



# **THE IMPLICATIONS OF EMPIRICAL SEQUENCE CAPTURE STUDIES IN BIRDS FOR LARGE-SCALE PHYLOGENETICS**

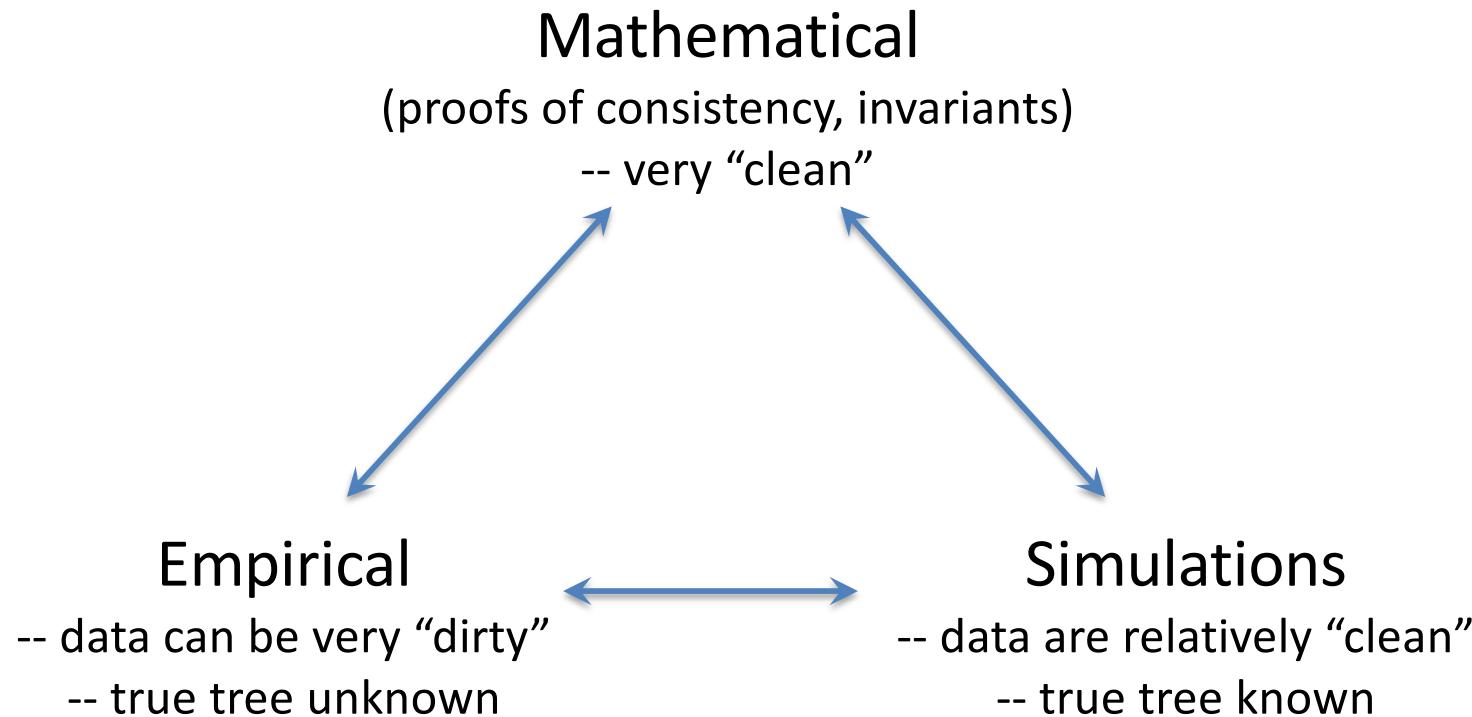
**Edward L Braun**

**Department of Biology  
University of Florida**

Seminar: ICERM, Brown University, 18 September 2024

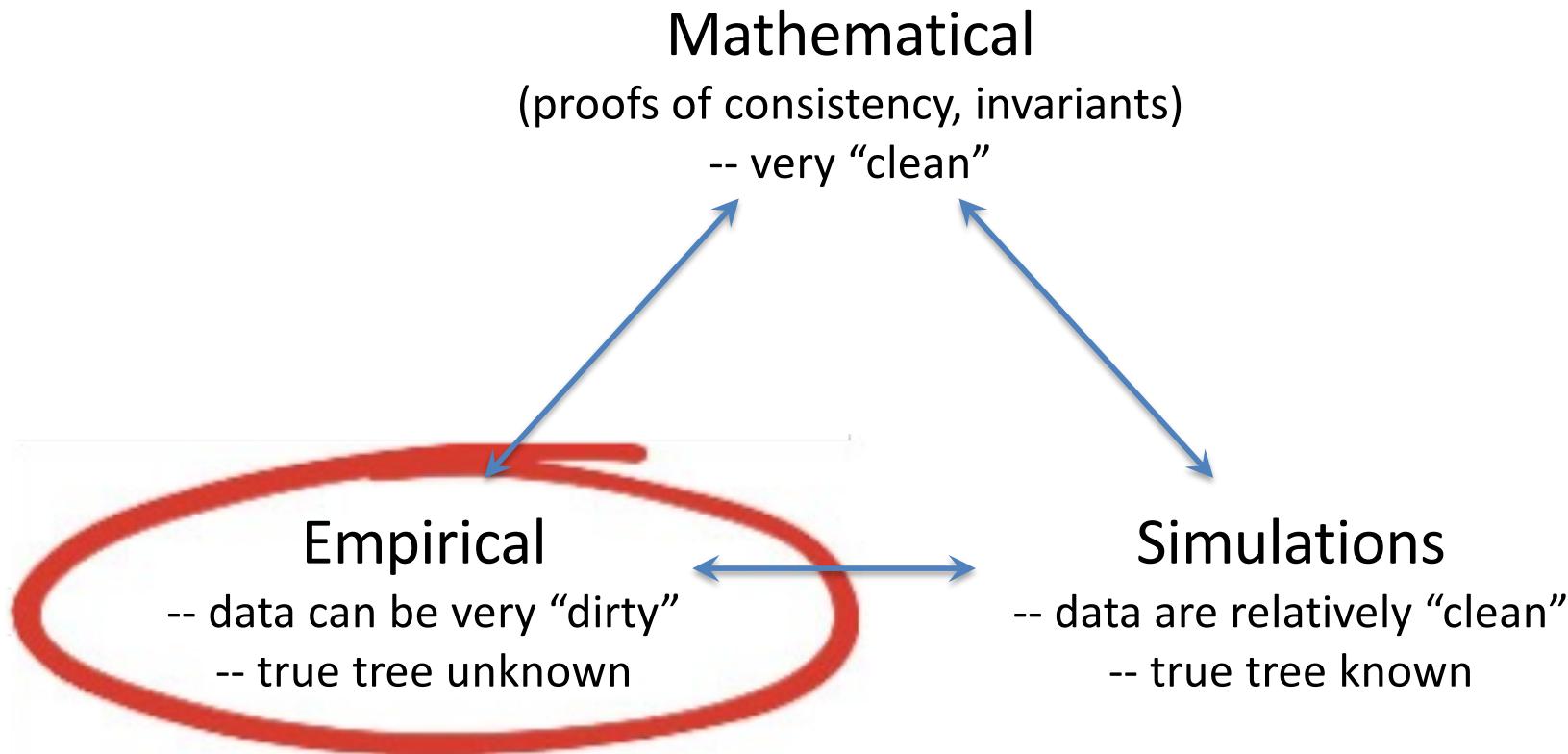
# WAYS TO STUDY PHYLOGENETIC METHODS

- Different ways of studying methods of phylogenetic estimation should complement each other



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# OUTLINE

- Why are birds interesting for phylogenetics?
- Biological and technical challenges
  - The “Usual Suspects”
  - Recombination landscape of genomes
  - Sequence assemblers
- Comparison of inference methods
  - Including distance methods (METAL)

# WHY BIRDS? PRIOR INFORMATION!

- Large number of phylogenomic studies

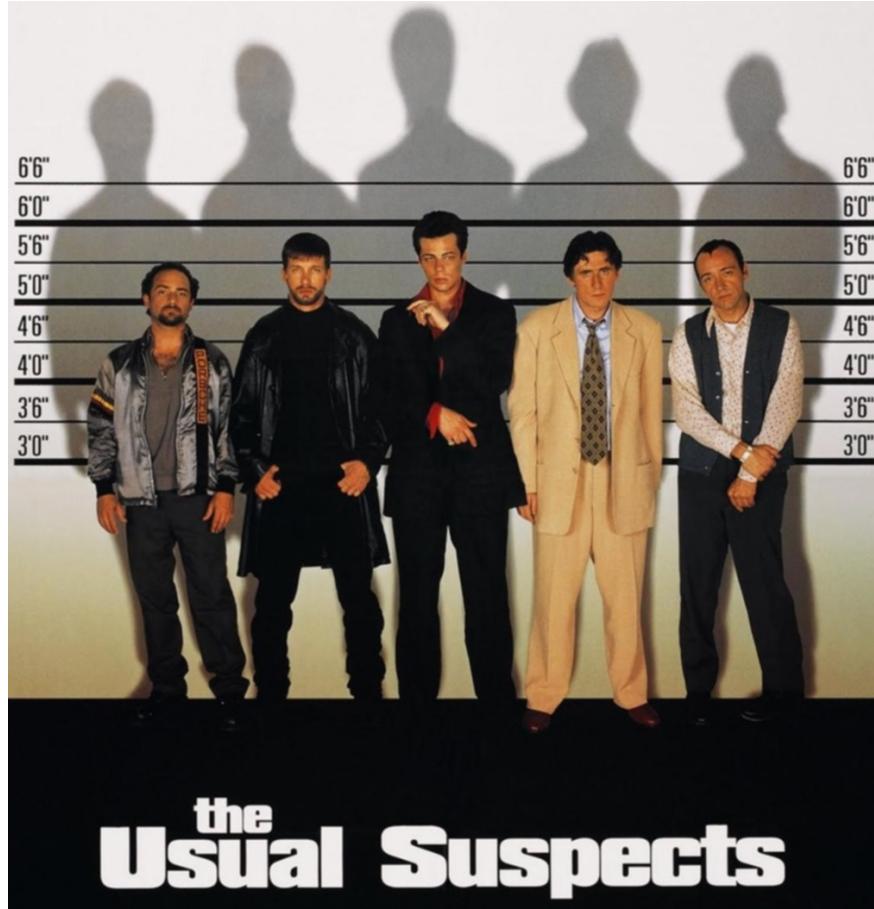
| Citation                         | # of Loci      | Data Type(s)                | # of Taxa <sup>2</sup> |
|----------------------------------|----------------|-----------------------------|------------------------|
| Multigene <sup>1</sup>           |                |                             |                        |
| Hackett et al. (2008)            | 19             | Introns                     | 169                    |
| Harshman et al. (2008)           | 20             | Introns                     | 14 (Palaeognathae)     |
| Haddrath and Baker (2012)        | 27             | Coding exons and introns    | 23 (Palaeognathae)     |
| Wang et al. (2011)               | 30             | Introns                     | 28 (Telluraves)        |
| Kimball et al. (2013)            | 31             | Introns                     | 77                     |
| Smith et al. (2013)              | 40             | Introns                     | 10 (Palaeognathae)     |
| Reddy et al. (2017)              | 54             | Introns                     | 235                    |
| Liu et al. (2018)                | 63             | Coding exons                | 48                     |
| Phylogenomic <sup>1</sup>        |                |                             |                        |
| McCormack et al. (2013)          | 1,541          | UCEs <sup>3</sup>           | 32 (Neoaves)           |
| Jarvis et al. (2014)             | 11,839         | Whole genomes <sup>4</sup>  | 48                     |
| Baker et al. (2014)              | 1,448          | Coding exons and UCEs       | 198                    |
| Prum et al. (2015)               | 259            | Coding exons                | 198                    |
| Suh et al. (2015)                | 2,118          | TE insertions <sup>5</sup>  | 43                     |
| Cloutier et al. (2019)           | 20,850         | Whole genomes <sup>6</sup>  | 15 (Palaeognathae)     |
| White and Braun (2019)           | 4,243          | UCEs                        | 23 (Strisores)         |
| Kuhl et al. (2021)               | — <sup>7</sup> | 3' UTRs <sup>8</sup>        | 429                    |
| Wang et al. (2022b)              | — <sup>7</sup> | Whole genomes               | 16 (Palaeognathae)     |
| This study                       | 4,307          | UCEs                        | 394                    |
| Recent phylogenomic <sup>1</sup> |                |                             |                        |
| Wu et al. (2024)                 | 25,460         | Whole genomes <sup>9</sup>  | 124                    |
| Stiller et al. (2024)            | 63,430         | Whole genomes <sup>10</sup> | 363                    |

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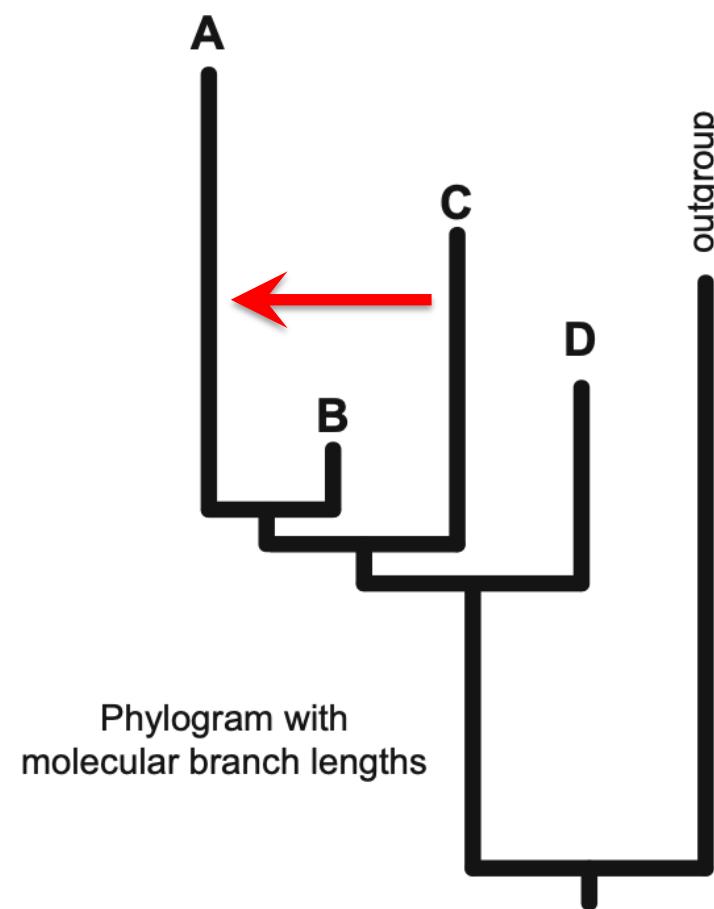
# WHY BIRDS?



- Avian phylogeny exhibits
  - ❖ Rapid radiation
    - Many short branches
    - Discordance among gene trees (incomplete lineage sorting)
  - ❖ Rate differences among taxa
    - Potential for long branch attraction
  - ❖ Shifts in evolutionary models
    - Convergence in GC content

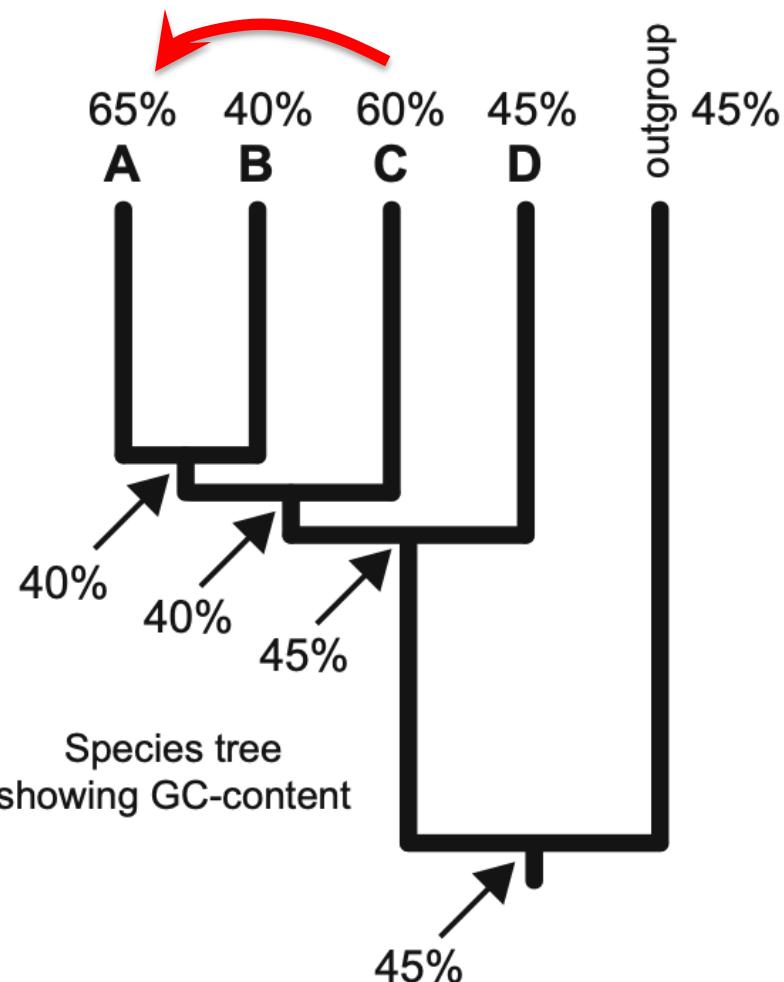
# WHAT ARE THE "USUAL SUSPECTS"?

- Long-branch attraction (an oldie but a baddie...)



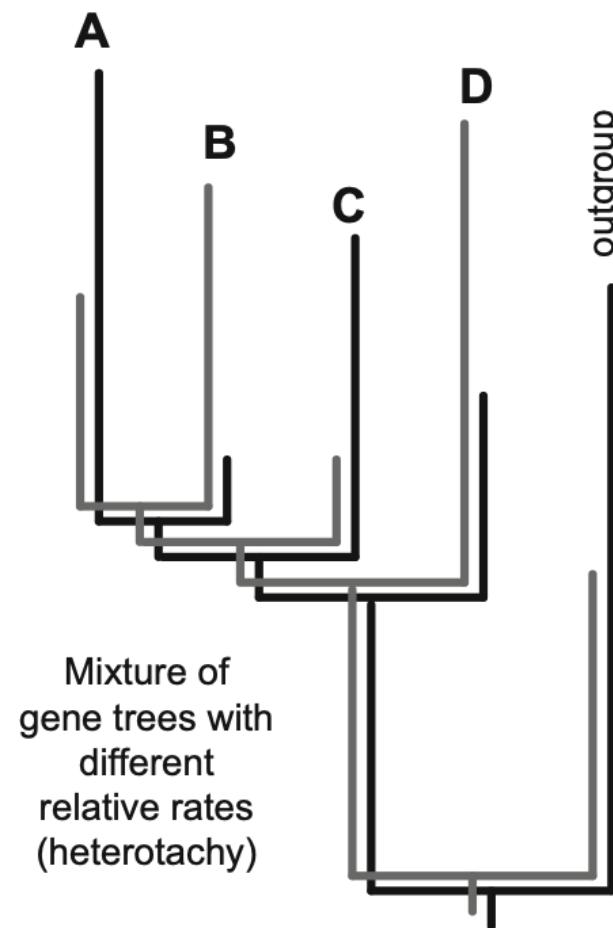
# WHAT ARE THE "USUAL SUSPECTS"?

