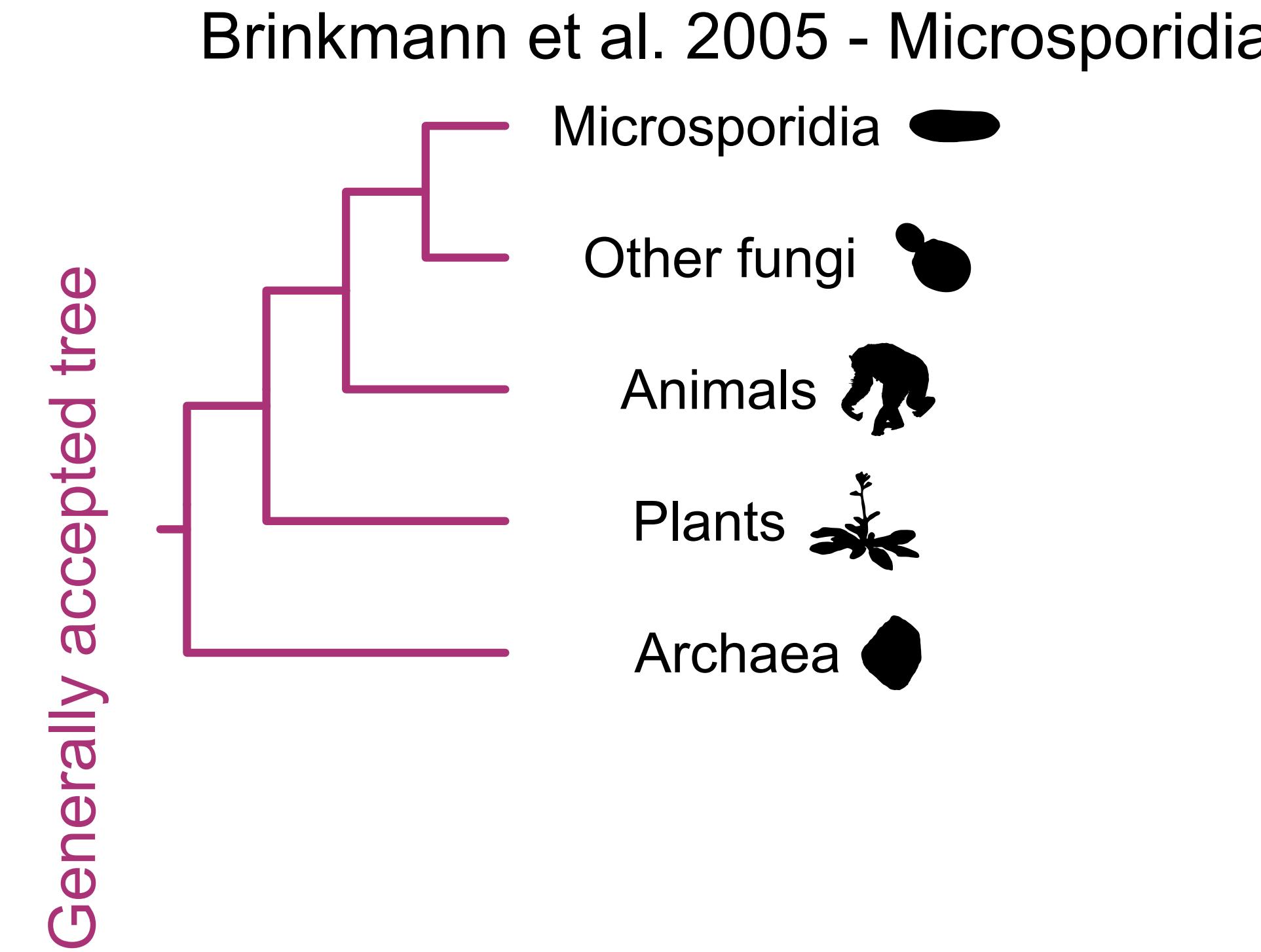
@JLSteenwyk

# What drives LBA?

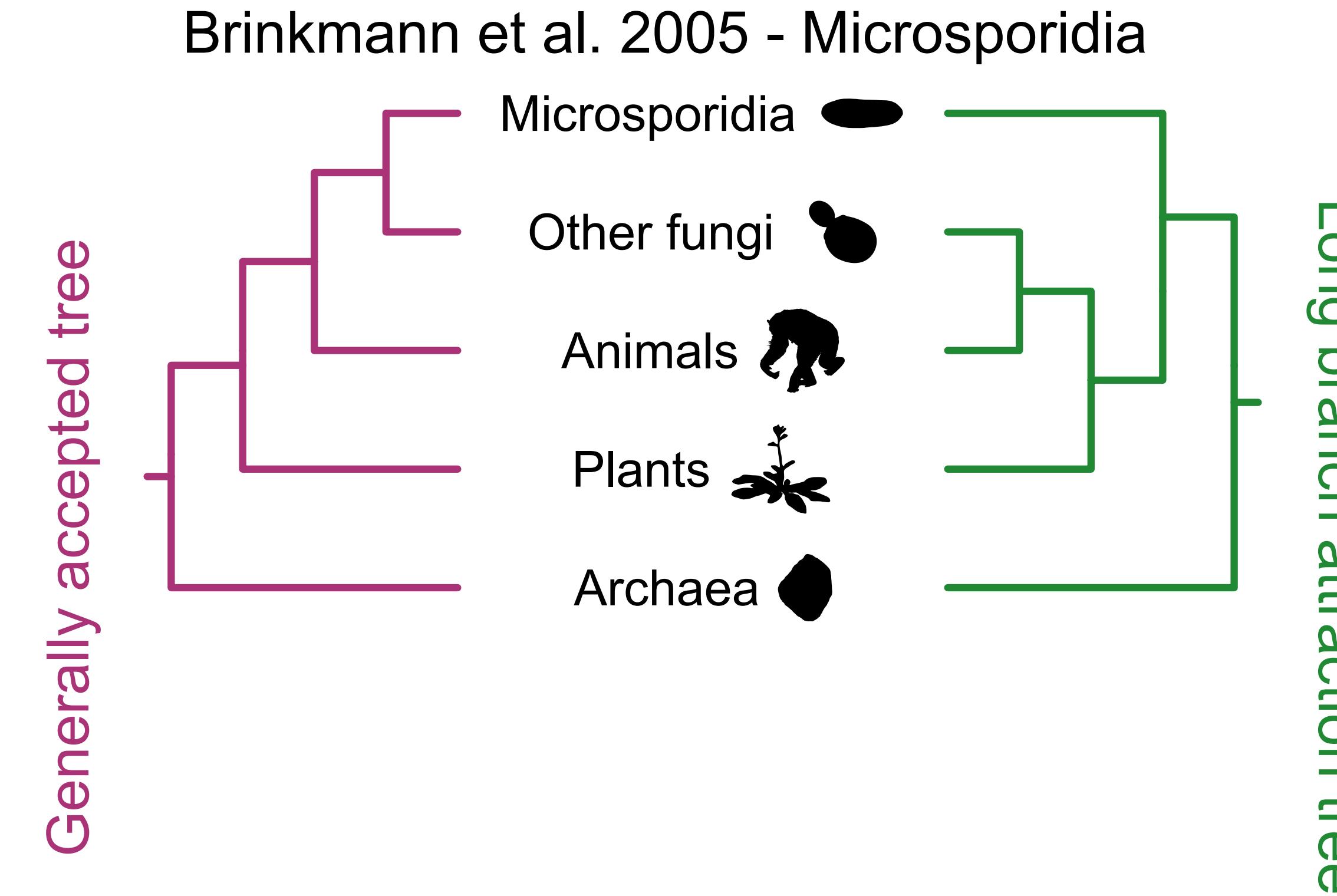
when divergent taxa or clades with long branch lengths (i.e., many character changes occurring over time) are inferred as each other's closest relative due to convergent evolution of a given character (e.g., amino acid substitution)



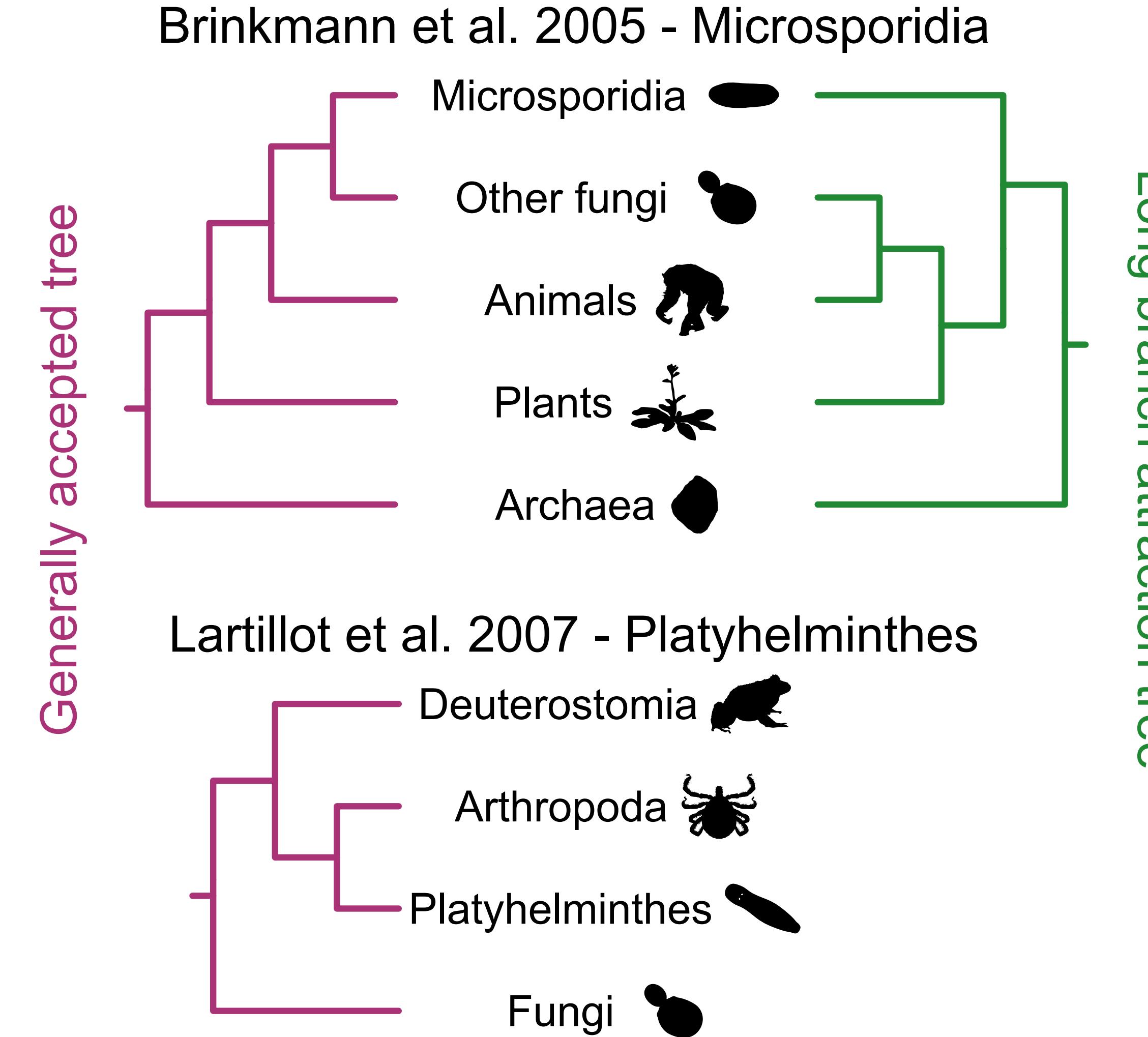
# Microsporidia are early diverging fungi



