# Chapter 7: Molecular phylogeny and evolution

### Learning objectives

Upon completing this chapter you should be able to:

- describe the molecular clock hypothesis and explain its significance;
- define positive and negative selection and test its presence in sequences of interest;
- describe the types of phylogenetic trees and their parts (branches, nodes, roots);
- create phylogenetic trees using distance-based and character-based methods; and
- explain the basis of different approaches to creating phylogenetic trees and evaluating them.

#### Outline

#### Introduction to molecular evolution

Principles of molecular phylogeny and evolution

Goals; historical background; molecular clock hypothesis;

positive and negative selection; neutral theory of evolution

Molecular phylogeny: properties of trees

Topologies and branch lengths of trees

Tree roots

Enumerating trees and selecting search strategies

Type of trees (species trees vs. gene/protein trees; DNA or protein)

Five stages of phylogenetic analysis

Stage 1: sequence acquisition

Stage 2: multiple sequence alignment

Stage 3: models of DNA and amino acid substitution

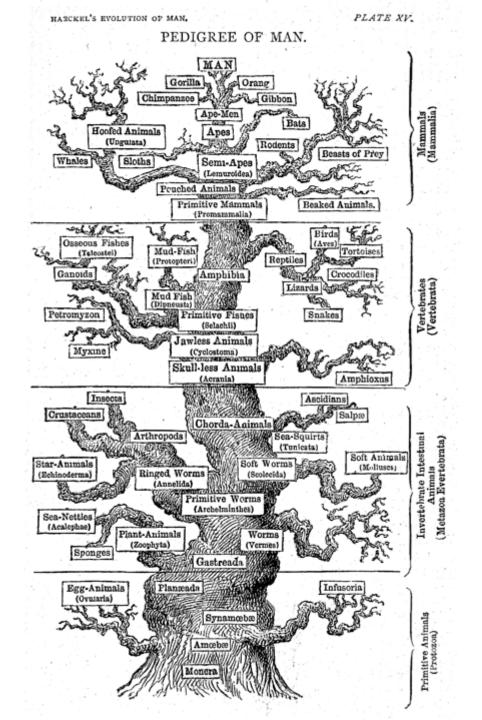
Stage 4: tree-building methods (distance-based; maximum

parsimony; maximum likelihood; Bayesian methods)

Stage 5: evaluating trees

Perspective

animals
plants
fungi
protists
monera



mammals

vertebrates

invertebrates

protozoa

#### Introduction

Charles Darwin's 1859 book (On the Origin of Species By Means of Natural Selection, or the Preservation of Favoured Races in the Struggle for Life) introduced the theory of evolution.

To Darwin, the struggle for existence induces a natural selection. Offspring are dissimilar from their parents (that is, variability exists), and individuals that are more fit for a given environment are selected for. In this way, over long periods of time, species evolve. Groups of organisms change over time so that descendants differ structurally and functionally from their ancestors.

#### Introduction

At the molecular level, evolution is a process of mutation with selection.

Molecular evolution is the study of changes in genes and proteins throughout different branches of the tree of life.

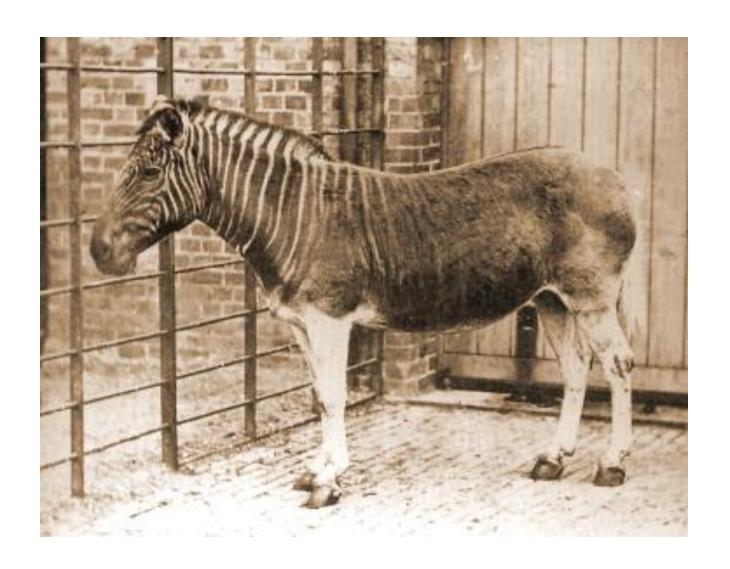
Phylogeny is the inference of evolutionary relationships. Traditionally, phylogeny relied on the comparison of morphological features between organisms. Today, molecular sequence data are also used for phylogenetic analyses.

# Goals of molecular phylogeny

#### Phylogeny can answer questions such as:

- Is my favorite gene under selective pressure?
- Was the extinct quagga more like a zebra or a horse?
- Was Darwin correct that humans are closest to chimps and gorillas?
- How related are whales, dolphins & porpoises to cows?
- Where and when did HIV originate?
- What is the history of life on earth?

# Was the quagga (now extinct) more like a zebra or a horse?



#### Outline

Introduction to molecular evolution

Principles of molecular phylogeny and evolution

Goals; historical background; molecular clock hypothesis;

positive and negative selection; neutral theory of evolution

Molecular phylogeny: properties of trees

Topologies and branch lengths of trees

Tree roots

Enumerating trees and selecting search strategies

Type of trees (species trees vs. gene/protein trees; DNA or protein)

Five stages of phylogenetic analysis

Stage 1: sequence acquisition

Stage 2: multiple sequence alignment

Stage 3: models of DNA and amino acid substitution

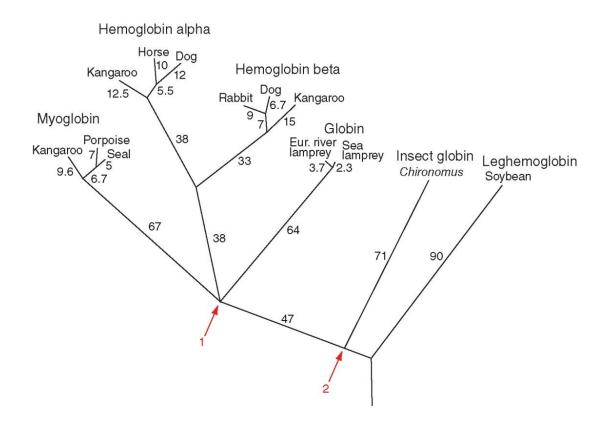
Stage 4: tree-building methods (distance-based; maximum

parsimony; maximum likelihood; Bayesian methods)

Stage 5: evaluating trees

Perspective

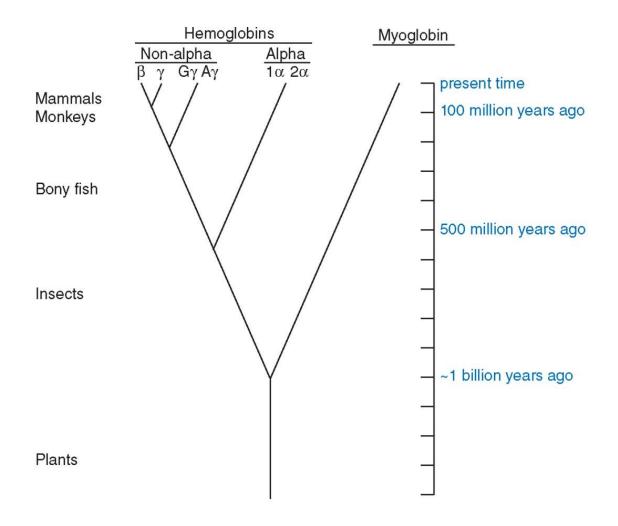
# 1960s: globin phylogeny (tree of 13 orthologs by Margaret Dayhoff and colleagues)



Arrow I: node corresponding to last common ancestor of a group of vertebrate globins.

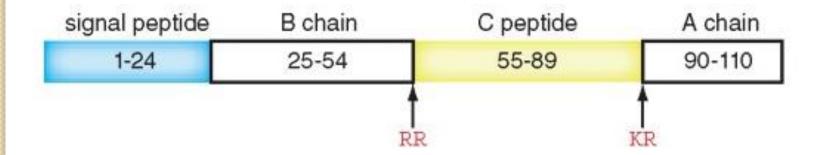
Arrow 2: ancestor of insect and vertebrate globins

# 1960s: globin phylogeny (tree of 7 paralogs)



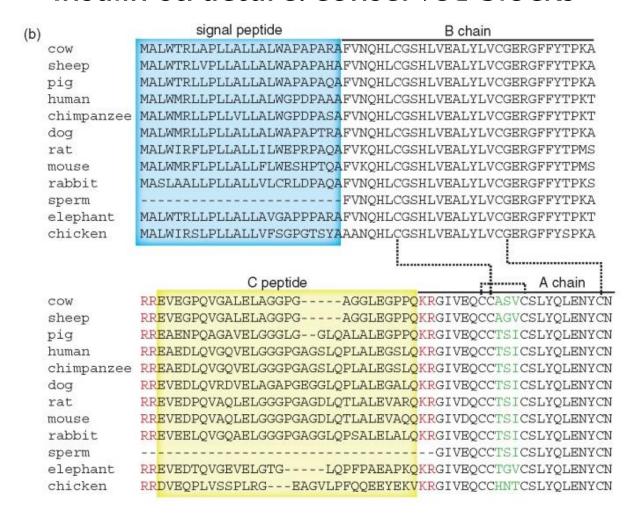
Dayhoff et al. (1972) analyzed related globins in the context of evolutionary time.

#### Insulin structure



Dibasic residues flank the C peptide which is cleaved and removed.