- Convergence in base composition



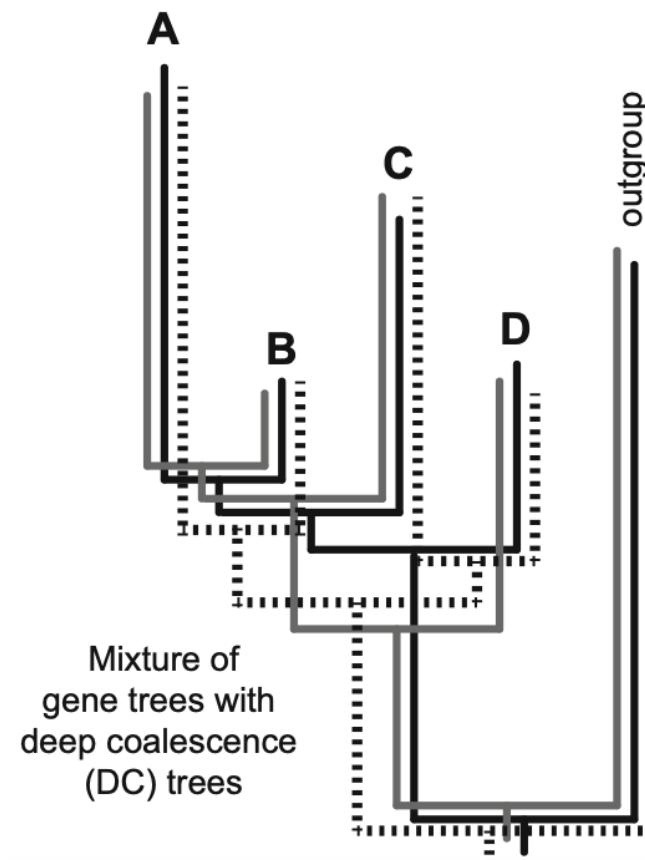
## WHAT ARE THE "USUAL SUSPECTS"?

- Heterotachy – mixtures of branch lengths

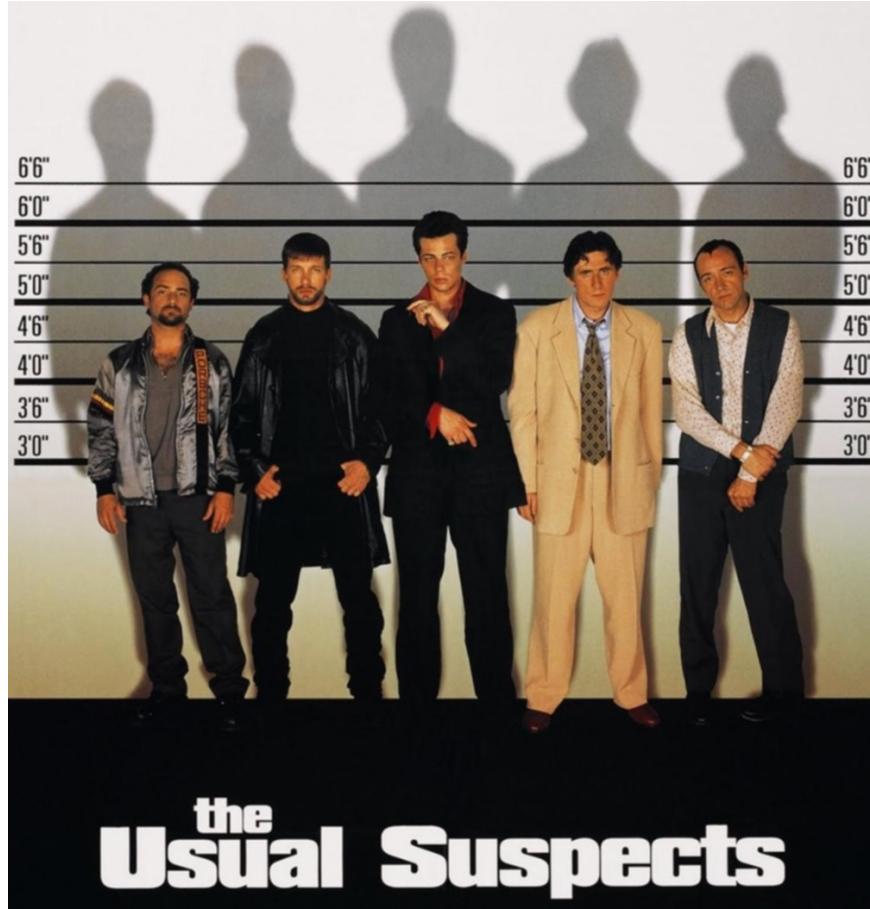


# WHAT ARE THE "USUAL SUSPECTS"?

- Incomplete lineage sorting (ILS)
  - ❖ Deviation from strict multispecies coalescent is possible



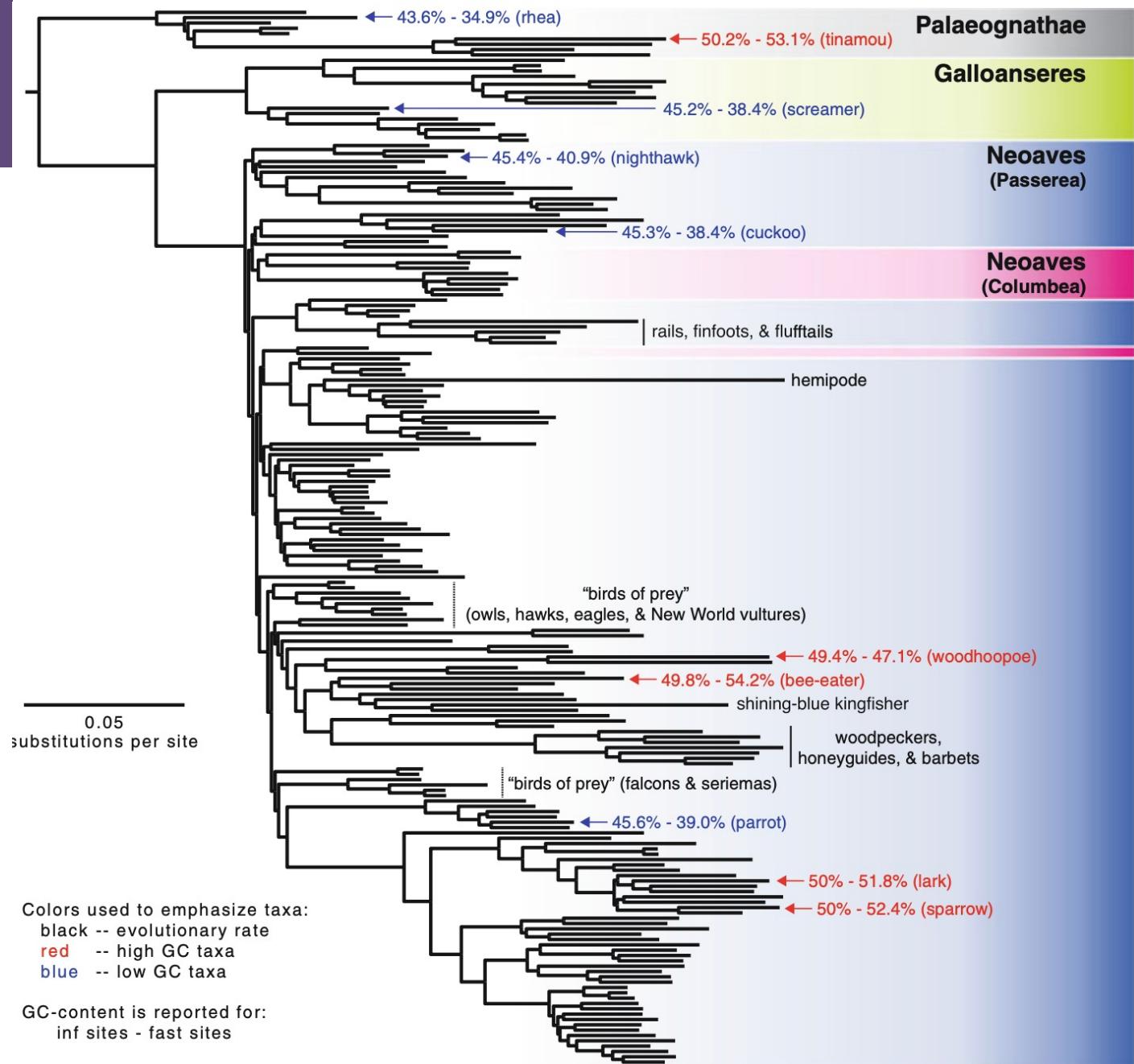
## WHY BIRDS?



- But the problems don't include all the usual suspects...
  - ❖ Limited gene duplication and loss
  - ❖ Conservation of synteny
- ✓ Orthology is (relatively) easy to establish

# RATES (& GC CONTENT)

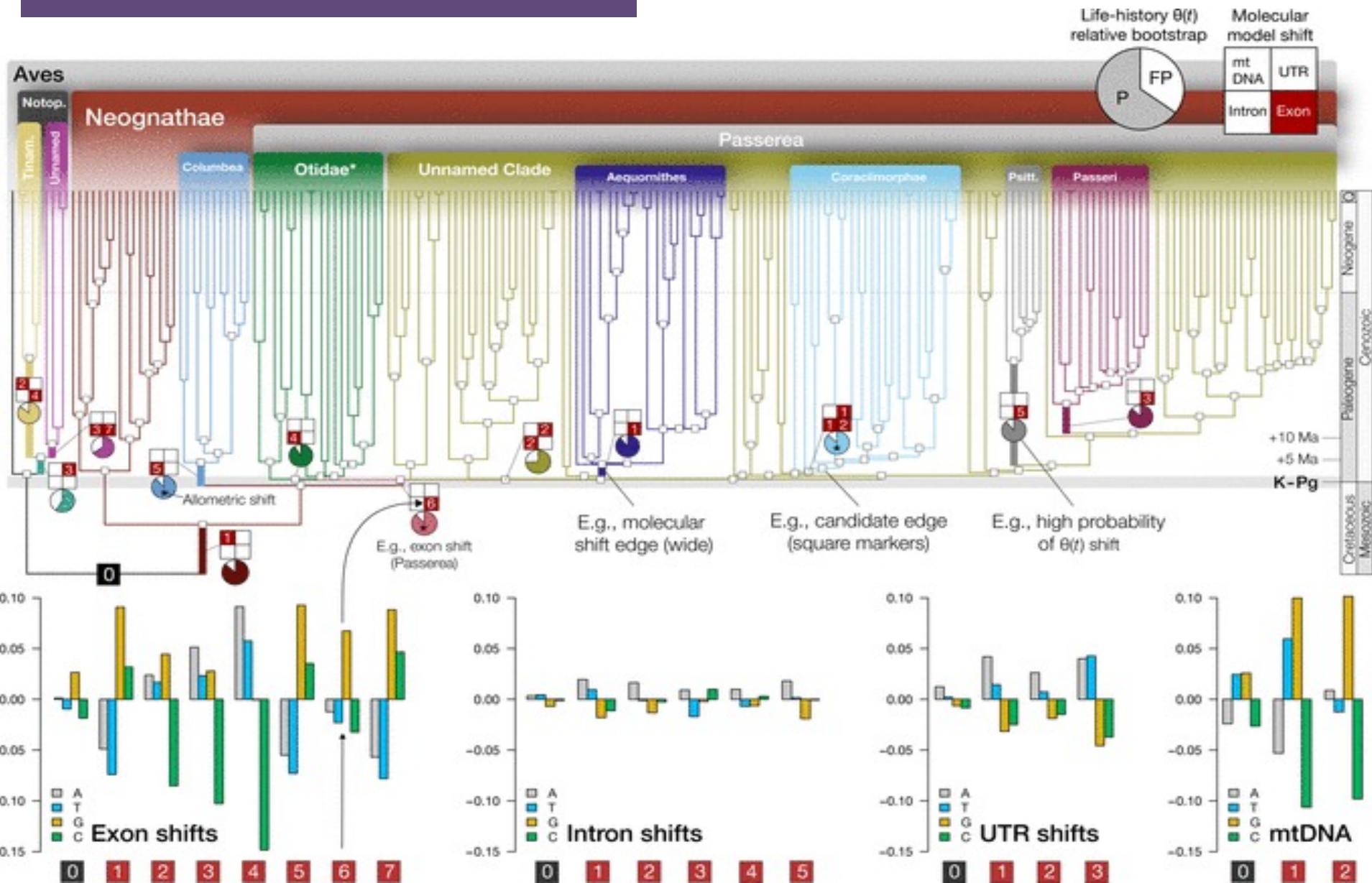
- Substantial branch length variation
- Rapid radiation (short branches at base of blue & pink clade)
- GC-content variation



From Braun et al. (2019)  
chapter in *Avian Genomics*  
- data are from Prum et al.  
(2015) *Nature*

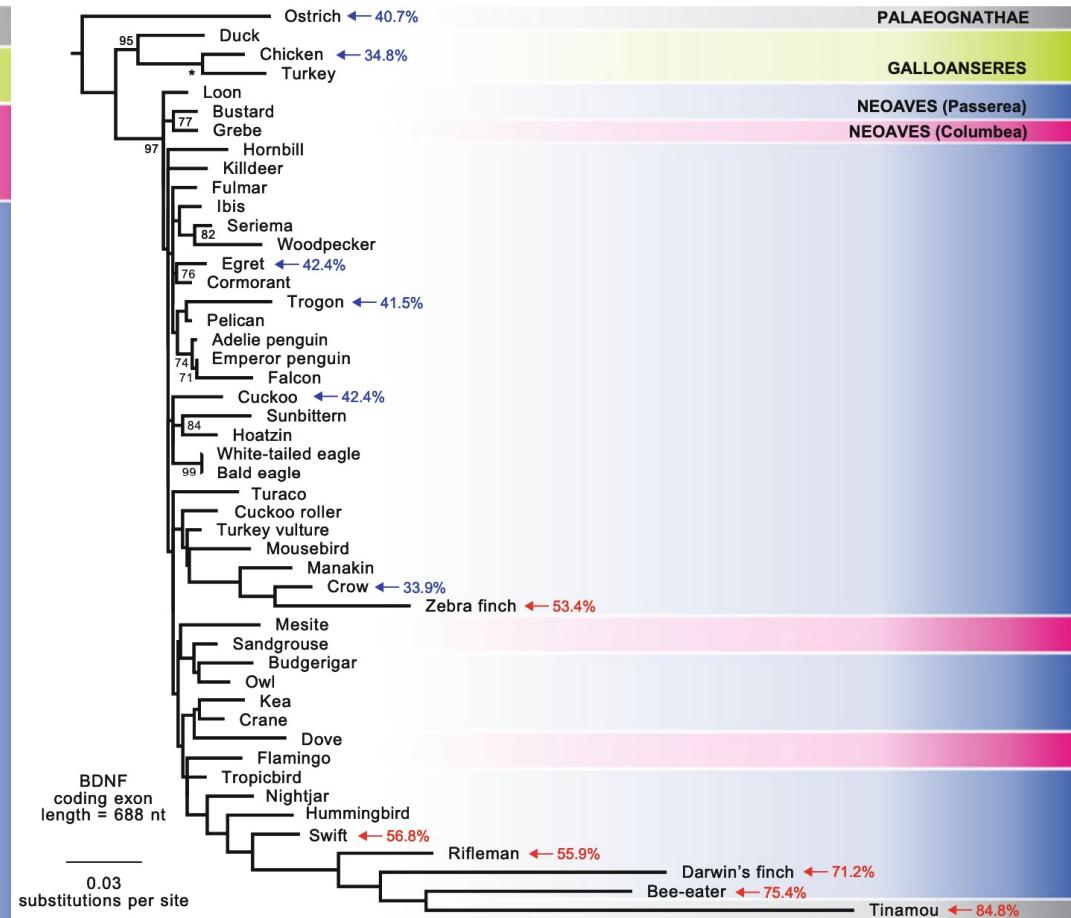
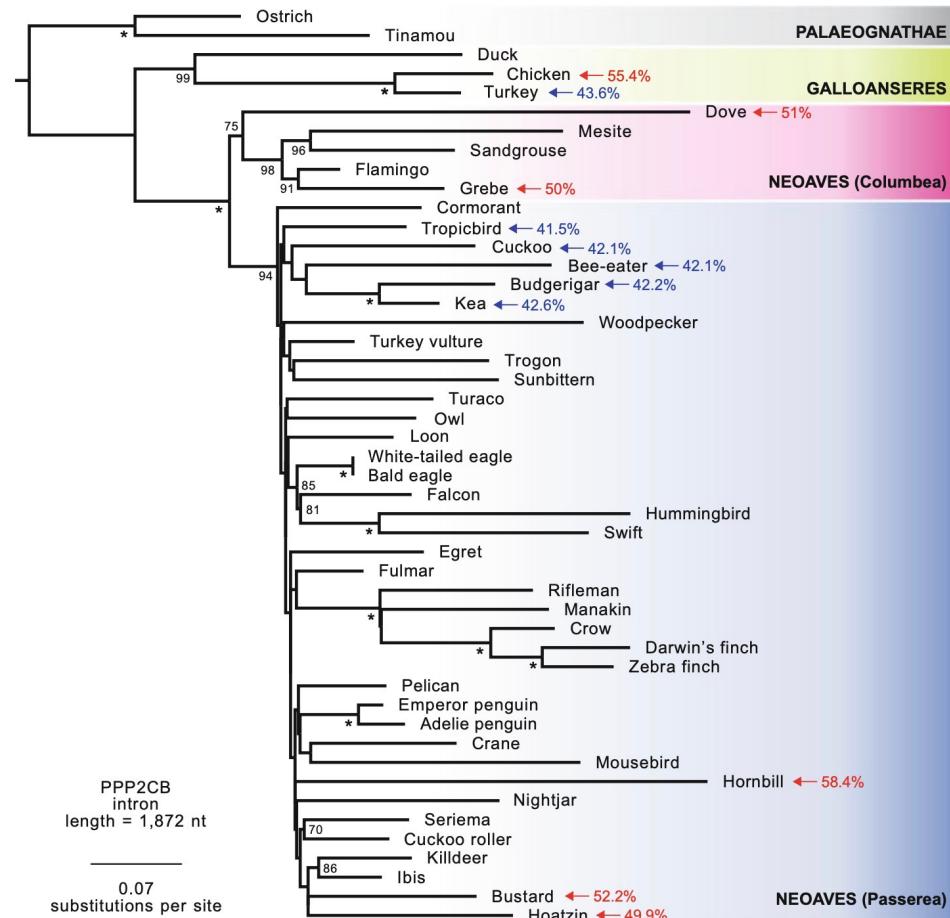
Book chapter: [https://doi.org/10.1007/978-3-030-16477-5\\_6](https://doi.org/10.1007/978-3-030-16477-5_6)