# Long-branch attraction can result in an erroneous tree

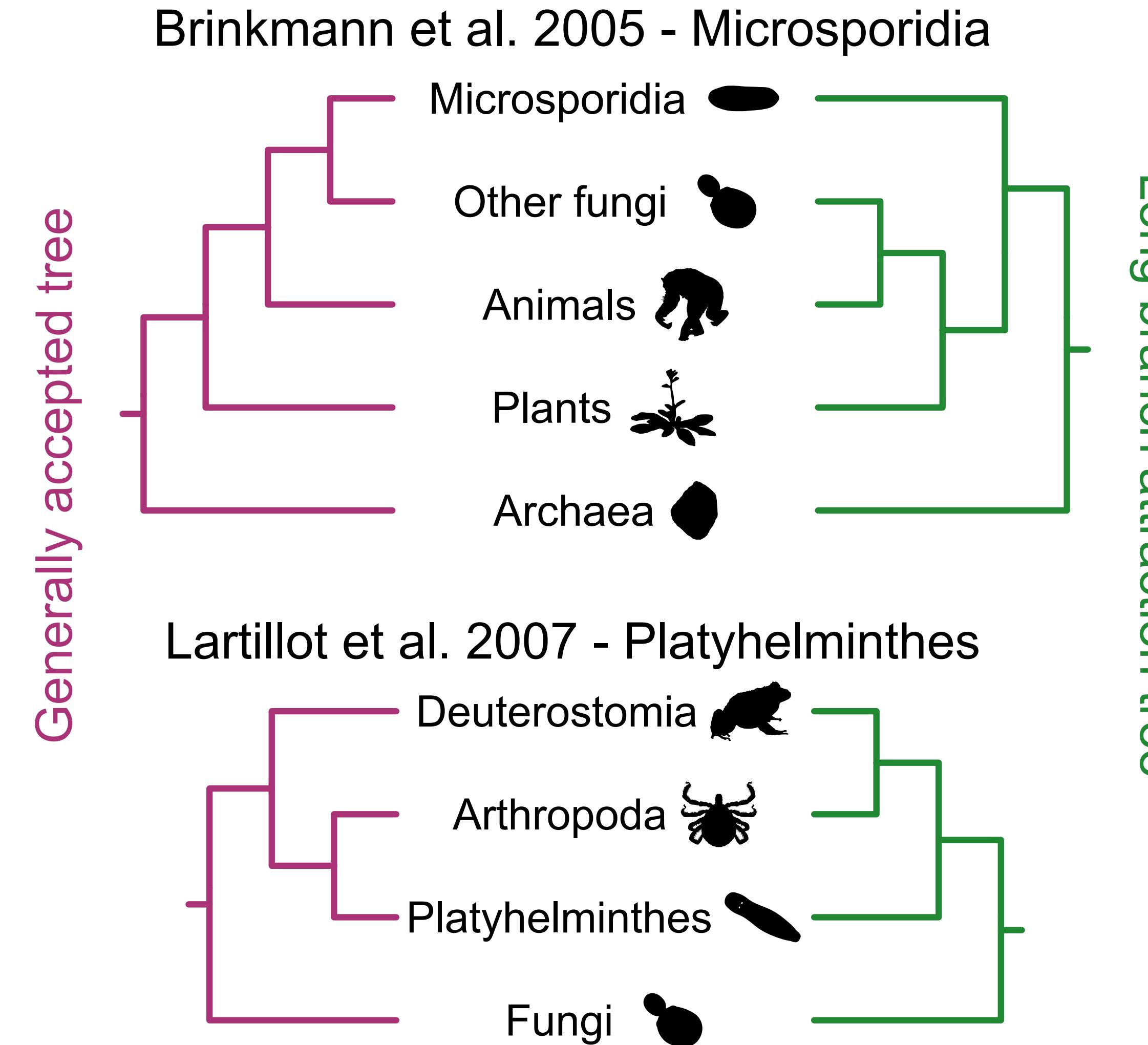


# Platyhelminthes are sister to arthropods

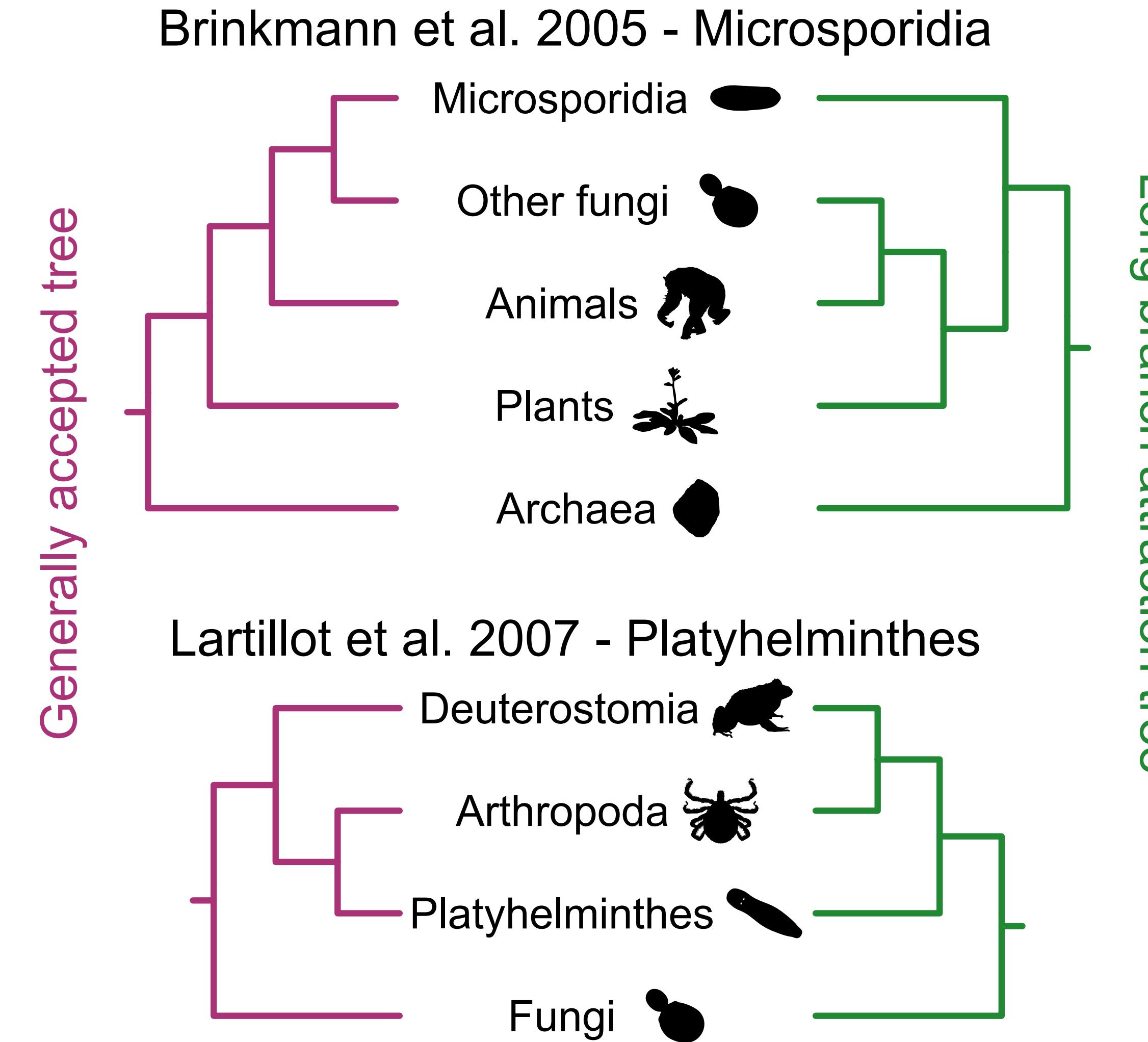


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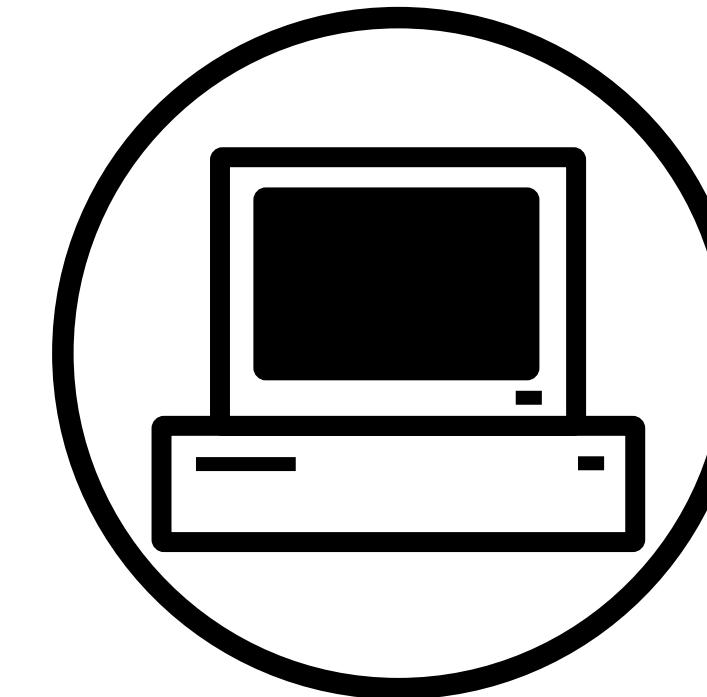
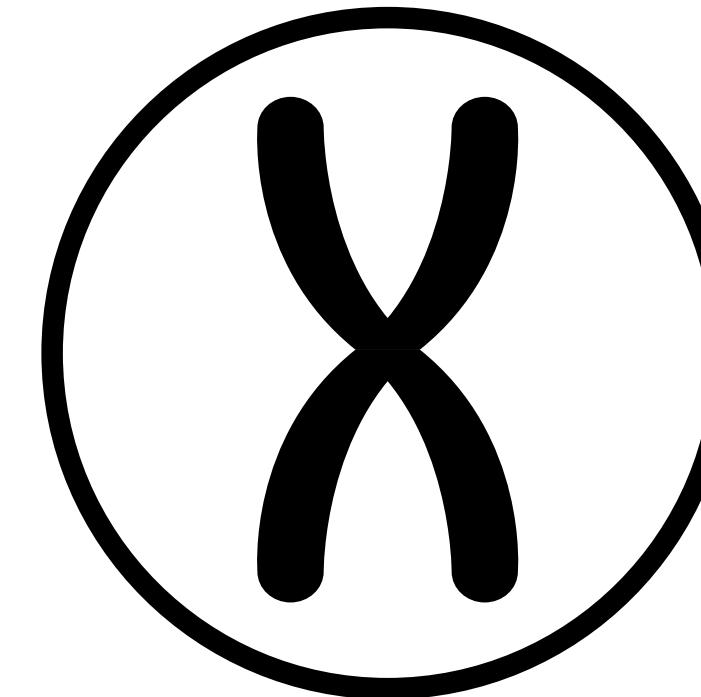
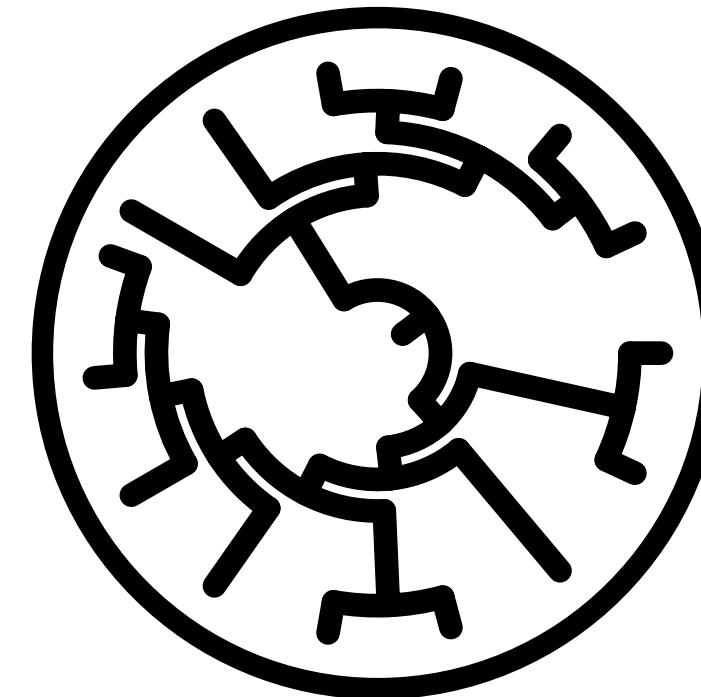
# LBA can lead to an erroneous tree



# Site-heterogeneous models can overcome LBA



# Outline



- Major methods in phylogenomics
- Substitution models, in (very) brief
- **Methods to concatenate sequences**
- Phylogenomic subsampling

# Methods to concatenate sequences

# Methods to concatenate sequences

## Manual

- That is, by hand



@JLSteenwyk

# Methods to concatenate sequences

## Manual

- That is, by hand....*but why???*



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# Methods to concatenate sequences

## Manual

- That is, by hand....*but why???*

## GUI (Graphical User Interface)

- SequenceMatrix

<https://onlinelibrary.wiley.com/doi/abs/10.1111/j.1096-0031.2010.00329.x>

- CONCATENATOR

<https://onlinelibrary.wiley.com/doi/abs/10.1111/j.1755-0998.2008.02164.x>



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# Methods to concatenate sequences

