



Division of Global Environment and Biological Sciences Biological Science Group

Hashimoto, T.

Collaborative member of CCS

(Department of Structural Biosciences,
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Division of Global Environment and Biological Sciences

Biological Science Group

— Created at Apr. 2004

Hashimoto, T.

Collaborative member

(Dept. Structural Biosci., Univ. of Tsukuba)

Since Aug. 2005

- Center for Computational Sciences

- Ass. Prof. Yuji Inagaki

- Dept. Structural Biosciences

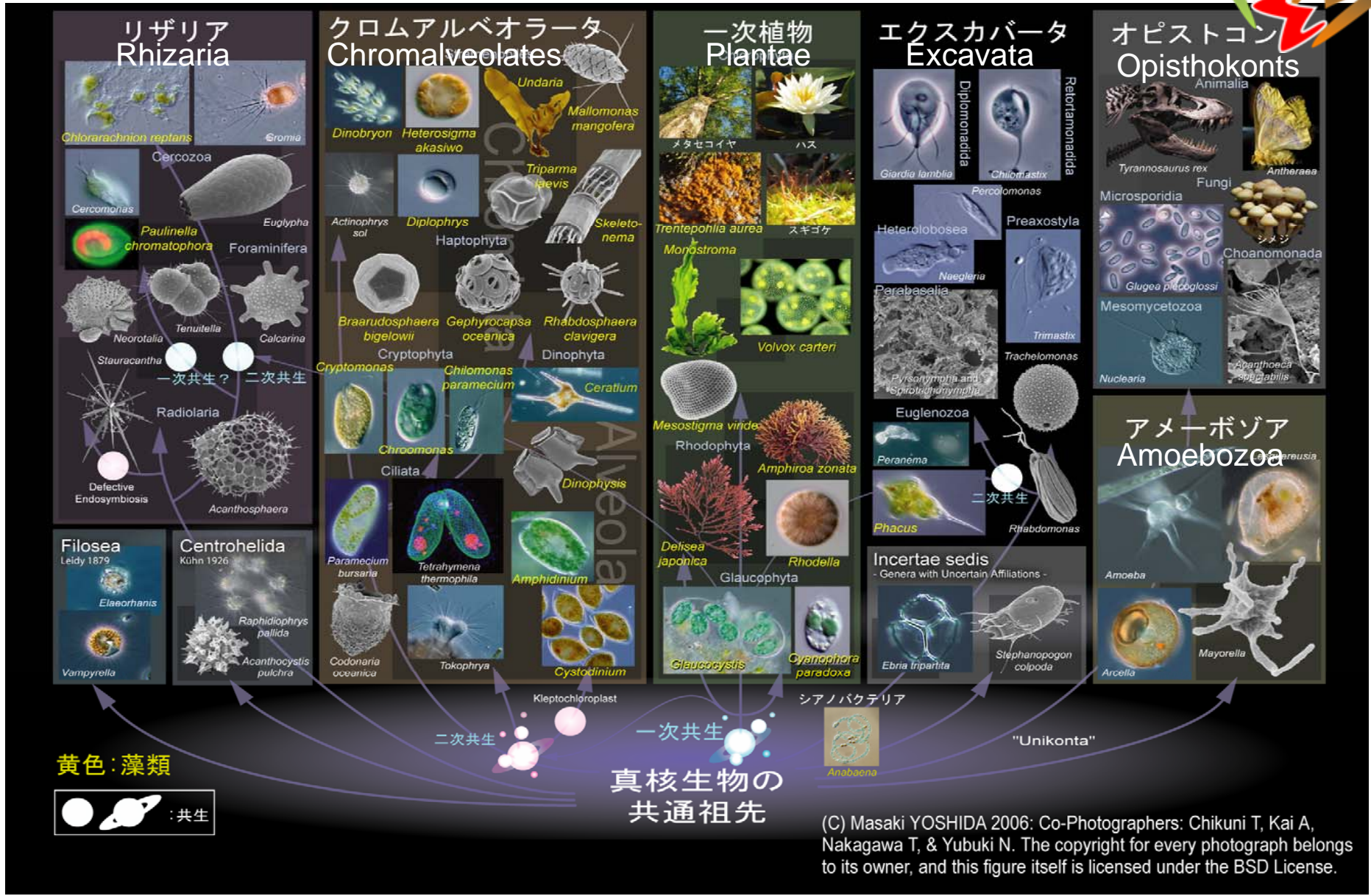
- Prof. Tetsuo Hashimoto

- (Collaborative member)

- Res. Assoc. Miako Sakaguchi

- Molecular Evolution
 - Global phylogeny of eukaryotes
 - Methodological studies on molecular phylogenetic inference

Beautiful creatures



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- Inference on the phylogenetic relationship among large groups of eukaryotes
- Inference on the root of the tree of eukaryotes
- Inference on the mitochondrial evolution
- Inference on the plastid evolution
- Methodological studies on molecular phylogenetic inference

- Establishment of the methodology for large scale phylogenetic analysis based on the maximum likelihood (ML) approach

'Mol-Evol' group:

- Biological Science Group

Yuji Inagaki / T. Hashimoto

- High Performance Computing Group

Prof. Mitsuhsa Sato (Director of CCS)

(Graduate students)

Yoshihiro Nakajima

Akihiro Aida (~Mar. 2007)



**Biological
Science
Group, CCS,
Tsukuba Univ.**



Sequence Alignment and Data for Phylogenetic Analysis



Ribosomal protein mS30

<i>Homo sapiens</i>	K	V	H	G	S	L	A	R	A	G	K	V	R	G	Q	T	P	K	V	A	K	Q	E	K	K	K	K	K	T	G	R	A	K	R	R	M	Q	Y	N	R	R				
<i>Schizosaccharomyces pombe</i>	M	G	K	V	H	G	S	L	A	R	A	G	K	V	V	K	S	Q	T	P	K	V	E	K	Q	E	K	P	K	Q	P	K	G	R	A	Y	K	R	L	L	Y	V	R	R	
<i>Encephalitozoon cuniculi</i>	M	A	T	T	T	I	N	K	A	G	K	V	R	N	Q	T	P	K	D	P	V	V	E	K	E	R	K	K	C	G	R	C	R	Q	R	L	K	F	E	K	R				
<i>Entamoeba histolytica</i>	M	G	K	V	H	G	G	L	T	R	A	G	K	V	R	N	Q	T	K	K	P	E	K	Y	D	T	G	K	K	K	F	P	S	G	R	A	Y	L	R	Y	L	Y	S	K	R
<i>Plasmodium falciparum</i>	M	G	K	V	H	G	S	L	A	R	A	G	K	V	K	N	Q	T	P	K	V	P	K	L	D	K	K	K	R	L	T	G	R	A	K	K	R	Q	L	Y	N	R	R		
<i>Giardia intestinalis</i>	M	A	R	A	H	G	G	L	T	S	A	G	K	V	R	K	C	T	P	K	K	E	K	K	E	K	P	R	P	P	R	G	R	A	Y	K	R	L	L	Y	N	K	N		
<i>Trichomonas vaginalis</i>	M	G	K	V	H	G	S	L	A	Q	A	G	K	V	R	S	N	T	P	K	V	P	K	M	D	K	P	K	E	V	R	G	R	A	R	L	R	K	I	Y	N	Q	R		