# MODEL SHIFTS



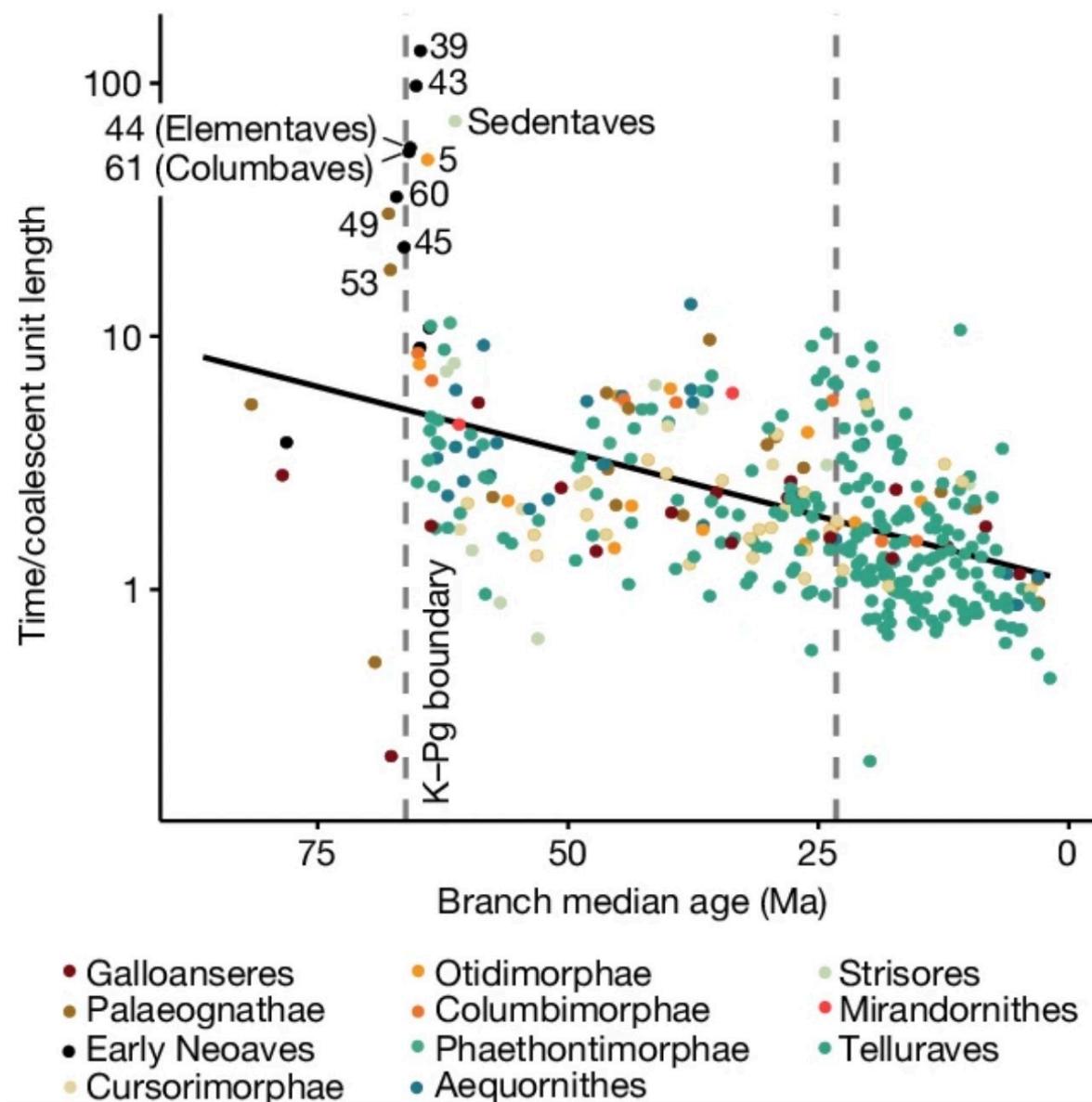
# HETEROTACHY+ -- PPP2CB vs BDNF

- Comparison of two gene trees – PPP2CB (left) vs BDNF (right)
  - Heterotachy + base composition variation (+ BDNF long-branch attraction)



# CHANGES IN EFFECTIVE POPULATION SIZE

- Note outliers in graph of timetree branch lengths divided by coalescent branch lengths (CBLs)
- Simplest explanation for elevated time/CBL values is **increased  $N_e$** 
  - Generation time shifts or errors in gene trees could explain as well
- Houde et al. (2019)  
*Diversity* came to similar conclusions regarding  $N_e$ 
  - Sparse taxon sample, but accounted for generation time and used long indels to establish bipartitions in gene trees



## CHALLENGES FOR AVIAN PHYLOGENOMICS

- Very short branches in some parts of the tree
- Shifts in the relative rate of evolution
  - ✓ Potential for long-branch attraction
- Shifts in the model of sequence evolution
  - ✓ Base composition convergence (especially GC-content)
  - ✓ Model shifts are most extreme in coding exons
- Gene tree discordance due to incomplete lineage sorting
  - ✓ Potentially exacerbated by periods of increased  $N_e$

# BIRD PHYLOGENY DOES NOT PRESENT A UNIQUE CHALLENGE

- Challenging relationships probably exist in all clades



New Results

## The danger zone: the joint trap of incomplete lineage sorting and long-branch attraction in placing Rafflesiaceae

Liming Cai, Liang Liu, Charles C. Davis

**doi:** <https://doi.org/10.1101/2024.08.07.606681>

This article is a preprint and has not been certified by peer review [what does this mean?].



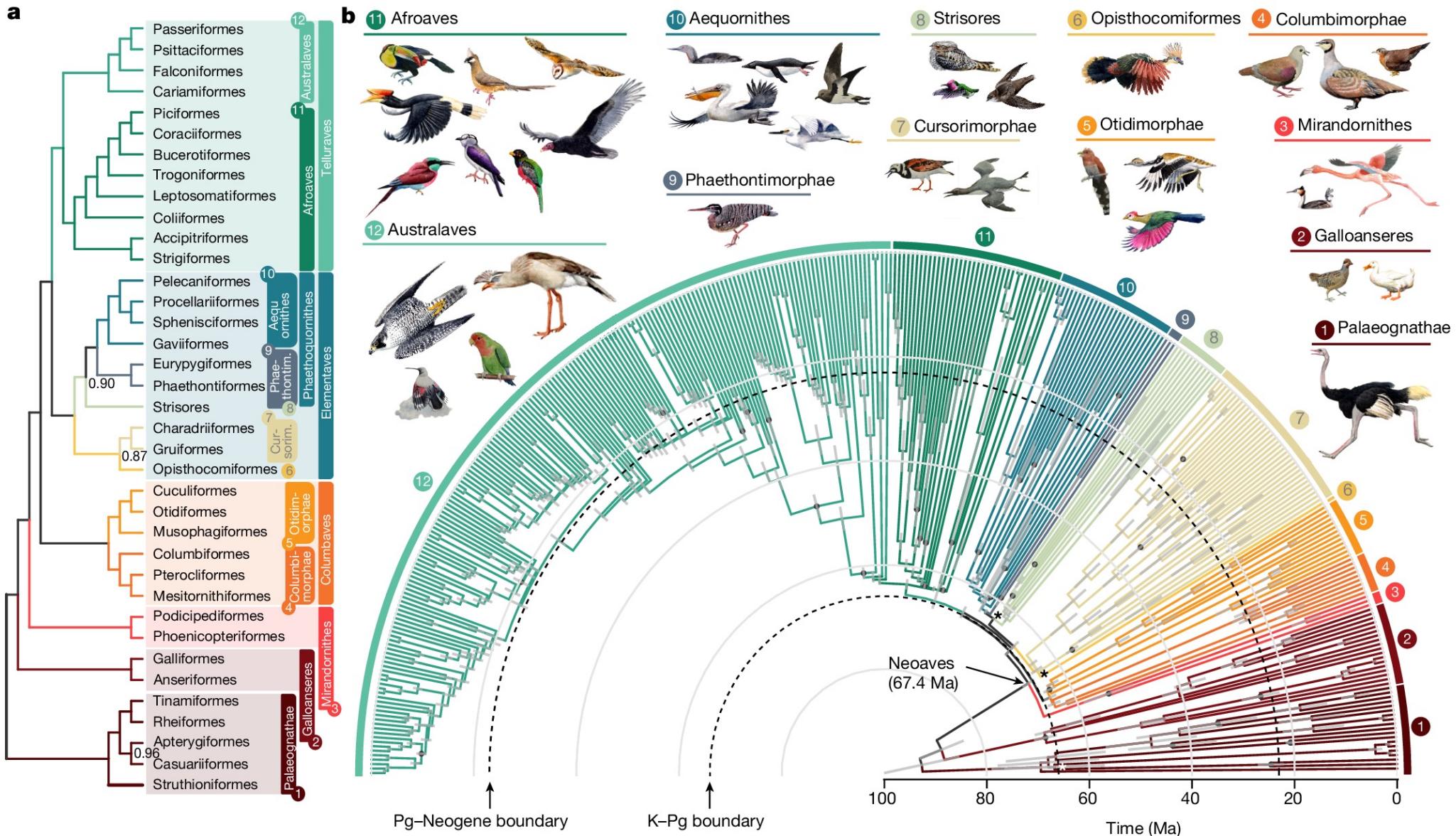
- But we have a lot of information about bird phylogeny

## SOME “UNUSUAL SUSPECTS”...

- Recombination landscape
- Sequence assembly and data quality

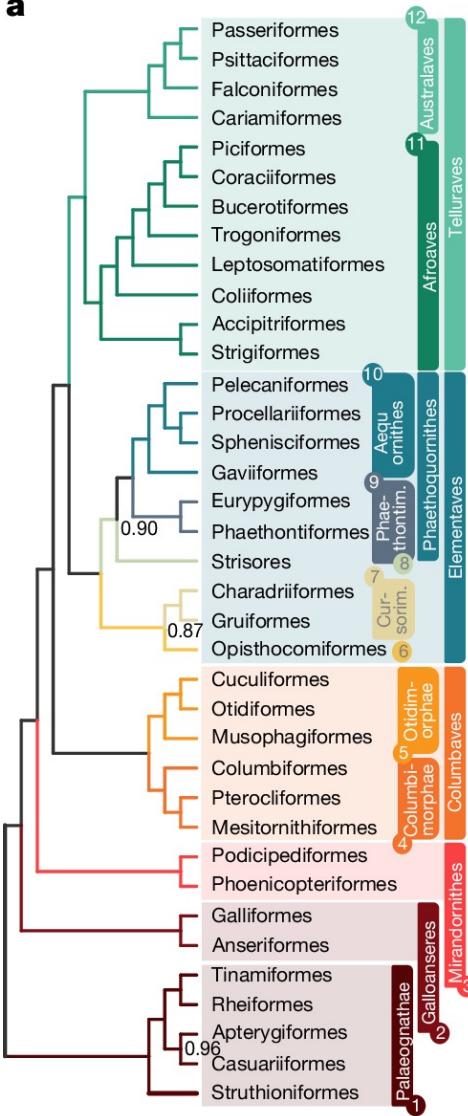


# CURRENT BEST ESTIMATE OF THE BIRD TREE



# CURRENT BEST ESTIMATE OF THE BIRD TREE

a



**Columbimorphae (doves, mesites, and sandgrouse)**

- United in some earlier trees (J1)

**Mirandornithes (flamingos and grebes)**



# EARLIER (REDDY ET AL. 2017) PHYLOGENY

J1 is:

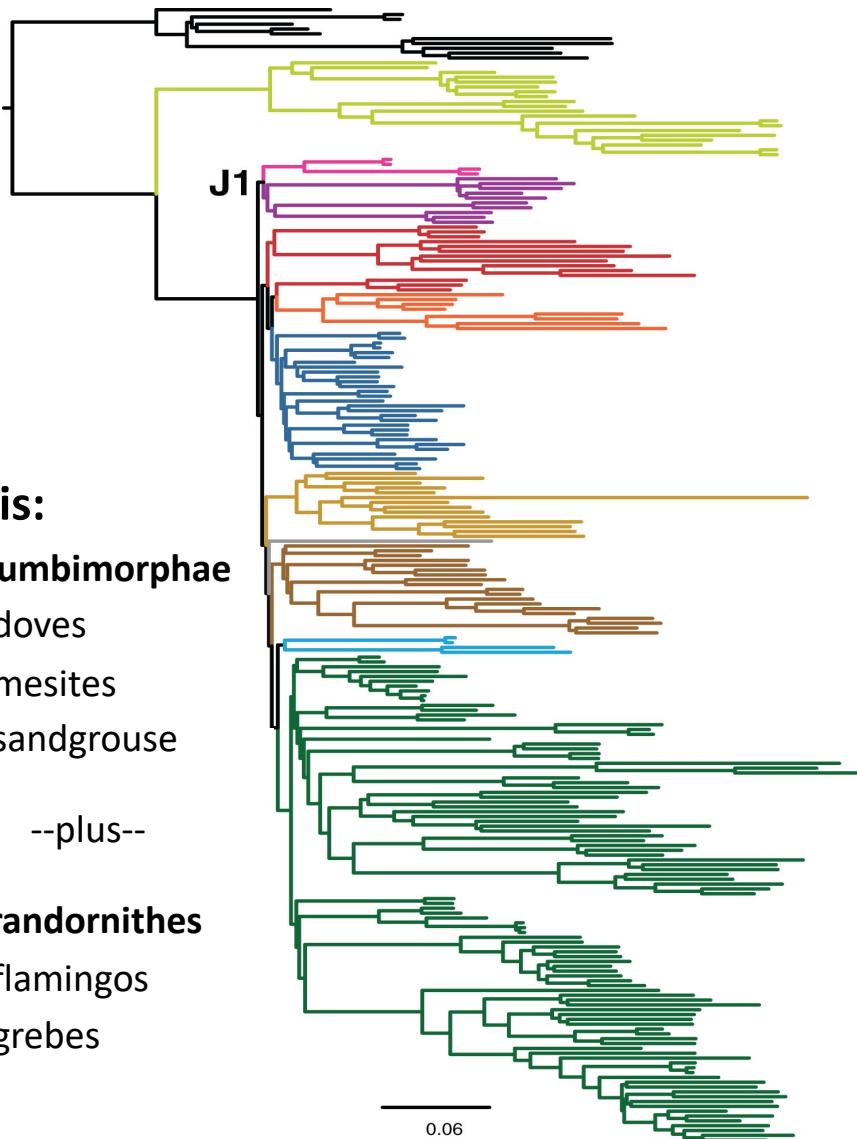
**Columbimorphae**

- doves
- mesites
- sandgrouse

--plus--

**Mirandornithes**

- flamingos
- grebes



- 54-locus tree
  - Strong support for clade J1
  - Recent phylogenies reject clade J1

Analysis and data matrix

**RAxML, fast bootstrap, GTR+Γ model**

- Early Bird II data, fully partitioned
- Early Bird II data, optimal rcluster (PF)
- Early Bird II data, unpartitioned
- Non-coding data, fully partitioned

| Clade J1 |     |     |
|----------|-----|-----|
| EB2      | KIM | JAR |

| Clade J1 |     |     |
|----------|-----|-----|
| EB2      | KIM | JAR |
| 99       | 99  | 99  |
| 97       | 97  | 100 |
| 98       | 97  | 98  |

**RAxML standard bootstrap, GTR+Γ model**

- Early Bird II data, optimal rcluster (PF)

|    |    |    |
|----|----|----|
| 96 | 97 | 98 |
|----|----|----|

**IQ-TREE ultrafast bootstrap, I+Γ rates**

- Early Bird II data, fully partitioned
- Early Bird II data, optimal rcluster (PF)
- Early Bird II data, unpartitioned
- Non-coding data, fully partitioned

|     |     |     |
|-----|-----|-----|
| 100 | 99  | 99  |
| 100 | 100 | 100 |
| 100 | 100 | 100 |

**IQ-TREE ultrafast bootstrap, free rates**

- Early Bird II data, fully partitioned
- Non-coding data, fully partitioned

|     |     |     |
|-----|-----|-----|
| 100 | 100 | 100 |
| 100 | 100 | 100 |

# WHY DOES REDDY SUPPORT J1?

J1 is:

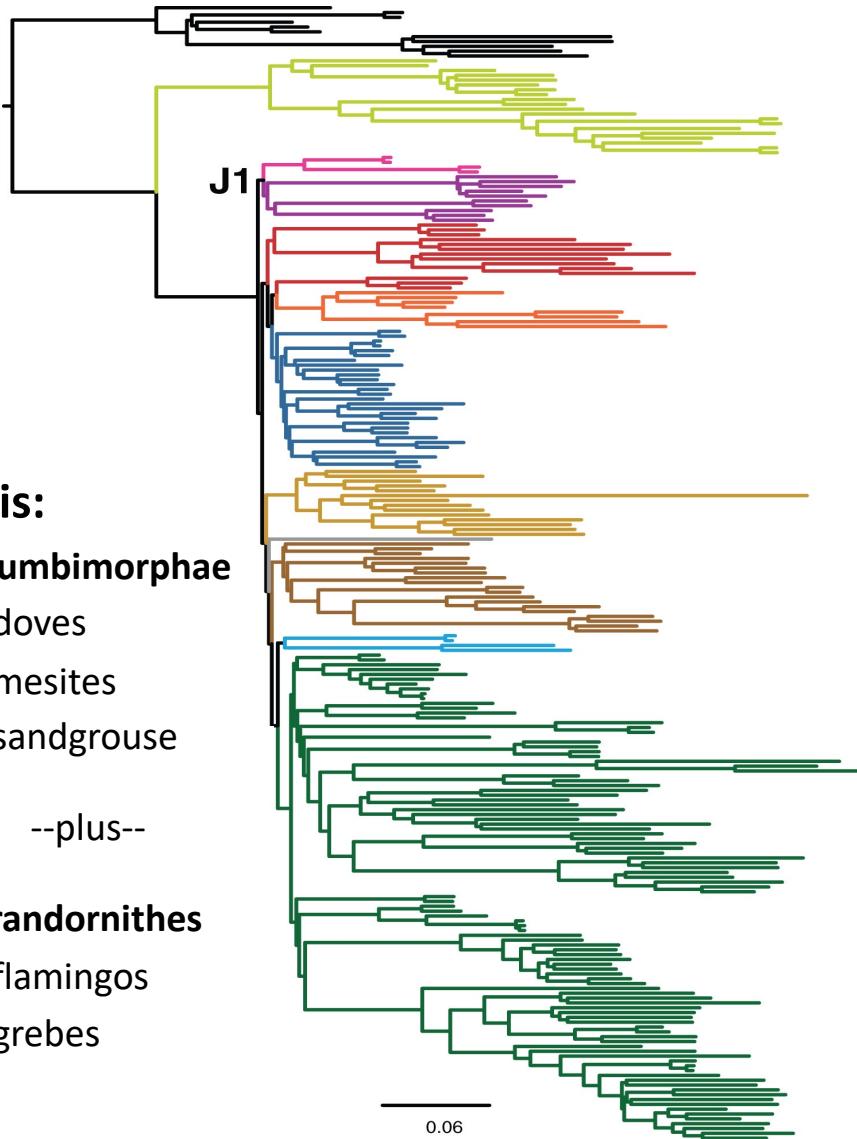
**Columbimorphae**

- doves
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**Mirandornithes**

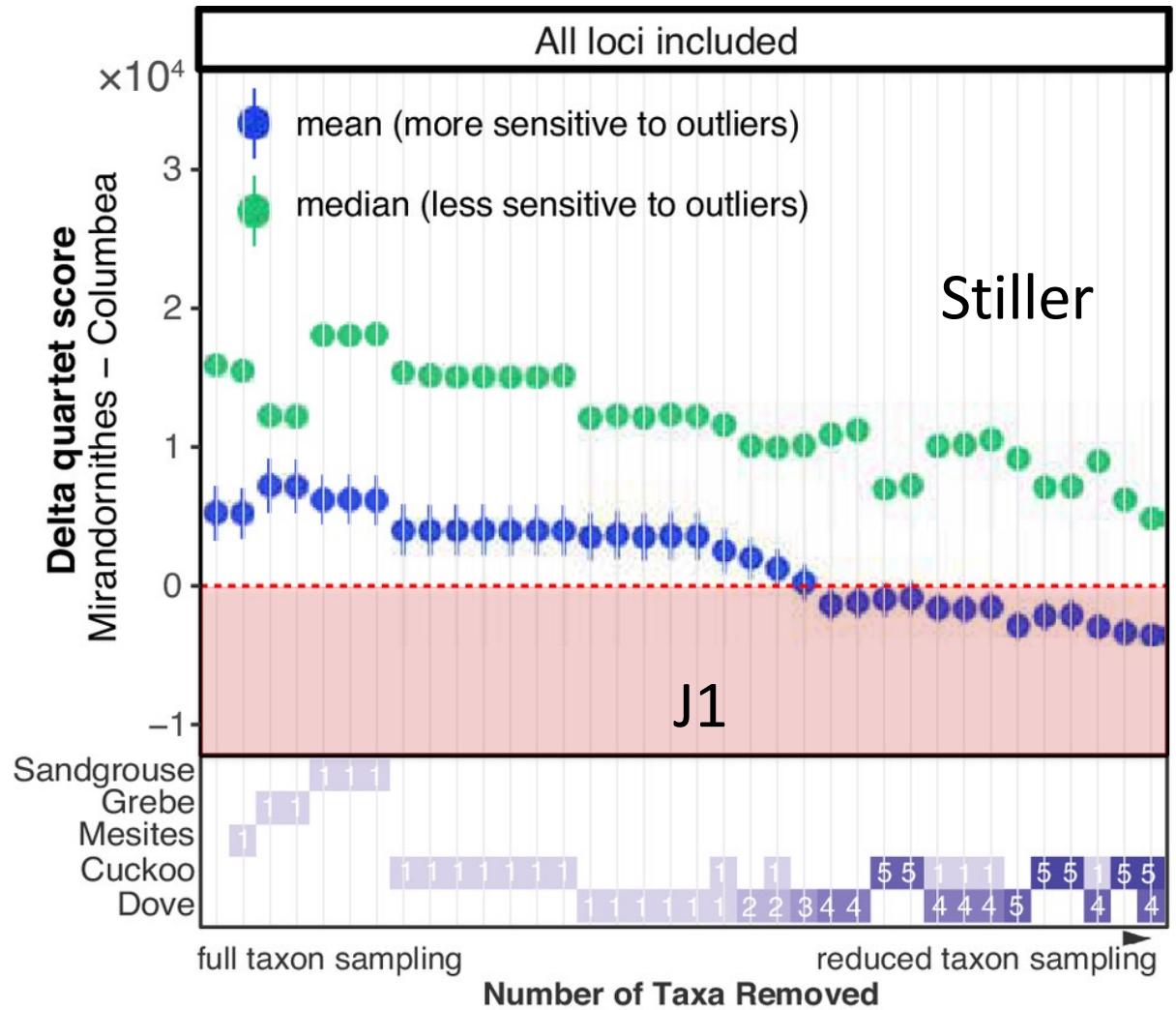
- flamingos
- grebes



- Few large-scale trees support J1
  - Most phylogenomic trees (e.g., Prum et al. 2015; Wu et al. 2024) have low support at the base
  - Stiller et al. 2024 has high support, but it contradicts J1
- **Exception** - Jarvis et al. (2014) has 100% bootstrap support
  - Jarvis has a limited taxon sample
  - But Reddy has many taxa
- Why is support so strong in Reddy and Jarvis?