## Manual

- That is, by hand....*but why???*

## GUI (Graphical User Interface)

- SequenceMatrix

<https://onlinelibrary.wiley.com/doi/abs/10.1111/j.1096-0031.2010.00329.x>

- CONCATENATOR

<https://onlinelibrary.wiley.com/doi/abs/10.1111/j.1755-0998.2008.02164.x>

## Command-line

- PhyKIT

<https://jlsteenwyk.com/PhyKIT/>

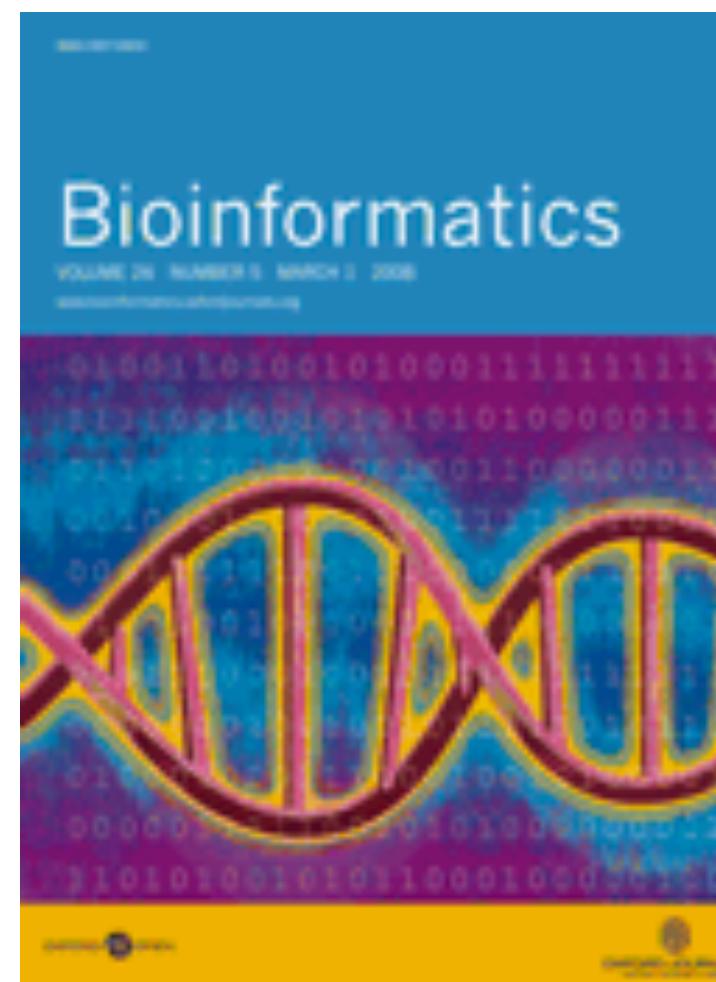
- FASconCAT-G

<https://www.ncbi.nlm.nih.gov/pmc/articles/PMC4243772/>



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# Two main programs used in the practical

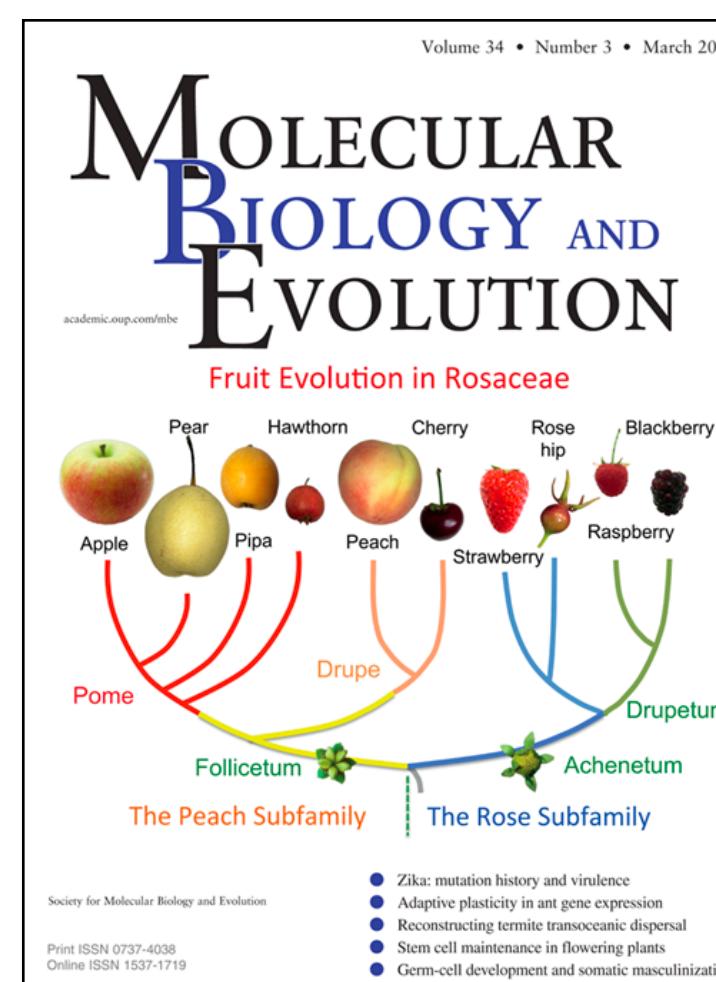


## PhyKIT: a broadly applicable UNIX shell toolkit for processing and analyzing phylogenomic data FREE

Jacob L Steenwyk ✉, Thomas J Buida, III, Abigail L Labella, Yuanning Li, Xing-Xing Shen, Antonis Rokas ✉

*Bioinformatics*, Volume 37, Issue 16, August 2021, Pages 2325–2331,  
<https://doi.org/10.1093/bioinformatics/btab096>

**Published:** 09 February 2021    **Article history ▾**



## IQ-TREE 2: New Models and Efficient Methods for Phylogenetic Inference in the Genomic Era ⓘ

Bui Quang Minh ✉, Heiko A Schmidt, Olga Chernomor, Dominik Schrempf, Michael D Woodhams, Arndt von Haeseler, Robert Lanfear    Author Notes

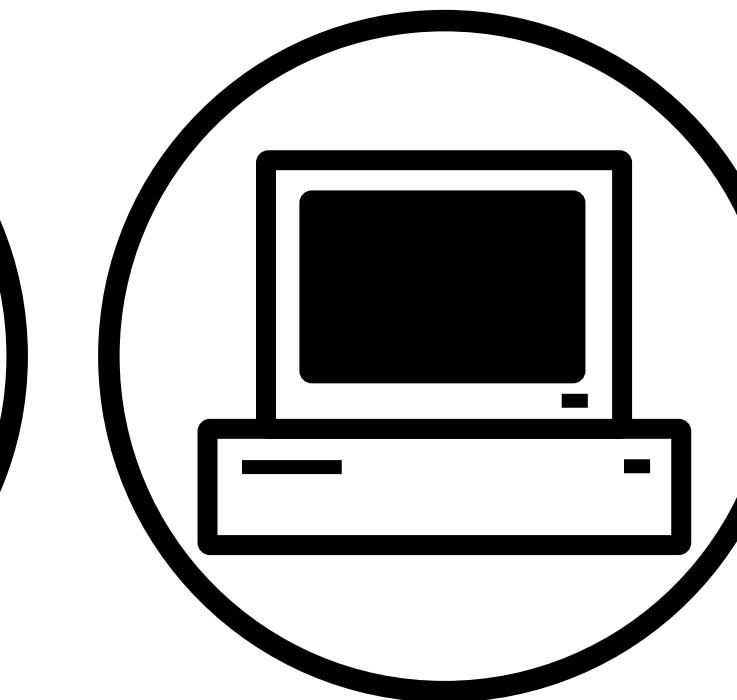
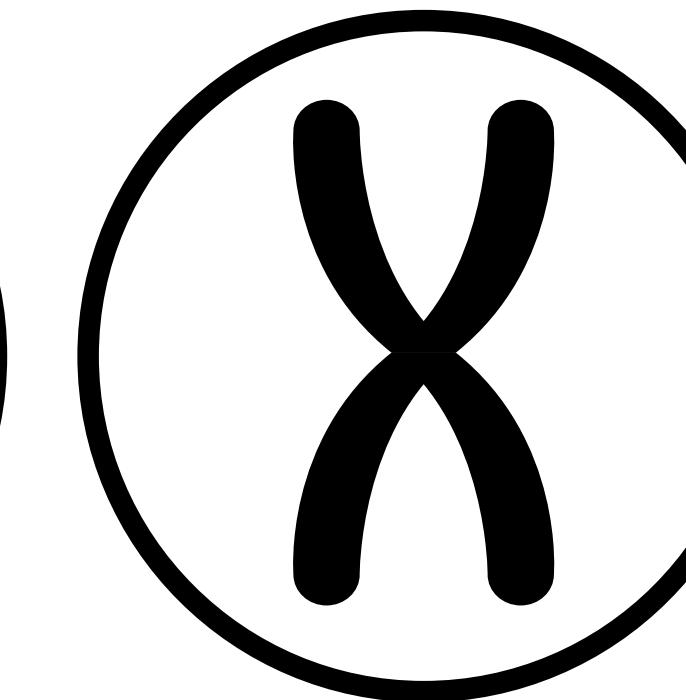
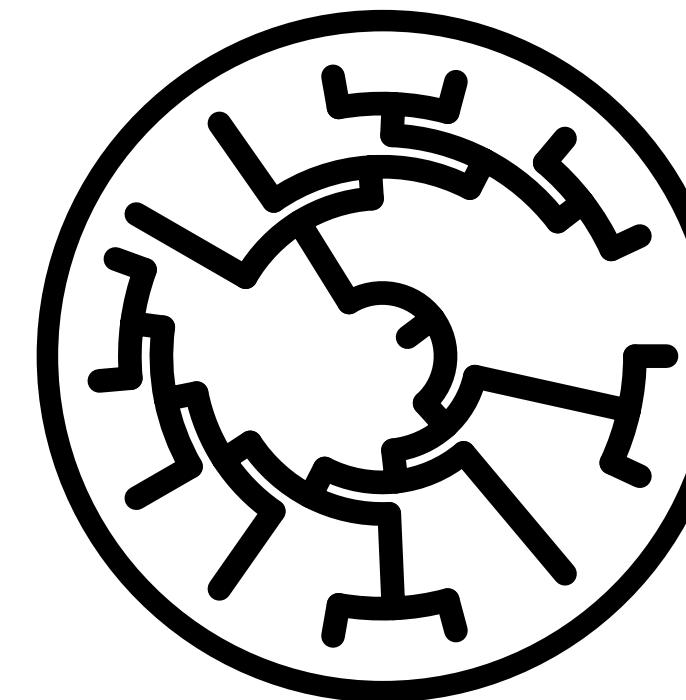
*Molecular Biology and Evolution*, Volume 37, Issue 5, May 2020, Pages 1530–1534,  
<https://doi.org/10.1093/molbev/msaa015>

**Published:** 03 February 2020



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# Outline



- Major methods in phylogenomics
- Substitution models, in (very) brief
- Methods to concatenate sequences
- **Phylogenomic subsampling**

# Phylogenomic subsampling, in brief



@JLSteenwyk

# Phylogenomic subsampling, in brief

1. Unstable bipartitions will be sensitive to gene selection



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# Phylogenomic subsampling, in brief

1. Unstable bipartitions will be sensitive to gene selection
2. Subsample the full data matrix and reinfer the species tree using fewer (but typically still several dozen to hundreds of genes)



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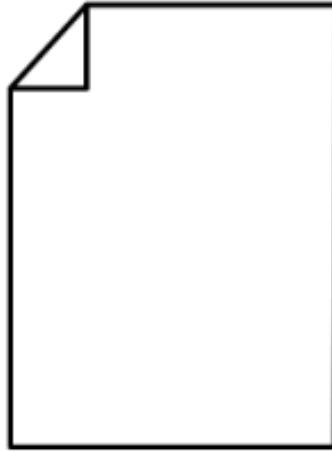
# Phylogenomic subsampling, in brief

1. Unstable bipartitions will be sensitive to gene selection
2. Subsample the full data matrix and reinfer the species tree using fewer (but typically still several dozen to hundreds of genes)
3. Compare resulting phylogenies and determine which bipartition are unstable

# Phylogenomic subsampling, in brief

1. Unstable bipartitions will be sensitive to gene selection
2. Subsample the full data matrix and reinfer the species tree using fewer (but typically still several dozen to hundreds of genes)
3. Compare resulting phylogenies and determine which bipartition are unstable
4. Examine potential drivers of incongruence thereafter.  
Incongruence will be examined in a later lab