Aligned

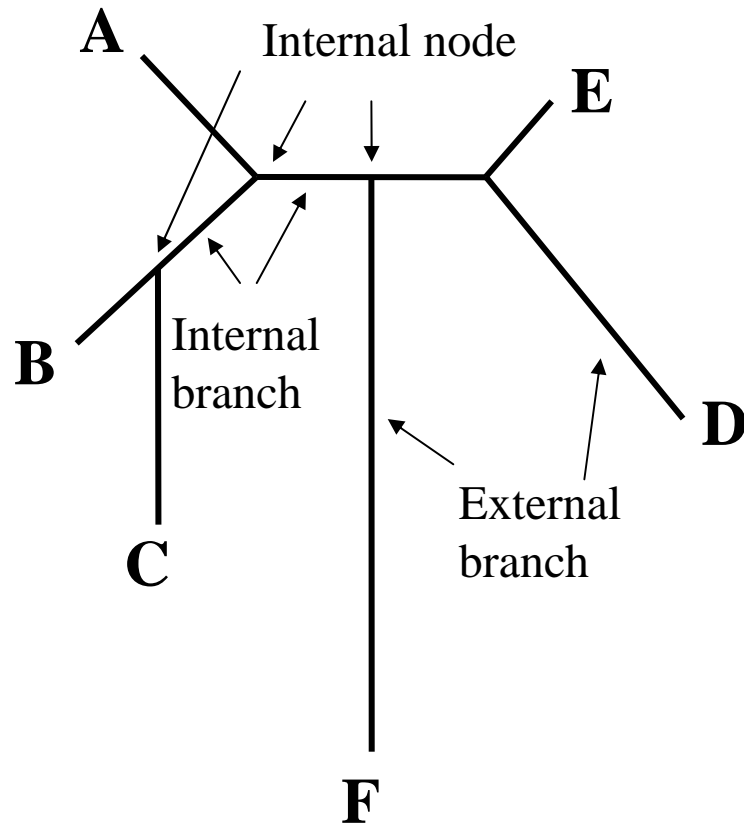
Hs	-	-	K	V	H	G	S	L	A	R	A	G	K	V	-	R	G	Q	T	P	K	V	A	K	Q	E	-	-	K	K	K	K	K	T	G	R	A	K	R	R	M	Q	Y	N	R	R
Sp	M	G	K	V	H	G	S	L	A	R	A	G	K	V	V	K	S	Q	T	P	K	V	E	K	Q	E	-	-	K	P	K	Q	P	K	G	R	A	Y	K	R	L	L	Y	V	R	R
Ec	-	-	M	A	T	T	T	I	N	K	A	G	K	V	-	R	N	Q	T	P	K	D	P	V	V	E	-	-	K	E	R	K	K	C	G	R	C	R	Q	R	L	K	F	E	K	R
Eh	M	G	K	V	H	G	G	L	T	R	A	G	K	V	-	R	N	Q	T	K	K	P	E	K	Y	D	T	G	K	K	K	F	P	S	G	R	A	Y	L	R	Y	L	Y	S	K	R
Pf	M	G	K	V	H	G	S	L	A	R	A	G	K	V	-	K	N	Q	T	P	K	V	P	K	L	D	-	-	K	K	K	R	L	T	G	R	A	K	K	R	Q	L	Y	N	R	R
Gi	M	A	R	A	H	G	G	L	T	S	A	G	K	V	-	R	K	C	T	P	K	K	E	K	E	-	-	K	P	R	P	P	R	G	R	A	Y	K	R	L	L	Y	N	K	N	
Tv	M	G	K	V	H	G	S	L	A	Q	A	G	K	V	-	R	S	N	T	P	K	V	P	K	M	D	-	-	K	P	K	E	V	R	G	R	A	R	L	R	K	I	Y	N	Q	R

Selected sites

Hs	G	S	L	A	R	A	G	K	V	R	G	Q	T	P	K	V	A	K	Q	E	K	K	K	K	K	T	G	R	A	K	R	R	M	Q	Y	N	R	R	
Sp	G	S	L	A	R	A	G	K	V	V	K	S	Q	T	P	K	V	E	K	Q	E	K	P	K	Q	P	K	G	R	A	Y	K	R	L	L	Y	V	R	R
Ec	T	T	I	N	K	A	G	K	V	R	N	Q	T	P	K	D	P	V	V	E	K	E	R	K	K	C	G	R	C	R	Q	R	L	K	F	E	K	R	
Eh	G	G	L	T	R	A	G	K	V	R	N	Q	T	K	K	P	E	K	Y	D	K	K	K	F	P	S	G	R	A	Y	L	R	Y	L	Y	S	K	R	
Pf	G	S	L	A	R	A	G	K	V	K	N	Q	T	P	K	V	P	K	L	D	K	K	K	R	L	T	G	R	A	K	K	R	Q	L	Y	N	R	R	
Gi	G	G	L	T	S	A	G	K	V	R	K	C	T	P	K	K	E	K	E	K	P	R	P	P	R	G	R	A	Y	K	R	L	L	Y	N	K	N		
Tv	G	S	L	A	Q	A	G	K	V	R	S	N	T	P	K	V	P	K	M	D	K	P	K	E	V	R	G	R	A	R	L	R	K	I	Y	N	Q	R	

- Physicochemically similar aa are marked with same color
- Column is called position or site

Phylogenetic Tree



A ~ F : extant species, groups, etc.

→ one of the relationships between
6 species

→ ((A,(B,C)),F,(D,E))

: tree topology

Branch length: substitution rate

Unit: substitutions/site

- Based on explicit evolutionary models, the analysis uses probability to find a tree that best accounts for the variation in a data set

$$f(\theta \mid \text{data}) = \Pr(\text{data} \mid \theta) \rightarrow \text{maximize}$$



||
(tree topology, branch lengths, α , π , etc.)

$$\log\{f(\theta \mid \text{data})\} \text{ (log-likelihood)} \rightarrow \text{maximize}$$

- Calculation is performed on each column of an alignment
- All possible trees are exhaustively examined \rightarrow Select the ML tree
- Robust against the violation of evolutionary rate constancy between species (sequences) \Rightarrow applicable for diverse sequences
- Computationally intense

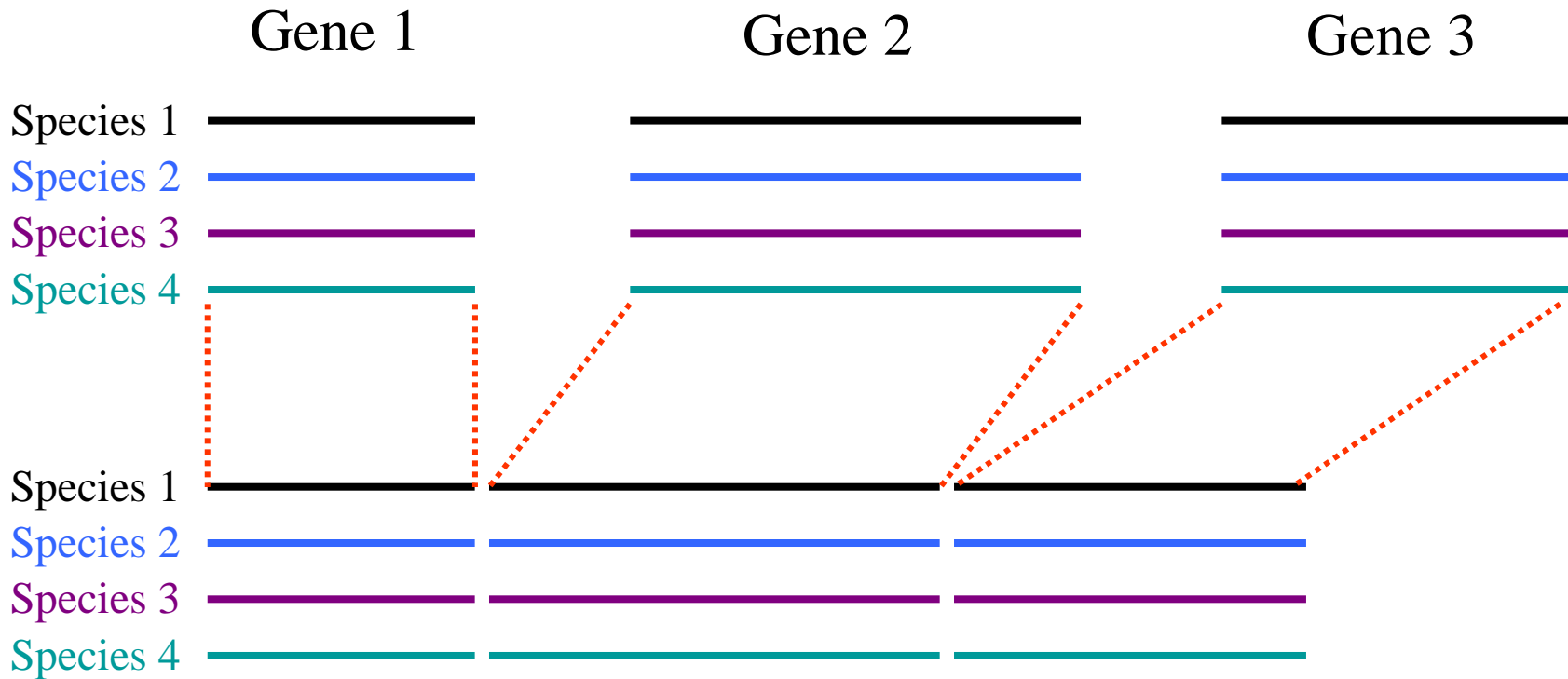
Number of Possible Trees



species number of tree topologies

1	1
2	1
3	1
4	3
5	15
6	105
7	945
8	10,395
9	135,135
10	2,027,025
	...
n	$\frac{(2n-5)!}{2^{n-3}(n-3)!}$