# TAXON SAMPLING MATTERS

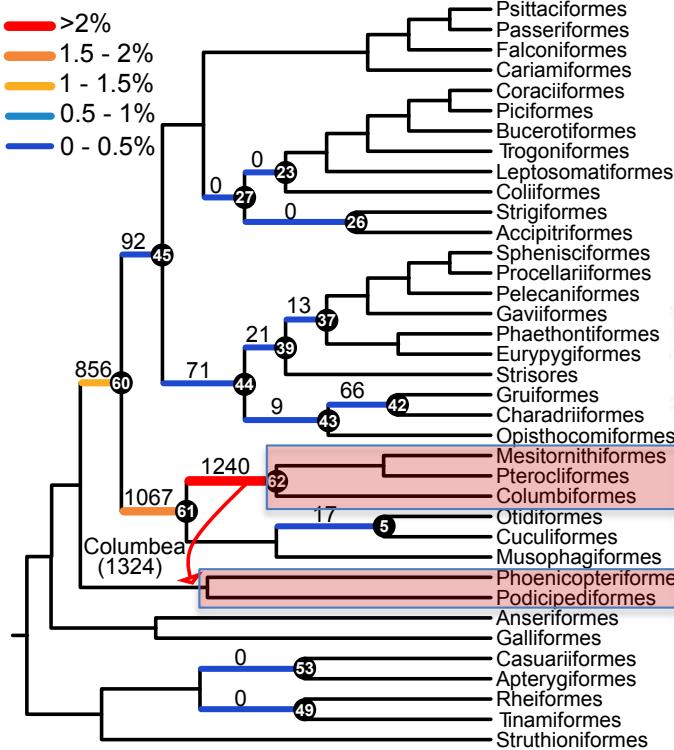
- Smaller taxon samples tend to support J1
  - Explains Jarvis result
  - But not Reddy!
- **Median quartet score supports Stiller (not J1)**
- Produced smaller taxon samples by pruning trees
  - Gene trees estimated using >300 taxa
- Mean vs median quartet scores differ



# GENE TREES SUPPORTING J1 ARE CLUSTERED

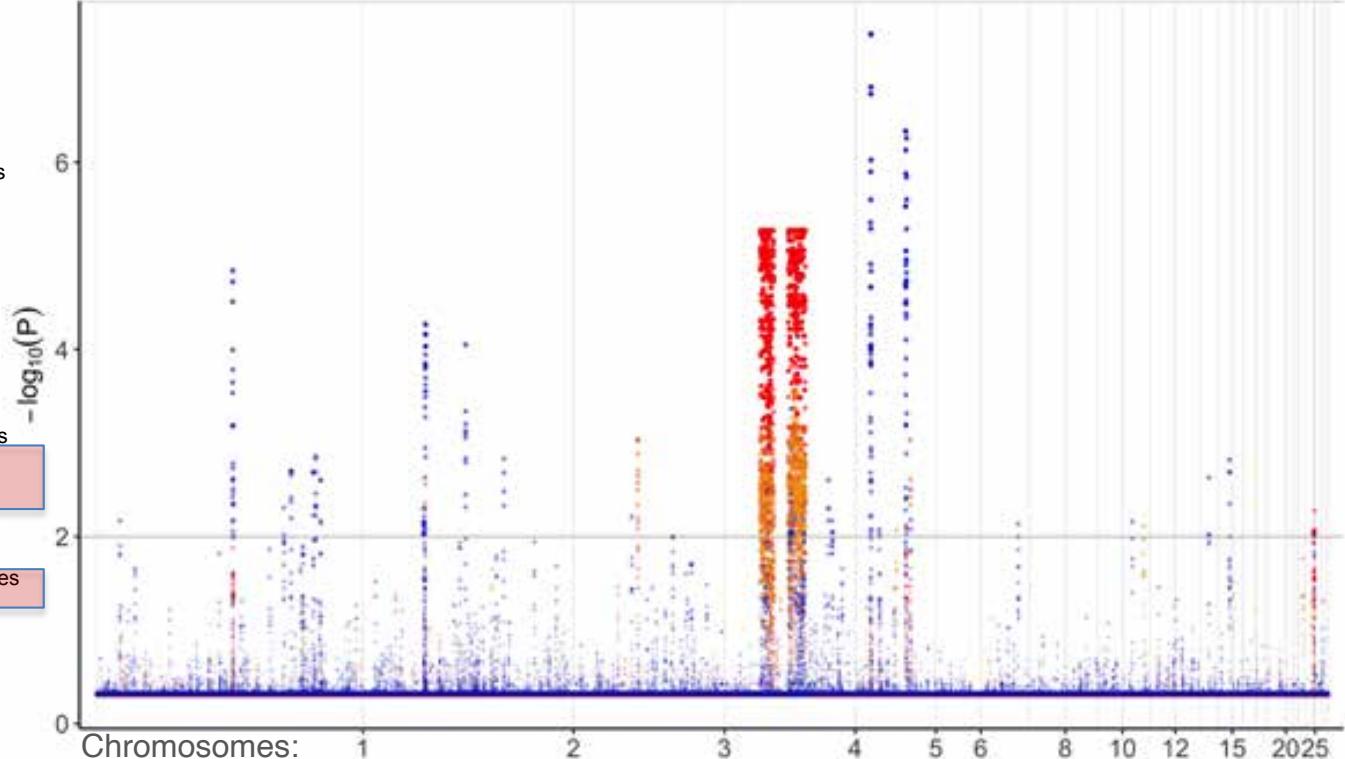
- Approximately 2% of the genome strongly supports clade J1
- Manhattan plot shows  $-\log(P)$  that 20-locus (~200 kb) windows have unusual quadripartition quartet support

A)



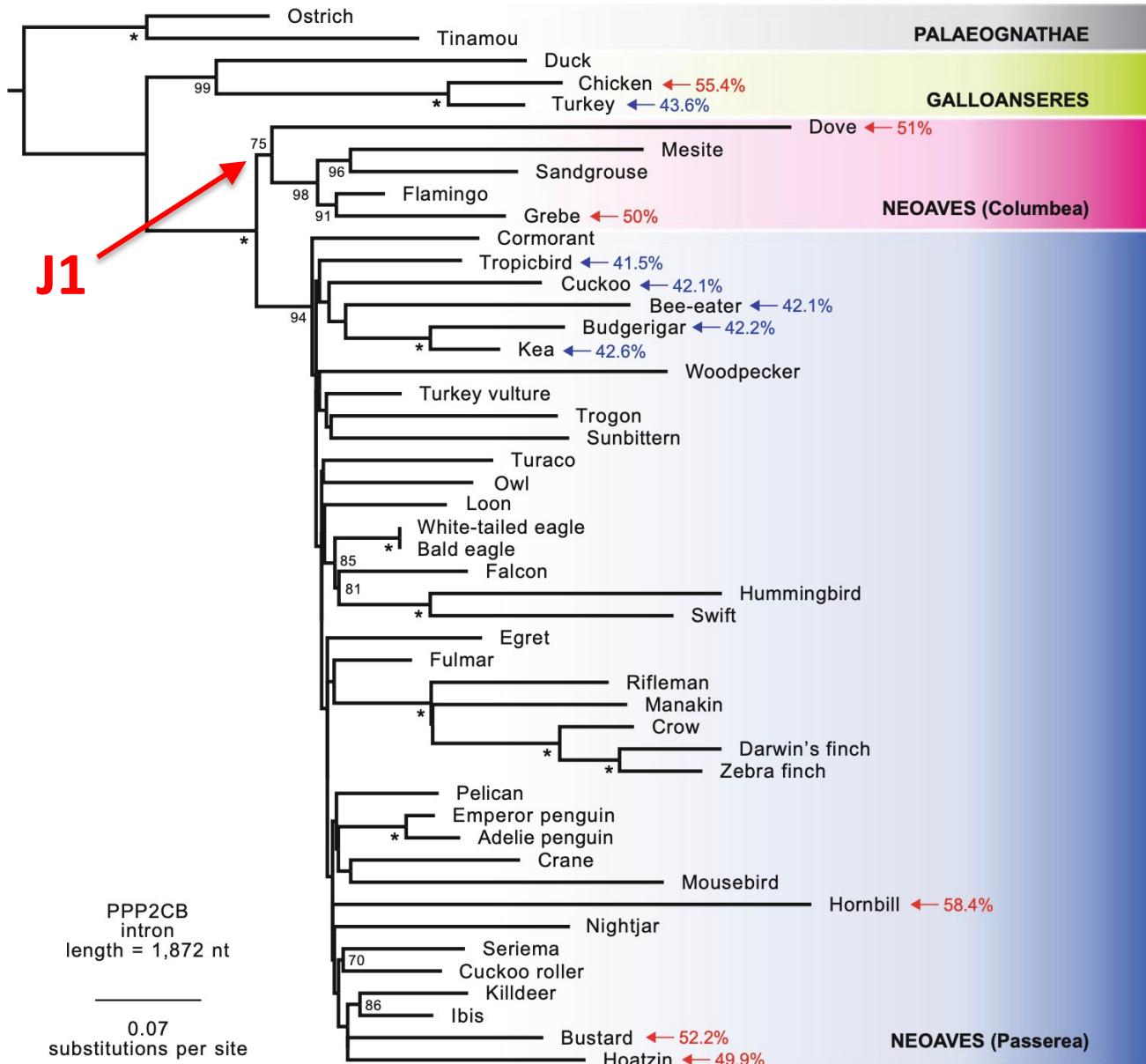
J1 taxa

B)



# PPP2CB –REDDY ET AL. OUTLIER LOCUS

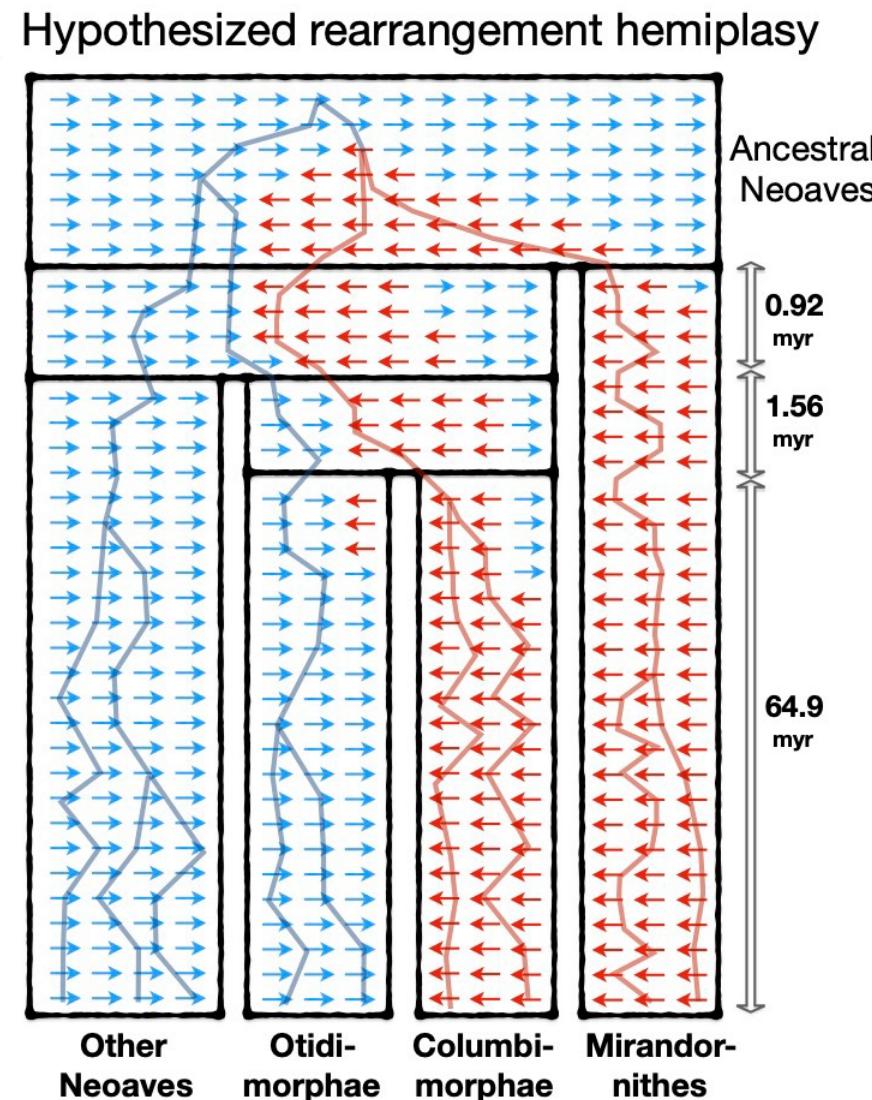
- Short region but 75% support for clade J1
  - J1 = “Columbea”
- Result attributed to limited variation in base composition
  - PPP2CB has a “better” tree than BDNF
- BUT.. PPP2CB lies in the outlier region
  - Supports J1



Braun et al. (2019) chapter  
in “Avian Genomics” book

# MODEL FOR CHROMOSOME 4 EVOLUTION

- ~ 2% of the bird genome have a specific gene tree
  - Recombination suppressed in the “outlier region”
  - Shifts estimates of the avian species tree to include clade J1
    - (for limited taxon samples)
  - ASTRAL and concatenation
- Reddy et al. (2017) **recovered J1** because **one of 54 loci** is in the outlier region

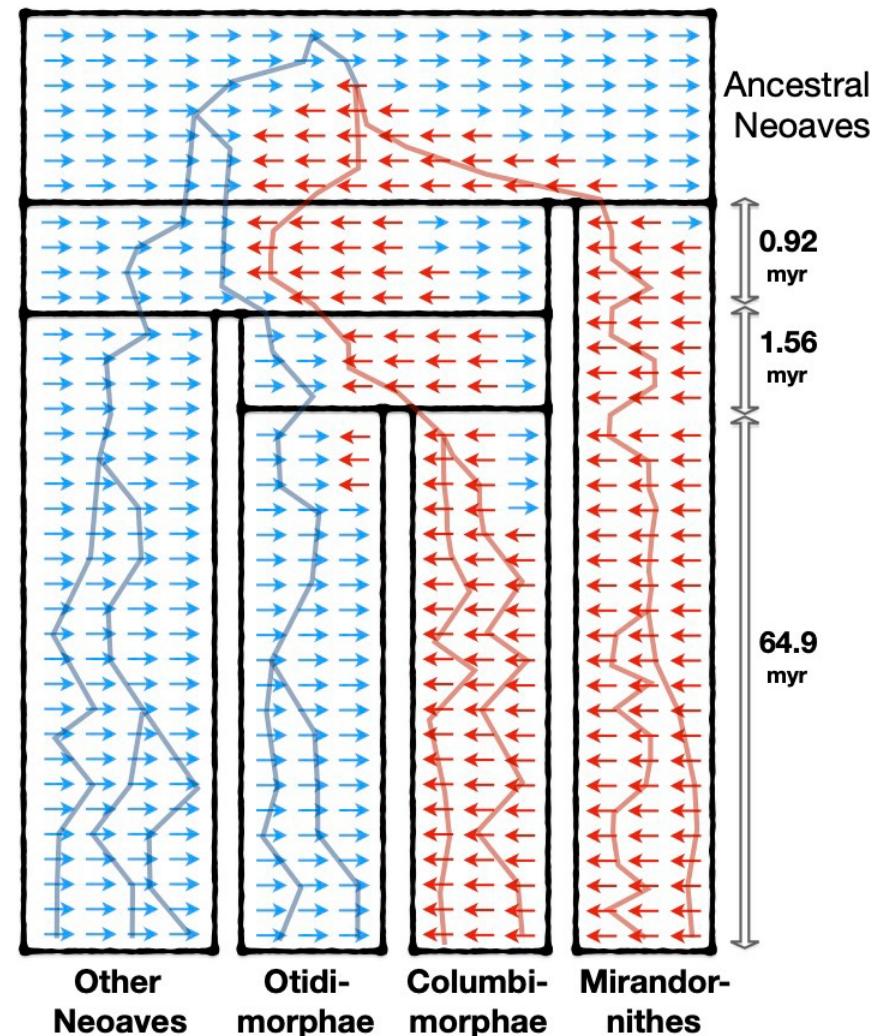


Mirarab et al. (2024) PNAS

# IMPACT OF CHROMOSOME 4 EVOLUTION

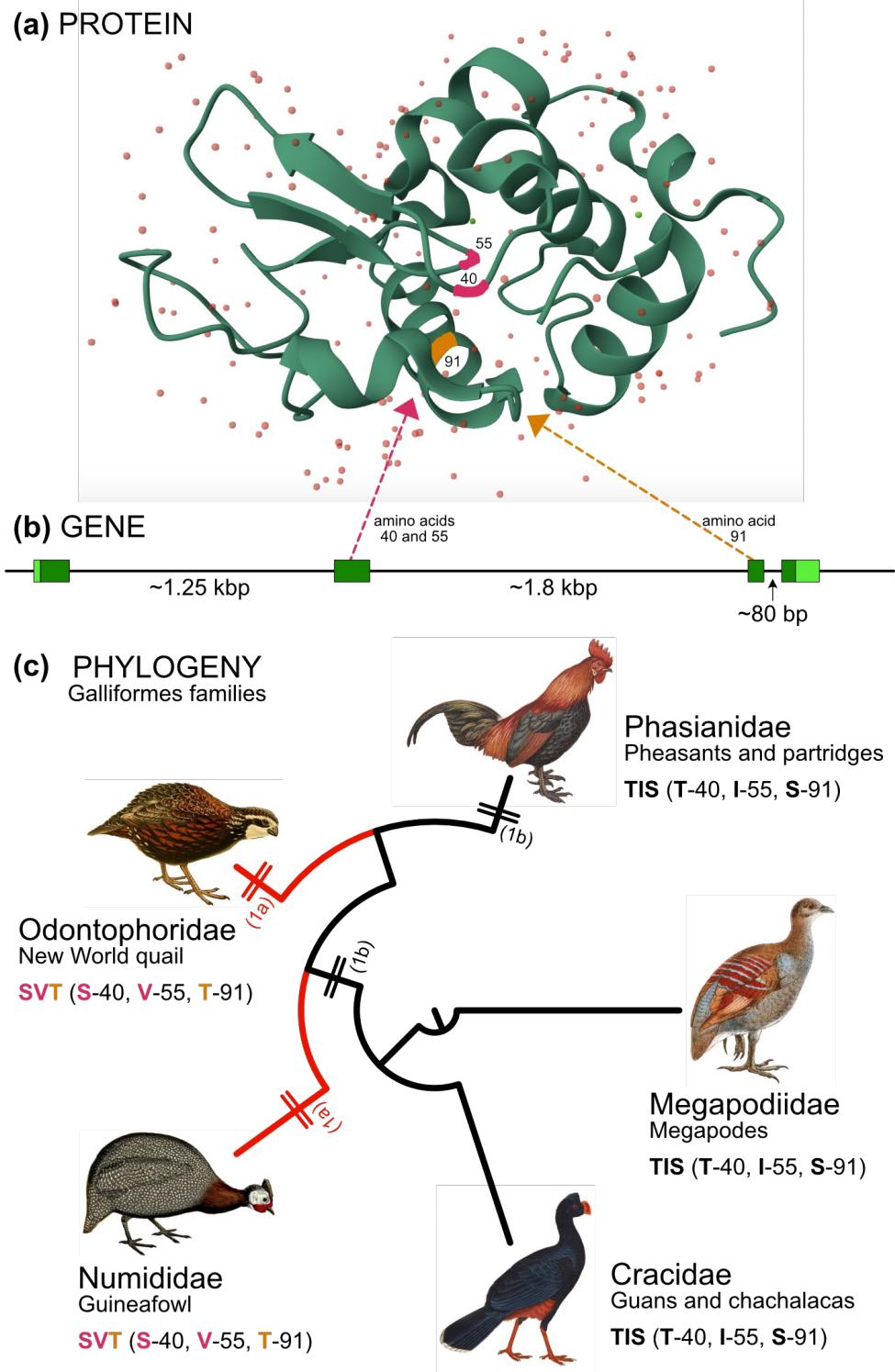
- Ancient (>60 mya) chromosomal rearrangement was polymorphic for a few million years
  - Detected by **absence of ILS** in the region
  - For birds, recombination will limit recombination free segments to a mean length of 5(!) to 5000 bp
- Persistence in population could reflect neutral evolution
  - Alternatively, could be balancing selection (weak evidence)