# Phylogenetic subsampling

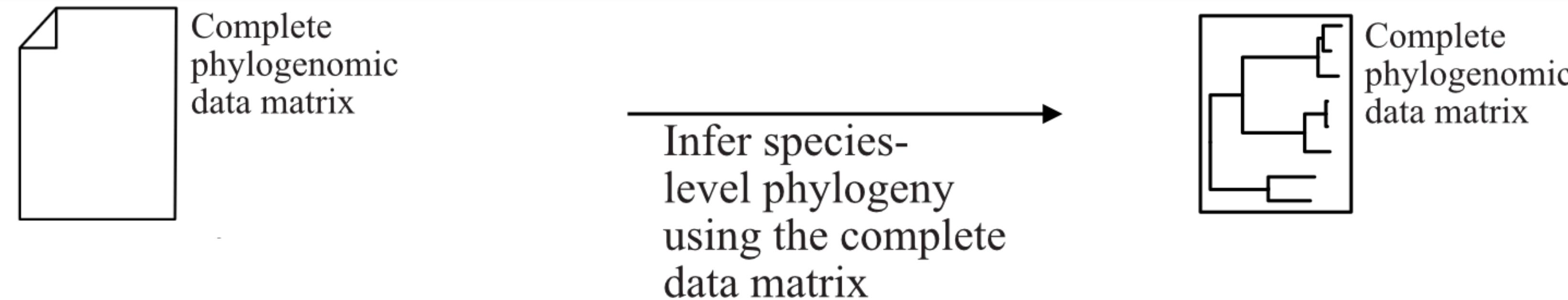


Complete  
phylogenomic  
data matrix

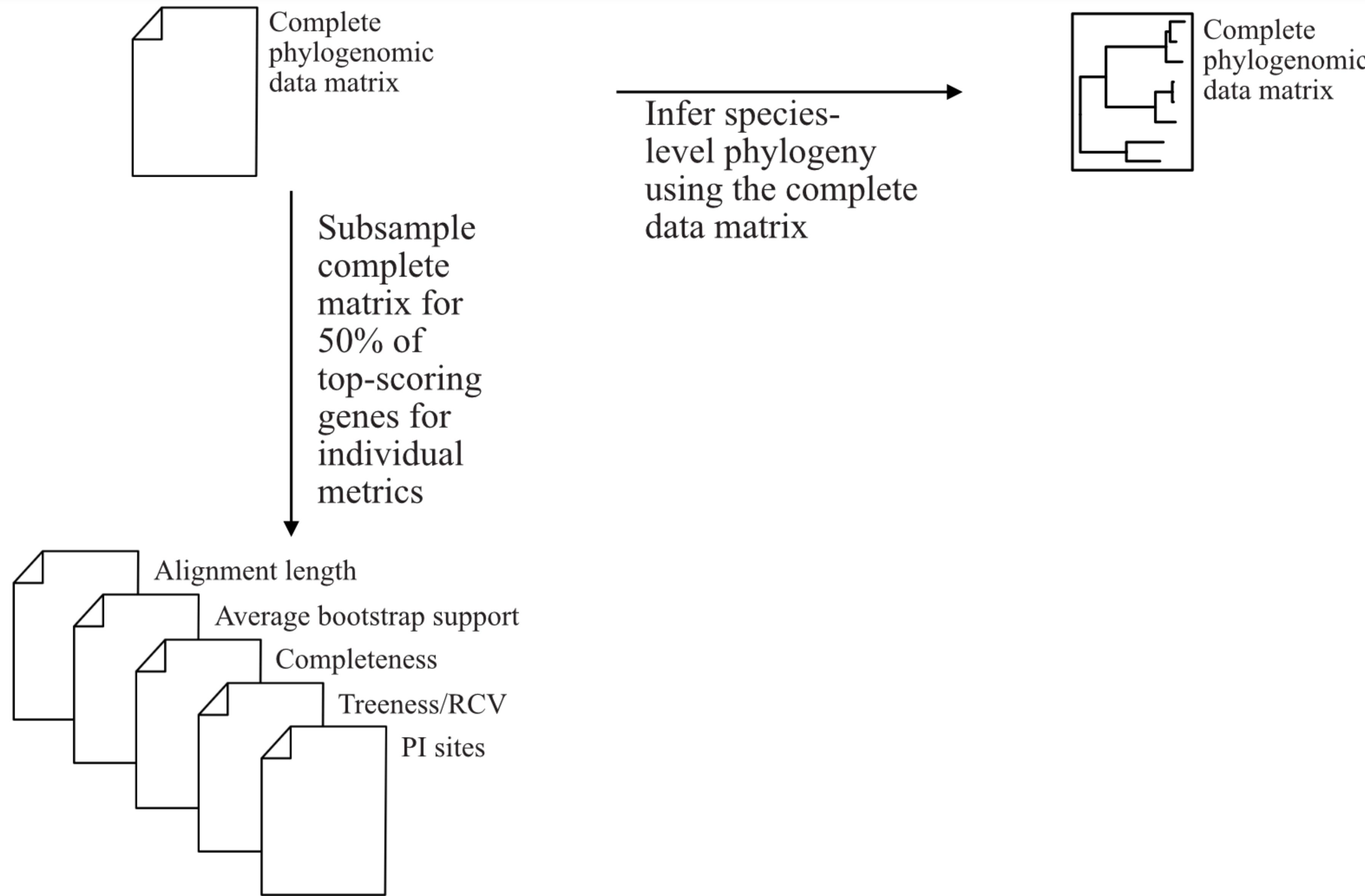


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# Phylogenetic subsampling

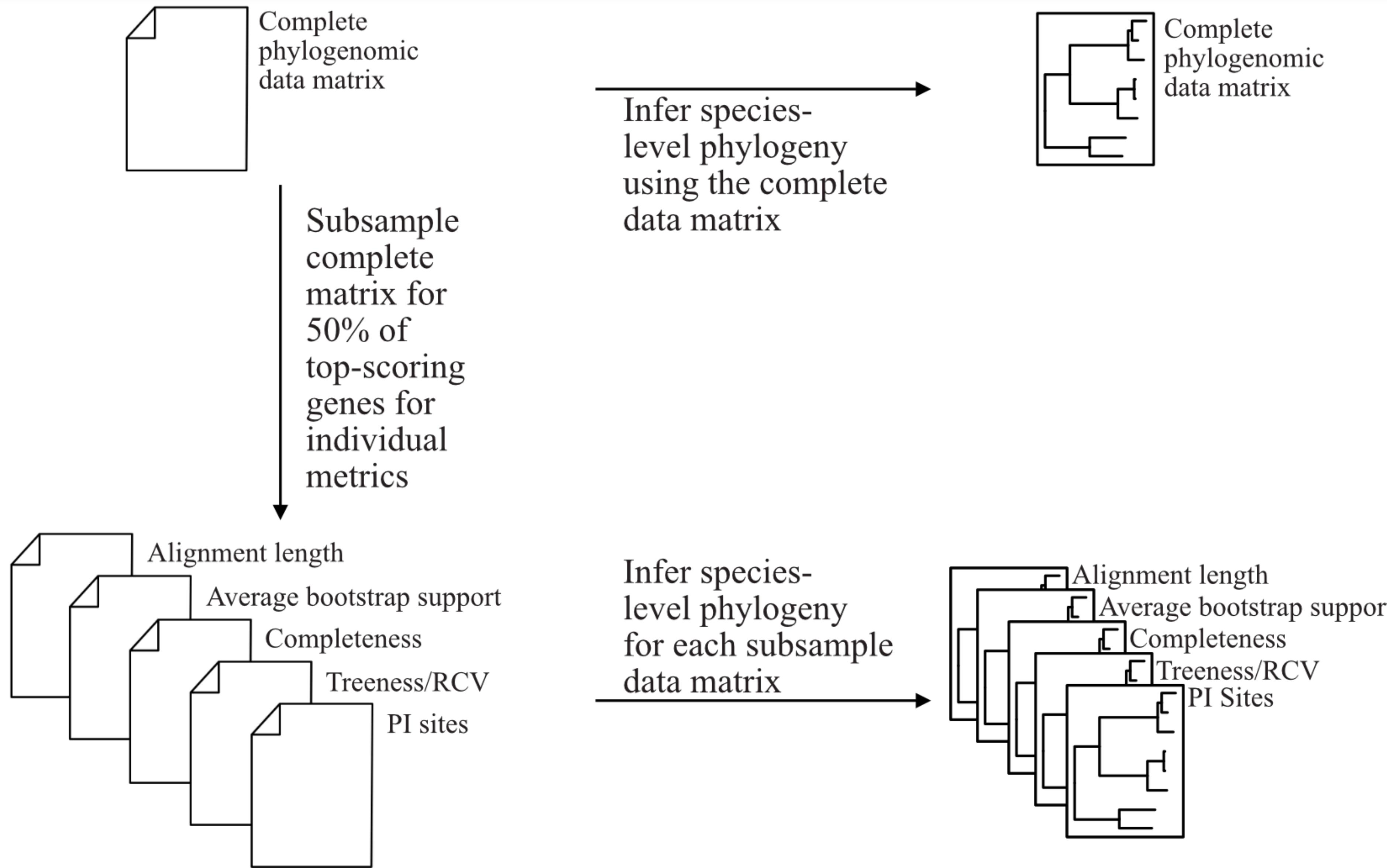


# Phylogenetic subsampling



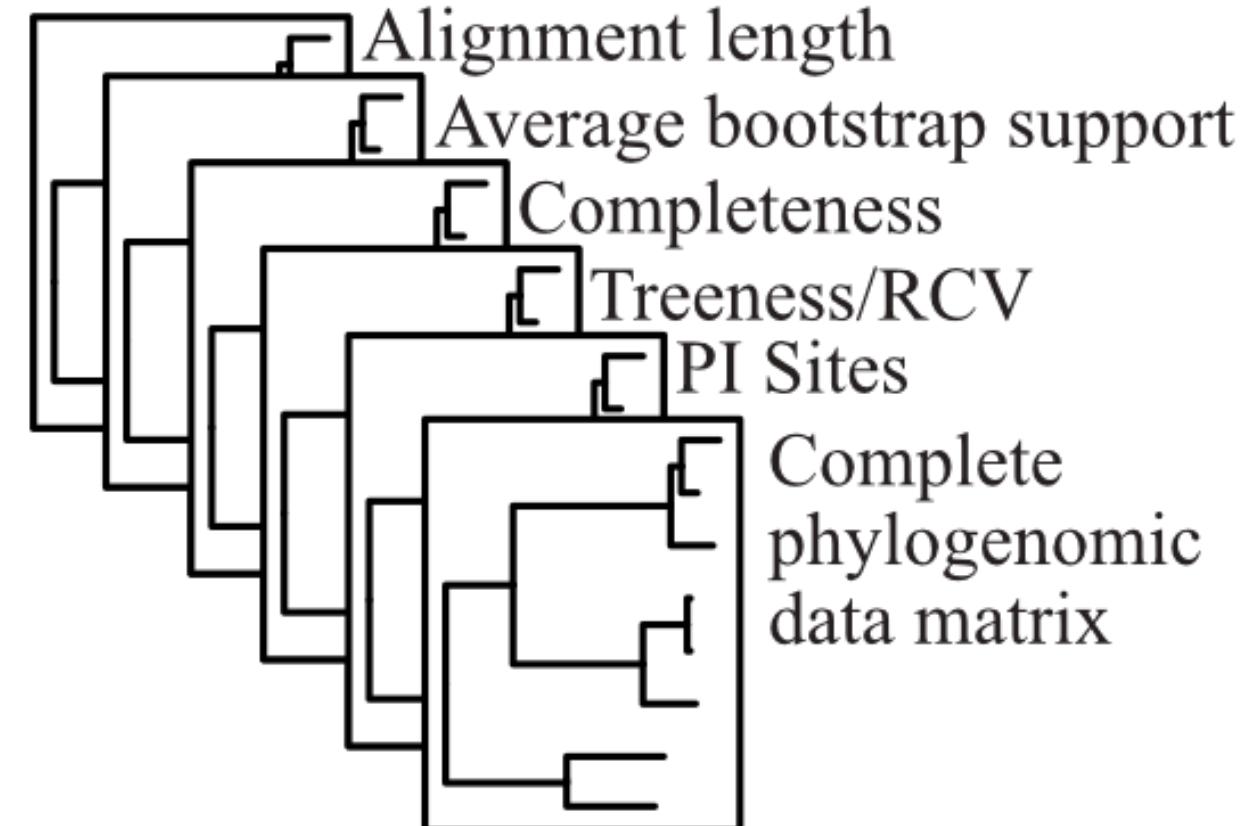
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# Phylogenetic subsampling