Combined analysis based on Concatenate Model



Concatenate sequences of different genes

⇒ regard as 1 gene

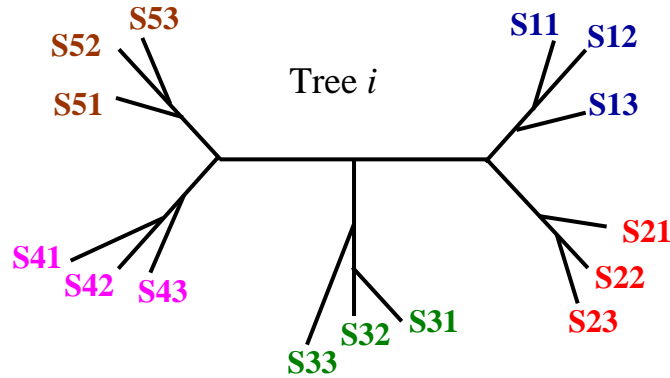


ML phylogenetic analysis ⇒ a set of parameters : $\hat{\theta}$

Combined analysis based on Separate Model

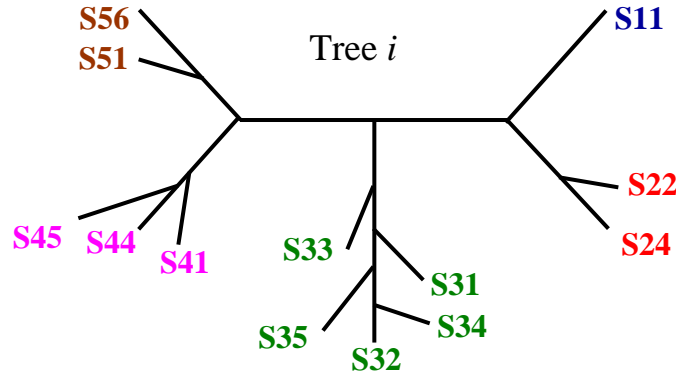


Gene 1
5 groups, 15 species



$$l_{1(i)}(\hat{\theta}_{1(i)}|X_1)$$

Gene 2
5 groups, 13 species



$$l_{2(i)}(\hat{\theta}_{2(i)}|X_2)$$

⋮

⋮

For each of Tree *i*
(*i* = 1, ..., 15)
calculate log-likelihood
of the gene *k*

Gene *m*
5 groups, *x* species

$$l_{m(i)}(\hat{\theta}_{m(i)}|X_m) \quad \left(+ \right)$$

The log-likelihood of the ML tree in total

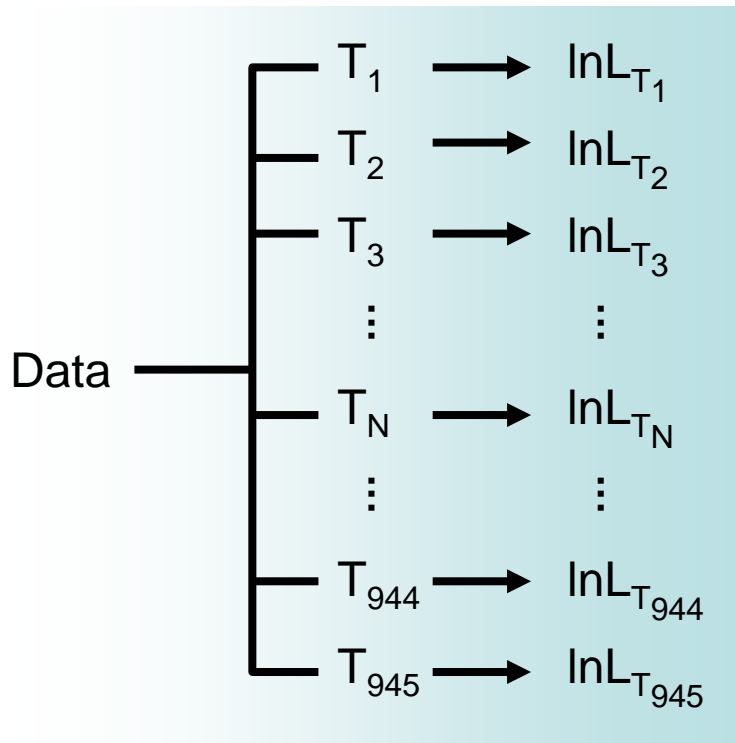
$$\max_i \left\{ \sum_{k=1}^m l_{k(i)}(\hat{\theta}_{k(i)}|X_k) \right\} = \max_i \left[\sum_{k=1}^m \left\{ \sum_{h=1}^{m_k} \log f_{k(i)}(X_{kh}|\hat{\theta}_{k(i)}) \right\} \right]$$

(*i* = 1, ..., 15)

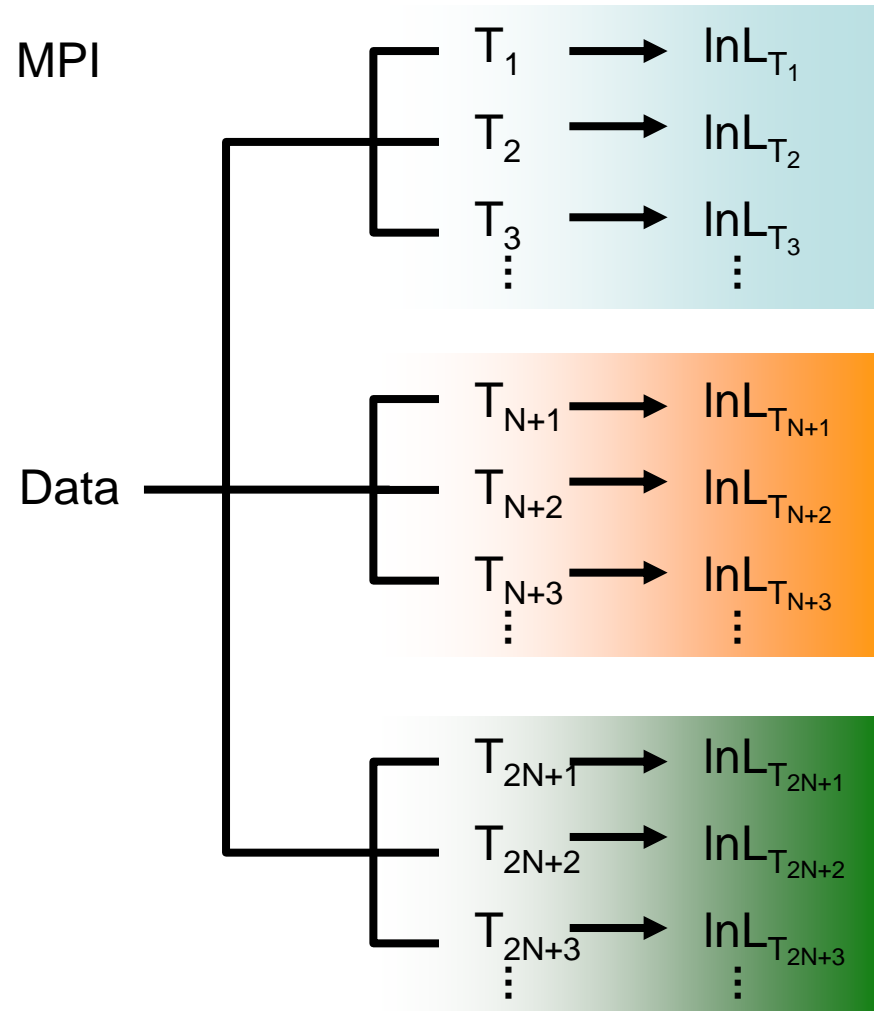
$$\sum_{k=1}^m l_{k(i)}(\hat{\theta}_{k(i)}|X_k)$$