Hypothesized rearrangement hemiplasy



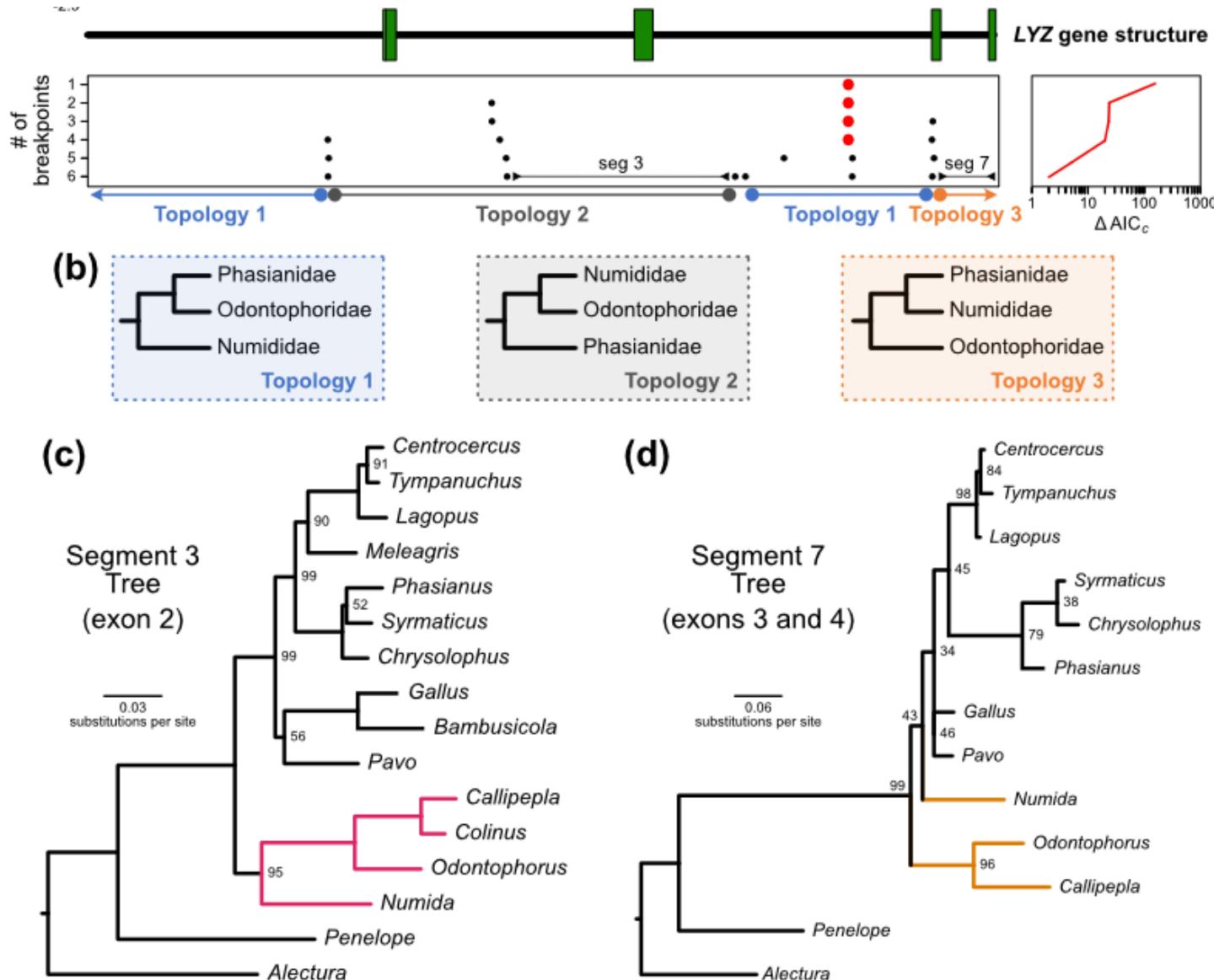
# RECOMBINATION

- Estimates of recombination-free region lengths are ~5 kb for large chromosomes
  - Are the estimates realistic?
- Protein with changes at three functionally important amino acids
  - Encoded by gene on chr 1 (largest chromosome)
- Changes would have to occur twice given the species tree



# RECOMBINATION

- Recombination-free segments are ~1 kb on chr 1

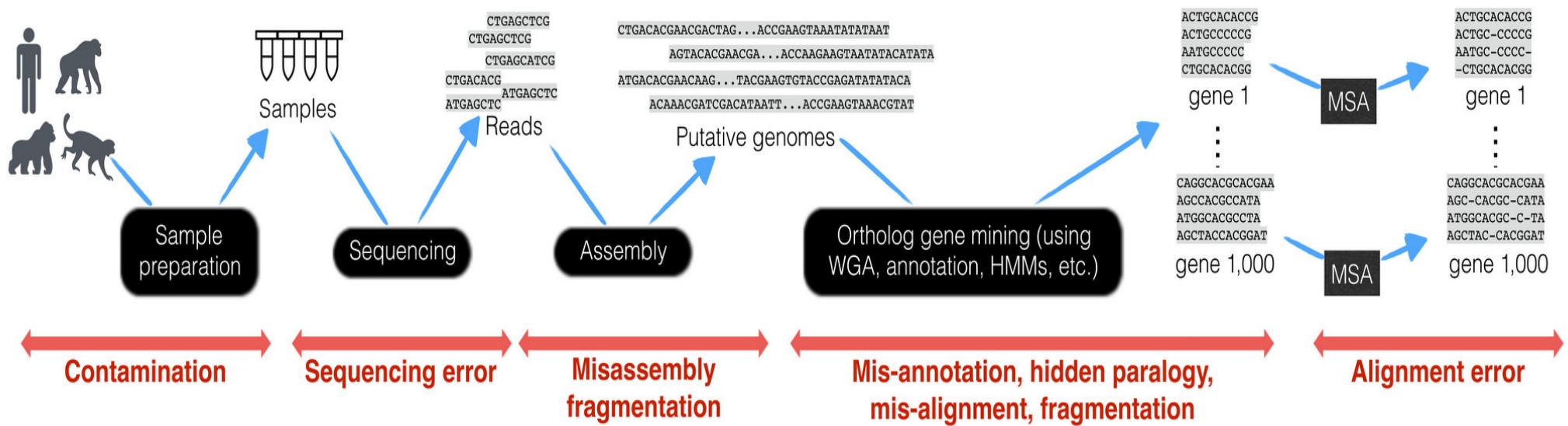


# TECHNICAL ISSUES

- Sequence alignment
  - Including the extraction of orthologous data
- Sequence assembly

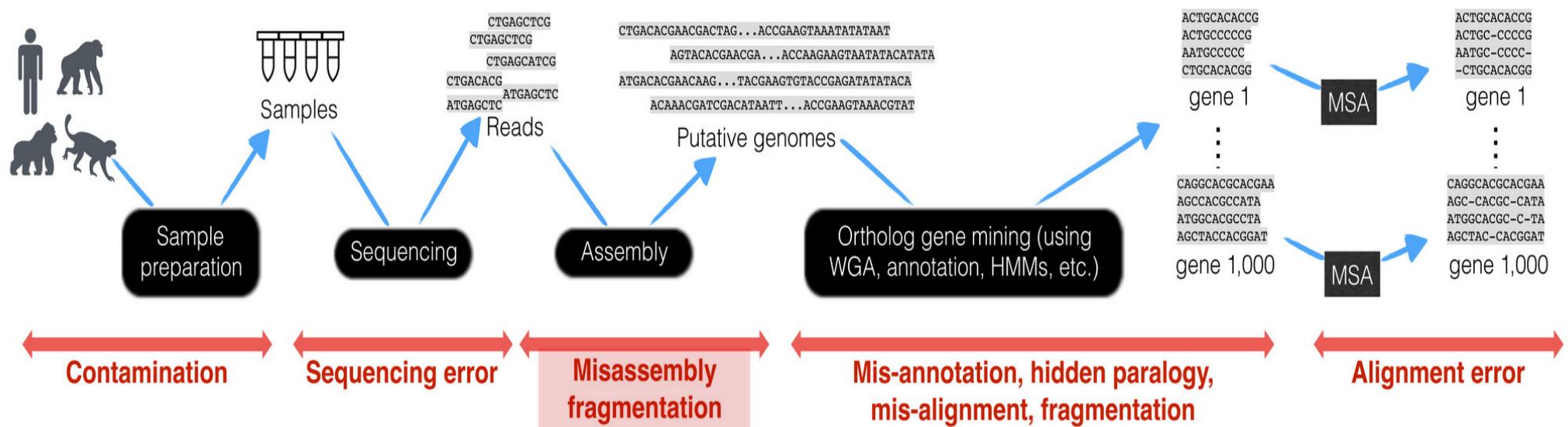
# TECHNICAL ISSUES

- There are many (potentially) problematic steps in phylogenomic pipelines



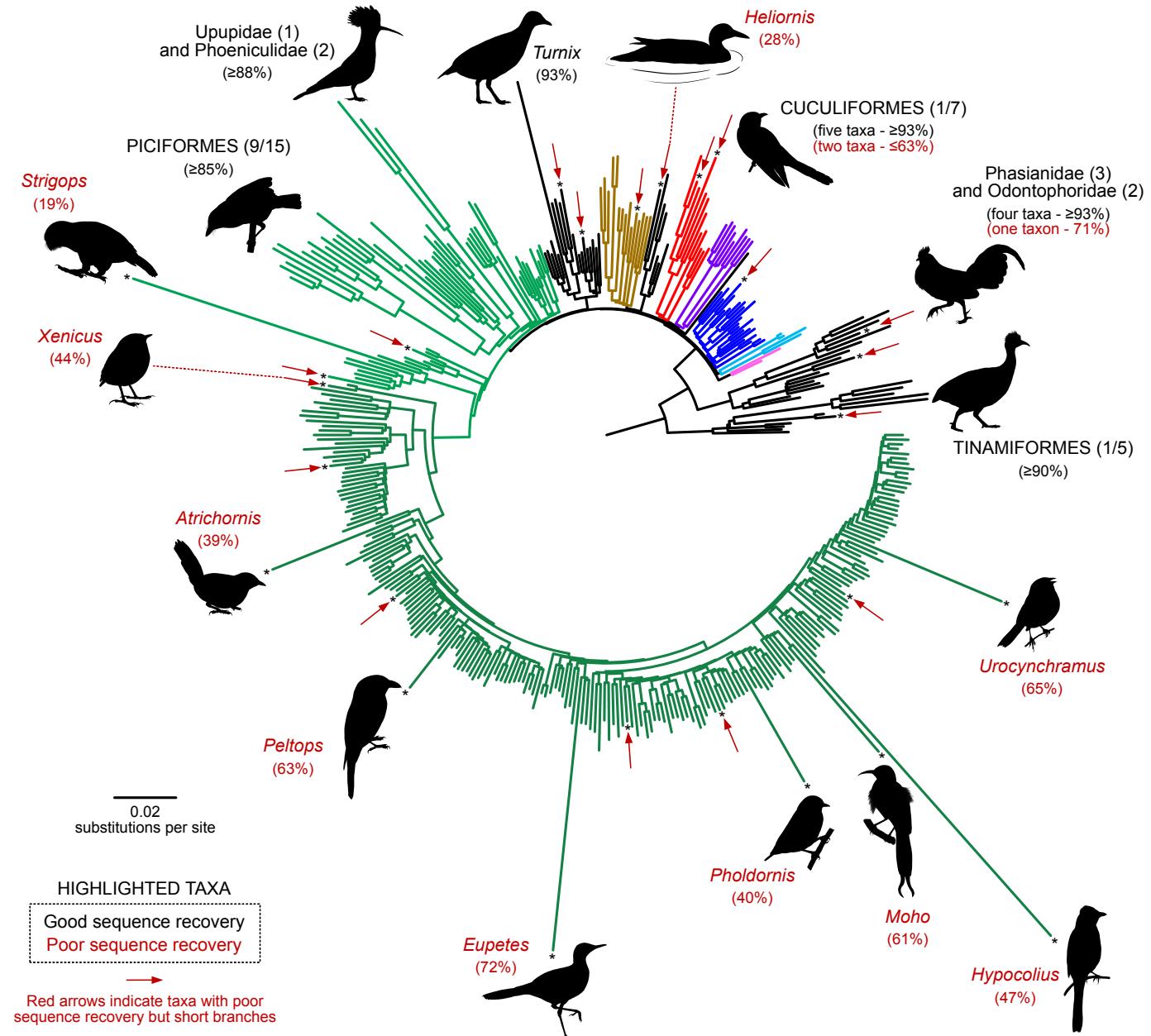
# SEQUENCE ASSEMBLY

- What is the potential for misassembly?



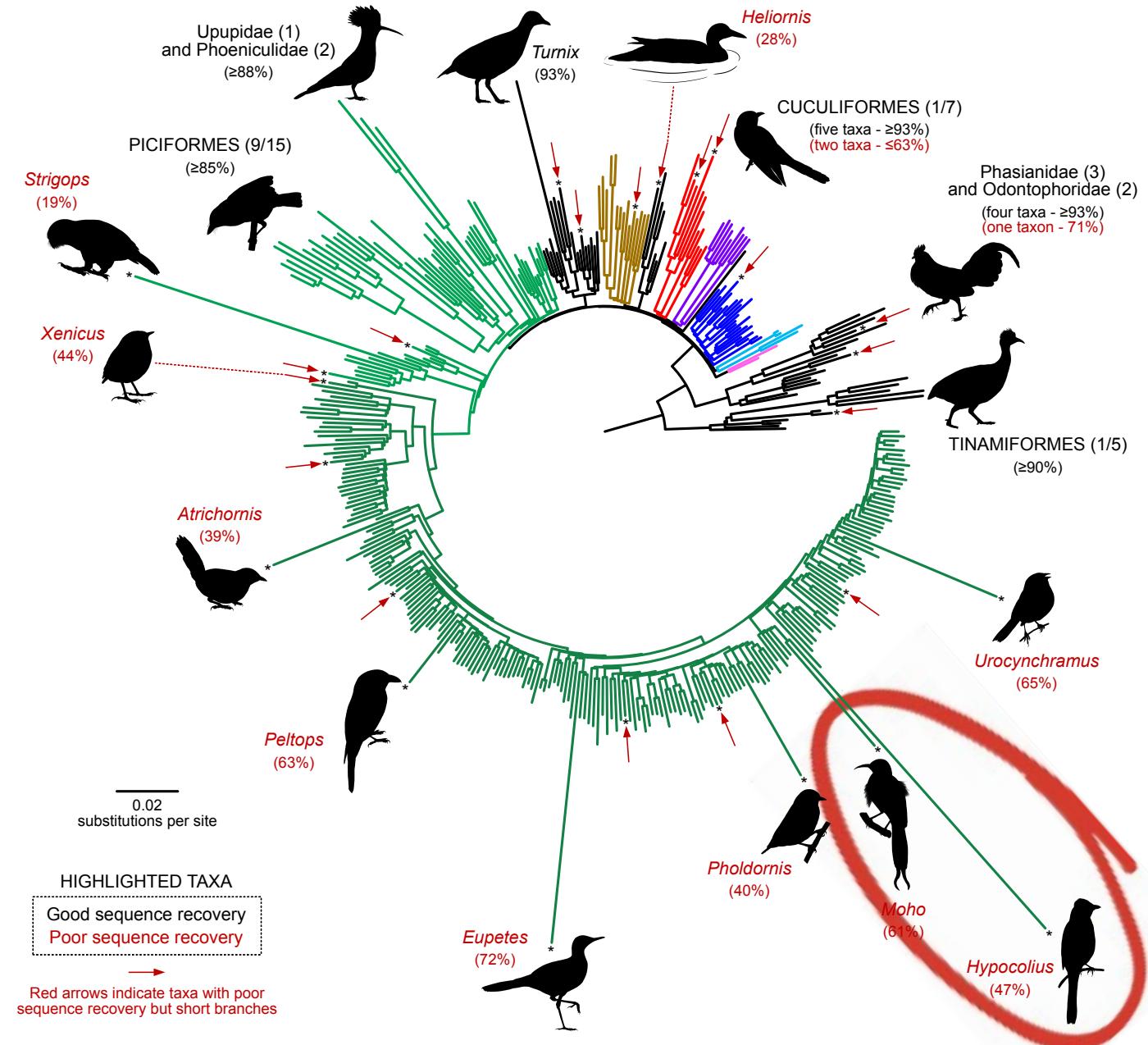
# A UCE TREE (“ALLFAM”)

- Typical patterns of branch length heterogeneity are evident...
- ...but there are also additional long branches evident
  - Taxa with **red names** had poor sequence recovery
  - The **red arrows** also indicate poor sequence recovery