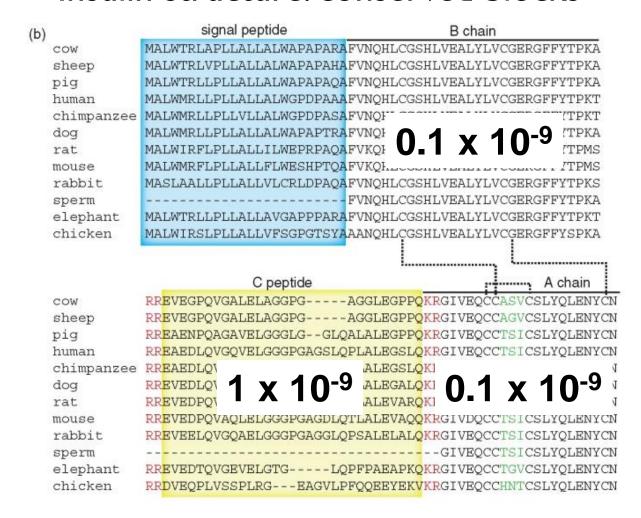
#### Insulin structure: conserved blocks



The residues in the B and A chains are highly conserved across species. The rate of nucleotide substitution is 6- to 10-fold higher in the C chain region.

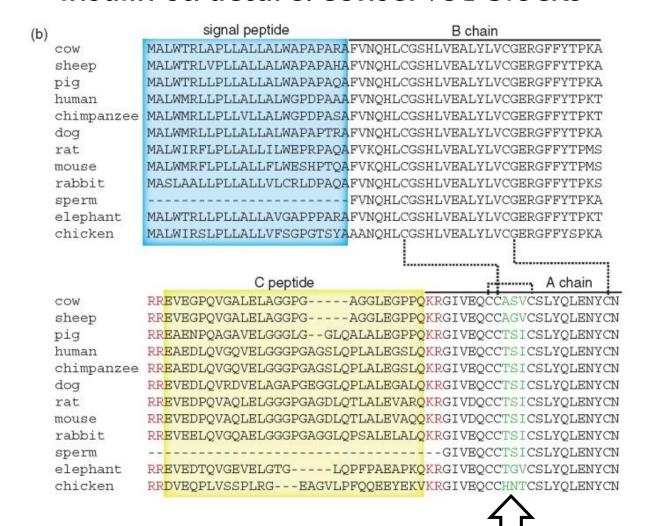
B&FG 3e Fig. 7.3 Page 249

#### Insulin structure: conserved blocks



Number of nucleotide substitutions/site/year

#### Insulin structure: conserved blocks



Note the sequence divergence in the disulfide loop region of the A chain. This is a spacer region that is under less evolutionary constraint.

### Historical background: insulin

By the 1950s, it became clear that amino acid substitutions occur nonrandomly. For example, Sanger and colleagues noted that most amino acid changes in the insulin A chain are restricted to a disulfide loop region. Such differences are called "neutral" changes (Kimura, 1968; Jukes and Cantor, 1969).

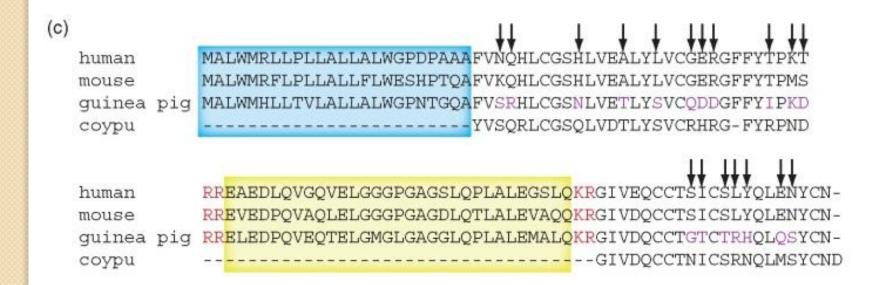
Subsequent studies at the DNA level showed that rate of nucleotide (and of amino acid) substitution is about sixto ten-fold higher in the C peptide, relative to the A and B chains.

### Historical background: insulin

Surprisingly, insulin from the guinea pig (and from the related coypu) evolve seven times faster than insulin from other species. Why?

The answer is that guinea pig and coypu insulin do not **bind two zinc ions**, while insulin molecules from most other species do. There was a relaxation on the structural constraints of these molecules, and so the genes diverged rapidly.

# Guinea pig and coypu insulins have evolved 7-fold faster than insulin from other species



Arrows indicate 18 amino acid positions at which guinea pig sequences vary from those of human and/or mouse

# Early (1960s) insights into protein evolution: oxytocin and vasopressin differ by only two amino acid residues but have vastly different functions

vasopressin-neurophysin 2-copeptin preproprotein [Homo sapiens]

Sequence ID: ref[NP\_000481.2] Length: 164 Number of Matches: 1

▶ See 5 more title(s)

Range 1: 20 to 28 GenPept Graphics

NW Score 47		Identities 7/9(78%)		Positives	Gaps 0/9(0%)
				7/9(77%)	
Query	20	CYIONCPLG	28 🚤	— Oxytocin (NP_000906.1)	
Sbjct	20	CY QNCP G CYFQNCPRG	28 🔫	— Arginine vasporessin (NP_	000481.2)

# Molecular clock hypothesis

In the 1960s, sequence data were accumulated for small, abundant proteins such as globins, cytochromes *c*, and fibrinopeptides. Some proteins appeared to evolve slowly, while others evolved rapidly.

Linus Pauling, Emanuel Margoliash and others proposed the hypothesis of a molecular clock:

For every given protein, the rate of molecular evolution is approximately constant in all evolutionary lineages

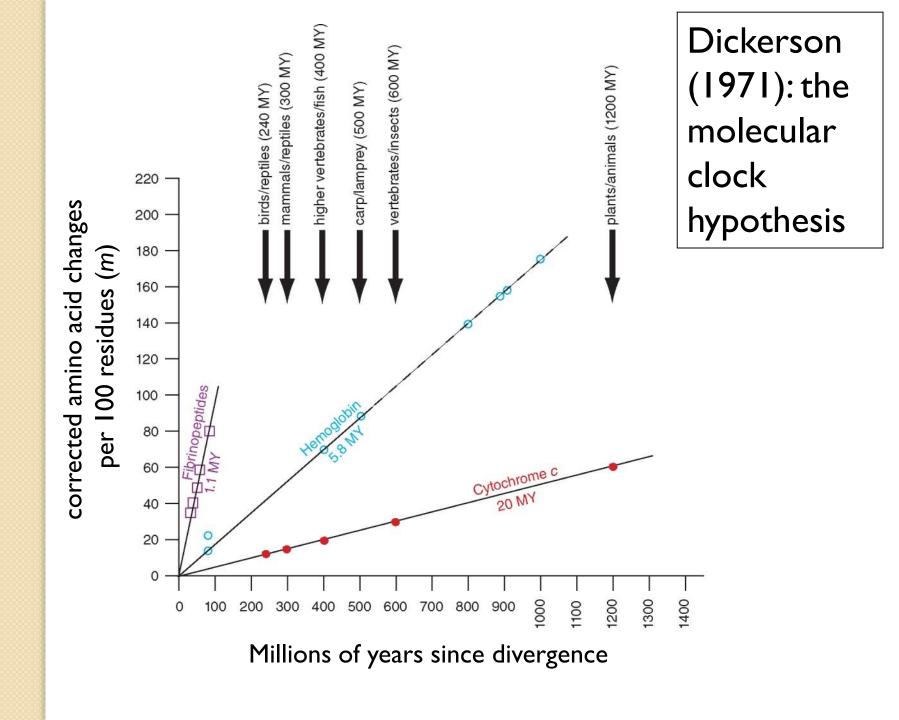
# Molecular clock hypothesis

As an example, Richard Dickerson (1971) plotted data from three protein families: cytochrome *c*, hemoglobin, and fibrinopeptides.

The x-axis shows the divergence times of the species, estimated from paleontological data. The y-axis shows m, the corrected number of amino acid changes per 100 residues.

n is the observed number of amino acid changes per 100 residues, and it is corrected to m to account for changes that occur but are not observed.

$$\frac{N}{100} = I - e^{-(m/100)}$$



### Molecular clock hypothesis: conclusions

#### Dickerson drew the following conclusions:

- For each protein, the data lie on a straight line. Thus, the rate of amino acid substitution has remained constant for each protein.
- The average rate of change differs for each protein. The time for a 1% change to occur between two lines of evolution is 20 MY (cytochrome c), 5.8 MY (hemoglobin), and 1.1 MY (fibrinopeptides).
- The observed variations in rate of change reflect functional constraints imposed by natural selection.

### Molecular clock hypothesis: implications

If protein sequences evolve at constant rates, they can be used to estimate the times that sequences diverged. This is analogous to dating geological specimens by radioactive decay.

# Positive and negative selection

Darwin's theory of evolution suggests that, at the phenotypic level, traits in a population that enhance survival are selected for, while traits that reduce fitness are selected against. For example, among a group of giraffes millions of years in the past, those giraffes that had longer necks were able to reach higher foliage and were more reproductively successful than their shorternecked group members, that is, the taller giraffes were selected for.

### Positive and negative selection

In the mid-20<sup>th</sup> century, a conventional view was that molecular sequences are routinely subject to positive (or negative) selection.

Positive selection occurs when a sequence undergoes significantly increased rates of substitution, while negative selection occurs when a sequence undergoes change slowly. Otherwise, selection is neutral.

### Neutral theory of evolution

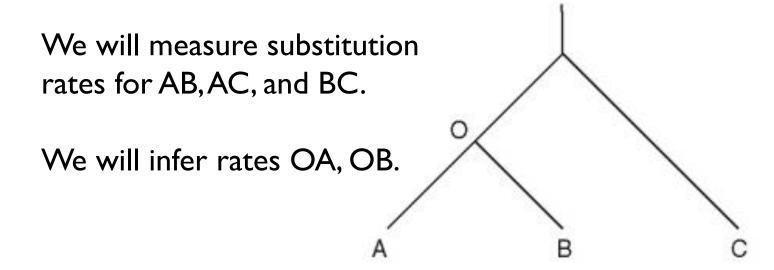
An often-held view of evolution is that just as organisms propagate through natural selection, so also DNA and protein molecules are selected for.

According to Motoo Kimura's 1968 neutral theory of molecular evolution, the vast majority of DNA changes are <u>not</u> selected for in a Darwinian sense. The main cause of **evolutionary change is random drift of mutant alleles** that are selectively neutral (or nearly neutral). Positive Darwinian selection does occur, but it has a limited role.