- Calculated InL by Tree-Puzzle

Sequential



MPI



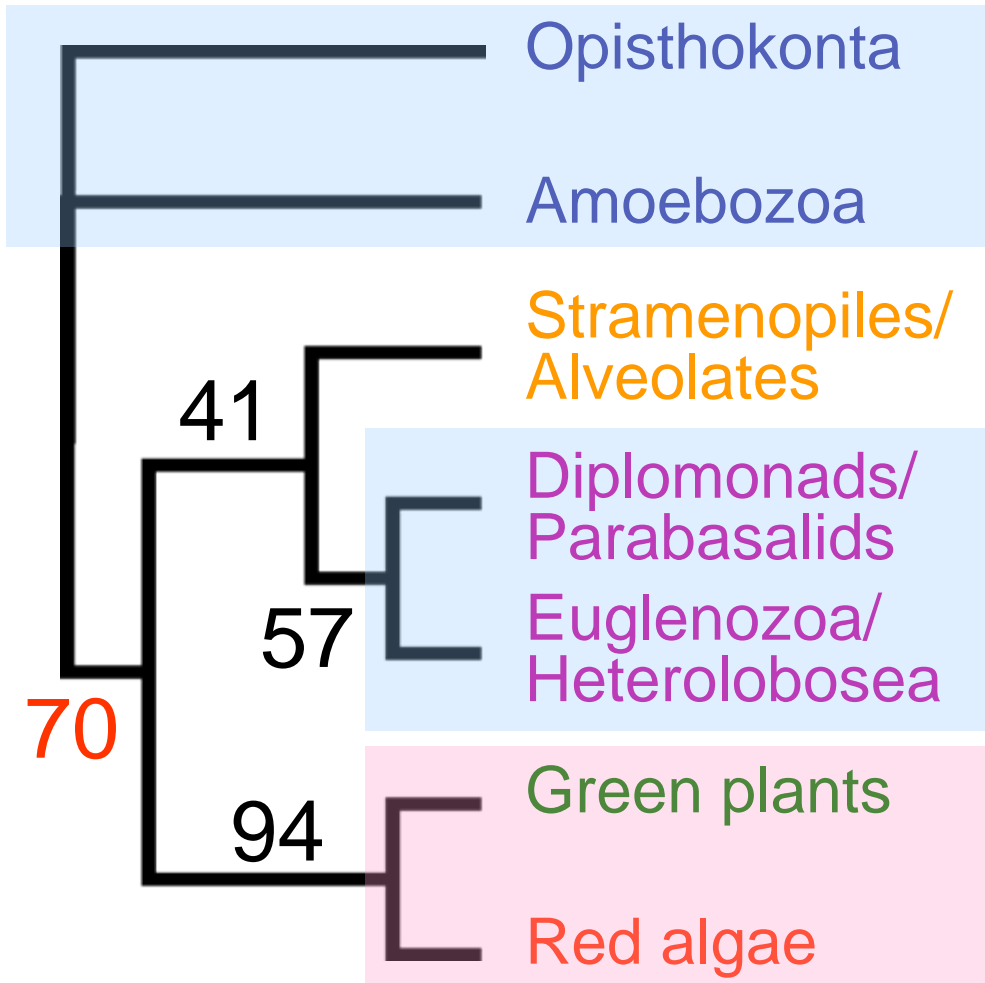
Phylogeny of Eukaryotes – Recent results



23-gene analyses – w/o α -tubulin ~10,000 positions

< Separate model >

(Exhaustive search for 945 trees)



- Recovered three eukaryotic “supergroups”
 - Unikont: Opisthokonta + Amoebozoa
 - Excavata: Dip/Par + Eug/Het
 - Plantae: G+R

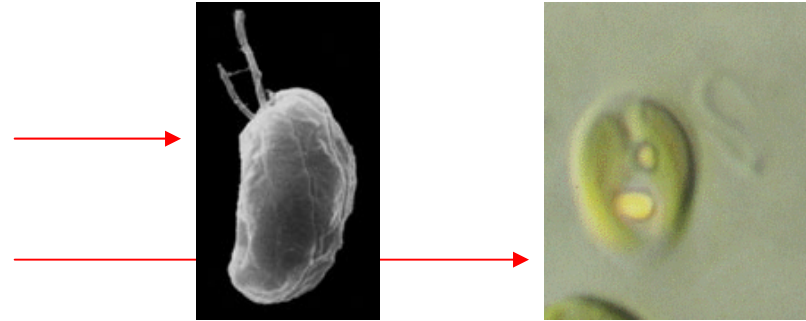
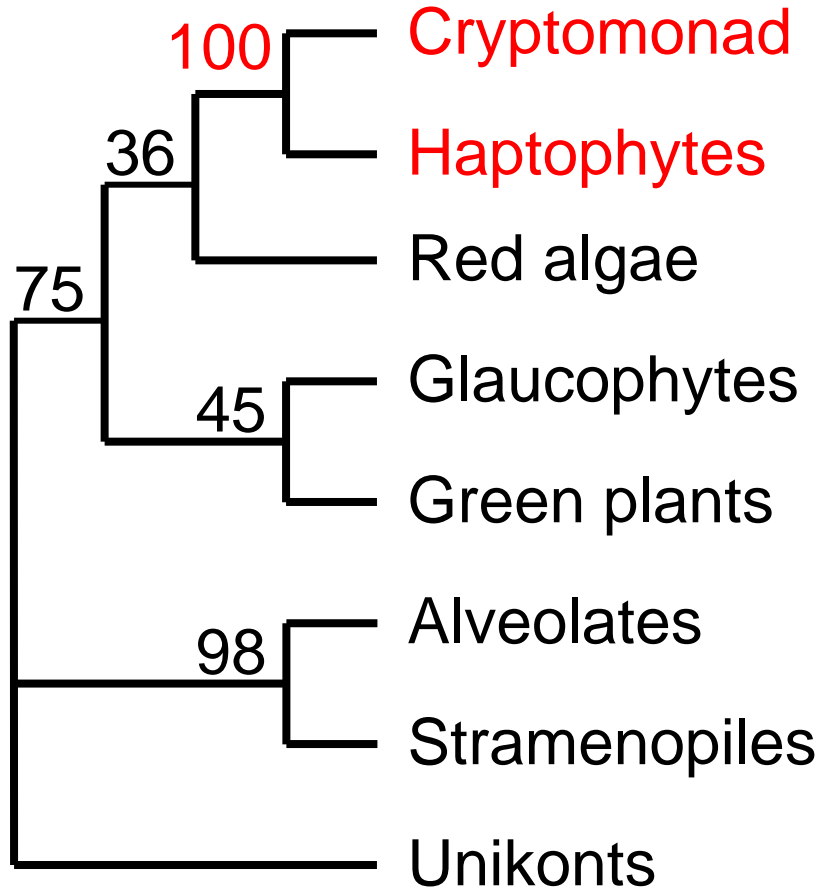
Phylogeny of Eukaryotes – Recent results



Multi-gene analyses – with ~8,500 positions

< Separate model >

(Exhaustive search for 10395 trees)



Guillardia

Pavlova

Multiple Gene Phylogenies Support the Monophyly of Cryptomonad and Haptophyte Host Lineages.

Patron, Inagaki, and Keeling:
Curr. Biol. 2007

Summary of Research Activities 2005-2007



— Biological Science Group —

Publications		Total
Peer reviewed	Review (In Jap.)	
20	4	24

Domestic Meetings			Total
Oral	Poster	Invited	
12	9	9	30

International Meetings			Total
Oral	Poster	Invited	
3	3	2	8

— Biological Science Group —

Grants: Grant-In-Aid for Scientific Research from JSPS

2005-2006 (B) ¥14,200,000

2006-2007 (C) ¥3,600,000

Grant-In-Aid for Young Scientists from JSPS

2006-2007 (B) ¥2,600,000

Awards: Yuji Inagaki 2007

An award from the minister of MEXT for young scientists

- Phylogenetic relationship among large groups of Eukaryotes
 - Excavata monophyly?
 - Chromalveolates monophyly?
- Methodological studies on molecular phylogenetic inference
 - Impact of the utilization of different models for combining multiple genes
(‘concatenate’ or ‘separate’)

- Establishment of the methodology for large scale phylogenetic analysis based on the maximum likelihood (ML) approach
 - Exhaustive search up to 2,027,025 trees for 10 lineages

Phylogenetic inference: estimation of :

- Tree topology
- Branch length

Methods of phylogenetic reconstruction:

- Distance matrix method
- Maximum parsimony method
- Maximum likelihood method

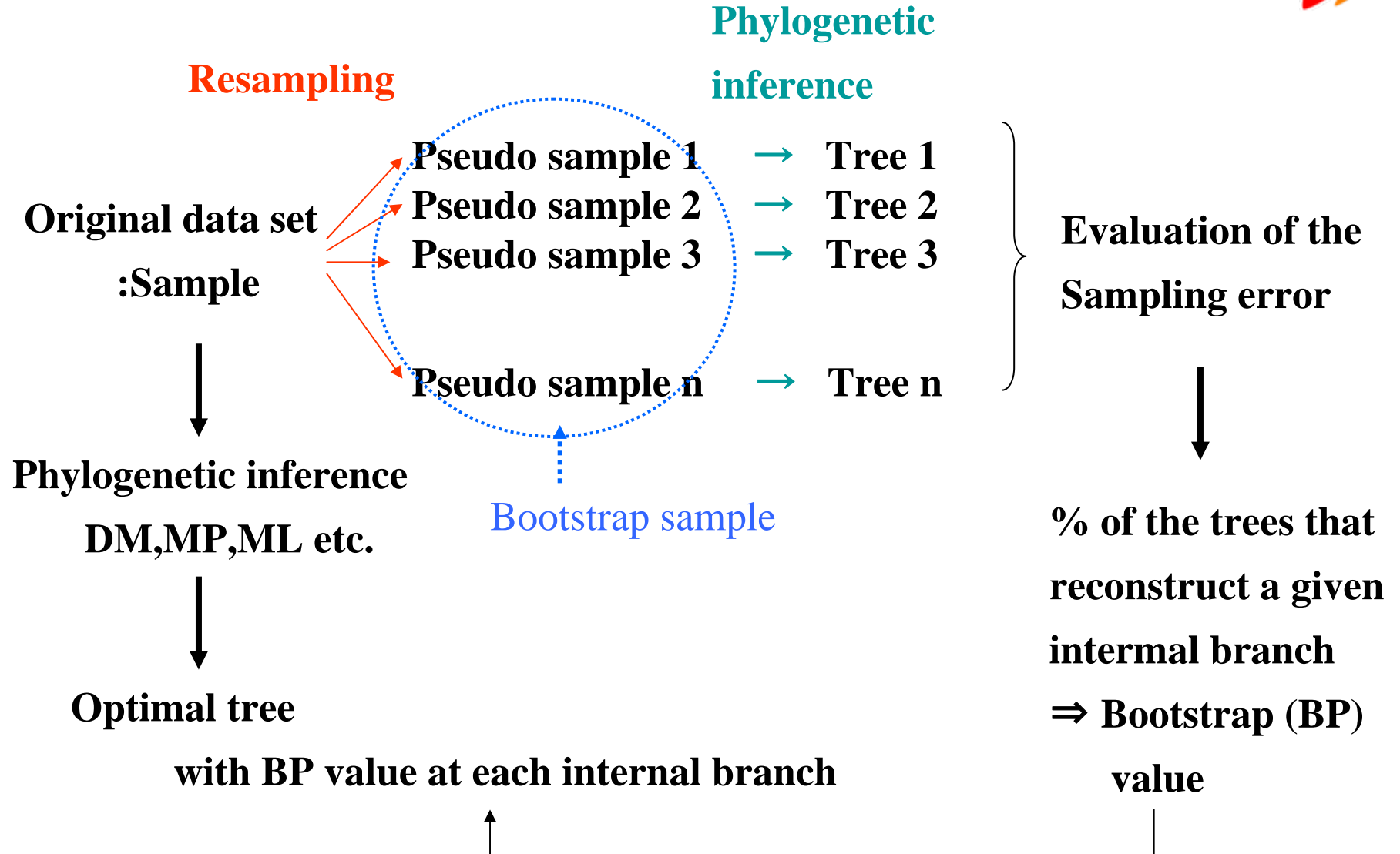
Phylogenetic inference: estimation of :

- Tree topology
- Branch length

Methods of phylogenetic reconstruction:

- Distance matrix method
- Maximum parsimony method
- **Maximum likelihood method**

Bootstrap analysis



Maximum likelihood method in brief

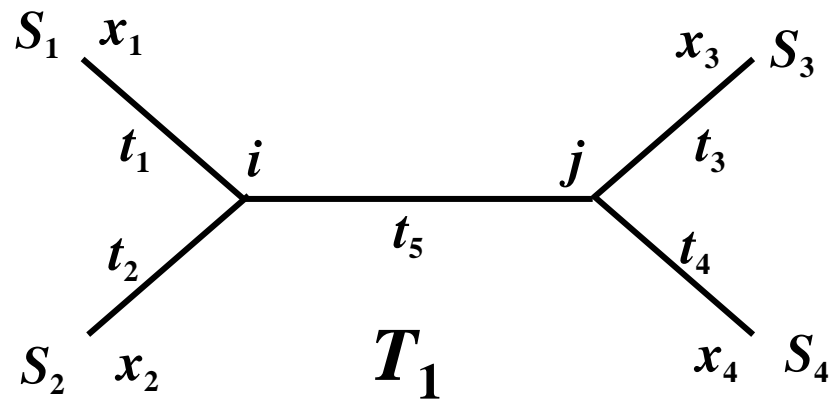
Example data set

(4 species, n positions)

$$X = (X_{ij}) \quad (i=1,\dots,4; j=1,\dots,n)$$

h 'th position

$$X_h = (X_{1h}, X_{2h}, X_{3h}, X_{4h})$$



S_1, \dots, S_4 : Extant species

x_1, \dots, x_4 : data of h 'th position in extant species

i, j : data of h 'th position in ancestral species

t_1, \dots, t_5 : branch lengths

Assumption 1. X_t : Continuous-time stationary Markov process with a transition probability $P_{ij}(t)$
transition probability k to l :

$$P_{kl}(t) = P\{X_{t+s} = l \mid X_s = k\}$$

Evolution (substitutions) of each branch occurs independently.

Assumption 2. Each position evolves independently.

Under the Assumption 1.

Using Chapman-Kolmogorov equation,

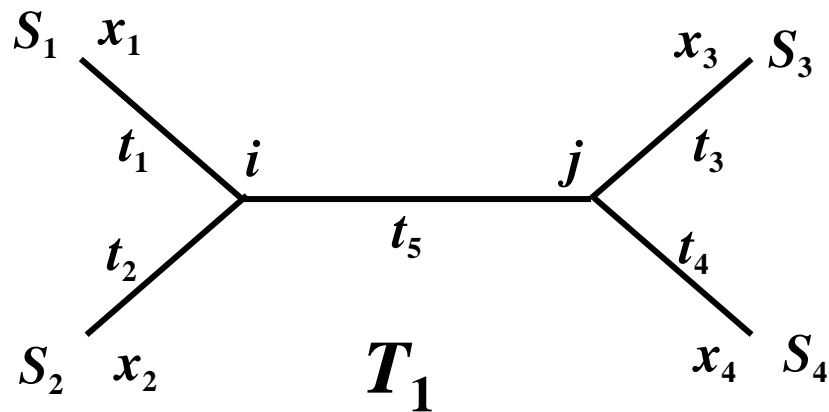
$f(x_1, x_2, x_3, x_4 | \theta)$ ← **probability of having the data of h 'th position, given a tree topology, T_1 , and a transition matrix $P_{ij}(t)$**

$$= \sum_i \sum_j P\{X_0 = i\} P\{X_{t_1} = x_1, X_{t_2} = x_2, X_{t_5} = j \mid X_0 = i\}$$

$$\times P\{X_{t_5+t_3} = x_3, X_{t_5+t_4} = x_4 \mid X_{t_1} = x_1, X_{t_2} = x_2, X_{t_5} = j, X_0 = i\}$$

$$= \sum_i \left\{ \pi_i P_{ix_1}(t_1) P_{ix_2}(t_2) \sum_j P_{ij}(t_5) P_{jx_3}(t_3) P_{jx_4}(t_4) \right\}$$

π_i : **composition of nucleotide or amino acid i**



- S_1, \dots, S_4 : **Extant species**
- x_1, \dots, x_4 : **data of h 'th position in extant species**
- i, j : **data of h 'th position in ancestral species**
- t_1, \dots, t_5 : **branch lengths**

Under the Assumption 2.

Likelihood function of θ given a data X can be written as:

$$L(\theta | \mathbf{X}) = \prod_{h=1}^n f(\mathbf{X}h | \theta)$$

Its log-likelihood:

$$l(\theta | \mathbf{X}) = \sum_{h=1}^n \log f(\mathbf{X}h | \theta)$$

$$\theta = (t_1, \dots, t_5) : \text{branch lengths}$$

$\hat{\theta}$ can be estimated by maximizing the log-likelihood function, l

$$l(\hat{\theta} | \mathbf{X}) = \max \{l(\theta | \mathbf{X}) : \hat{\theta} \in \Theta\}$$

By comparing the log-likelihood ($l(\hat{\theta} | \mathbf{X})$) values between the different tree topologies, T_1 , T_2 , and T_3 , a tree with the highest log-likelihood value is selected as the ML tree.

Parameters

- Tree topology, T branch lengths (t_1, \dots, t_5)
- Transition Probability those included in $P_{ij}(t)$
- Composition π_i
- Among site-rate heterogeneity α (shape parameter of Γ distribution)

$P_{ij}(t)$: for nucleotide substitutions

Jukes-Cantor

Kimura-2-parameter

HKY85

TN93

.....

: for amino acid substitutions

Poisson

PAM

JTT

WAG

.....