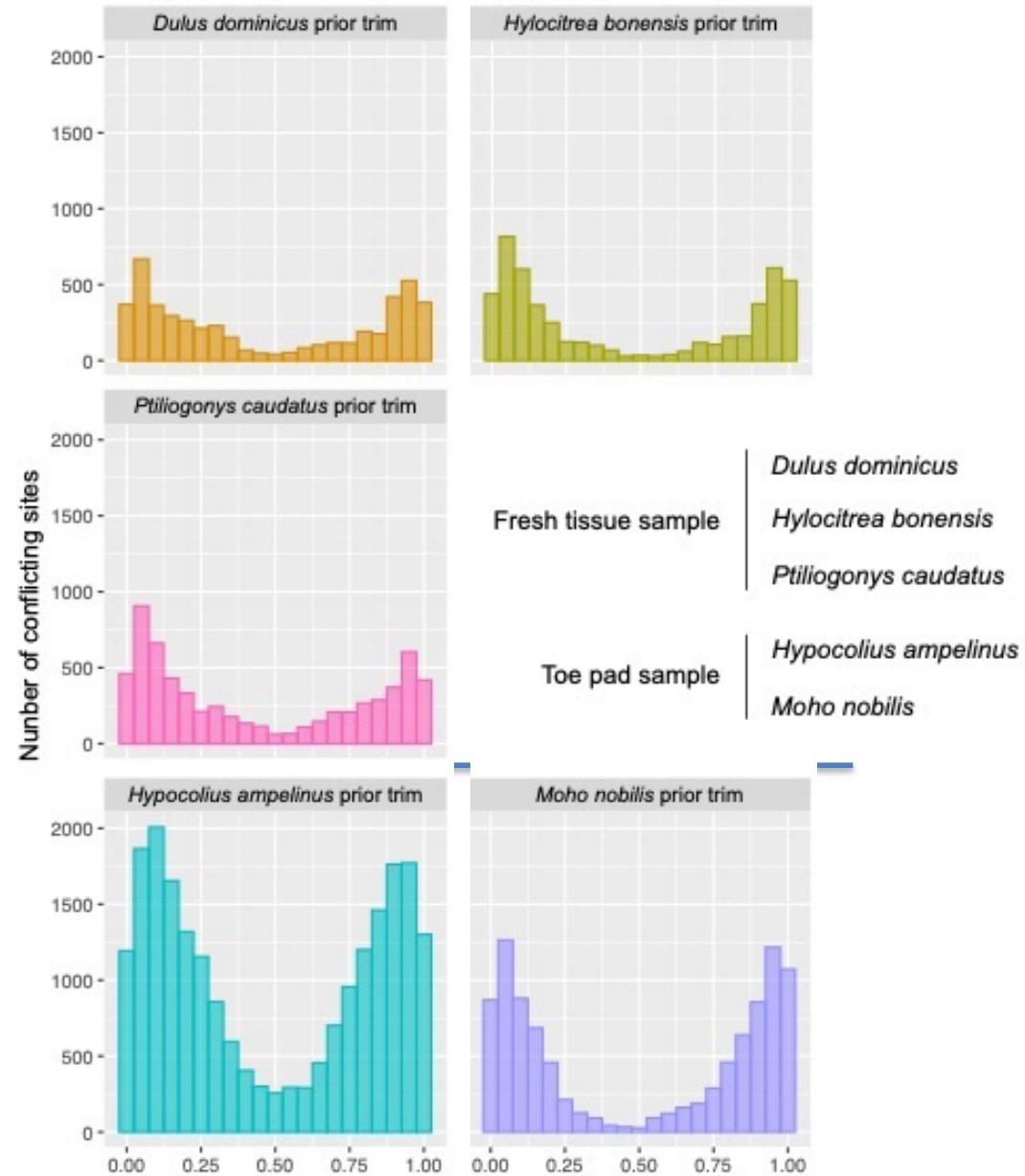
# A UCE TREE (“ALLFAM”)

- Both circled taxa were from historical samples
  - *Moho nobilis\** (Hawai‘i ‘ō‘ō)
  - *Hypocolius ampelinus* (Grey hypocolius)
  - Sister group:
    - *Hylocitrea bonensis* (yellow-flanked whistler)
      - Short branch



# CONFLICTS BETWEEN ASSEMBLERS

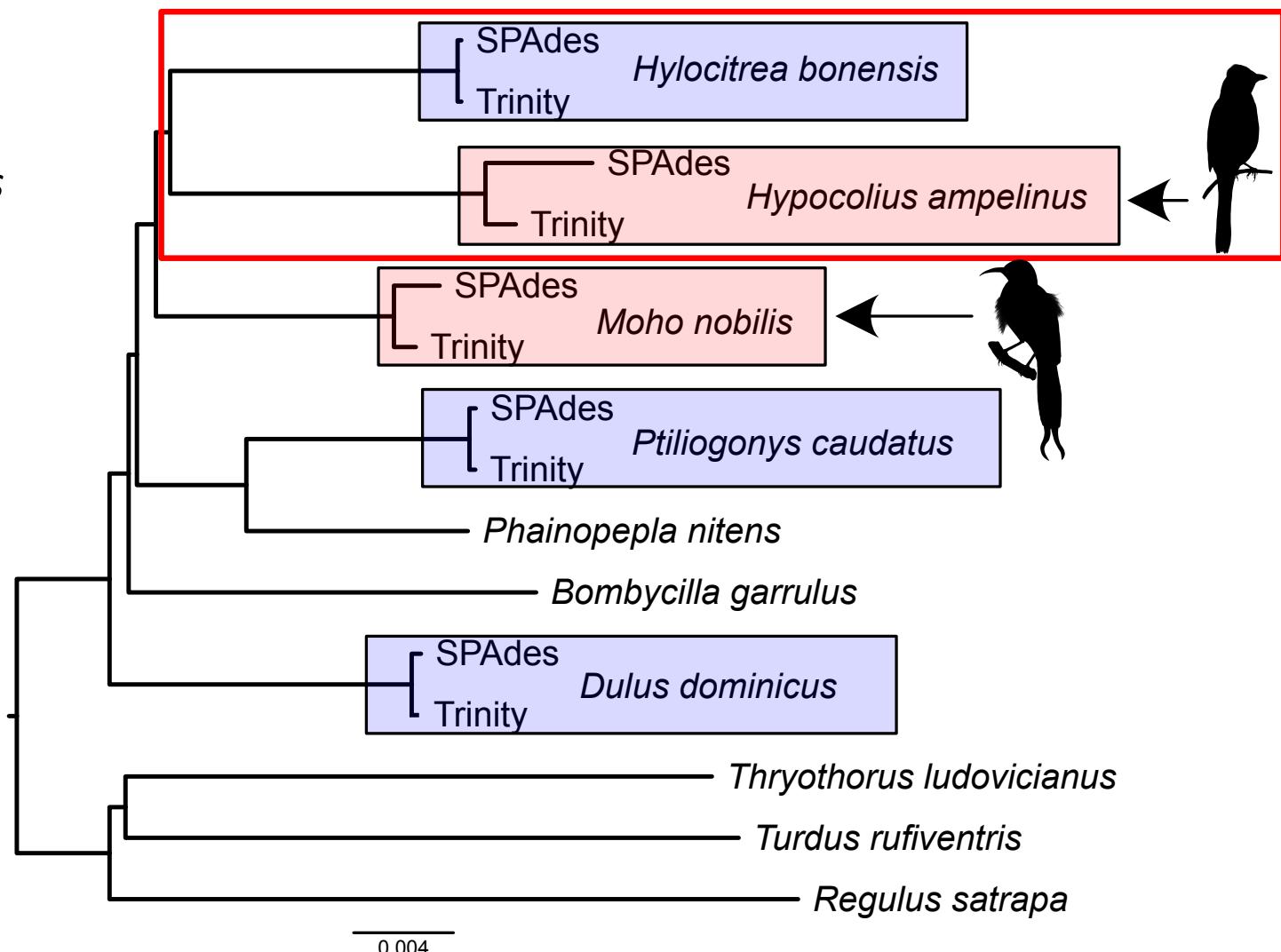
- Re-assemble data using two different programs
  - SPAdes and Trinity
  - Original assemblies were SPAdes (different settings)
- Two historical
  - *Moho nobilis* (extinct)
  - *Hypocolius ampelinus*
  - Form a clade in “allfam”
- Three recent
  - *Dulus dominicus*
  - *Hylocitrea bonensis*\*
  - *Ptiliogonys caudatus*



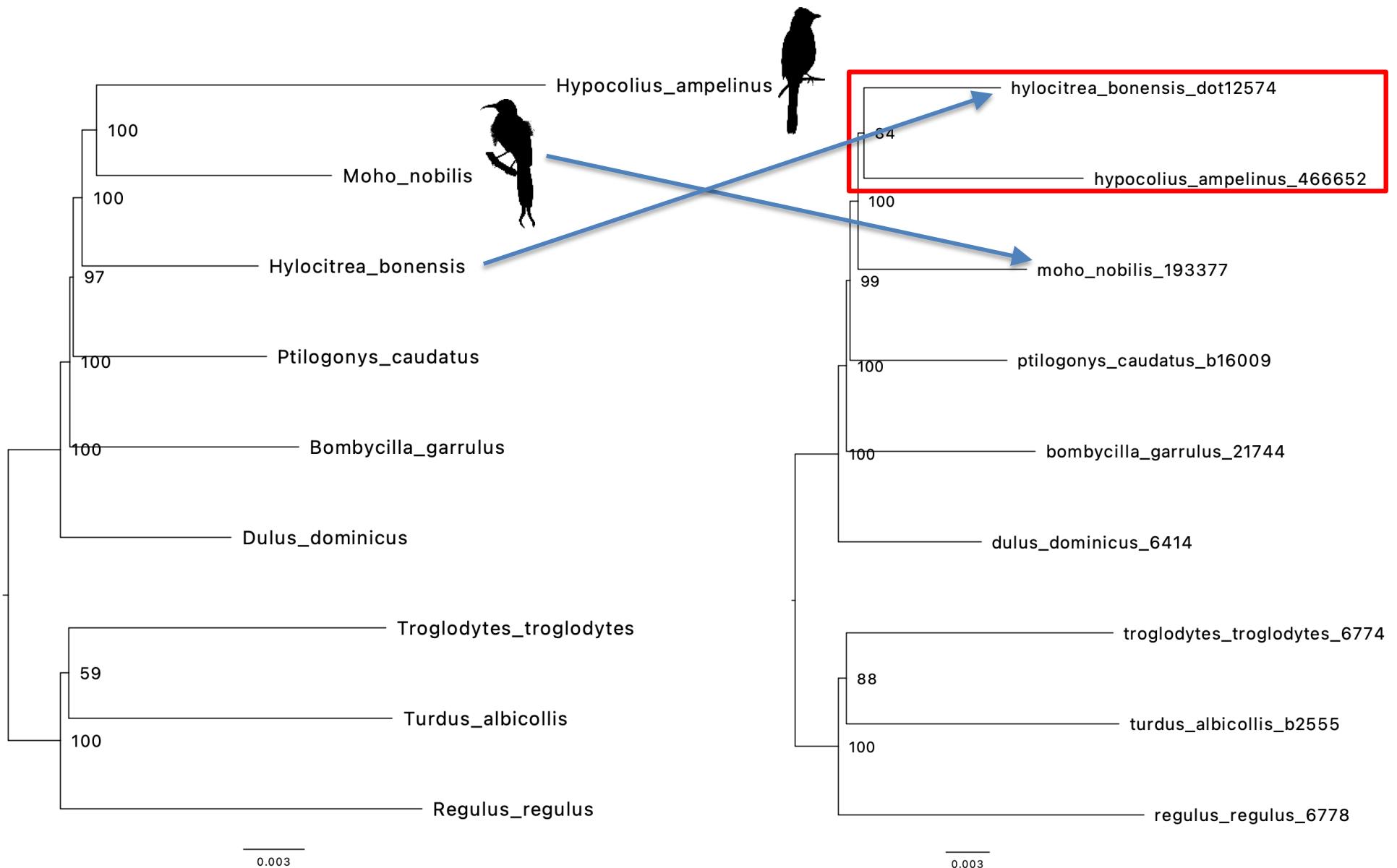
\* Sister to “historical taxa clade”

# LONG BRANCHES REFLECT ASSEMBLY

- Tree with different assemblies treated as taxa
- *Moho* and *Hypocolius* have shorter root-to-tip branches
  - Comparable to *Hylocitrea*
- Different topology (note red box)
- **Terminal branches longer for historical samples!**



# ALIGNMENTS FROM BRAUN ET AL. 2024 (LEFT) VS REALIGNED DATA USING THE SAME ASSEMBLIES (RIGHT)



# ASSEMBLY AND ALIGNMENT

- So...what are the relationships for *Hypocolius*, *Moho*, and *Hylocitrea*?
  - *Hypocolius* and *Hylocitrea* form a clade (with *Moho* sister) with all assemblies (and all taxon samples) where *Hypocolius* has a short branch
  - *Hypocolius* + *Hylocitrea* found if conflicts between assemblers recoded as N's
- Long branches are artifactual
- Interaction between assembly quality and alignment

## PERFORMANCE OF VARIOUS METHODS

- Avian phylogeny has received extensive study
- It is possible to establish a set of “reliable clades” likely to be in the true bird species tree
- Can be divided into subsets based on their “easy”
  - Range from “easy” (typically supported by individual genes) to “hard” (only recovered in analyses of phylogenomic data)

|                            | Easy    | Medium  | Hard   | TOTAL    |
|----------------------------|---------|---------|--------|----------|
| Families <sup>1</sup>      | 93      | —       | —      | 93       |
| Superfamilies <sup>2</sup> | 3 / 1   | 14      | 4      | 21 / 1   |
| Orders <sup>1,2</sup>      | 36 / 1  | 3       | —      | 39 / 1   |
| Superorders <sup>2</sup>   | 7 / 5   | 12 / 11 | 9 / 8  | 28 / 24  |
| TOTAL <sup>2</sup>         | 139 / 7 | 29 / 11 | 13 / 8 | 181 / 26 |

Reliable clades that can be scored for “allfam” (left) and Jarvis (right) taxon samples

## PERFORMANCE OF VARIOUS METHODS

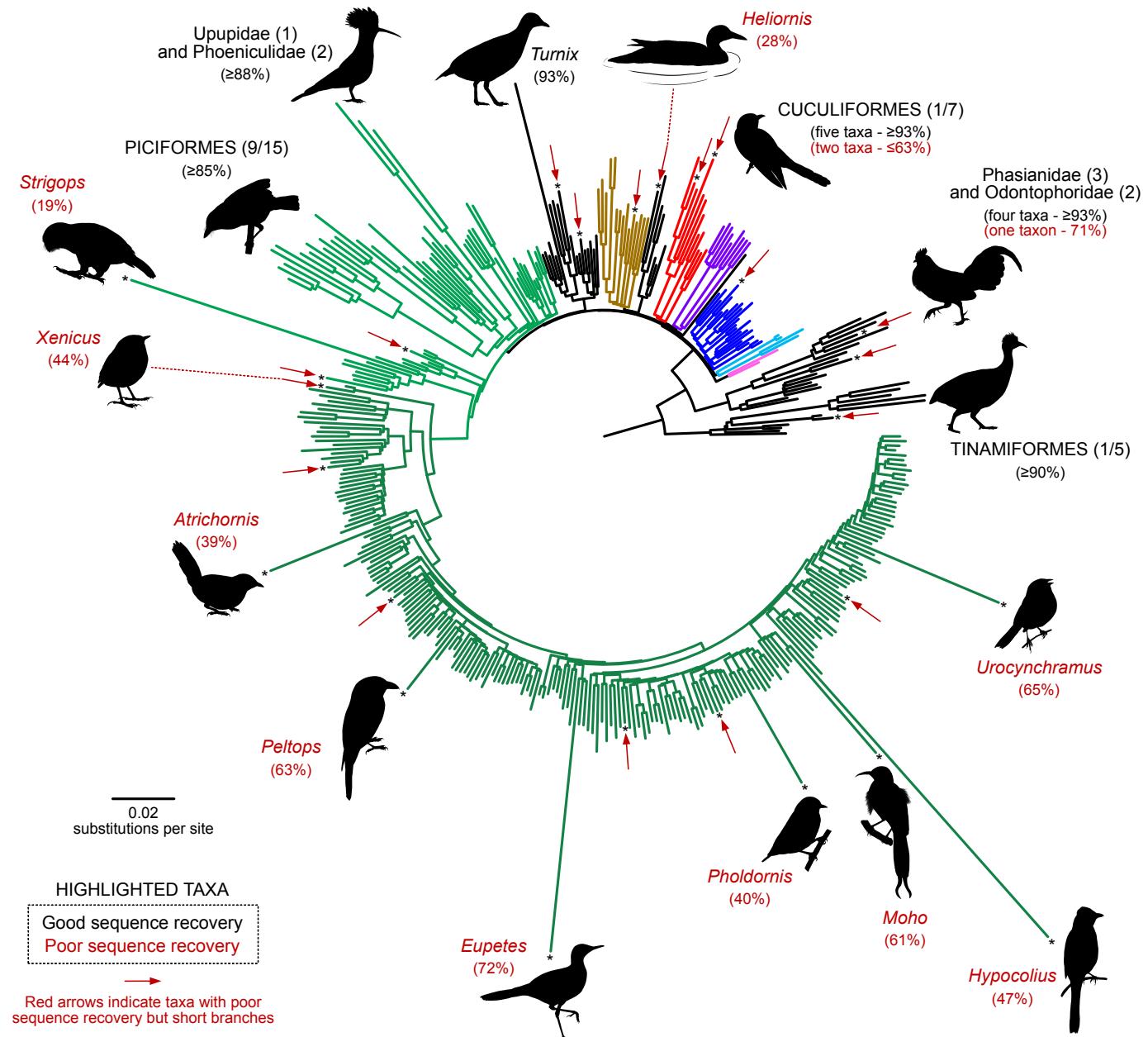
- The number of reliable clades recovered can provide a way to evaluate methods
  - Imperfect because we don't have knowledge of the true tree
  - Less controlled than simulations...
  - ...but still a useful method

|                            | Easy    | Medium  | Hard   | TOTAL    |
|----------------------------|---------|---------|--------|----------|
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| Superfamilies <sup>2</sup> | 3 / 1   | 14      | 4      | 21 / 1   |
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Reliable clades that can be scored for “allfam” (left) and Jarvis (right) taxon samples

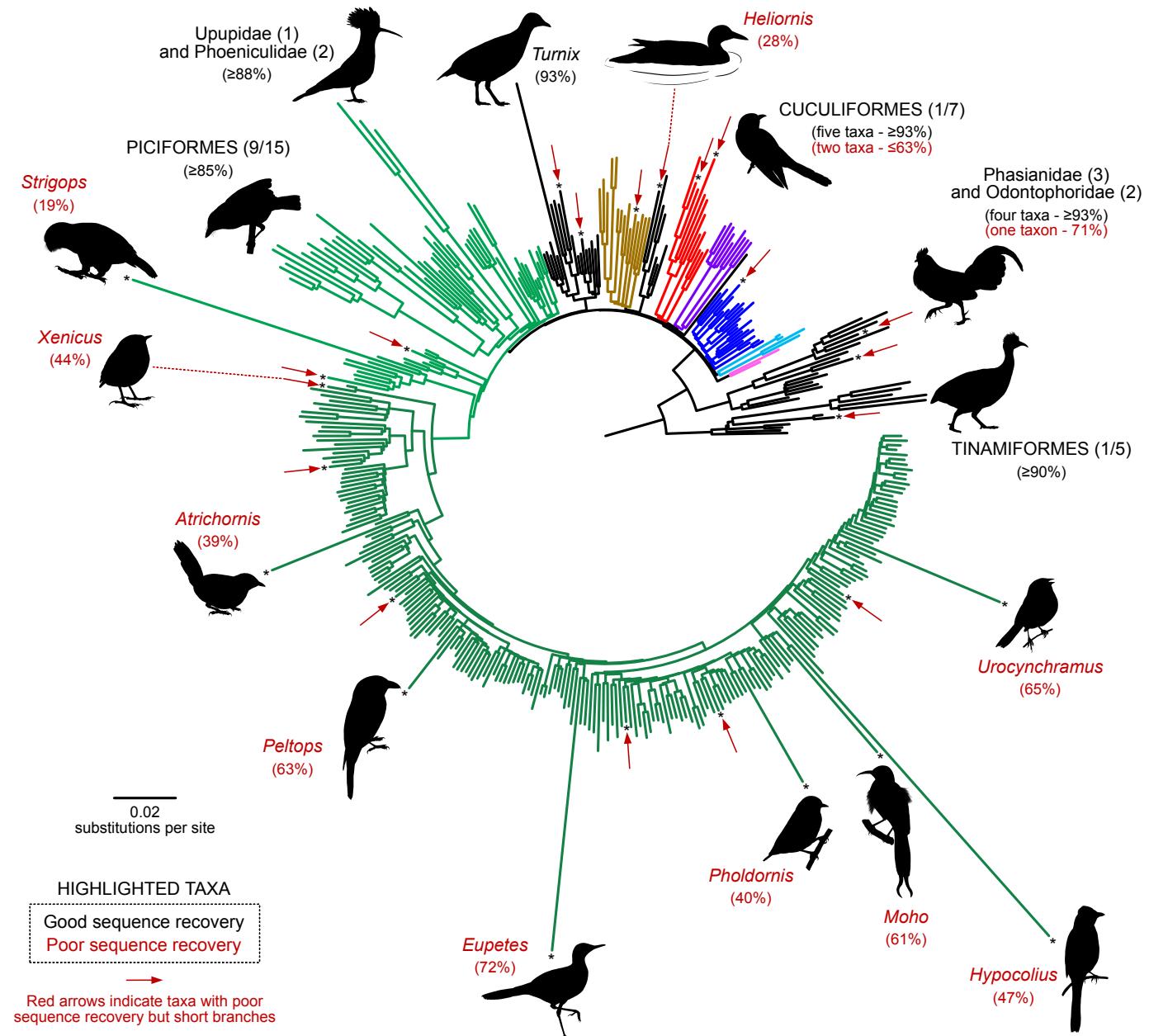
# THE ALLFAM TREE

- Phylogram based on ML analysis of concatenated data
- 4307 UCE loci
- 2,042,823 aligned sites
- 852,768 informative sites
- Initial “species tree” analyses yielded trees with many fewer reliable clades than concatenation



# THE ALLFAM TREE

- Decided to try a broad suite of species tree analyses
- ASTRAL
- ASTRID
- SVD quartets
- METAL (distances)
  - Dasarathy et al. 2015  
*IEEE/ACM TCBB* 12: 422-32
  - Allman et al. 2019 *SIAM J Appl Algebra Geometry*, 3: 107-27.