As an example, the divergent C peptide of insulin changes according to the neutral mutation rate.

#### Relative rate test to test the molecular clock

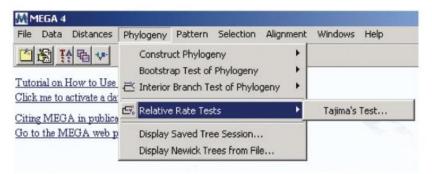
Test whether protein (or DNA) from organisms A, B evolve at the same rate (Tajima, 1993). Define a common ancestor (O) and select an appropriate outgroup (C).



We will perform a chi square  $(\chi^2)$  test to determine if those rates are comparable (null hypothesis) or whether we can reject the null at a significance level of p < 0.05.

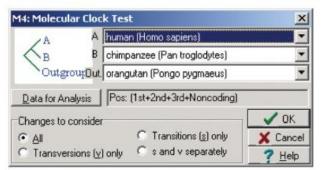
#### Relative rate test to test the molecular clock

Tajima's test is implemented in MEGA (phylogeny pull-down)



In this example
A=human mitochondrial DNA
B=chimp
C=orang-utan (outgroup)

The output shows p<0.05. We reject the null hypothesis of equal rates of evolution between human and chimp lineages.



Configuration	Count
Identical sites in all three sequences (m <sub>iii</sub> )	712
Divergent sites in all three sequences $(m_{ijk})$	3
Unique differences in Sequence A (m <sub>ijj</sub> )	31
Unique differences in Sequence B (m <sub>iji</sub> )	49
Unique differences in Sequence C (m;;;)	100

Note: The equality of evolutionary rate between human (Homo sapiens) and chimpanzee (Pan troglodytes) is tested using orangutan (Pongo pygmaeus) as an outgroup in Tajima' relative rate test in MEGA4 [1, 2]. The  $\chi^2$  test statistic was 4.05 (P=0.04417 with 1 degree[s] of freedom). P-value less than 0.05 is often used to reject the null hypothesis of equal rates between lineages.

# Consider using DNA, RNA, or protein for phylogeny

#### Four globins are aligned.

- The DNA contains informative differences in the 5' (and 3') untranslated regions.
- There are protein changes (top, green arrowheads).
- There are more DNA changes: note 6 positions having synonymous changes (nucleotides shaded blue) and six positions with nonsynonymous changes (red nucleotides).

#### Outline

Introduction to molecular evolution
Principles of molecular phylogeny and evolution

Goals; historical background; molecular clock hypothesis; positive and negative selection; neutral theory of evolution

Molecular phylogeny: properties of trees

Topologies and branch lengths of trees

Tree roots

Enumerating trees and selecting search strategies

Type of trees (species trees vs. gene/protein trees; DNA or protein)

Five stages of phylogenetic analysis

Stage 1: sequence acquisition

Stage 2: multiple sequence alignment

Stage 3: models of DNA and amino acid substitution

Stage 4: tree-building methods (distance-based; maximum parsimony; maximum likelihood; Bayesian methods)

Stage 5: evaluating trees

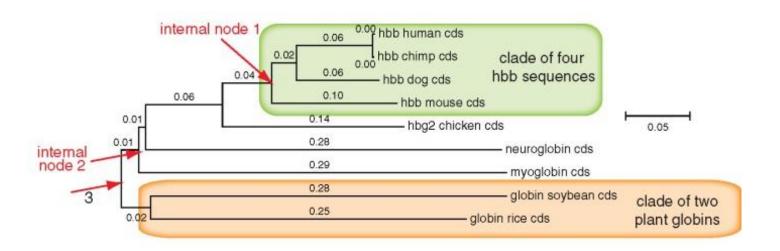
Perspective

# Molecular phylogeny: nomenclature of trees

There are two main kinds of information inherent to any tree: topology and branch lengths.

We will now describe the parts of a tree.

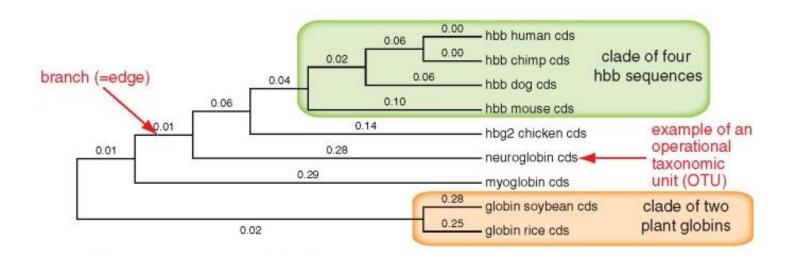
# Nine globin coding sequences: neighbor-joining tree (rectangular tree style)



Nine globin DNA coding sequences were imported into MEGA, aligned with MUSCLE, and the branches and nodes are displayed in four different ways.

Note here that there are external nodes (extant sequences at the right) and internal nodes (each represents an ancestral sequence).

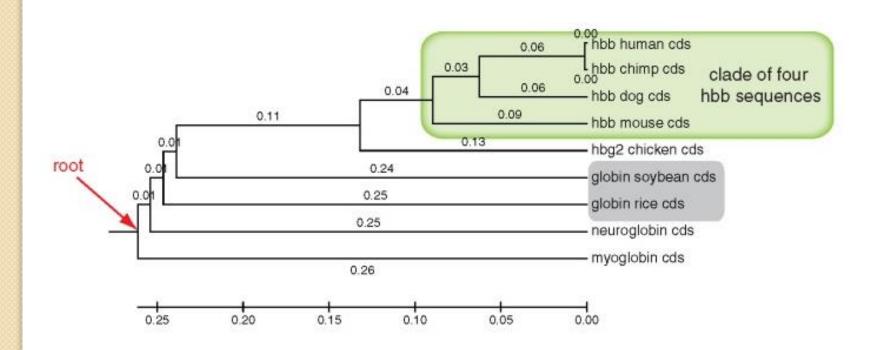
# Nine globin coding sequences: neighbor-joining tree ("topology only" tree style)



Advantage of this display format: external nodes are lined up neatly to the right.

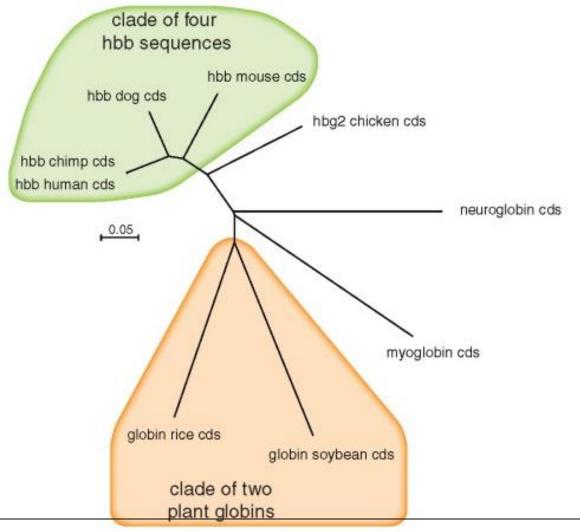
Disadvantage: branch lengths are not proportional to the values (as they were in the previous slide).

# Nine globin coding sequences: UPGMA tree



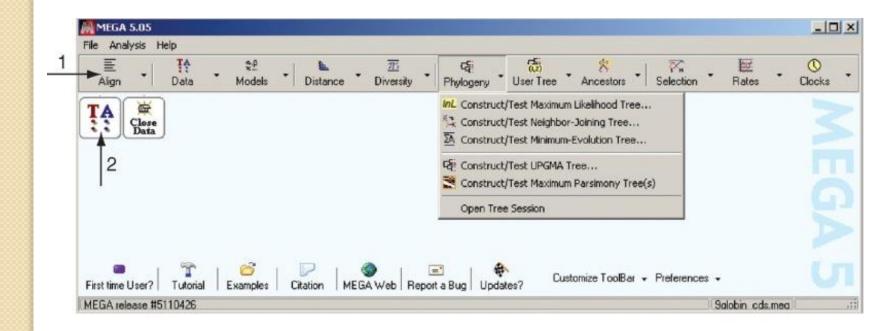
We define UPGMA below. Note that this tree is rooted. The topology of the two plant globins has changed: they now are (unrealistically) members of a clade with vertebrate globins)

# Nine globin coding sequences: neighbor-joining tree (radial tree style)



You may choose how to display your data. Be sure to define the scale bar; here it is nucleotide substitutions.

# MEGA software for phylogenetic analyses: main dialog box

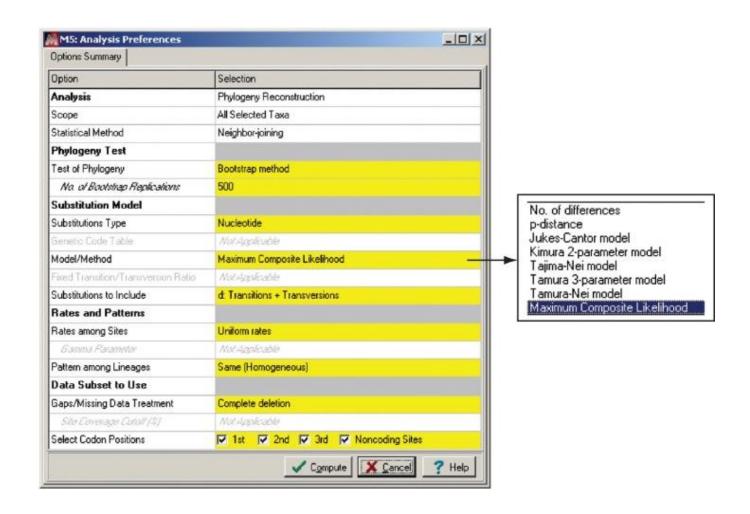


MEGA is freely available from http://www.megasoftware.net. Visit that site for a manual and publications.