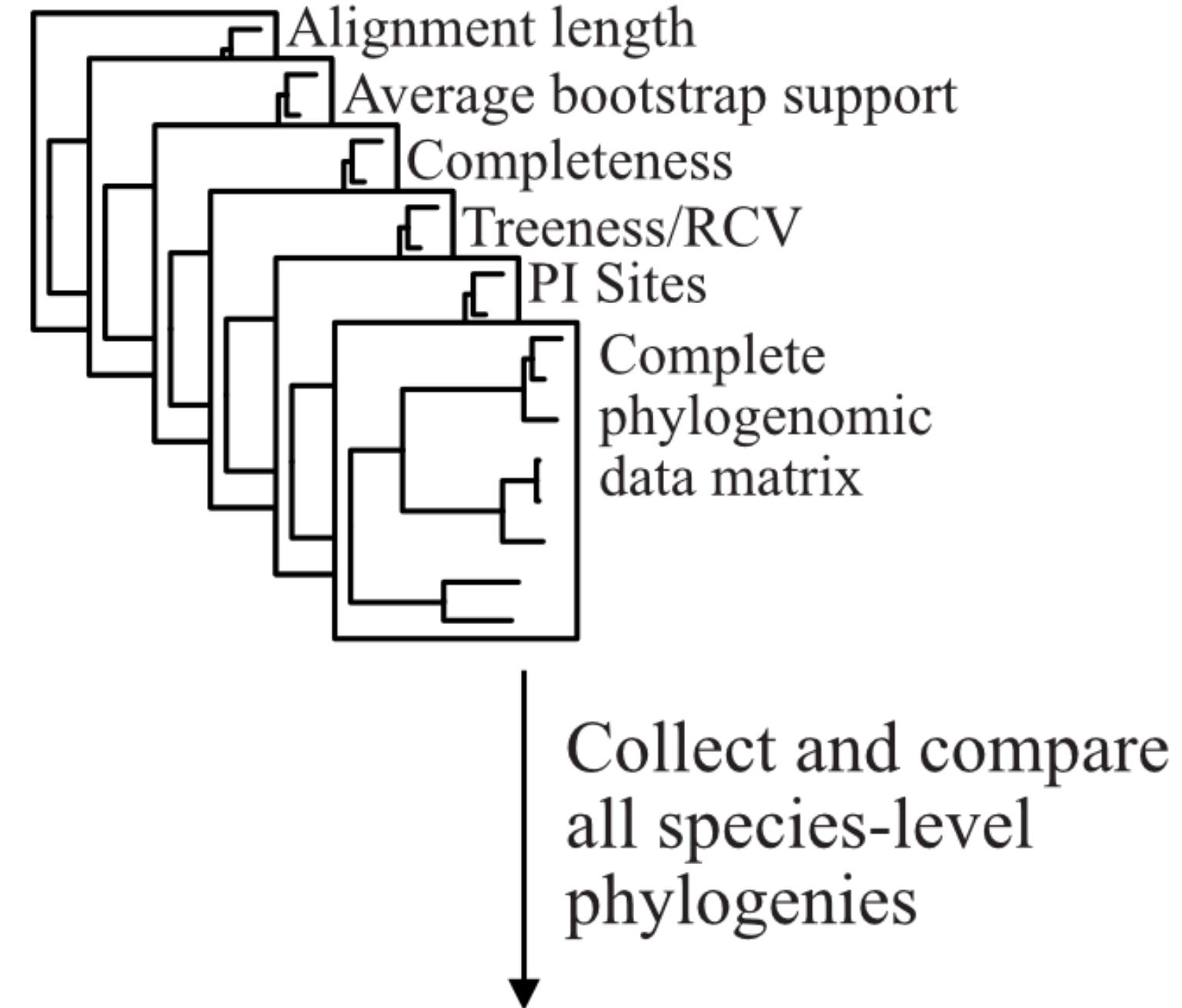


@JLSteenwyk

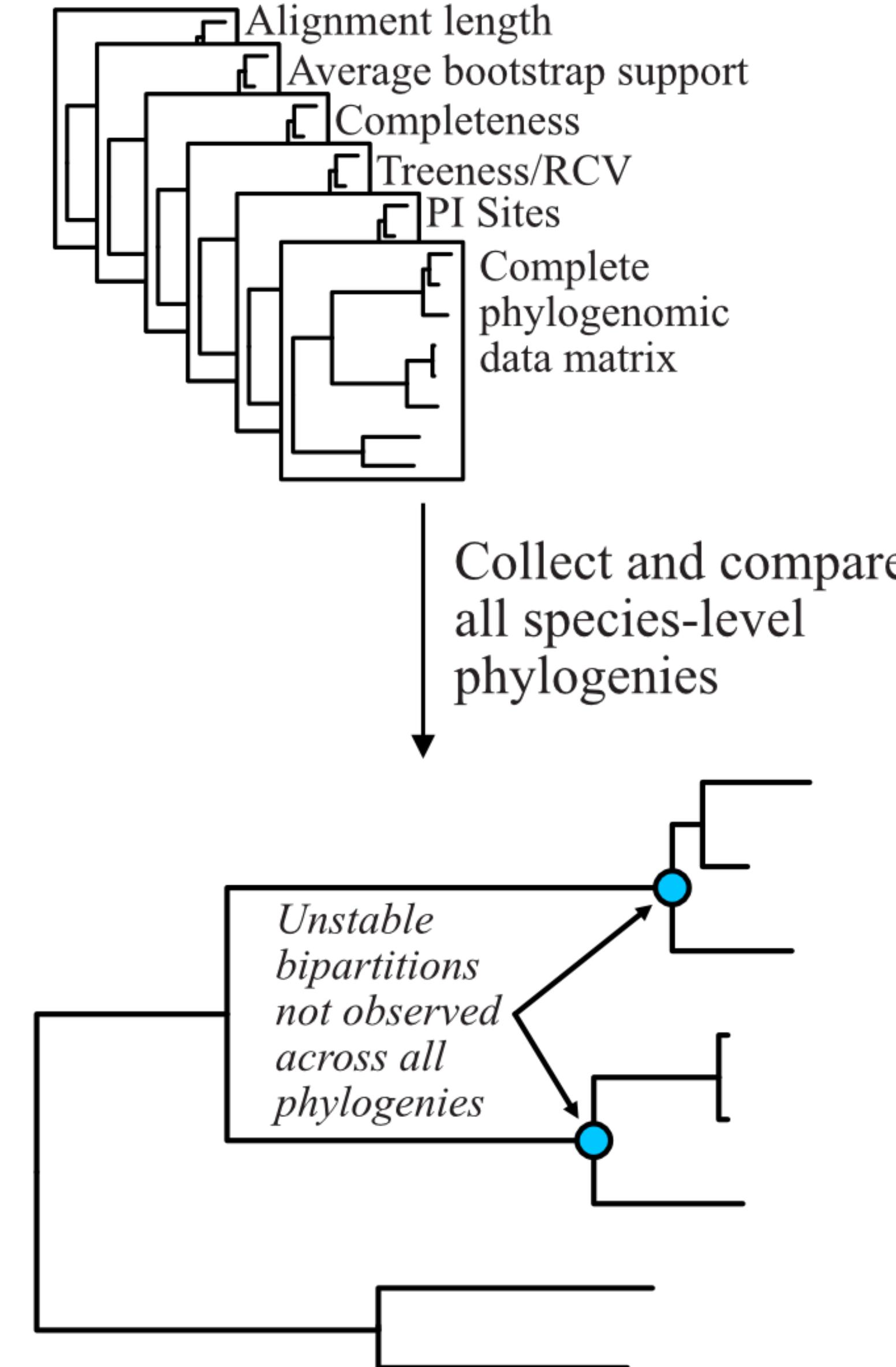
# Phylogenetic subsampling



# Phylogenetic subsampling



# Phylogenetic subsampling



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# Metrics that capture phylogenetic signal

1. Alignment length
2. Alignment length with no gaps
3. GC content (for NTs)
4. Pairwise identity
5. # of parsimony informative sites
6. # of variable sites
7. Relative composition variability
8. Average bootstrap support value
9. Degree of violation of a molecular clock
10. Evolutionary rate
11. Long branch score
12. Treeness
13. Saturation
14. Treeness / RCV



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# Metrics that capture phylogenetic signal

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13. Saturation
14. Treeness / RCV



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# Alignment length

```
>sp1  
ACGTAGCG-TCGATC  
>sp2  
ACGT-GCGATCGATC  
>sp3  
ACGTAGC-ATCGATC  
>sp4  
ACGTAGCGATCGATG  
>sp5  
AC--AGCGATCGATC  
>sp6  
ACGTAGCGA---ATC
```

The length of this alignment is 15 sites



@JLSteenwyk

# Alignment length

```
>sp1  
ACGTAGCG-TCGATC  
>sp2  
ACGT-GCGATCGATC  
>sp3  
ACGTAGC-ATCGATC  
>sp4  
ACGTAGCGATCGATG  
>sp5  
AC--AGCGATCGATC  
>sp6  
ACGTAGCGA---ATC
```

***Higher values are better!***

The length of this alignment is 15 sites



@JLSteenwyk

# Alignment length, no gaps

```
>sp1  
ACGTAGCG - TCGATC  
>sp2  
ACGT - GCGATCGATC  
>sp3  
ACGTAGC - ATCGATC  
>sp4  
ACGTAGCGATCGATG  
>sp5  
AC -- AGCGATCGATC  
>sp6  
ACGTAGCGA --- ATC
```

Excluding sites with gaps, the length of this alignment is 7 sites



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# Alignment length, no gaps

```
>sp1  
ACGTAGCG - TCGATC  
>sp2  
ACGT - GCGATCGATC  
>sp3  
ACGTAGC - ATCGATC  
>sp4  
ACGTAGCGATCGATG  
>sp5  
AC -- AGCGATCGATC  
>sp6  
ACGTAGCGA --- ATC
```

***Higher values are better!***

Excluding sites with gaps, the length of this alignment is 7 sites



@JLSteenwyk

# Pairwise identity

```
>sp1  
ACGTAGCG-TCGATC  
>sp2  
ACGT-GCGATCGATC  
>sp3  
ACGTAGC-ATCGATC  
>sp4  
ACGTAGCGATCGATG  
>sp5  
AC--AGCGATCGATC  
>sp6  
ACGTAGCGA---ATC
```

# Pairwise identity

```
>sp1  
ACGTAGCG-TCGATC  
>sp2  
ACGT-GCGATCGATC  
>sp3  
ACGTAGC-ATCGATC →  
>sp4  
ACGTAGCGATCGATG  
>sp5  
AC--AGCGATCGATC  
>sp6  
ACGTAGCGA---ATC
```

```
>sp1  
ACGTAGCG-TCGATC  
>sp2  
ACGT-GCGATCGATC
```

13/15 sites are identical between sp1 and sp2. Thus, sp1 and sp2 have a pairwise identity of 0.8667

# Pairwise identity

```
>sp1  
ACGTAGCG-TCGATC  
>sp2  
ACGT-GCGATCGATC  
>sp3  
ACGTAGC-ATCGATC  
>sp4  
ACGTAGCGATCGATG  
>sp5  
AC--AGCGATCGATC  
>sp6  
ACGTAGCGA---ATC
```

→

```
>sp1  
ACGTAGCG-TCGATC  
>sp2  
ACGT-GCGATCGATC
```

13/15 sites are identical between sp1 and sp2. Thus, sp1 and sp2 have a pairwise identity of 0.8667



repeat for others and report summary statistics or the pairwise identity of each combination (verbose option)



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# Relative composition variability

- Average variability in the sequence composition among taxa in an MSA



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- Evaluates potential composition biases
  - violate assumptions of site composition homogeneity in standard substitution models



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$$\frac{\sum_{i=1}^c \sum_{j=1}^n |c_{ij} - \bar{c}_i|}{s \times n}$$



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  - violate assumptions of site composition homogeneity in standard substitution models

$$\frac{\sum_{i=1}^c \sum_{j=1}^n |c_{ij} - \bar{c}_i|}{s \times n}$$

- $c$  is the number of different character states per sequence type
- $n$  is the number of taxa in an MSA
- $s$  is the number of sites in an MSA

# Relative composition variability

**High compositional bias**

>sp1

AAATTTT

>sp2

AAA-TTA

>sp3

AAATTTT

>sp4

AAATTAT

>sp5

AAATTTT



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# Relative composition variability

**High compositional bias**

>sp1

AAATTTT

>sp2

AAA-TTA

>sp3

RCV = 0.2171

AAATTTT

>sp4

AAATTAT

>sp5

AAATTTT



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# Relative composition variability

<b>High compositional bias</b>		<b>Lower compositional bias</b>
>sp1		>sp1
AAATTTT		ACATTGG
>sp2		>sp2
AAA-TTA		ACA-TGG
>sp3	RCV = 0.2171	>sp3
AAATTTT		ACATTGG
>sp4		>sp4
AAATTAT		ACATTGG
>sp5		>sp5
AAATTTT		ACATTGG

# Relative composition variability

**High compositional bias**

- >sp1
- AAATTTT
- >sp2
- AAA-TTA
- >sp3
- RCV = 0.2171
- AAATTTT
- >sp4
- AAATTAT
- >sp5
- AAATTTT

**Lower compositional bias**

- >sp1
- ACATTGG
- >sp2
- ACA-TGG
- >sp3
- ACATTGG
- >sp4
- ACATTGG
- >sp5
- ACATTGG

RCV = 0.0914

# Relative composition variability

<b>High compositional bias</b>	<b>Lower RCV</b>	<b>Lower compositional bias</b>
>sp1		>sp1
AAATTTT	<b><i>Lower RCV</i></b>	ACATTGG
>sp2	<b><i>values are better</i></b>	>sp2
AAA-TTA		ACA-TGG
>sp3	RCV = 0.2171	>sp3
AAATTTT		ACATTGG
>sp4		>sp4
AAATTAT		ACATTGG
>sp5		>sp5
AAATTTT		ACATTGG