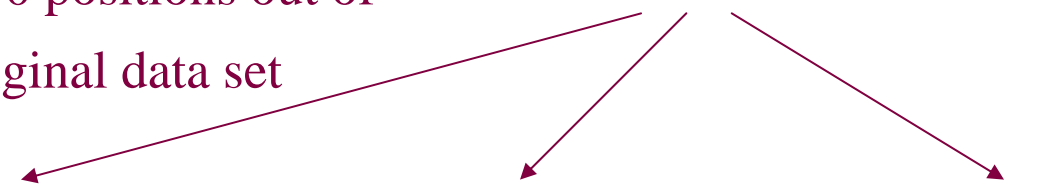
Bootstrap resampling

Original data set
: 4×10 matrix

Cryptosporidium	ACTAACTGAG
Toxoplasma	ACTATGAGAG
Theileria	GCTGTGAAAA
Plasmodium	GCTGTGATCA

0123456789

Randomly resample 10 positions out of
10 positions in the original data set



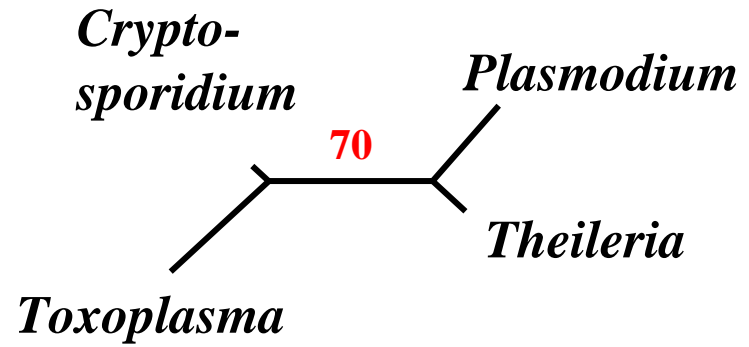
Crypto	CACTGAAGAA	AACGTAATAC	GGCTAATGAG
Toxo	CTGTGAAGTA	TACGAAATAC	GGGTATAGAG
Theil	CTGTAAGATG	TGCAAGATAC	AAGTGTA AAA
Plasmo	CTGTACGTTG	TGCAAGCTCC	ATGTGTATCA
	1452983740	4019608281	9752346789	