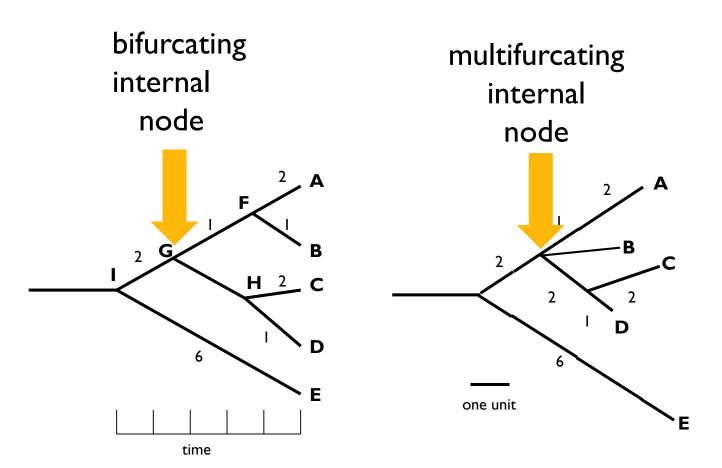
# MEGA software for phylogenetic analyses: alignment editor to create or open an alignment



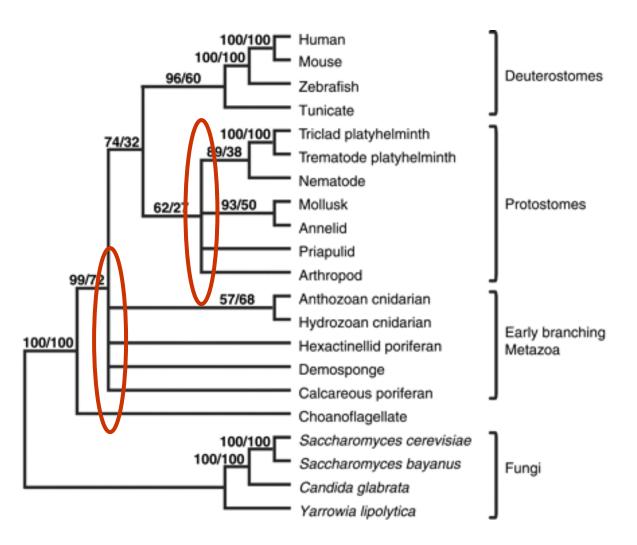
# MEGA software for phylogenetic analyses: analysis preferences dialog box



### Tree nomenclature



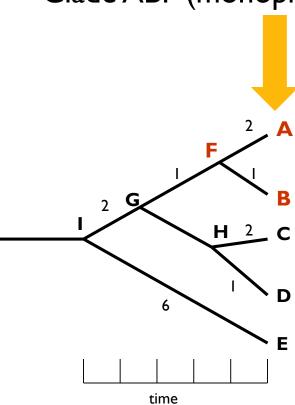
# Examples of multifurcation: failure to resolve the branching order of some metazoans and protostomes



Rokas A. et al., Animal Evolution and the Molecular Signature of Radiations Compressed in Time, *Science* 310:1933 (2005), Fig. 1.

### Tree nomenclature: clades

Clade ABF (monophyletic group)

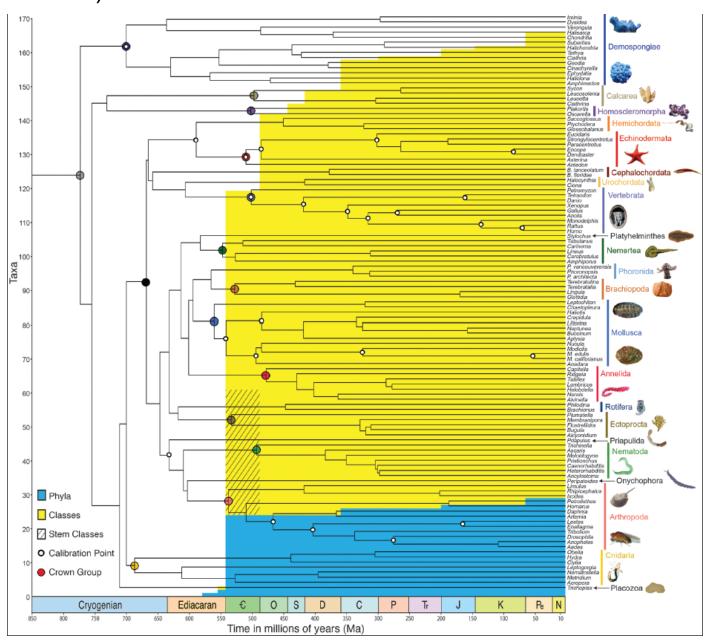


#### Arctic fox Kit fox Corsac fox Ruppell's fox 99 Red fox 100 Cape fox 100 Blanford's fox 100 Fennec fox 75 Raccoon dog 100 Bat-eared fox Short-eared dog Crab-eating fox 100 Sechuran fox 99 100 Culpeo fox 80 Pampas fox 100 Chilla 99 100 93 Darwin's fox 100 Hoary fox Maned wolf 96 100 100 Bush dog Side-striped jackal 100 100 Black-backed jackal 100 3–4 Myr Golden jackal 9-10 100 Myr Dog 93 100 78 100 100 100 Grey wolf 100 Coyote Ethiopian wolf 6–7.4 Myr 78 Dhole 100 African wild dog Grey fox 100 Island fox Black bear 100 100 Giant panda Northern elephant seal 100 100 Walrus

### Examples of clades

Lindblad-Toh et al., *Nature* 438: 803 (2005), fig. 10

Diversification of animals (Erwin DH *Science* 25 Nov. 2011 p.1091, PMID 22116879)



### Outline

Introduction to molecular evolution
Principles of molecular phylogeny and evolution

Goals; historical background; molecular clock hypothesis; positive and negative selection; neutral theory of evolution Molecular phylogeny: properties of trees

Topologies and branch lengths of trees

#### Tree roots

Enumerating trees and selecting search strategies

Type of trees (species trees vs. gene/protein trees; DNA or protein)

Five stages of phylogenetic analysis

Stage 1: sequence acquisition

Stage 2: multiple sequence alignment

Stage 3: models of DNA and amino acid substitution

Stage 4: tree-building methods (distance-based; maximum parsimony; maximum likelihood; Bayesian methods)

Stage 5: evaluating trees

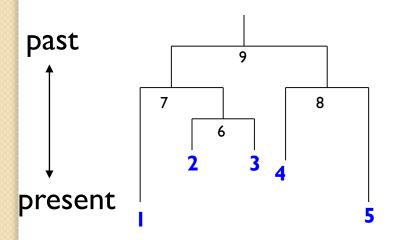
Perspective

#### Tree roots

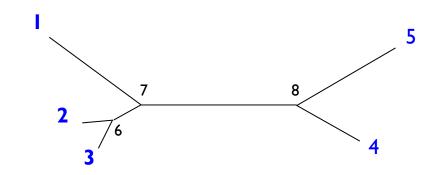
The root of a phylogenetic tree represents the common ancestor of the sequences. Some trees are unrooted, and thus do not specify the common ancestor.

A tree can be rooted using an outgroup (that is, a taxon known to be distantly related from all other OTUs).

### Tree nomenclature: roots

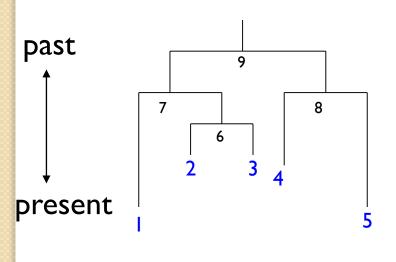


Rooted tree (specifies evolutionary path)

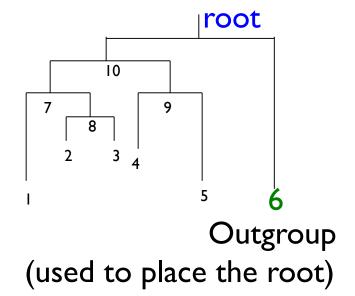


Unrooted tree

### Tree nomenclature: outgroup rooting



Rooted tree



### Outline

Introduction to molecular evolution

Principles of molecular phylogeny and evolution

Goals; historical background; molecular clock hypothesis; positive and negative selection; neutral theory of evolution

Molecular phylogeny: properties of trees

Topologies and branch lengths of trees

Tree roots

Enumerating trees and selecting search strategies

Type of trees (species trees vs. gene/protein trees; DNA or protein)

Five stages of phylogenetic analysis

Stage 1: sequence acquisition

Stage 2: multiple sequence alignment

Stage 3: models of DNA and amino acid substitution

Stage 4: tree-building methods (distance-based; maximum parsimony; maximum likelihood; Bayesian methods)

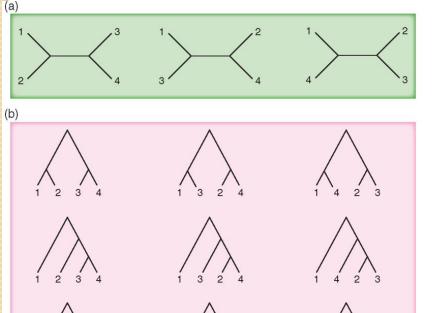
Stage 5: evaluating trees

Perspective

### Numbers of trees

Number	Number of	Number of
of OTUs	rooted trees	unrooted trees
2	I	<u> </u>
3	3	1
4	15	3
5	105	15
10	34,459,425	105
20	$8 \times 10^{21}$	$2 \times 10^{20}$

### Numbers of rooted and unrooted trees: 4 OTUs



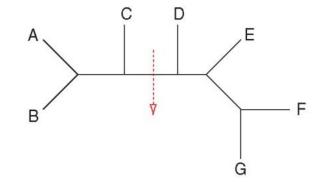
For 4 OTUs there are three possible unrooted trees.

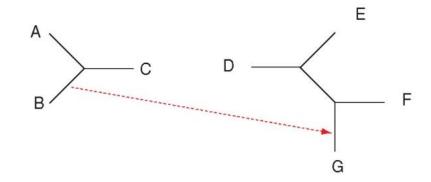
For 4 OTUs there are 15 possible rooted trees.

There is only one of these 15 trees that accurately describes the evolutionary process by which these four sequences evolved.