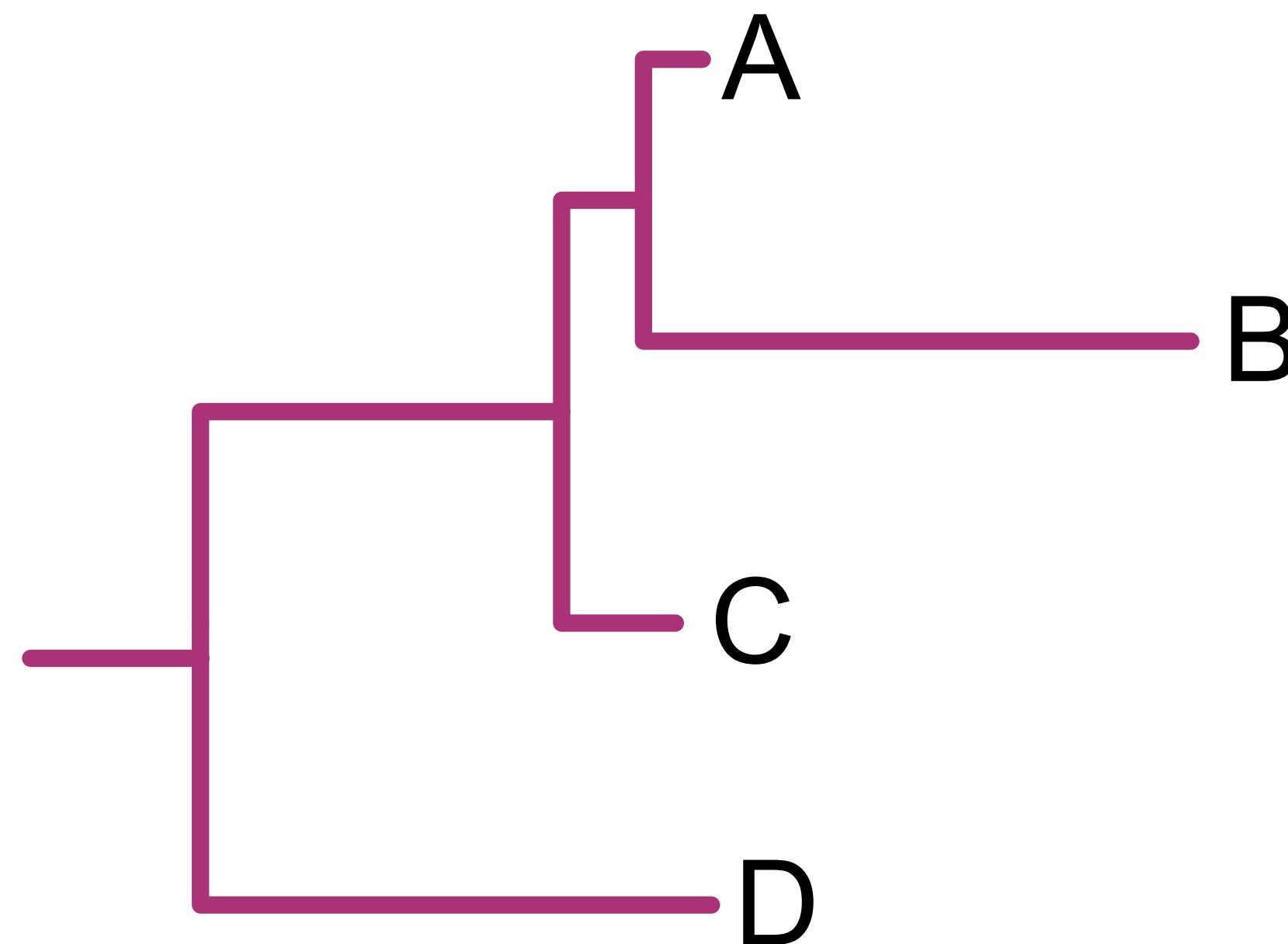
# Degree of violation of a molecular clock



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# Degree of violation of a molecular clock

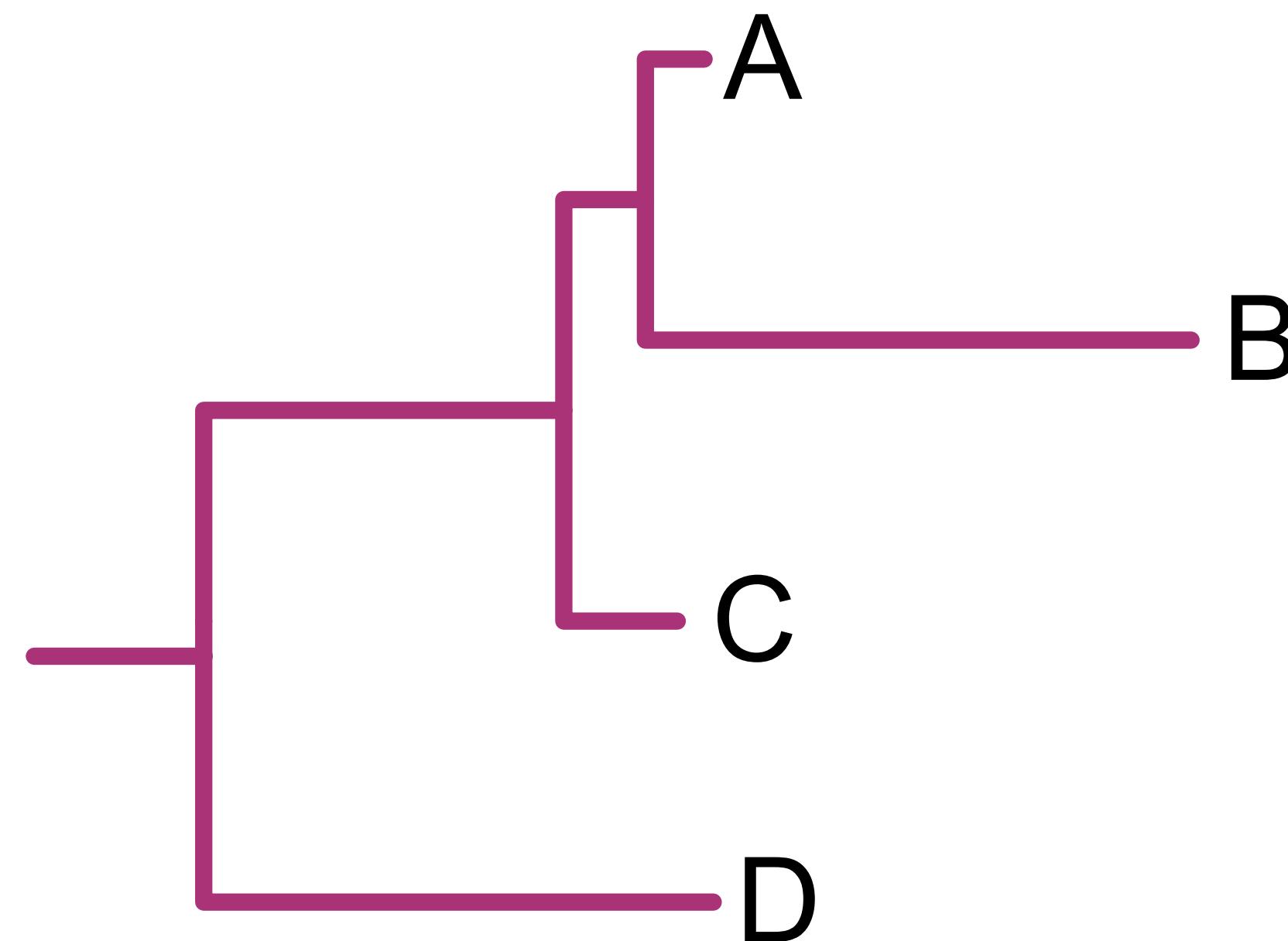
Non-clock like



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# Degree of violation of a molecular clock