# CLADE RECOVERY

- Broken in subsets by "ease" of recovery
  - Easy at top
  - Uncertain at the bottom
  - Bold clade have TE support
- Only method with consistently good performance was ML concatenation
- Potentially unfair due to missing data

(a)

|                  | #  | Clade                          | ML concat (ExaML) | ML concat (IQ-TREE) | weighted ASTRAL | weighted ASTRID | SVD quartets | METAL (NJ)  |              |                 |             |            |                  |
|------------------|----|--------------------------------|-------------------|---------------------|-----------------|-----------------|--------------|-------------|--------------|-----------------|-------------|------------|------------------|
|                  | #  | Clade                          | 0                 | 0                   | 0               | 0               | 1            | p-distances | ML distances | Trace distances | logdet i.r. | logdet-inv | logdet inf sites |
| Easy<br>(+++)    | 1  | PALAEOGNATHAE                  | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 2  | <b>Notopalaeognathae</b>       | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 4  | NEOGNATHAE                     | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 5  | Galloanserae                   | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 6  | Neoaves                        | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 7  | <b>Mirandornithes (VII)</b>    | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 16 | Daedalornithes                 | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 33 | Passeriformes                  | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 34 | Eupasseres                     | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  |    |                                | 0                 | 0                   | 0               | 0               | 1            | 2           | 2            | 2               | 2           | 2          | 0                |
| Medium<br>(++)   | 3  | <b>Novaeratitae</b>            | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 12 | Strisores (V)                  | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 19 | <b>Aequornithes (II)</b>       | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 20 | Feraequornithes                | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 21 | Procellariimorphae             | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 24 | Telluraves (I)                 | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 26 | Cavitaves                      | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 27 | Eucavitaves                    | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 28 | Picocoraciæ                    | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 30 | Australaves                    | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 31 | Eufalconimorphae               | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 32 | Psittacopasserae               | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  |    |                                | 1                 | 1                   | 1               | 0               | 5            | 8           | 9            | 9               | 8           | 8          | 5                |
| Hard<br>(+)      | 8  | Columbimorphae (VI)            | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 9  | Pteroclimesites                | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 11 | <b>Musophagotides</b>          | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 17 | Phaethoquornithes              | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 18 | <b>Phaethontimorphae (III)</b> | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 22 | Pelecanimorphae                | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 23 | <b>Pelecanes</b>               | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 25 | Coraciimorphae                 | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 29 | <b>Picodynastornithes</b>      | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  |    |                                | 1                 | 1                   | 1               | 1               | 1            | 5           | 7            | 7               | 7           | 7          | 5                |
| Uncertain<br>(-) | 10 | Otidimorphae (IV)              | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 13 | Vanescaves                     | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 14 | Sedentaves                     | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | 15 | Letornithes                    | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | -  | Afroaves                       | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | -  | Accipitriformes+Strigiformes   | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                  | -  | Coraciimorphae+Australaves     | 1                 | 1                   | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |

(b)

|                         | Tree | Non-monophyletic Orders | Families |
|-------------------------|------|-------------------------|----------|
| <b>ML concatenation</b> |      |                         |          |
| IQ-TREE                 | 0    | 0                       |          |
| ExaML                   | 0    | 0                       |          |
| <b>MSC methods</b>      |      |                         |          |
| weighted ASTRAL         | 1    | 6                       |          |
| weighted ASTRID         | 0    | 4                       |          |
| SVD quartets            | 3    | 1                       |          |
| <b>METAL (NJ)</b>       |      |                         |          |
| p-distances             | 4    | 4                       |          |
| ML distances            | 5    | 4                       |          |
| Trace distances         | 5    | 4                       |          |
| logdet i.r.             | 4    | 4                       |          |
| logdet-inv              | 4    | 4                       |          |
| logdet inf sites        | 0    | 3                       |          |

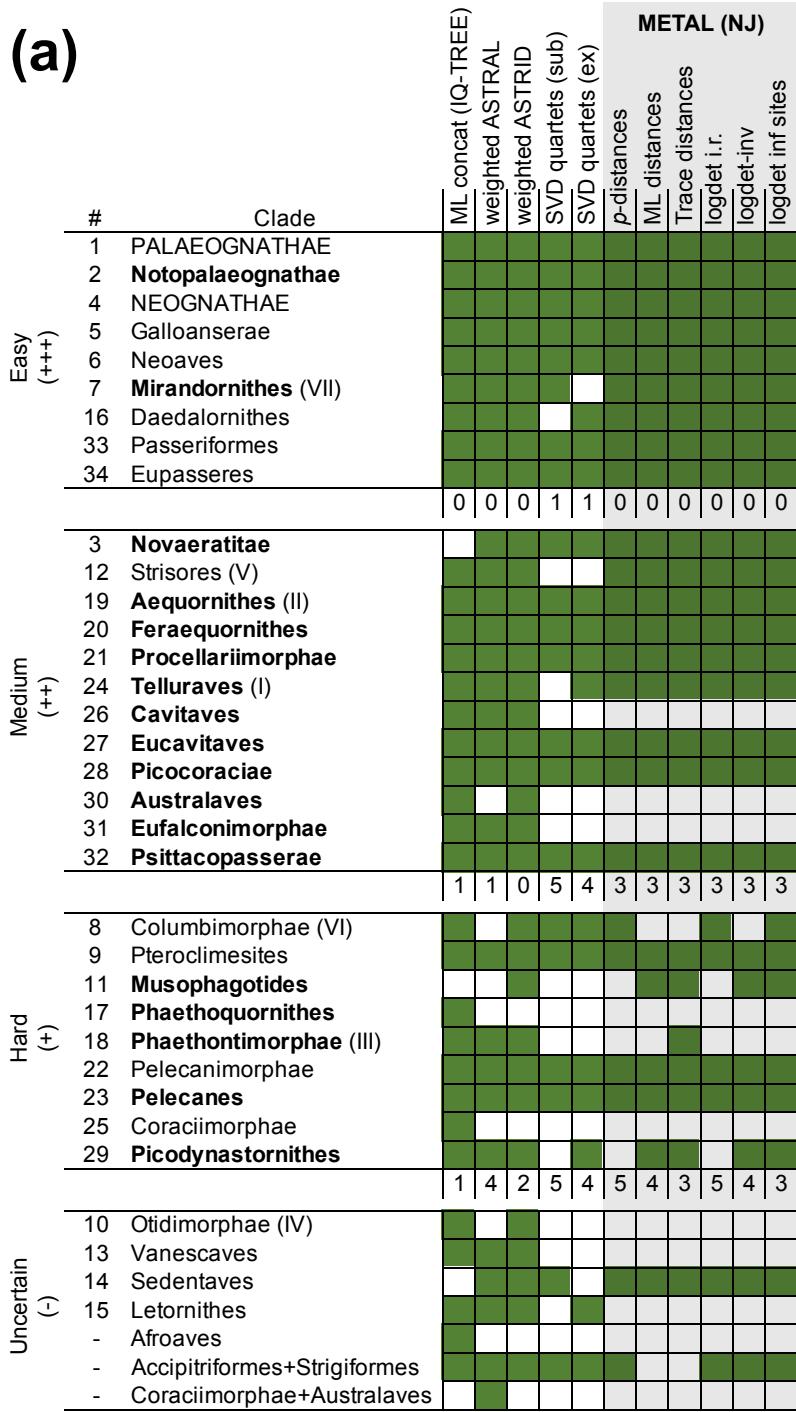
(c)

|                | Clade                | ML concat (IQ-TREE) | ML concat (ExaML) | weighted ASTRAL | weighted ASTRID | SVD quartets | p-distances | ML distances | Trace distances | logdet i.r. | logdet-inv | logdet inf sites |
|----------------|----------------------|---------------------|-------------------|-----------------|-----------------|--------------|-------------|--------------|-----------------|-------------|------------|------------------|
| Easy<br>(+++)  | Tyranni (suboscines) | 1                   | 1                 | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                | Passeri (oscines)    | 0                   | 0                 | 0               | 0               | 0            | 0           | 0            | 0               | 0           | 0          | 0                |
| Medium<br>(++) | Eurylaimides         | 1                   | 1                 | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                | Tyrannides           | 1                   | 1                 | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                | Furnariida           | 1                   | 1                 | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                | Tyrannida            | 1                   | 1                 | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                | Malaconotoidea       | 1                   | 1                 | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                | Corvoidea            | 1                   | 1                 | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                | Sylviida             | 1                   | 1                 | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                | Sylvoidea            | 1                   | 1                 | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                | Muscicapida          | 1                   | 1                 | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                | Bombycilloidea       | 1                   | 1                 | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                | Muscicapoidea        | 1                   | 1                 | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                | Certhioidea          | 1                   | 1                 | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                | Passerida            | 1                   | 1                 | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                | Emberizoidea         | 1                   | 1                 | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
| Hard<br>(+)    | Corvides             | 0                   | 0                 | 4               | 3               | 2            | 5           | 5            | 5               | 5           | 5          | 5                |
|                | Orioloidea           | 1                   | 1                 | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                | Passerides           | 1                   | 1                 | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |
|                | Aegithaloidea        | 0                   | 0                 | 3               | 1               | 0            | 3           | 3            | 3               | 3           | 3          | 3                |
| Locustelloidea |                      | 1                   | 1                 | 1               | 1               | 1            | 1           | 1            | 1               | 1           | 1          | 1                |

# CLADE RECOVERY

- Eliminating taxa with large amounts of missing data did improve all methods
- Is the issue simply the amount of data
- NJ analyses had worst performance

(a)



(b)

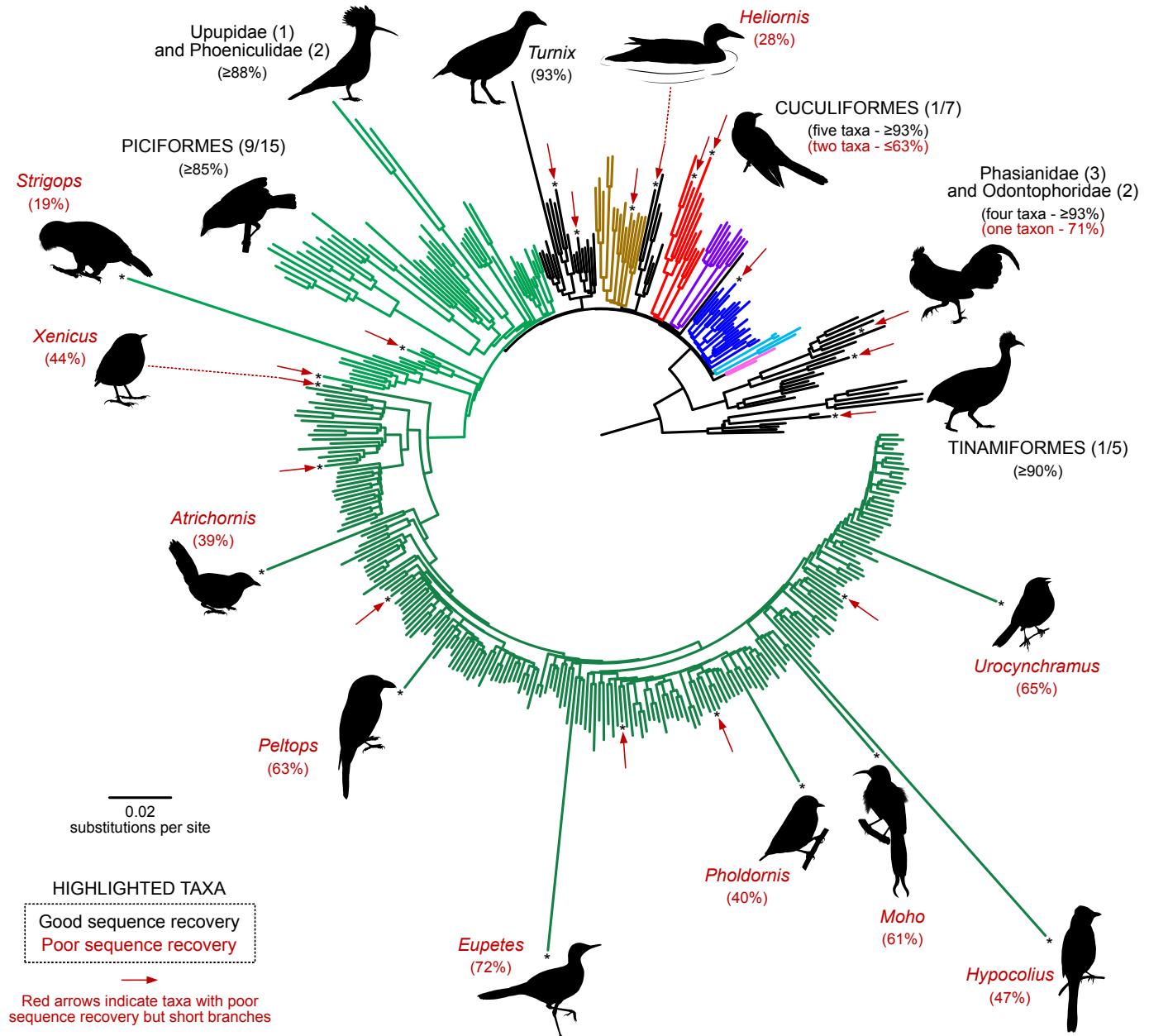
| Tree                    | Non-monophyletic<br>Orders Families |          |
|-------------------------|-------------------------------------|----------|
|                         | Orders                              | Families |
| <b>ML concatenation</b> |                                     |          |
| IQ-TREE                 | 0                                   | 0        |
| <b>MSC methods</b>      |                                     |          |
| weighted ASTRAL         | 0                                   | 1        |
| weighted ASTRID         | 0                                   | 0        |
| SVD quartets (sub)      | 3                                   | 0        |
| SVD quartets (ex)       | 3                                   | 0        |
| <b>METAL (NJ)</b>       |                                     |          |
| p-distances             | 0                                   | 0        |
| ML distances            | 0                                   | 0        |
| Trace distances         | 0                                   | 0        |
| logdet i.r.             | 0                                   | 0        |
| logdet-inv              | 0                                   | 0        |
| logdet inf sites        | 0                                   | 0        |

(c)

| Clade                | METAL (NJ)          |                   |                 |                 |              |             |              |                 |             |            |
|----------------------|---------------------|-------------------|-----------------|-----------------|--------------|-------------|--------------|-----------------|-------------|------------|
|                      | ML concat (IQ-TREE) | ML concat (ExaML) | weighted ASTRAL | weighted ASTRID | SVD quartets | p-distances | ML distances | Trace distances | logdet i.r. | logdet-inv |
| Easy<br>(+++)        |                     |                   |                 |                 |              |             |              |                 |             |            |
| Tyranni (suboscines) | 0                   | 0                 | 0               | 0               | 0            | 0           | 0            | 0               | 0           | 0          |
| Passeri (oscines)    | 0                   | 0                 | 0               | 0               | 0            | 0           | 0            | 0               | 0           | 0          |
| Medium<br>(++)       |                     |                   |                 |                 |              |             |              |                 |             |            |
| Eurylaimides         | 0                   | 0                 | 0               | 0               | 0            | 0           | 0            | 0               | 0           | 0          |
| Tyrannides           | 0                   | 0                 | 0               | 0               | 0            | 0           | 0            | 0               | 0           | 0          |
| Furnariida           | 0                   | 0                 | 0               | 0               | 0            | 0           | 0            | 0               | 0           | 0          |
| Tyrannida            | 0                   | 0                 | 0               | 0               | 0            | 0           | 0            | 0               | 0           | 0          |
| Malacoontoidea       | 0                   | 0                 | 0               | 0               | 0            | 0           | 0            | 0               | 0           | 0          |
| Corvoidea            | 0                   | 0                 | 0               | 0               | 0            | 0           | 0            | 0               | 0           | 0          |
| Sylviida             | 0                   | 0                 | 0               | 0               | 0            | 0           | 0            | 0               | 0           | 0          |
| Sylvoidea            | 0                   | 0                 | 0               | 0               | 0            | 0           | 0            | 0               | 0           | 0          |
| Muscicapida          | 0                   | 0                 | 0               | 0               | 0            | 0           | 0            | 0               | 0           | 0          |
| Bombycilloidea       | 0                   | 0                 | 0               | 0               | 0            | 0           | 0            | 0               | 0           | 0          |
| Muscicapoidea        | 0                   | 0                 | 0               | 0               | 0            | 0           | 0            | 0               | 0           | 0          |
| Certhioidea          | 0                   | 0                 | 0               | 0               | 0            | 0           | 0            | 0               | 0           | 0          |
| Passerida            | 0                   | 0                 | 0               | 0               | 0            | 0           | 0            | 0               | 0           | 0          |
| Emberizoidea         | 0                   | 0                 | 0               | 0               | 0            | 0           | 0            | 0               | 0           | 0          |
| Hard<br>(+)          |                     |                   |                 |                 |              |             |              |                 |             |            |
| Corvides             | 0                   | 0                 | 0               | 0               | 0            | 0           | 0            | 0               | 0           | 0          |
| Orioloidea           | 0                   | 0                 | 0               | 0               | 0            | 0           | 0            | 0               | 0           | 0          |
| Passerides           | 0                   | 0                 | 0               | 0               | 0            | 0           | 0            | 0               | 0           | 0          |
| Aegithaloidea        | 0                   | 0                 | 0               | 0               | 0            | 0           | 0            | 0               | 0           | 0          |
| Locustelloidea       | 0                   | 0                 | 0               | 0               | 0            | 0           | 0            | 0               | 0           | 0          |

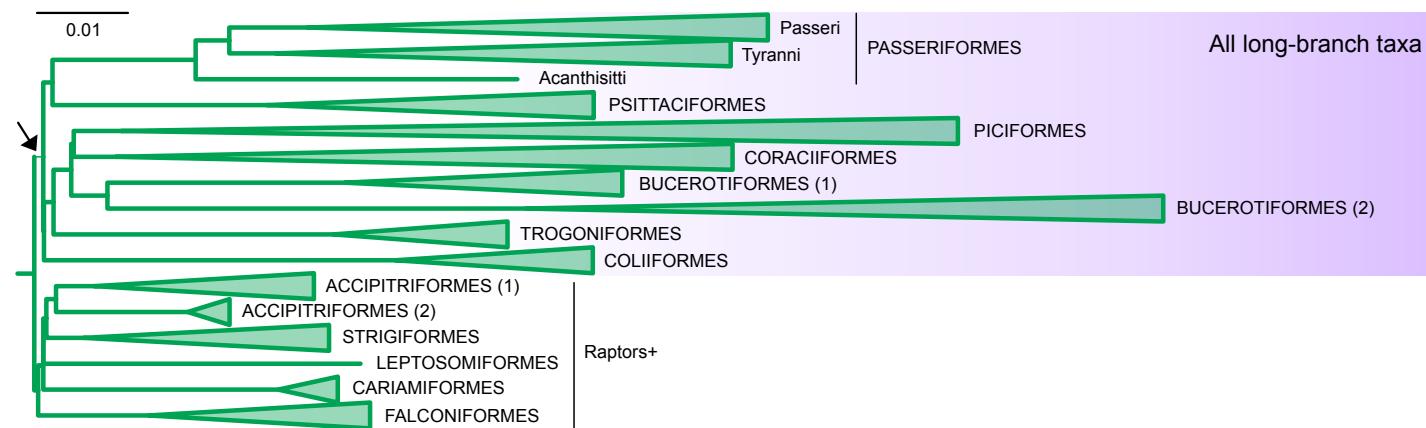
# LONG BRANCH ATTRACTION IN "LANDBIRDS"? (THE GREEN CLADE)