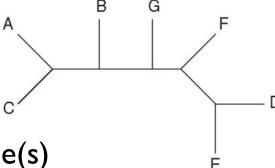
## Finding optimal trees: branch swapping

Bisect a branch to form two subtrees





Reconnect via one branch from each subtree; evaluate each bisection



Identify the optimal tree(s)

#### Outline

Introduction to molecular evolution

Principles of molecular phylogeny and evolution

Goals; historical background; molecular clock hypothesis;

positive and negative selection; neutral theory of evolution

Molecular phylogeny: properties of trees

Topologies and branch lengths of trees

Tree roots

Enumerating trees and selecting search strategies

Type of trees (species trees vs. gene/protein trees; DNA or protein)

Five stages of phylogenetic analysis

Stage 1: sequence acquisition

Stage 2: multiple sequence alignment

Stage 3: models of DNA and amino acid substitution

Stage 4: tree-building methods (distance-based; maximum

parsimony; maximum likelihood; Bayesian methods)

Stage 5: evaluating trees

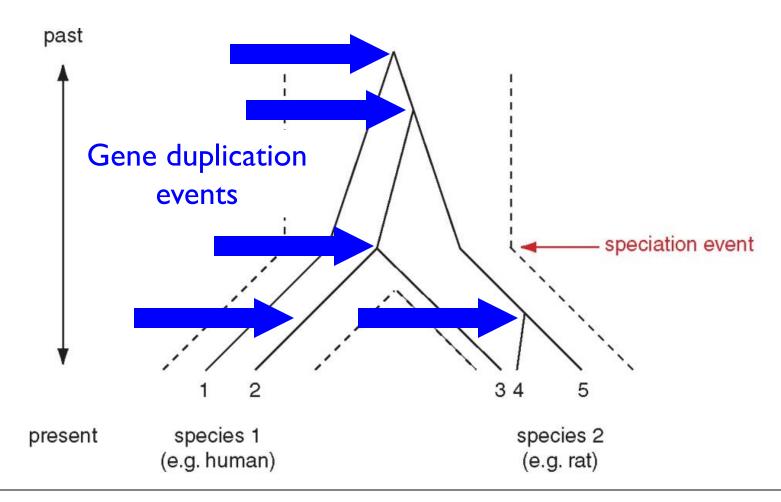
Perspective

### Species trees versus gene/protein trees

Molecular evolutionary studies can be complicated by the fact that both species and genes evolve. Speciation usually occurs when a species becomes reproductively isolated. In a species tree, each internal node represents a speciation event.

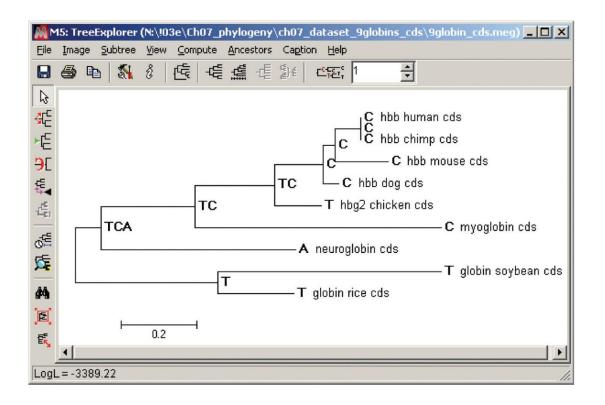
Genes (and proteins) may duplicate or otherwise evolve before or after any given speciation event. The topology of a gene (or protein) based tree may differ from the topology of a species tree.

### Species trees versus gene/protein trees



A gene (e.g. a globin) may duplicate before or after two species diverge!

# Species trees versus gene/protein trees: we can infer ancestral sequences!



Reconstruction of ancestral sequences using MEGA (ancestors tab following creation of a maximum likelihood tree of nine globin sequences).

#### Outline

Introduction to molecular evolution

Principles of molecular phylogeny and evolution

Goals; historical background; molecular clock hypothesis;

positive and negative selection; neutral theory of evolution

Molecular phylogeny: properties of trees

Topologies and branch lengths of trees

Tree roots

Enumerating trees and selecting search strategies

Type of trees (species trees vs. gene/protein trees; DNA or protein)

### Five stages of phylogenetic analysis

Stage 1: sequence acquisition

Stage 2: multiple sequence alignment

Stage 3: models of DNA and amino acid substitution

Stage 4: tree-building methods (distance-based; maximum

parsimony; maximum likelihood; Bayesian methods)

Stage 5: evaluating trees

Perspective

## Stage I: Use of DNA, RNA, or protein

If the synonymous substitution rate  $(d_S)$  is greater than the nonsynonymous substitution rate  $(d_N)$ , the DNA sequence is under negative (purifying) selection. This limits change in the sequence (e.g. insulin A chain).

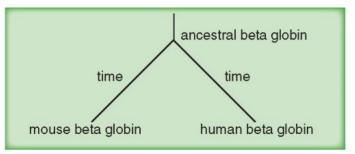
If  $d_S < d_N$ , positive selection occurs. For example, a duplicated gene may evolve rapidly to assume new functions.

### Stage I: Use of DNA, RNA, or protein

For phylogeny, DNA can be more informative.

Some substitutions in a DNA sequence alignment can be directly observed: single nucleotide substitutions, sequential substitutions, coincidental substitutions. Additional mutational events can be inferred by analysis of ancestral sequences.

# Two sequences (human and mouse) and their common ancestor: we can infer which DNA changes occurred over time



ancestral		M	V	H	L	S	P	V	E	K	S	A	V	
human		M	V	H	L	$\mathbf{T}$	P	E	E	K	S	A	V	
mouse		M	V	Н	L	T	D	A	E	K	S	A	V	
ancestral	5′	ATG	GTG	CAT	CTG	AGT	CCT	GTT	CAG	AAG	TCT	GCT	GTT	3'
human	5′	ATG	GTG	CAT	CTG	ACT	CCT	GAG	GAG	AAG	TCT	GCC	GTT	3'
mouse	5′	ATG	GTG	CAC	CTG	ACT	GAT	GCT	GAG	AAG	TCT	GCT	GTC	3'

ancestral human mouse globin globin globin

	0.00	0.00		
Α	Α	Α	AA	
G	$G \rightarrow C$	$G \rightarrow C$	CC	parallel substitutions
T	T	Т	TT	
С	С	$C \rightarrow G$	CG	single substitution
С	С	$C \rightarrow T \rightarrow A$	CA	sequential substitution
T	T	Т	TT	
G	G	G	GG	
T	$T \rightarrow A$	$T \rightarrow C$	AC	coincidental substitutions
T	$T \rightarrow G$	T	GT	
С	$C \rightarrow G$	$C \rightarrow T \rightarrow G$	GG	convergent substitutions
Α	Α	Α	AA	
G	$G \rightarrow T \rightarrow G$	G	GG	back substitution
				I

parallel substitutions single sequential

coincidental convergent back substitution

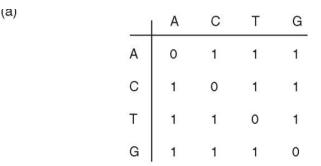
ancestral globin human globin (hypothetical)

mouse globin

observed alignment

Substitution mechanism

### Step matrices: number of steps required to change a character



nucleotide step matrix

		1
- 7	r	١,
·	L	,,
١.		,

	A	С	D	E	F	G	Н	I	K	L	М	N	Р	Q	R	S	Т	V	W	Y
A	0	2	1	1	2	1	2	2	2	2	2	2	1	2	2	1	1	1	2	2
C		0	2	3	1	1	2	2	3	2	3	2	2	3	1	1	2	2	1	1
D			0	1	2	1	1	2	2	2	3	1	2	2	2	2	2	1	3	1
E				0	3	1	2	2	1	2	2	2	2	1	2	2	2	1	2	2
F					0	2	2	1	3	1	2	2	2	3	2	1	2	1	2	1
G						0	2	2	2	2	2	2	2	2	1	1	2	1	1	2
H							0	2	2	1	3	1	1	1	1	2	2	2	3	1
I								0	1	1	1	1	2	2	1	1	1	1	3	2
K									0	2	1	1	2	1	1	2	1	2	2	2
L										0	1	2	1	1	1	1	2	1	1	2
M											0	2	2	2	1	2	1	1	2	3
N												0	2	2	2	1	1	2	3	1
P													0	1	1	1	1	2	2	2
Q														0	1	2	2	2	2	2
R															0	1	1	2	1	2
S																0	1	2	1	1
$\mathbf{T}$																	0	2	2	2
V																		0	2	2
W																			0	2
Y																				0

amino acid step matrix

For amino acids, between 1 and 3 nucleotide changes are required to change one residue to another.

#### Outline

Introduction to molecular evolution

Principles of molecular phylogeny and evolution

Goals; historical background; molecular clock hypothesis;

positive and negative selection; neutral theory of evolution

Molecular phylogeny: properties of trees

Topologies and branch lengths of trees

Tree roots

Enumerating trees and selecting search strategies

Type of trees (species trees vs. gene/protein trees; DNA or protein)

Five stages of phylogenetic analysis

Stage 1: sequence acquisition

Stage 2: multiple sequence alignment

Stage 3: models of DNA and amino acid substitution

Stage 4: tree-building methods (distance-based; maximum

parsimony; maximum likelihood; Bayesian methods)

Stage 5: evaluating trees

Perspective

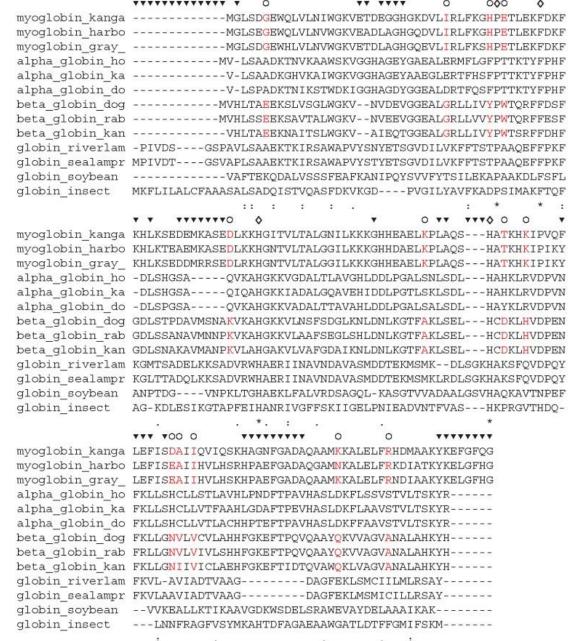
### Stage 2: Multiple sequence alignment

The fundamental basis of a phylogenetic tree is a multiple sequence alignment.