Pseudo sample 1

Pseudo sample 2

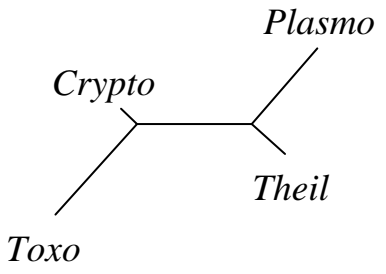
Pseudo sample 3

ML tree of the original data set

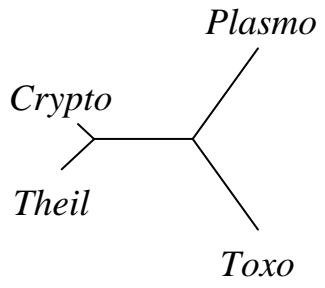


— 0.1 substitutions / position

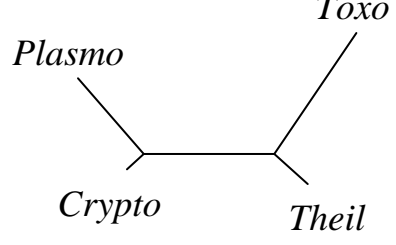
Bootstrap sample 1
ML tree



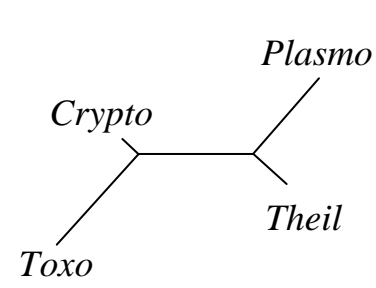
Bootstrap sample 2
ML tree



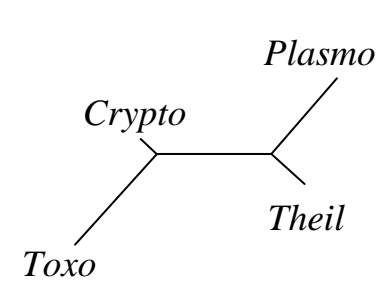
Bootstrap sample 3
ML tree



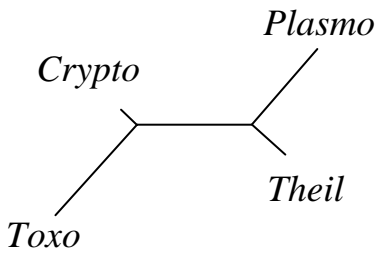
Bootstrap sample 4
ML tree



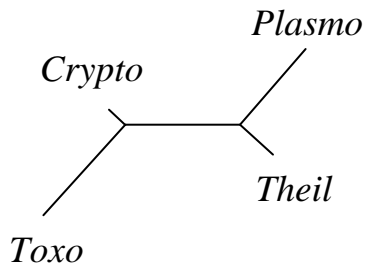
Bootstrap sample 5
ML tree



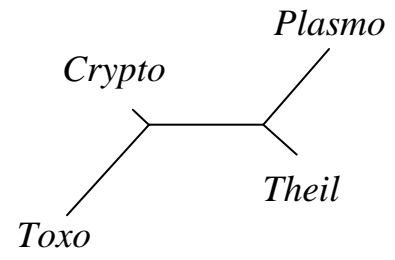
Bootstrap sample 6
ML tree



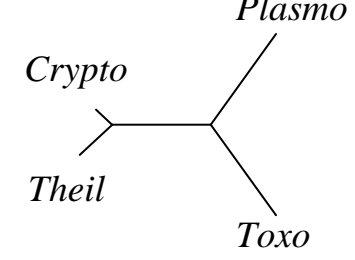
Bootstrap sample 7
ML tree



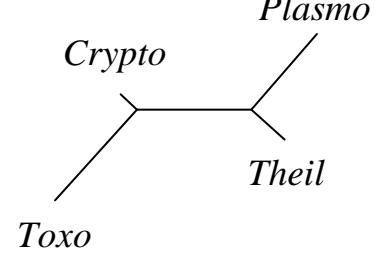
Bootstrap sample 8
ML tree



Bootstrap sample 9
ML tree



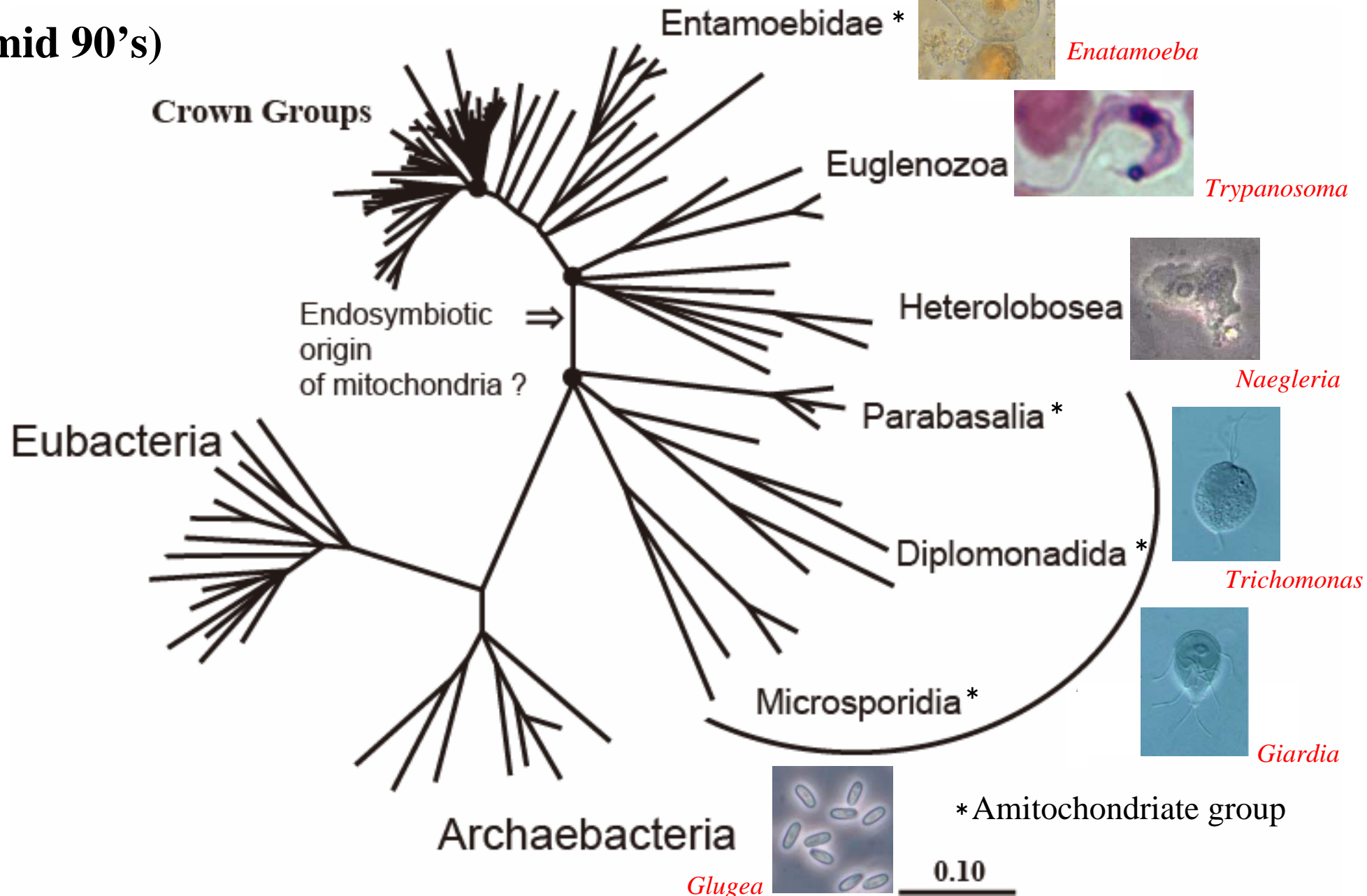
Bootstrap sample 10
ML tree



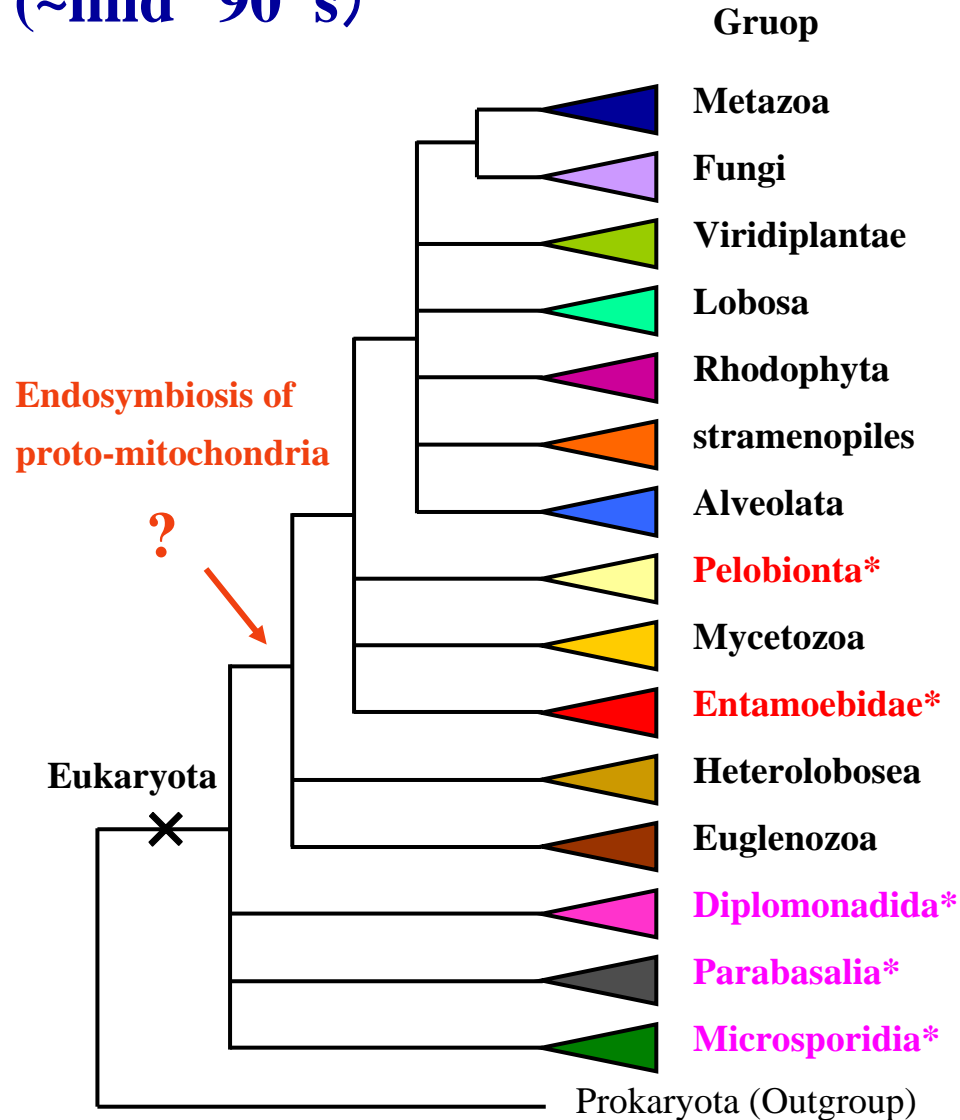
Classical SSUrRNA tree

(~mid 90's)

Eukaryota



SSUrRNA tree of Eukaryota (~mid 90' s)



* Amitochondriate protist group

Presence of large
monophyletic groups

The branching order among these groups was misleading!

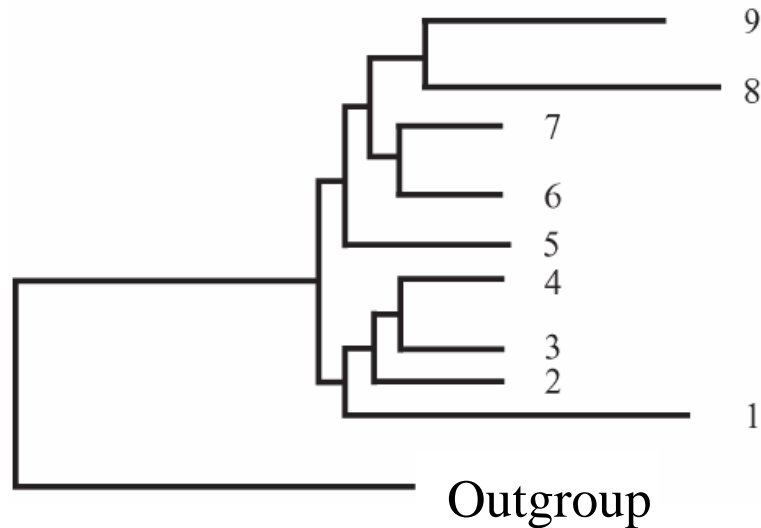
Because, long branch attraction (LBA) made the SSUrRNA tree misleading.