Non-clock like



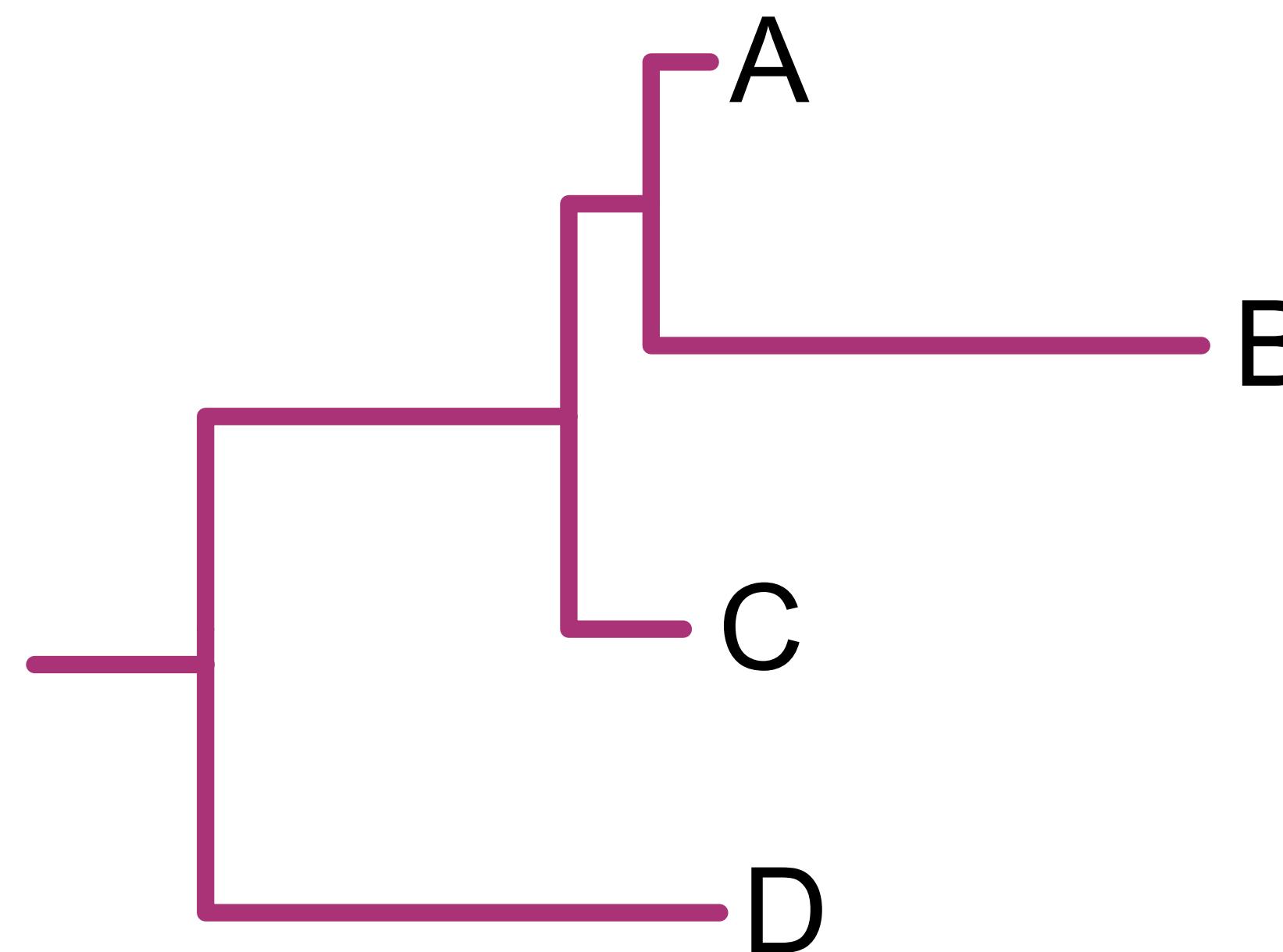
High DVMC



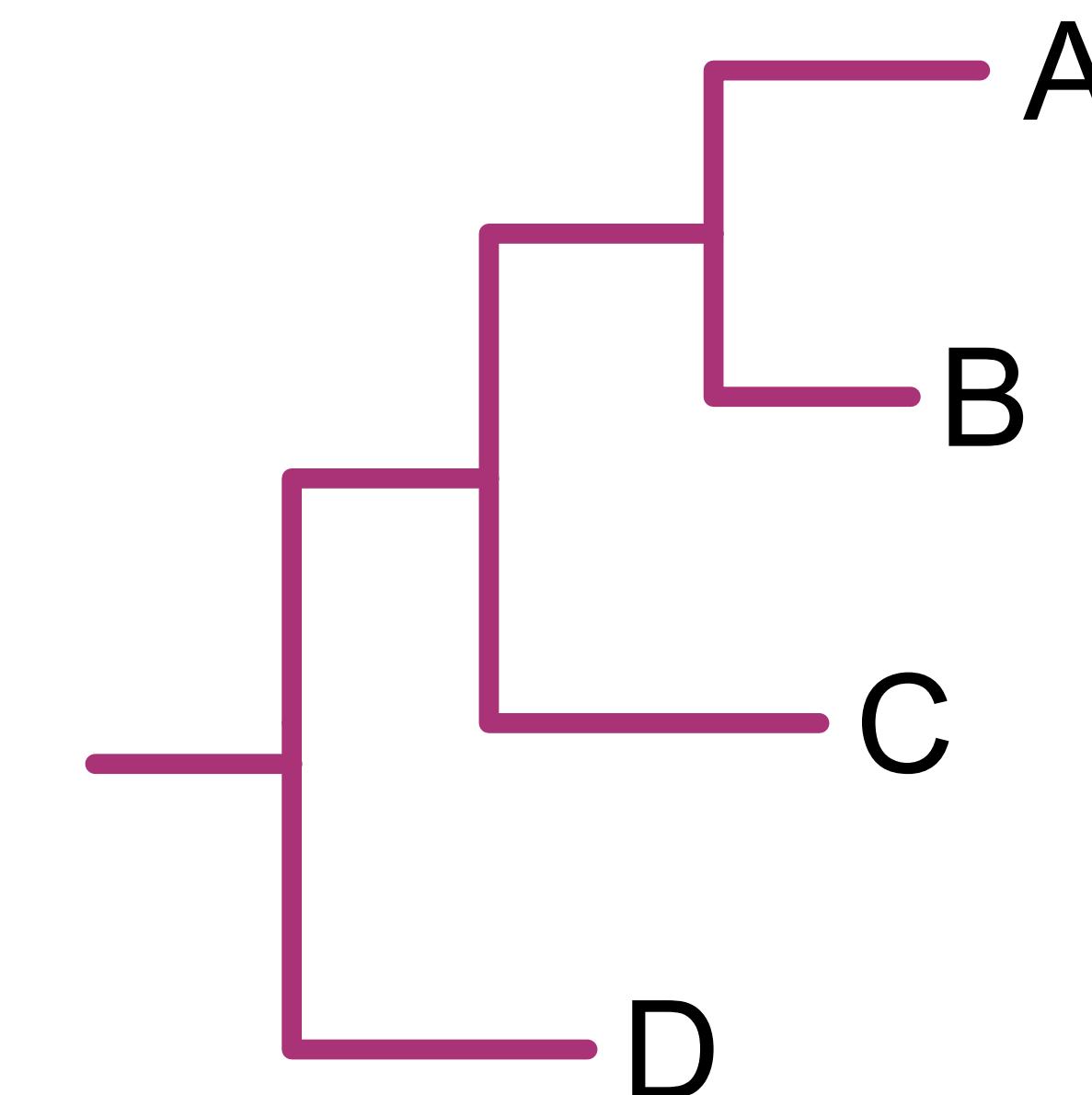
@JLSteenwyk

# Degree of violation of a molecular clock

Non-clock like



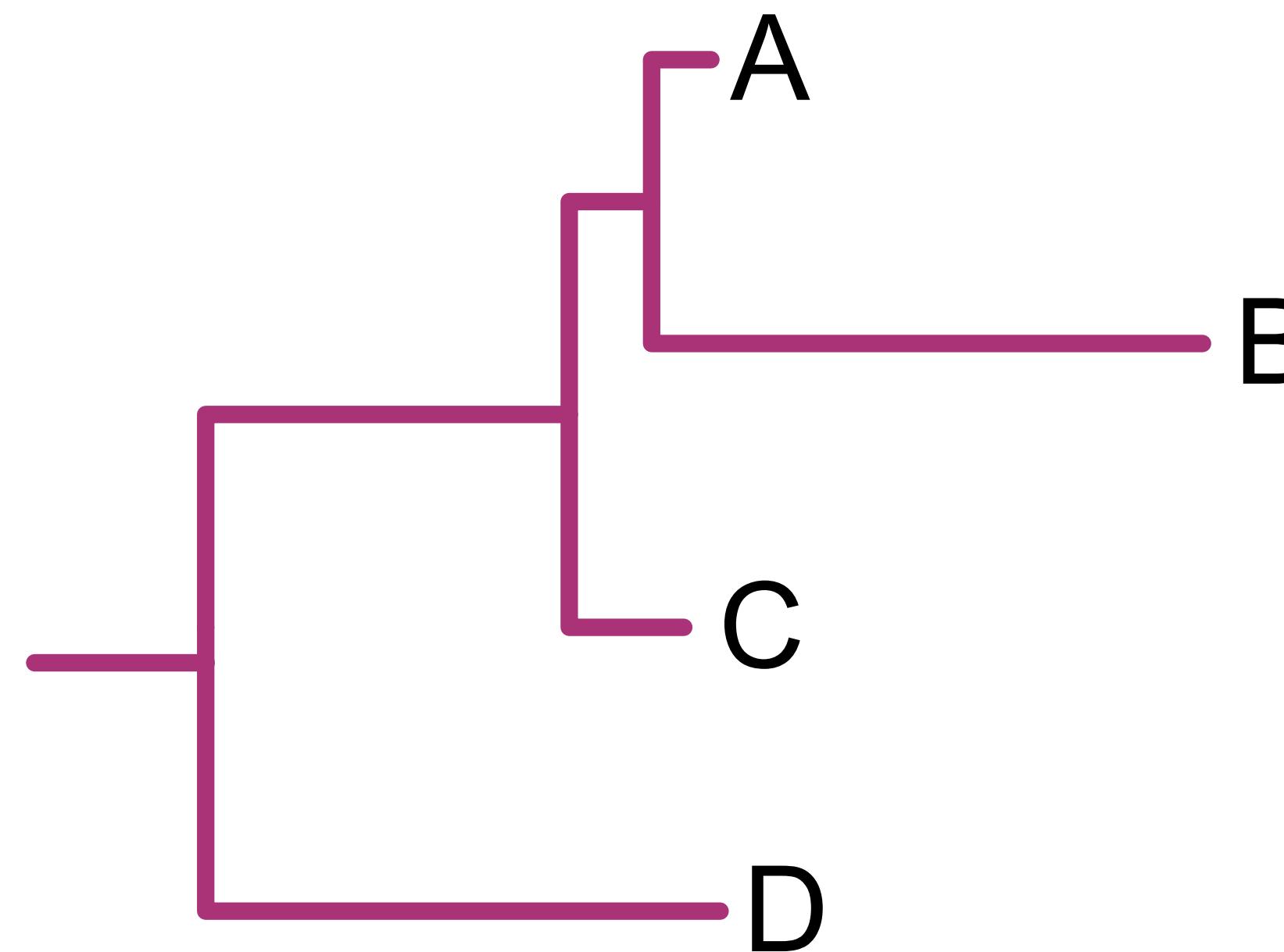
Clock-like



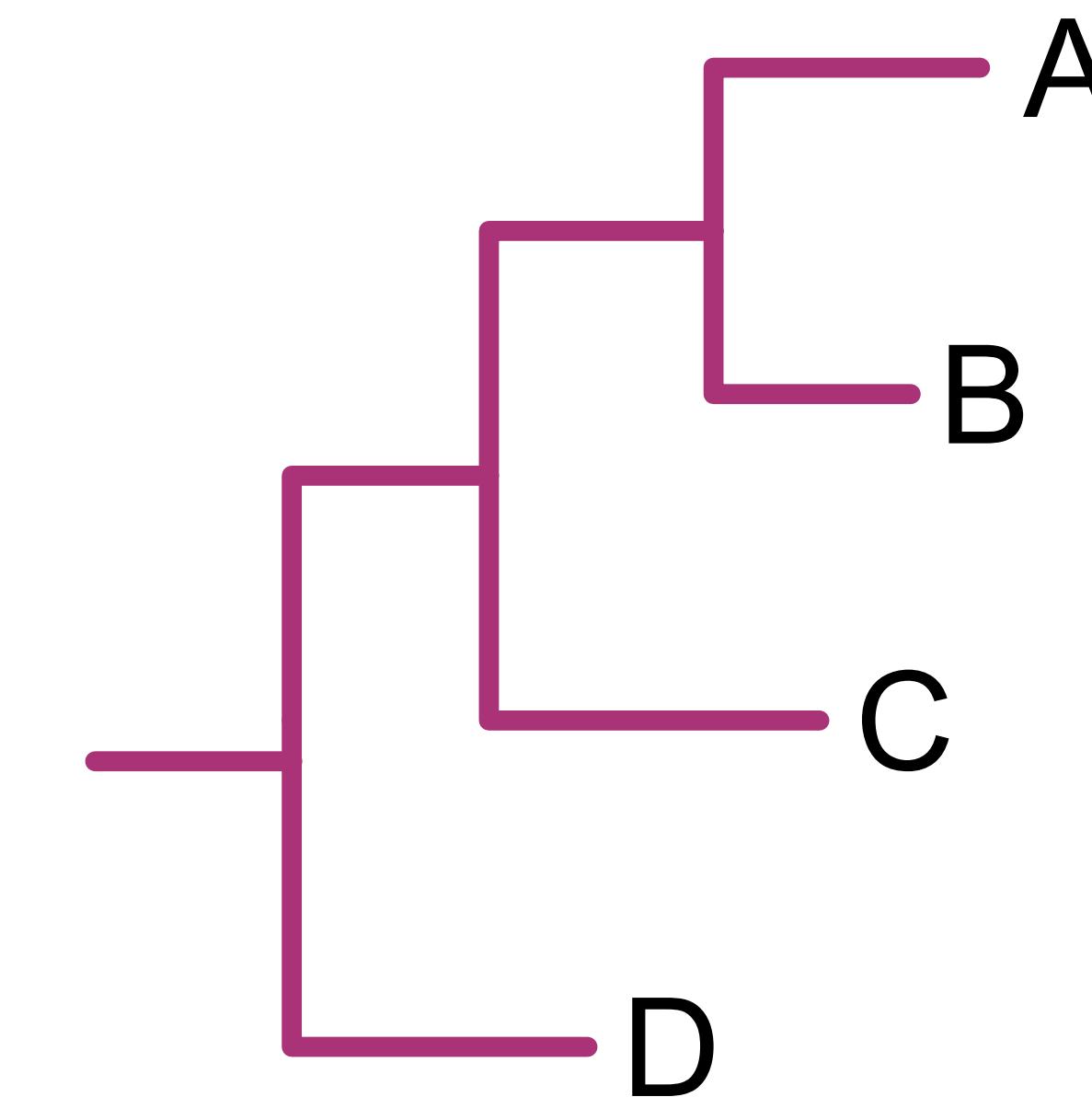
High DVMC

# Degree of violation of a molecular clock

Non-clock like



Clock-like



High DVMC

Low DVMC



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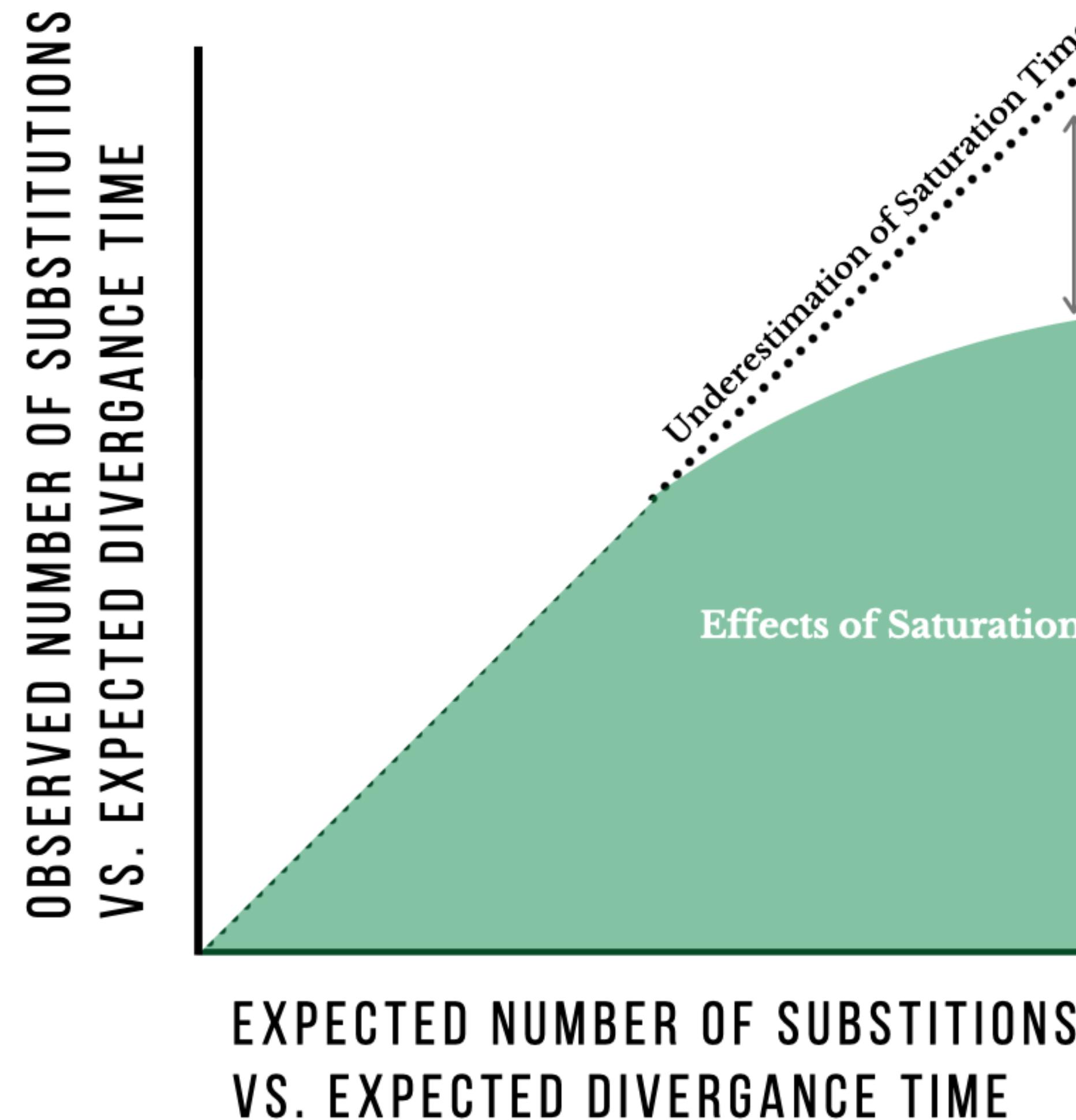
# Degree of violation of a molecular clock