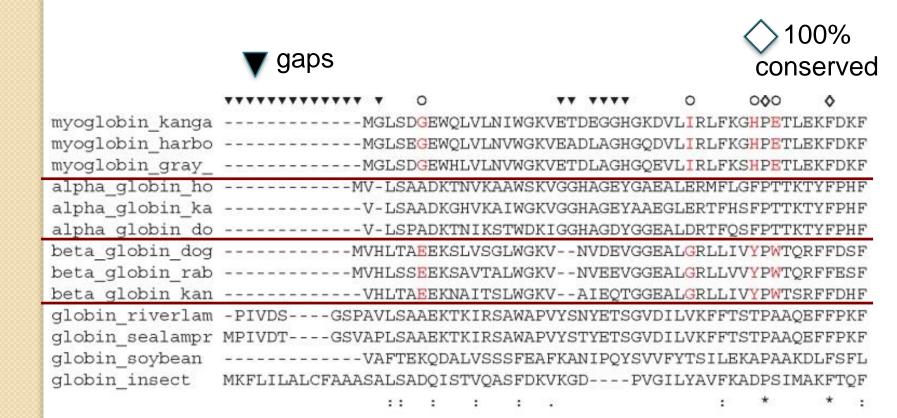
(If there is a misalignment, or if a nonhomologous sequence is included in the alignment, it will still be possible to generate a tree.)

Consider the following alignment of 13 homologous globin proteins

# Multiple alignment of myoglobins, alpha globins, beta globins



# Open circles: positions that distinguish myoglobins, alpha globins, beta globins



### Stage 2: Multiple sequence alignment

- [1] Confirm that all sequences are homologous
- [2] Adjust gap creation and extension penalties as needed to optimize the alignment
- [3] Restrict phylogenetic analysis to regions of the multiple sequence alignment for which data are available for all taxa (delete columns having incomplete data).

#### Outline

Introduction to molecular evolution

Principles of molecular phylogeny and evolution

Goals; historical background; molecular clock hypothesis;

positive and negative selection; neutral theory of evolution

Molecular phylogeny: properties of trees

Topologies and branch lengths of trees

Tree roots

Enumerating trees and selecting search strategies

Type of trees (species trees vs. gene/protein trees; DNA or protein)

Five stages of phylogenetic analysis

Stage 1: sequence acquisition

Stage 2: multiple sequence alignment

Stage 3: models of DNA and amino acid substitution

Stage 4: tree-building methods (distance-based; maximum parsimony; maximum likelihood; Bayesian methods)

Stage 5: evaluating trees

Perspective

### Stage 3: Models of substitution

The simplest approach to measuring distances between sequences is to align pairs of sequences, and then to count the number of differences. The degree of divergence is called the Hamming distance. For an alignment of length N with n sites at which there are differences, the degree of divergence D is:

D = n / N

### Stage 3: Models of substitution

The simplest approach to measuring distances between sequences is to align pairs of sequences, and then to count the number of differences. The degree of divergence is called the Hamming distance. For an alignment of length N with n sites at which there are differences, the degree of divergence D is:

$$D = n / N$$

But observed differences do not equal genetic distance! Genetic distance involves mutations that are not observed directly

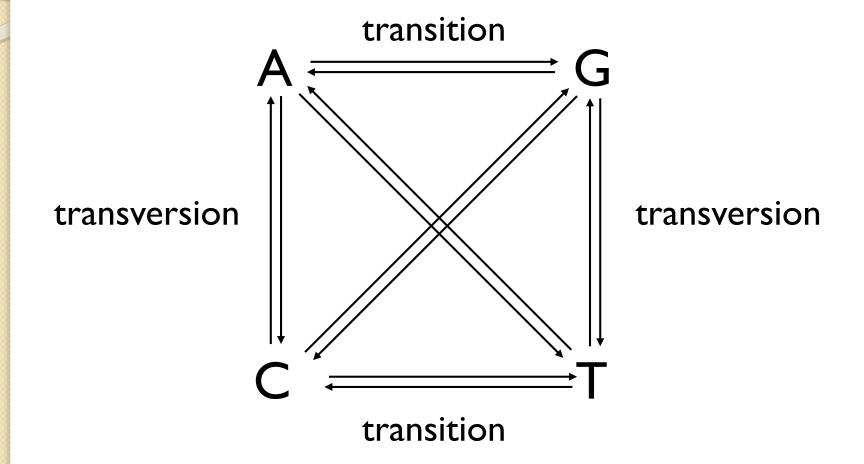
### Stage 3: Models of substitution

Jukes and Cantor (1969) proposed a corrective formula:

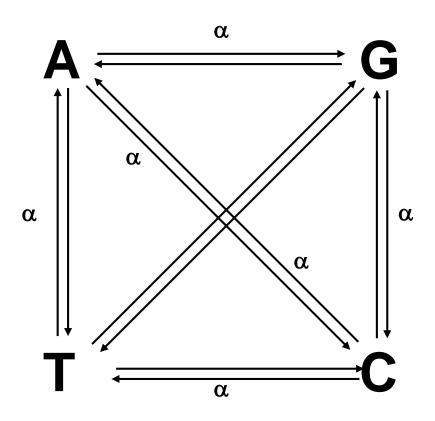
$$D = (-\frac{3}{4}) \ln (1 - \frac{4}{3}p)$$

This model describes the probability that one nucleotide will change into another. It assumes that each residue is equally likely to change into any other (i.e. the rate of transversions equals the rate of transitions). In practice, the transition is typically greater than the transversion rate.

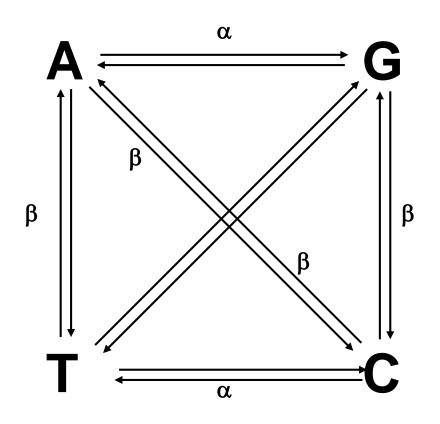
### There are dozens of models of nucleotide substitution



# Jukes and Cantor one-parameter model of nucleotide substitution ( $\alpha$ = $\beta$ )



# Kimura two-parameter model of nucleotide substitution (assumes $a \neq b$ )



## Stage 4: Tree-building methods: distance

Jukes and Cantor (1969) proposed a corrective formula:

$$D = (-\frac{3}{4}) \ln (1 - \frac{4}{3}p)$$

#### Outline

Introduction to molecular evolution

Principles of molecular phylogeny and evolution

Goals; historical background; molecular clock hypothesis;

positive and negative selection; neutral theory of evolution

Molecular phylogeny: properties of trees

Topologies and branch lengths of trees

Tree roots

Enumerating trees and selecting search strategies

Type of trees (species trees vs. gene/protein trees; DNA or protein)

Five stages of phylogenetic analysis

Stage 1: sequence acquisition

Stage 2: multiple sequence alignment

Stage 3: models of DNA and amino acid substitution

Stage 4: tree-building methods (distance-based; maximum parsimony; maximum likelihood; Bayesian methods)

Stage 5: evaluating trees

Perspective

## Stage 4: Tree-building methods

We will discuss several tree-building methods:

UPGMA distance-based

Neighbor-joining distance-based

Maximum parsimony character-based

Maximum likelihood character-based (model-based)

Bayesian character-based (model-based)

#### Stage 4: Tree-building methods

Distance-based methods involve a distance metric, such as the number of amino acid changes between the sequences, or a distance score. Examples of distance-based algorithms are UPGMA and neighbor-joining.

Character-based methods include maximum parsimony and maximum likelihood. Parsimony analysis involves the search for the tree with the fewest amino acid (or nucleotide) changes that account for the observed differences between taxa.

-----MGLSDGEWQLVLNIWGKVETDEGGHGKDVLIRLFKGHPETLEKFDKF myoglobin kanga myoglobin harbo -----MGLSEGEWQLVLNVWGKVEADLAGHGQDVLIRLFKGHPETLEKFDKF mvoqlobin grav -----MGLSDGEWHLVLNVWGKVETDLAGHGQEVLIRLFKSHPETLEKFDKF alpha globin ho ------MV-LSAADKTNVKAAWSKVGGHAGEYGAEALERMFLGFPTTKTYF ------V-LSAADKGHVKAIWGKVGGHAGEYAAEGLERTFHSFPTTKTYFPHF alpha globin ka alpha globin do -----V-LSPADKTNIKSTWDKIGGHAGDYGGEALDRTFQSFPTTKTYFPHF beta globin dog -----MVHLTAEEKSLVSGLWGKV--NVDEVGGEALGRLLIVYPWTQRFFDSF beta globin rab -----MVHLSSEEKSAVTALWGKV--NVEEVGGEALGRLLVVYPWTQRFFESF beta globin kan -----VHLTAEEKNAITSLWGKV--AIEQTGGEALGRLLIVYPWTSRFFDHF globin riverlam -PIVDS----GSPAVLSAAEKTKIRSAWAPVYSNYETSGVDILVKFFTSTPAAQEFFPKF globin sealampr MPIVDT----GSVAPLSAAEKTKIRSAWAPVYSTYETSGVDILVKFFTSTPAAQEFFPKF globin soybean ------VAFTEKODALVSSSFEAFKANIPOYSVVFYTSILEKAPAAKDLFSFL globin insect MKFLILALCFAAASALSADQISTVQASFDKVKGD----PVGILYAVFKADPSIMAKFTOF myoglobin kanga KHLKSEDEMKASEDLKKHGITVLTALGNILKKKGHHEAELKPLAQS---HATKHK myoglobin harbo KHLKTEAEMKASEDLKKHGNTVLTALGGILKKKGHHDAELKPLAQS---HATKHK mvoglobin grav KHLKSEDDMRRSEDLRKHGNTVLTALGGILKKKGHHEAELKPLAQS---HATKHKIPIKY alpha globin ho -DLSHGSA-----QVKAHGKKVGDALTLAVGHLDDLPGALSNLSDL---HAHKLRVDPVN alpha globin ka -DLSHGSA-----QIQAHGKKIADALGQAVEHIDDLPGTLSKLSDL---HAHKLRVI alpha globin do -DLSPGSA-----QVKAHGKKVADALTTAVAHLDDLPGALSALSDL---HAYKLE beta globin dog GDLSTPDAVMSNAKVKAHGKKVLNSFSDGLKNLDNLKGTFAKLSEL---HCDKLHVK EN beta globin rab GDLSSANAVMNNPKVKAHGKKVLAAFSEGLSHLDNLKGTFAKLSEL---HCDKLHVD beta globin kan GDLSNAKAVMANP globin riverlam KGMTSADELKKSAD globin sealampr KGLTTADQLKKSAI Distance-based tree globin soybean ANPTDG----VNPF