- Note the branch length heterogeneity  
-- even if we ignore the artifactual long branches

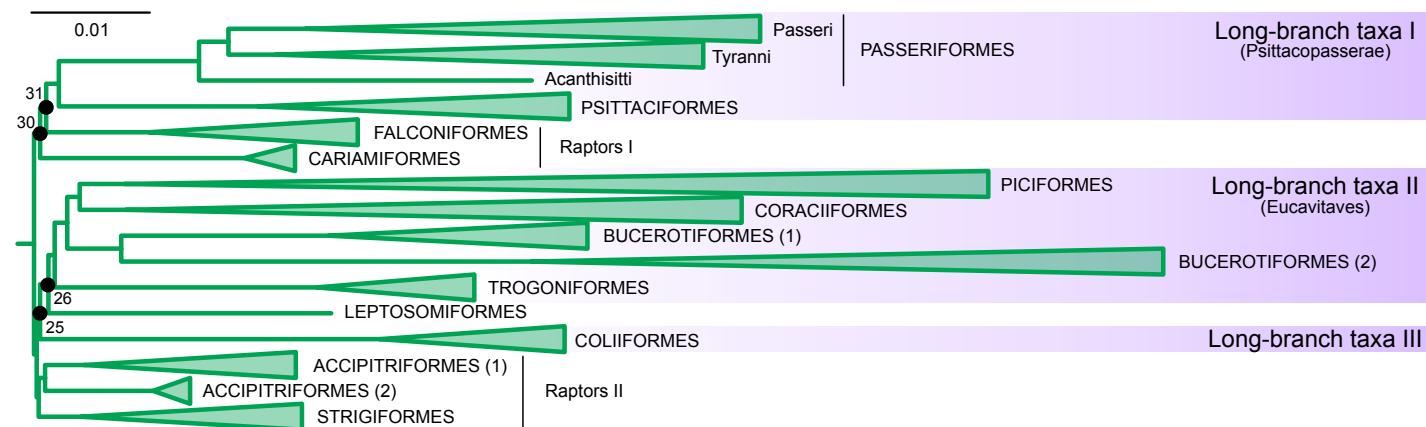


# IS METAL PRONE TO LONG BRANCH ATTRACTION?

(a) NJ of logdet inf sites distances



(b) ML concatenation



- Long branch taxa clustered in NJ analysis of “landbirds” (Telluraves)

# LARGER DATASET

-- UCE data from Jarvis et al. (2014)

- Fewer loci (3158) but longer flanks
- 9.2 million sites
- 4.5x the number of informative sites as allfam
- Pink clades are non-monophyletic if long-branch taxa in landbirds are clustered

|                  | #  | Name                         | Jarvis et al. (2014) | ML concat (IQ-TREE) | weighted ASTRAL | weighted ASTRID | SVD quartets | <b>METAL (NJ)</b>   |
|------------------|----|------------------------------|----------------------|---------------------|-----------------|-----------------|--------------|---------------------|
| Easy<br>(++)     | 1  | PALAEognathae                | 0                    | 0                   | 0               | 0               | 0            | <i>p</i> -distances |
|                  | 4  | NEOGNATHAE                   | 0                    | 0                   | 0               | 0               | 0            | ML distances        |
|                  | 5  | Galloanserae                 | 0                    | 0                   | 0               | 0               | 0            | Trace distances     |
|                  | 6  | Neoaves                      | 0                    | 0                   | 0               | 0               | 0            | logdet i.r.         |
|                  | 7  | <b>Mirandornithes (VII)</b>  | 0                    | 0                   | 0               | 0               | 0            | logdet-inv          |
|                  | 33 | Passeriformes                | 0                    | 0                   | 0               | 0               | 0            | logdet inf sites    |
|                  | 34 | Eupasseres                   | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  |    | # non-monophyletic in allfam | 0                    | 0                   | 0               | 0               | 0            |                     |
| Medium<br>(+)    | 12 | Strisores (V)                | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  | 19 | Aequornithes (II)            | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  | 20 | Feraequornithes              | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  | 21 | Procellariimorphae           | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  | 24 | Telluraves (I)               | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  | 26 | <b>Cavitaves</b>             | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  | 27 | Eucavitaves                  | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  | 28 | Picocoraciae                 | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  | 30 | <b>Australaves</b>           | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  | 31 | Eufalconimorphae             | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  | 32 | Psittacopasserae             | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  |    | # non-monophyletic in allfam | 0                    | 0                   | 0               | 0               | 0            |                     |
| Hard<br>(+)      | 8  | Columbimorphae (VI)          | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  | 9  | Pteroclimesites              | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  | 11 | <b>Musophagotides</b>        | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  | 17 | Phaethoquornithes            | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  | 18 | Phaethontimorphae (III)      | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  | 23 | Pelecanes                    | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  | 25 | Coraciimorphae               | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  | 29 | <b>Picodynastornithes</b>    | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  |    | # non-monophyletic in allfam | 2                    | 1                   | 0               | 0               | 5            |                     |
| Uncertain<br>(-) | 10 | Otidimorphae (IV)            | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  | -  | Afroaves                     | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  | -  | Accipitriformes+Strigiformes | 0                    | 0                   | 0               | 0               | 0            |                     |
|                  | -  | Coraciimorphae+Australaves   | 0                    | 0                   | 0               | 0               | 0            |                     |

# LARGER DATASET

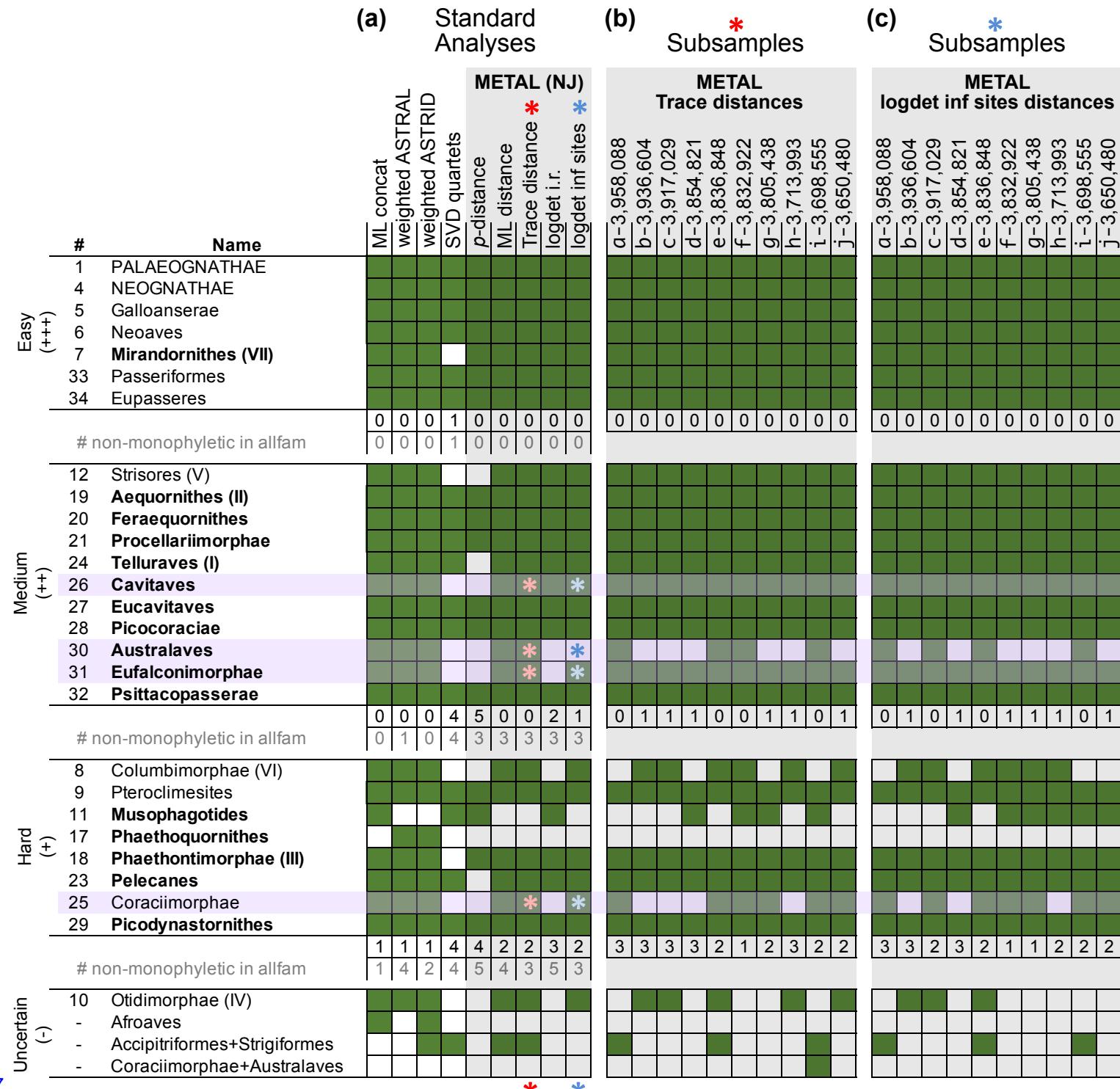
- Jarvis et al. (2014) intronic data
- 3x more parsimony informative sites than Jarvis UCEs

|                  | #                            | Name                         | ML concat | weighted ASTRAL | weighted ASTRID | SVD quartets | p-distance | ML distance | Trace distance | * METAL (NJ) | * |
|------------------|------------------------------|------------------------------|-----------|-----------------|-----------------|--------------|------------|-------------|----------------|--------------|---|
| Easy<br>(+++)    | 1                            | PALAEognathae                | ■         | ■               | ■               | ■            | ■          | ■           | ■              | *            | * |
|                  | 4                            | NEOGNATHAE                   | ■         | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | 5                            | Galloanserae                 | ■         | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | 6                            | Neoaves                      | ■         | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | 7                            | <b>Mirandornithes (VII)</b>  |           | ■               |                 |              |            |             |                |              |   |
|                  | 33                           | Passeriformes                | ■         | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | 34                           | Eupasseres                   | ■         | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | # non-monophyletic in allfam |                              |           | 0 0 0           | 1               | 0 0 0        | 0 0 0      | 0 0 0       | 0 0 0          |              |   |
|                  |                              |                              |           | 0 0 0           | 1               | 0 0 0        | 0 0 0      | 0 0 0       | 0 0 0          |              |   |
| Medium<br>(+)    | 12                           | Strisores (V)                | ■         | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | 19                           | <b>Aequornithes (II)</b>     |           | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | 20                           | Feraequornithes              | ■         | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | 21                           | Procellariimorphae           | ■         | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | 24                           | Telluraves (I)               | ■         | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | 26                           | <b>Cavittaves</b>            |           | ■               | ■               | ■            | ■          | ■           | *              | *            | * |
|                  | 27                           | Eucavittaves                 | ■         | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | 28                           | Picocoraciae                 | ■         | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | 30                           | <b>Australaves</b>           |           | ■               | ■               | ■            | ■          | ■           | *              | *            | * |
|                  | 31                           | Eufalconimorphae             |           | ■               | ■               | ■            | ■          | ■           | *              |              | * |
|                  | 32                           | Psittacopasserae             | ■         | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | # non-monophyletic in allfam |                              |           | 0 0 0           | 4               | 5 0          | 0 2        | 1           |                |              |   |
|                  |                              |                              |           | 0 1 0           | 4               | 3 3          | 3 3        | 3           |                |              |   |
| Hard<br>(+)      | 8                            | Columbimorphae (VI)          | ■         | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | 9                            | Pteroclimesites              | ■         | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | 11                           | <b>Musophagotides</b>        |           | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | 17                           | Phaethoquornithes            | ■         | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | 18                           | Phaethontimorphae (III)      | ■         | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | 23                           | Pelecanes                    | ■         | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | 25                           | <b>Coraciimorphae</b>        |           | ■               | ■               | ■            | ■          | ■           | *              | *            | * |
|                  | 29                           | <b>Picodynastornithes</b>    | ■         | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | # non-monophyletic in allfam |                              |           | 1 1 1           | 4               | 4 2          | 2 3        | 2           |                |              |   |
|                  |                              |                              |           | 1 4 2           | 4               | 5 4          | 3 5        | 3           |                |              |   |
| Uncertain<br>(-) | 10                           | Otidimorphae (IV)            | ■         | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | -                            | Afroaves                     |           | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | -                            | Accipitriformes+Strigiformes |           | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  | -                            | Coraciimorphae+Australaves   |           | ■               | ■               | ■            | ■          | ■           | ■              |              |   |
|                  |                              |                              |           |                 |                 |              |            |             | *              | *            |   |

- METAL has relatively good performance
- Best distances are:
  - GTR+G
  - logdet of inf sites
  - Indicated with asterisks

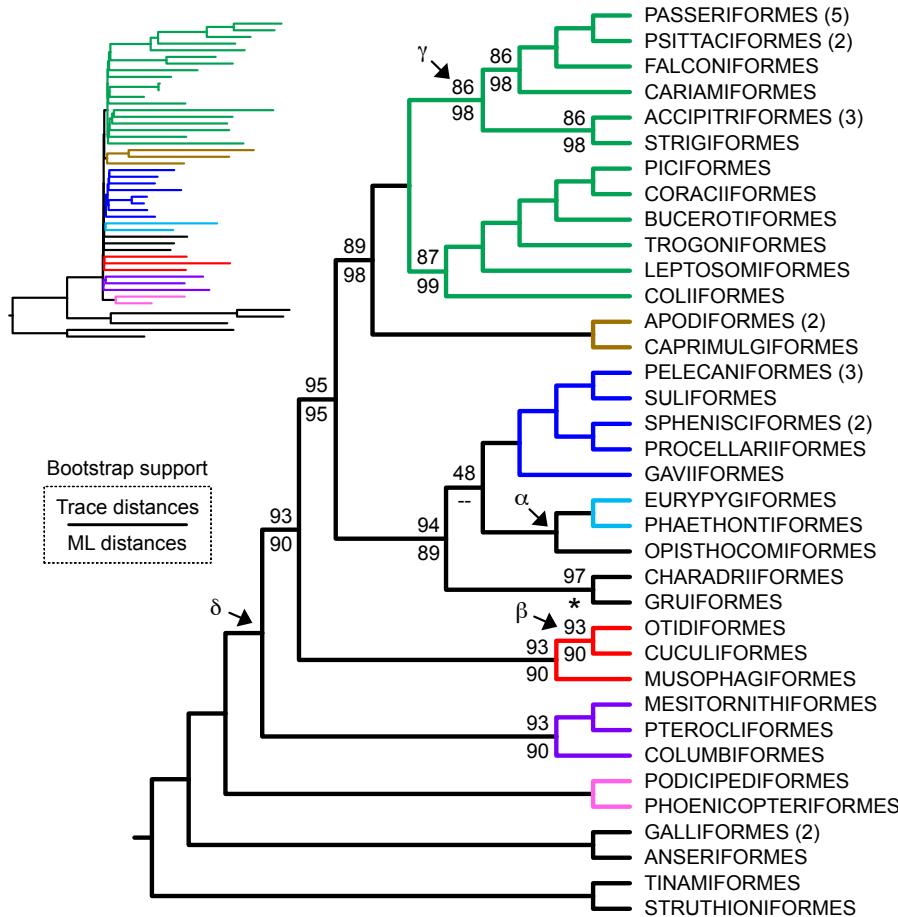
# LARGER DATASET

-- Subsampling to yield datasets comparable to the Jarvis UCE dataset yield results that resemble the Jarvis UCE results

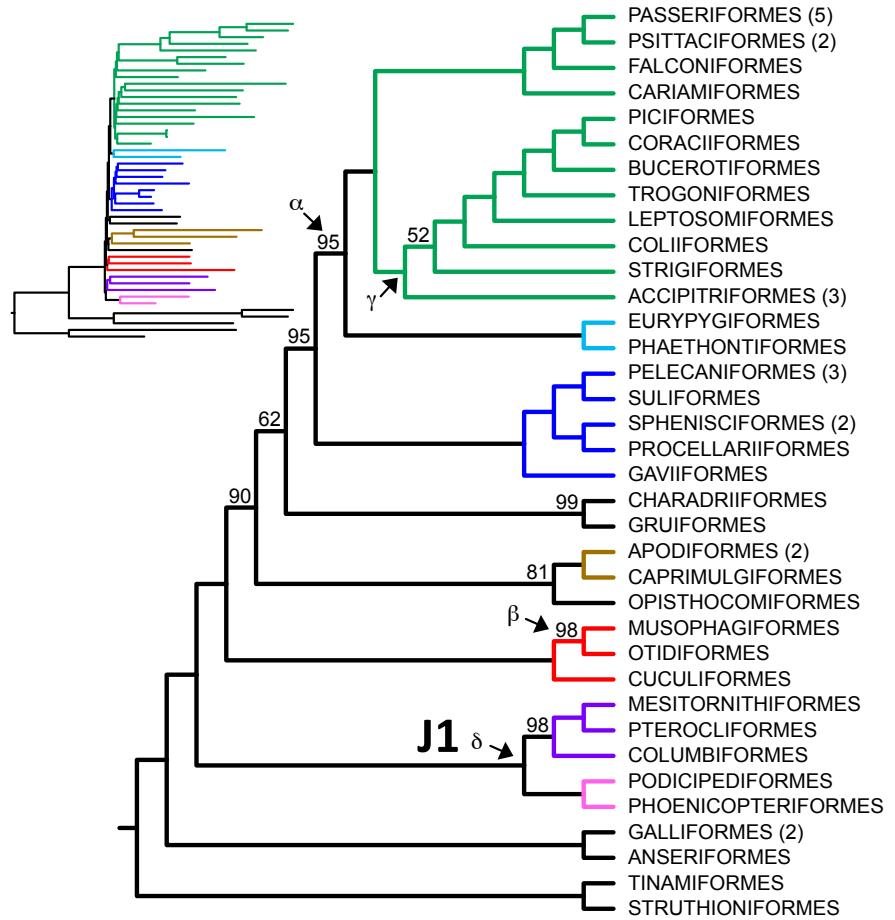


# METAL ANALYSIS OF INTRON DATASET

(a) NJ of GTR+Γ distances



(b) ML concatenation (IQ-TREE)



- METAL does not recover “J1” (Neoaves root matches Stiller et al. 2024)
- ML concatenation does recover J1

# THANKS!

- Rebecca Kimball and Kimball-Braun lab
  - Min Zhao, Dawson Houghtaling
- “OpenWings” (UCE data collection)
  - Brian Smith, Brant Faircloth, Robb Brumfield, Carl Oliveros
- Many other collaborators
  - Especially the B10K consortium
  - Siavash Mirarab, Chao Zhang, Josefina Stiller, Mike Braun, Jake Berv
- NSF grant DEB-1655683



# OPEN QUESTIONS

- What is the best way to deal with variation over time in the recombination landscape?
- Are there principled ways to address problems caused by misassembly?
  - Including the interaction of incorrect assembly and alignment
- Can the performance of METAL be improved?
  - Reduce data requirement (generalized least squares?)
  - Improve the selection of distance metrics
  - Deal with among-sites rate heterogeneity