Genes with low DVMC may be useful for divergence time analysis

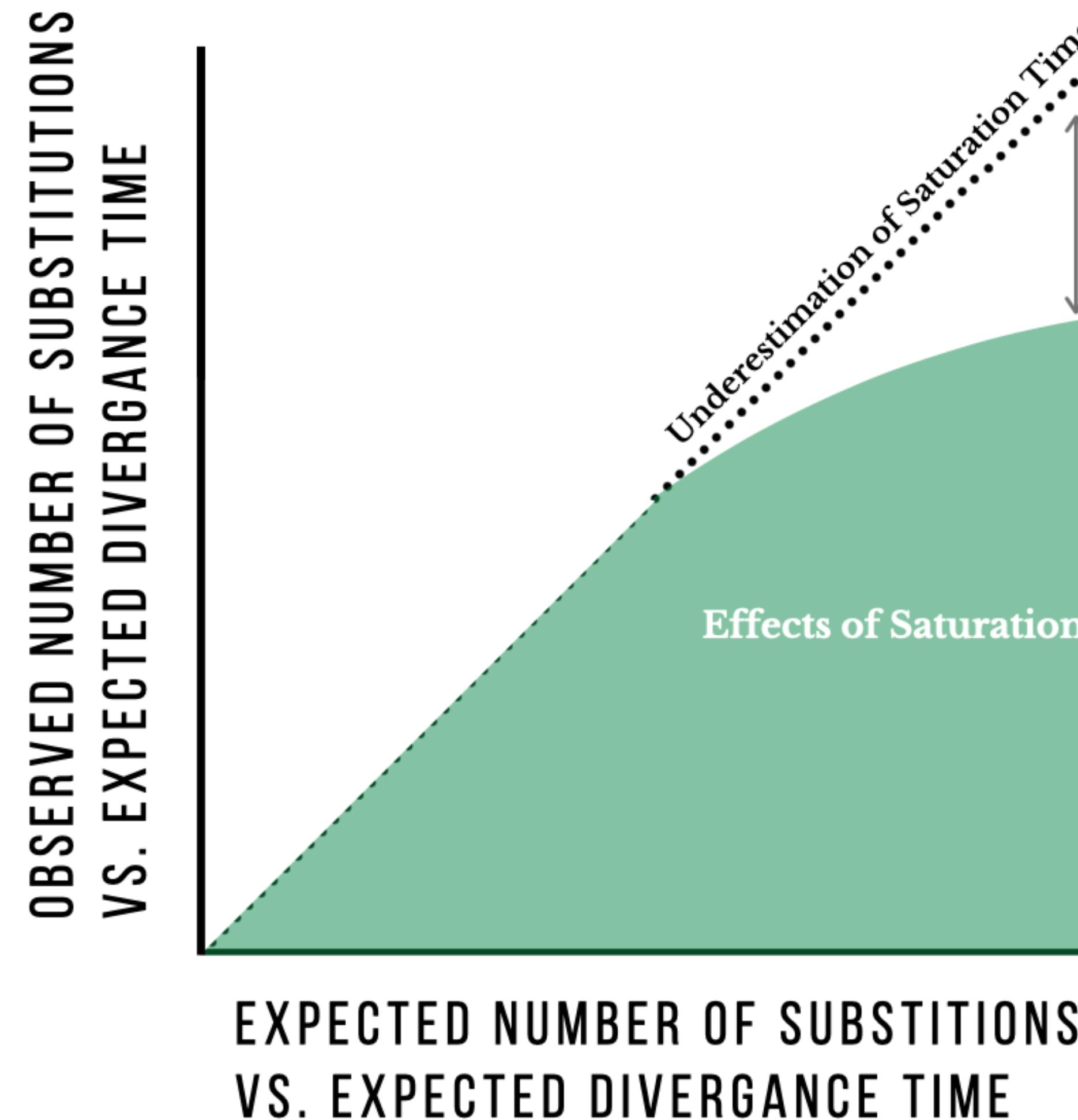


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# Saturation by multiple substitutions



# Saturation by multiple substitutions

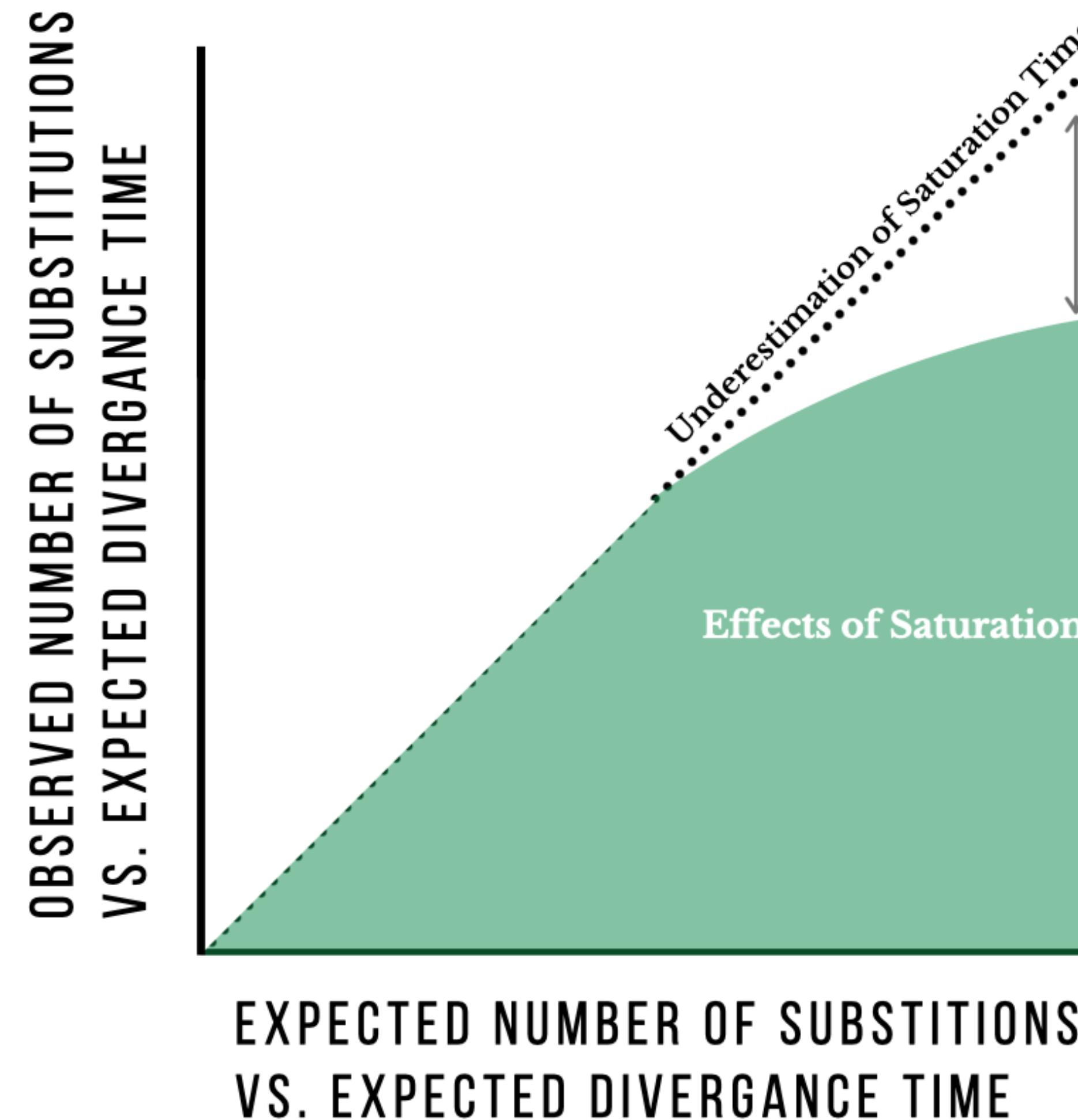


- X-axis can be approximated using phylogenetic distances
  - Tip-to-tip distances in a tree



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# Saturation by multiple substitutions



- X-axis can be approximated using phylogenetic distances
  - Tip-to-tip distances in a tree
- Y-axis can be approximated using pairwise identity
  - Distance in an MSA

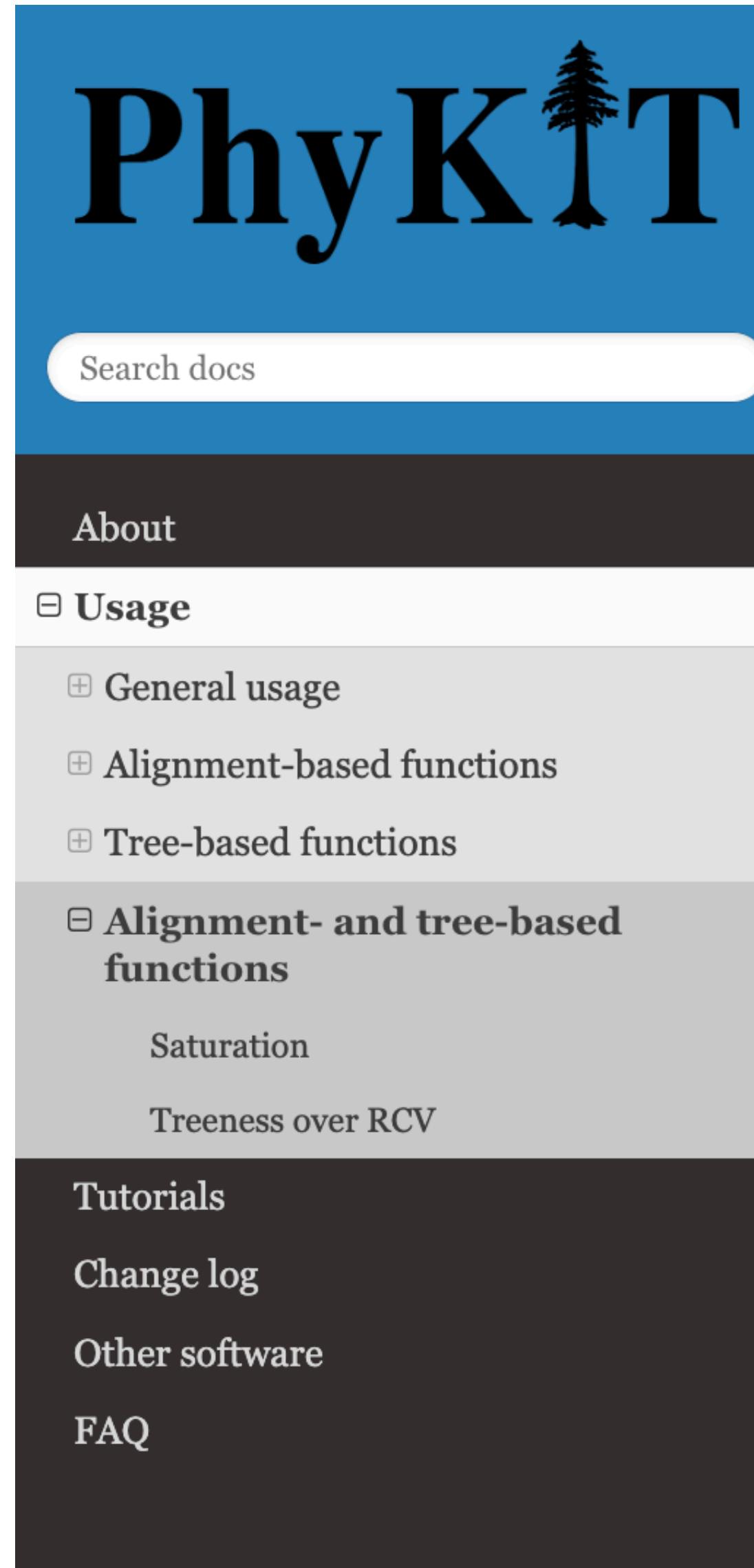


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# So many metrics, so many details

1. Alignment length - **higher better**
2. Alignment length with no gaps - **higher better**
3. GC content (for NTs) - **lower better**
4. Pairwise identity - **depends**
5. # of parsimony informative sites - **higher better**
6. # of variable sites - **higher better**
7. Relative composition variability - **lower better**
8. Average bootstrap support value - **higher better**
9. Degree of violation of a molecular clock - **lower better**
10. Evolutionary rate - **depends**
11. Long branch score - **lower better**
12. Treeness - **higher better**
13. Saturation - **higher better**
14. Treeness / RCV - **higher better**

# Where known, PhyKIT documentation will say



The screenshot shows the PhyKIT documentation website. The header features the PhyKIT logo with a tree icon. Below the header is a search bar labeled "Search docs". The main navigation menu includes "About", "Usage" (which is expanded), "Alignment- and tree-based functions" (which is expanded), "Tutorials", "Change log", "Other software", and "FAQ". Under "Usage", there are links for "General usage", "Alignment-based functions", "Tree-based functions", and "Saturation" (which is highlighted). Under "Alignment- and tree-based functions", there are links for "Saturation", "Treeness over RCV", and "phykit saturation -a <alignment> -t <tree> [-v/--verbose]" (which is highlighted). The "Options:" section lists "-a/--alignment", "-t/--tree", and "-v/--verbose".

## Saturation

<https://jlsteenwyk.com/PhyKIT>

Function names: saturation; sat

Command line interface: pk\_saturation; pk\_sat

Calculate saturation for a given tree and alignment.

Saturation is defined as sequences in multiple sequence alignments that have undergone numerous substitutions such that the distances between taxa are underestimated.

Data with no saturation will have a value of 1. Completely saturated data will have a value of 0.

Saturation is calculated following Philippe et al., PLoS Biology (2011), doi: 10.1371/journal.pbio.1000602.

```
phykit saturation -a <alignment> -t <tree> [-v/--verbose]
```

Options:

*-a/--alignment*: an alignment file

*-t/--tree*: a tree file

*-v/--verbose*: print out patristic distances and uncorrected distances used to determine saturation

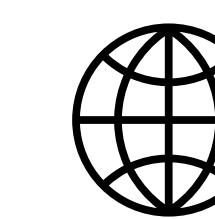


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# Concatenation and partitioning



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<https://jlsteenwyk.com/>