globin insect

AG-KDLESIKGTAE

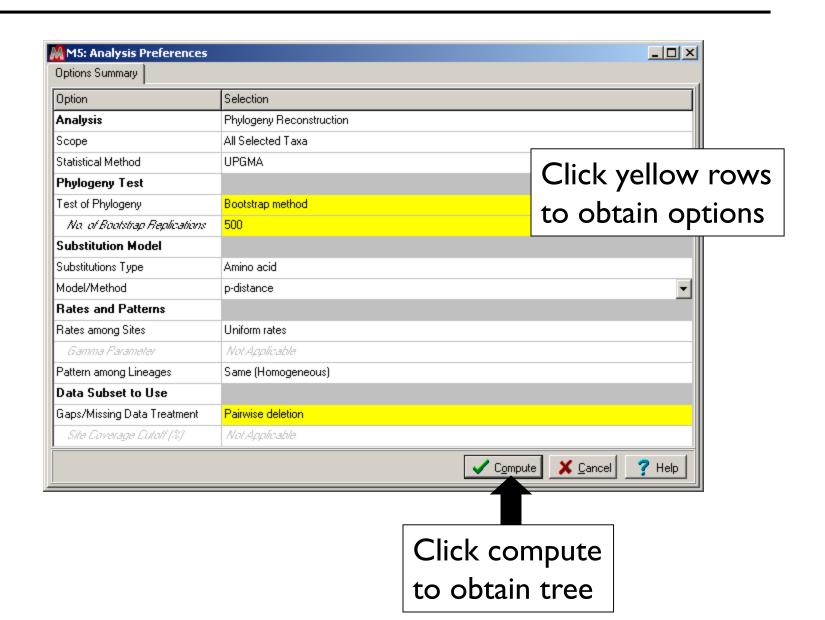
Calculate the pairwise alignments; if two sequences are related, put them next to each other on the tree

myoglobin\_kanga -----MGLSDGEWQLVLNIWGKVETDEGGHGKDVLIRLFKGHPETLEKFDKF myoglobin harbo -----MGLSEGEWQLVLNVWGKVEADLAGHGQDVLIRLFKGHPETLEKFDKF myoglobin gray ------MGLSDGEWHLVLNVWGKVETDLAGHGQEVLIRLFKSHPETLEKFDKF alpha globin ho ---MV-LSAADKTNVKAAWSKVGGHAGEYGAEALERMFLGFPTTKTYFPHF -----V-LSAADKGHVKAIWGKVGGHAGEYAAEGLERTFHSFPTTKTYFPHF alpha globin ka --alpha globin do ------V-LSPADKTNIKSTWDKIGGHAGDYGGEALDRTFQSFPTTKTYFPHF beta globin dog -------MVHLTAEEKSLVSGLWGKV--NVDEVGGEALGRLLIVYPWTQRFFDSF beta\_globin\_rab -----MVHLSSEEKSAVTALWGKV--NVEEVGGEALGRLLVVYPWTQRFFESF beta globin kan ------VHLTAEEKNAITSLWGKV--AIEQTGGEALGRLLIVYPWTSRFFDHF globin riverlam -PIVDS----GSPAVLSAAEKTKIRSAWAPVYSNYETSGVDILVKFFTSTPAAQEFFPKF qlobin sealampr MPIVDT----GSVAPLSAAEKTKIRSAWAPVYSTYETSGVDILVKFFTSTPAAQEFFPKF qlobin soybean -----VAFTEKQDALVSSSFEAFKANIPQYSVVFYTSILEKAPAAKDLFSFL globin insect MKFLILALCFAAASALSADQISTVQASFDKVKGD----PVGILYAVFKADPSIMAKFTQF myoglobin\_kanga KHLKSEDEMKASEDLKKHGITVLTALGNILKKKGHHEAELKPLAQS---HATKHKIPVQF myoglobin harbo KHLKTEAEMKASEDLKKHGNTVLTALGGILKKKGHHDAELKPLAQS---HATKHKIPIKY myoglobin gray KHLKSEDDMRRSEDLRKHGNTVLTALGGILKKKGHHEAELKPLAQS---HATKHKIPIKY alpha globin ho -DLSHGSA-----QVKAHGKKVGDALTLAVGHLDDLPGALSNLSDL---HAHKLRVDPVN alpha\_globin\_ka -DLSHGSA-----QIQAHGKKIADALGQAVEHIDDLPGTLSKLSDL---HAHKLRVDPVN alpha globin do -DLSPGSA-----QVKAHGKKVADALTTAVAHLDDLPGALSALSDL---HAYKLRVDPVN beta globin dog GDLSTPDAVMSNAKVKAHGKKVLNSFSDGLKNLDNLKGTFAKLSEL---HCDKLHVDPEN beta globin rab GDLSSANAVMNNPKVKAHGKKVLAAFSEGLSHLDNLKGTFAKLSEL---HCDKLHVDPEN beta globin kan GDLSNAKAVMANPKVLAHGAKVLVAFGDAIKNLDNLKGTFAKLSEL---HCDKLHVDPEN globin\_riverlam KGMTSADELKKSADVRWHAERIINAVNDAVASMDDTEKMSMK--DLSGKHAKSFQVDPQY globin sealampr KGLTTADQLKKSADVRWHAERIINAVNDAVASMDDTEKMSMKLRDLSGKHAKSFQVDPQY globin soybean ANPTDG----VNPKLTGHAEKLFALVRDSAGQL-KASGTVVADAALGSVHAQKAVTNPEF RGVTHDO-Character-based tree: identify positions that best describe how characters (amino acids) are derived from common

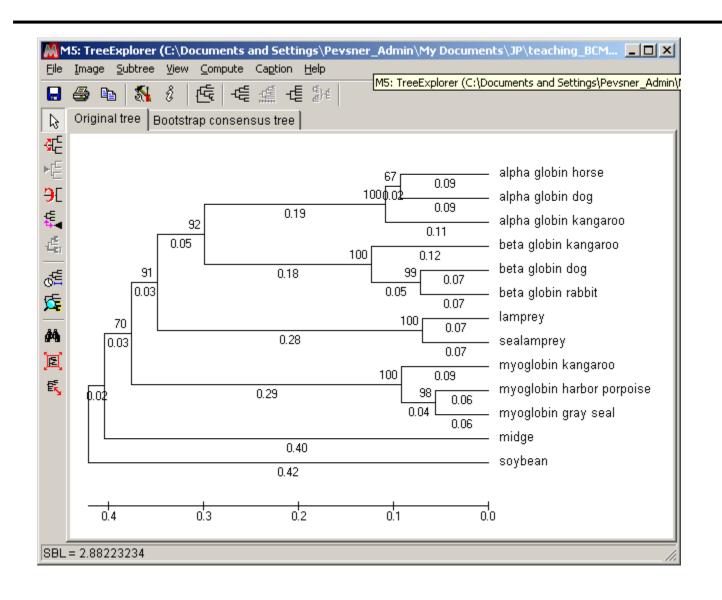
ancestors

#### Use of MEGA for a distance-based tree: UPGMA

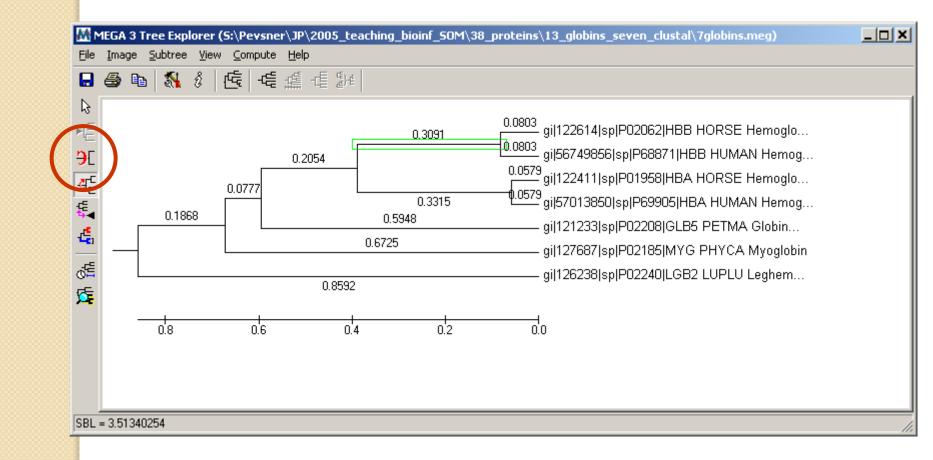
(an easy method to explain, but not accurate for most purposes)



#### Use of MEGA for a distance-based tree: UPGMA

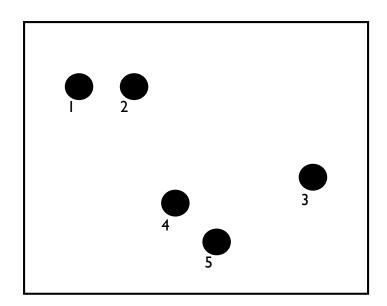


#### Use of MEGA for a distance-based tree: UPGMA

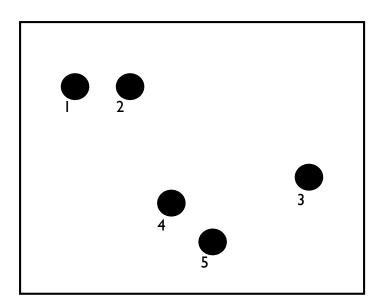


Flipping branches around a node creates an equivalent topology

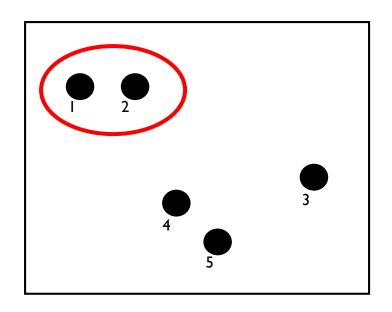
UPGMA is unweighted pair group method using arithmetic mean

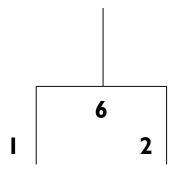


Step I: compute the pairwise distances of all the proteins. Get ready to put the numbers I-5 at the bottom of your new tree.