LBA— Most serious problem in phylogenetic analysis

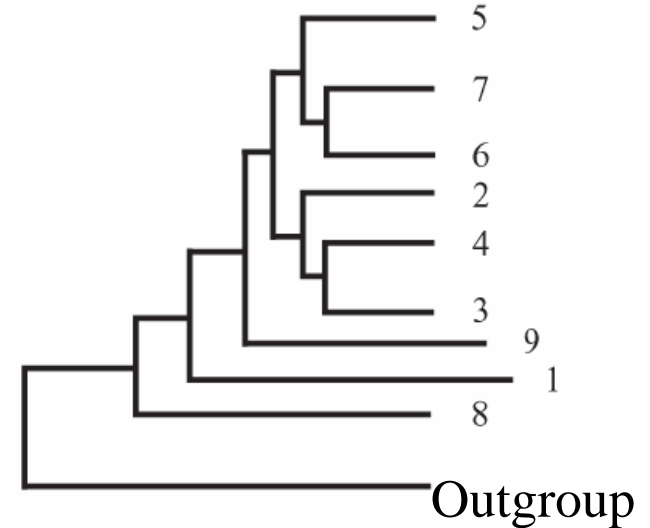
Long Branch Attraction (LBA) artefact

: the most serious problem in phylogenetic analyses

A



B



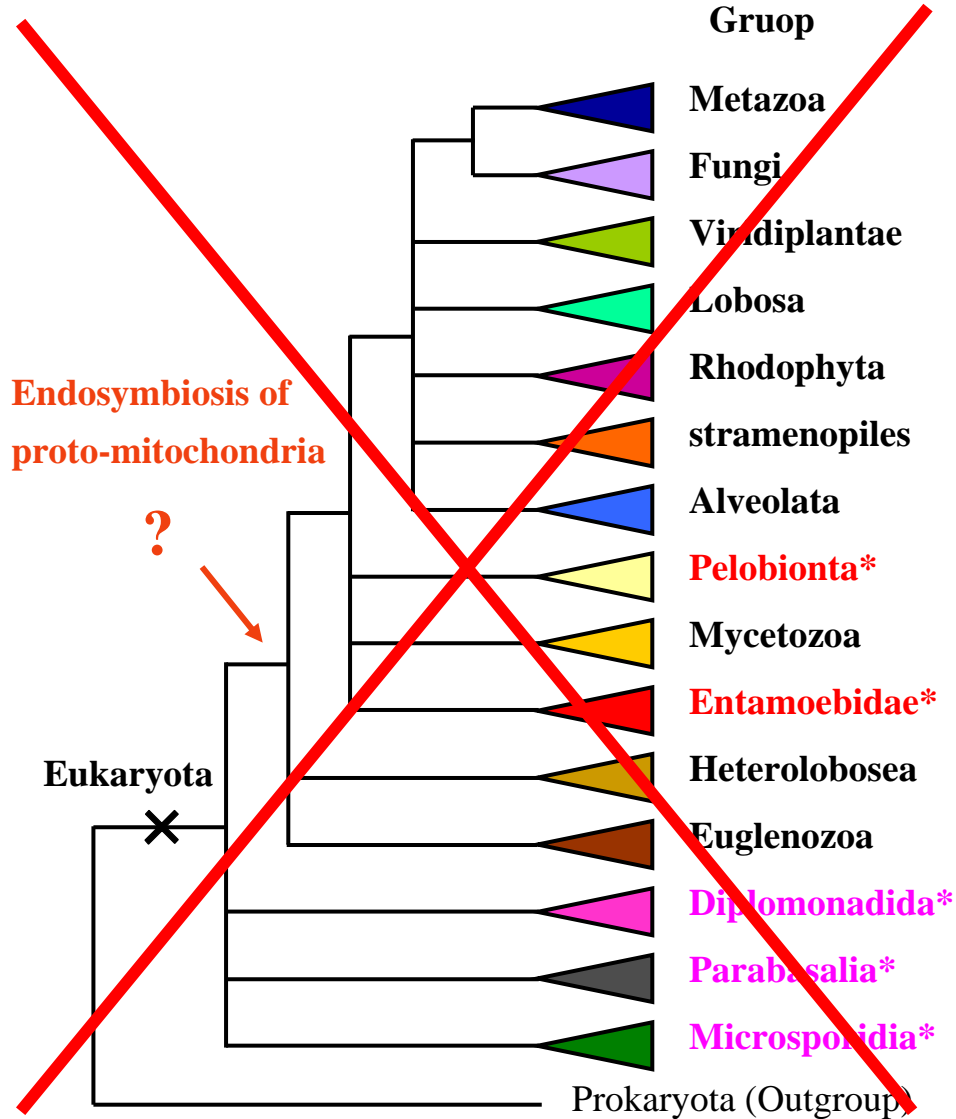
Real tree

Based on this tree, sequence data at external nodes are simulated.

Inferred tree based on the simulated sequence data

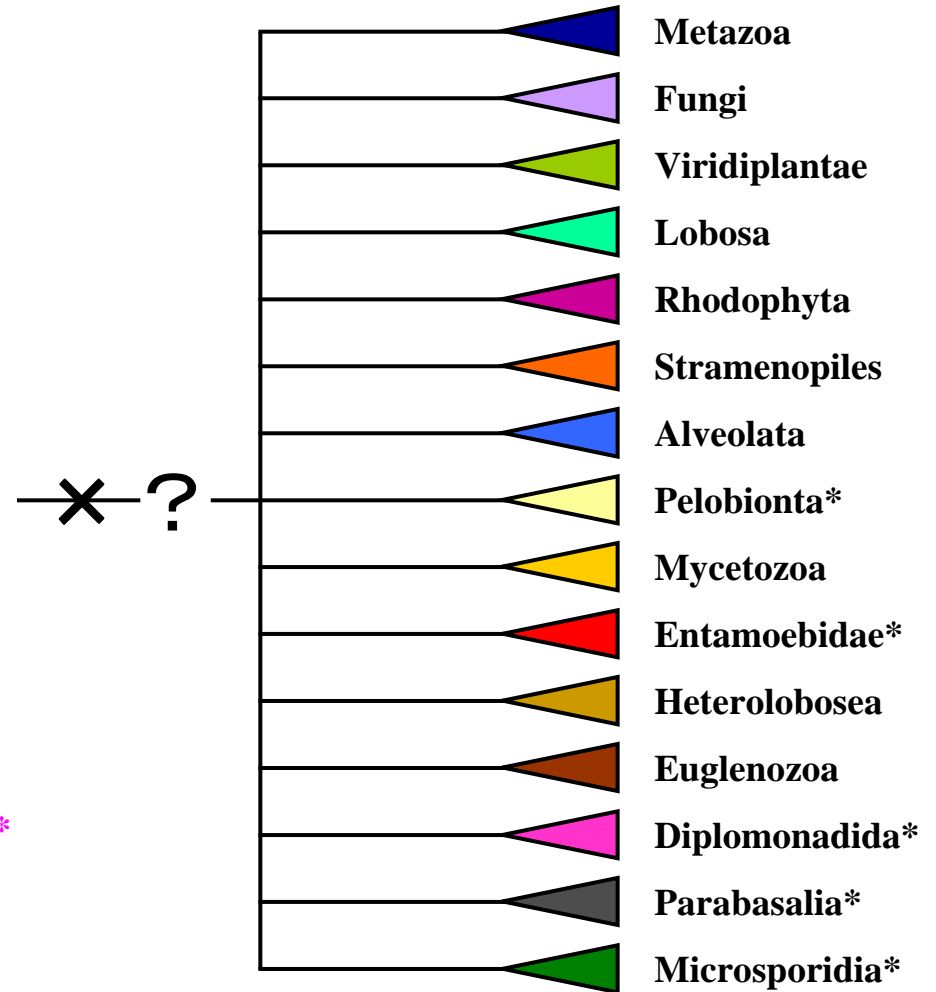
Long branches are artificially located at the base of the tree

SSUrRNA tree of Eukaryota (~mid 90's)



* Amitochondriate protist group

(late 90's)



No consensus on eukaryotic phylogeny !

Combined phylogeny of multi-genes (2000~)

- To accumulate phylogenetic
signals of individual genes

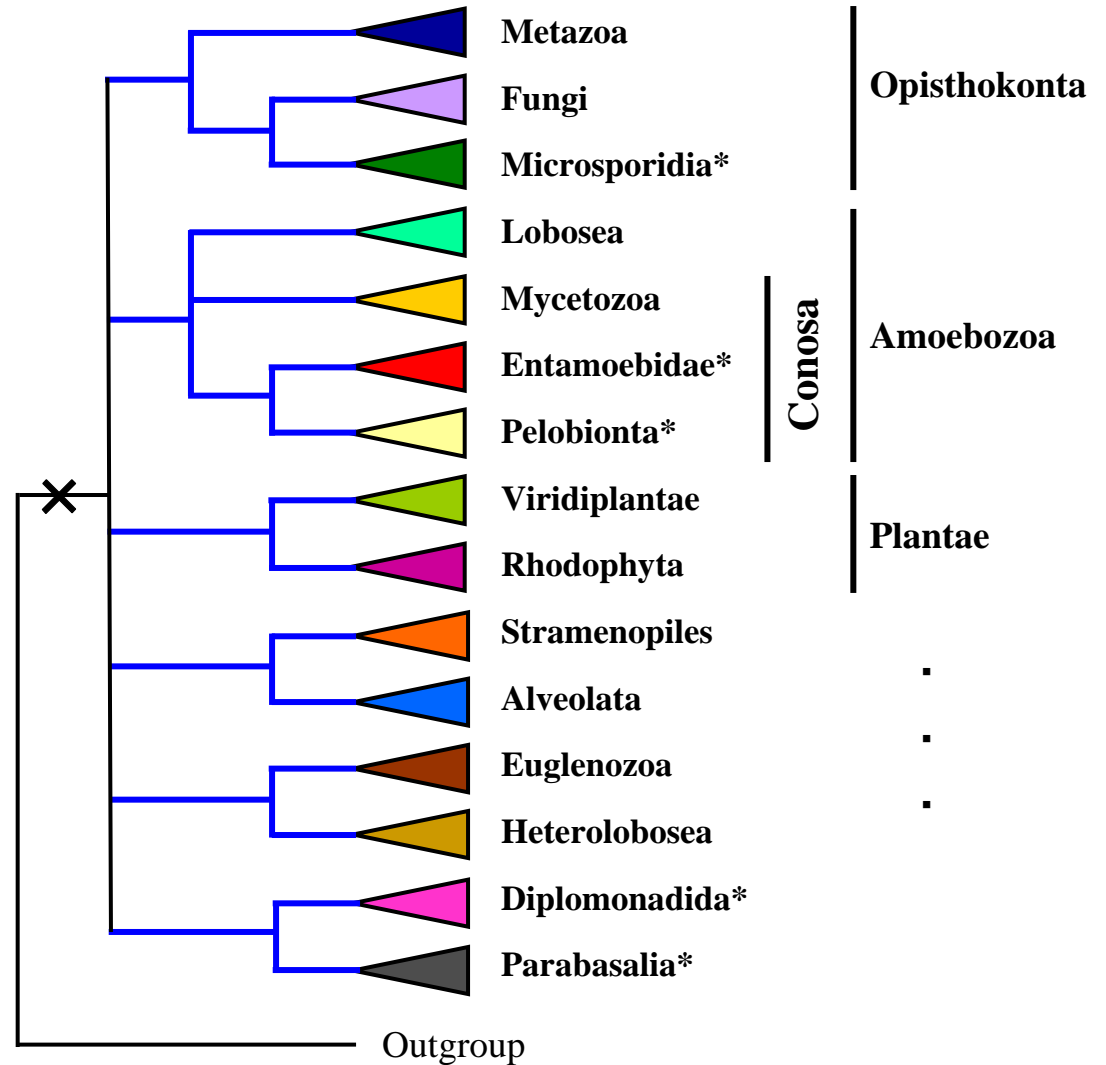


Robust inference

Large groups

⇒ Supergroup

Large group ⇒ Supergroup



* Amitochondriate group