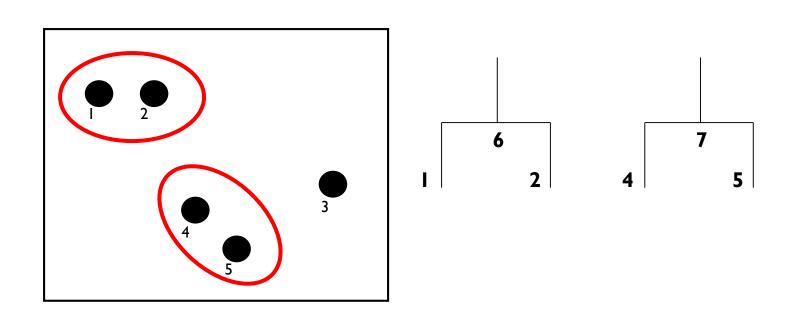


Step 2: Find the two proteins with the smallest pairwise distance. Cluster them.

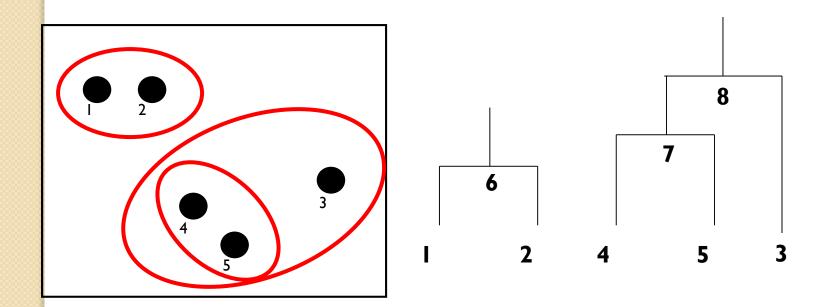




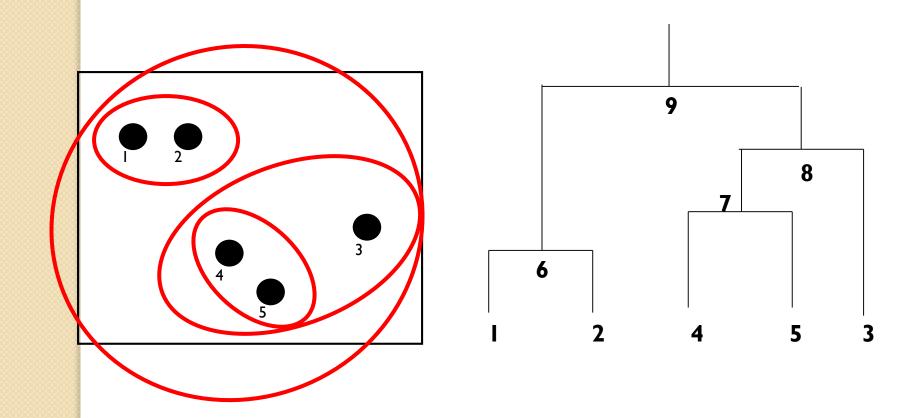
Step 3: Do it again. Find the next two proteins with the smallest pairwise distance. Cluster them.



Step 4: Keep going. Cluster.



Step 4: Last cluster! This is your tree.



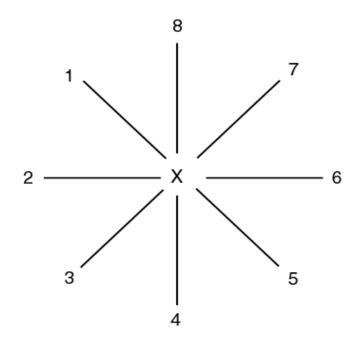
#### Distance-based methods: UPGMA trees

UPGMA is a simple approach for making trees.

- An UPGMA tree is always rooted.
- An assumption of the algorithm is that the molecular clock is constant for sequences in the tree. If there are unequal substitution rates, the tree may be wrong.
- While UPGMA is simple, it is less accurate than the neighbor-joining approach (described next).

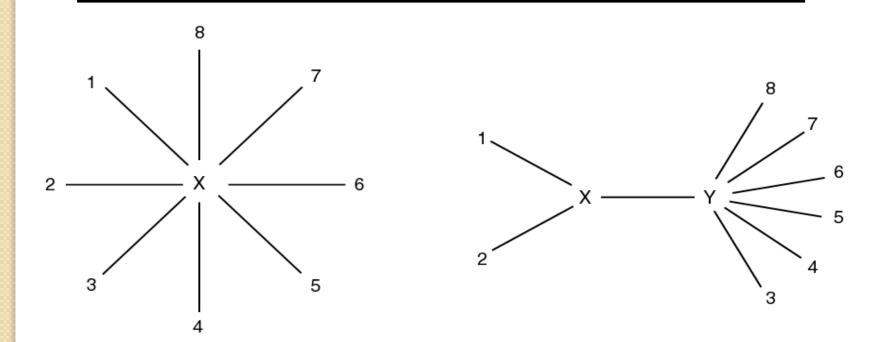
#### Making trees using neighbor-joining

The neighbor-joining method of Saitou and Nei (1987) Is especially useful for making a tree having a large number of taxa.



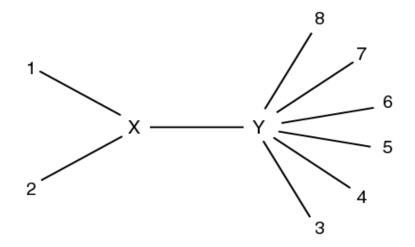
Begin by placing all the taxa in a star-like structure.

#### Making trees using neighbor-joining



Next, identify neighbors (e.g. I and 2) that are most closely related. Connect these neighbors to other OTUs via an internal branch, XY.At each successive stage, minimize the sum of the branch lengths.

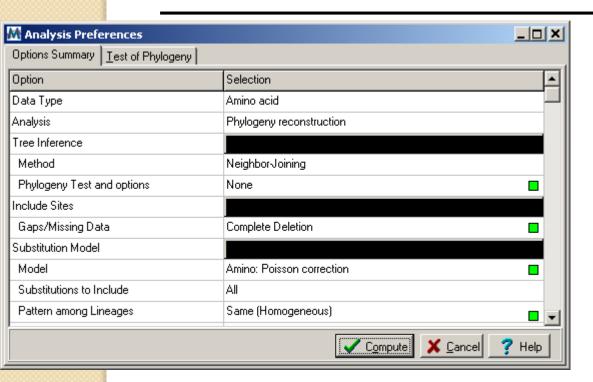
## Making trees using neighbor-joining



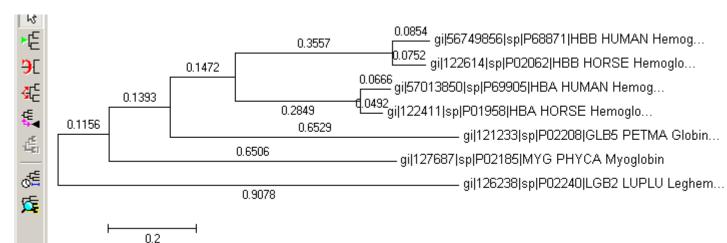
Define the distance from X to Y by

$$d_{XY} = I/2(d_{1Y} + d_{2Y} - d_{12})$$

#### Use of MEGA for a distance-based tree: NJ



Neighbor-joining produces a reasonably similar tree as UPGMA. It is fast, and commonly used (especially for large numbers of sequences).



#### Tree-building methods: character based

Rather than pairwise distances between proteins, evaluate the aligned columns of amino acid residues (characters).

Tree-building methods based on characters include maximum parsimony and maximum likelihood.

#### Tree-building methods: character based

The main idea of maximum parsimony is to find the tree with the shortest branch lengths possible. Thus we seek the most parsimonious ("simple") tree.

- Identify informative sites. For example, constant characters are not parsimony-informative.
- Construct trees, counting the number of changes required to create each tree. For about 12 taxa or fewer, evaluate all possible trees exhaustively; for >12 taxa perform a heuristic search.
- Select the shortest tree (or trees).

As an example of tree-building using maximum parsimony, consider these four taxa:

**AAG** 

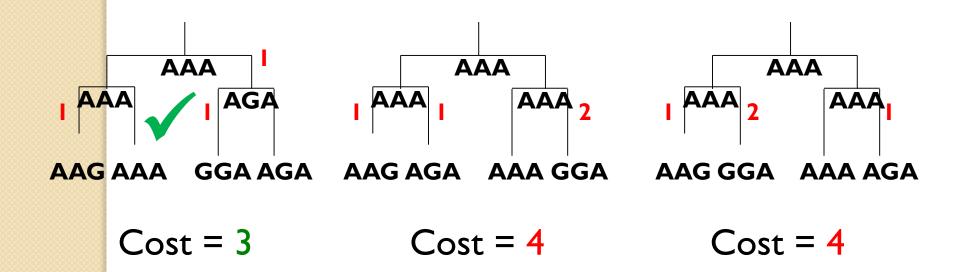
AAA

**GGA** 

**AGA** 

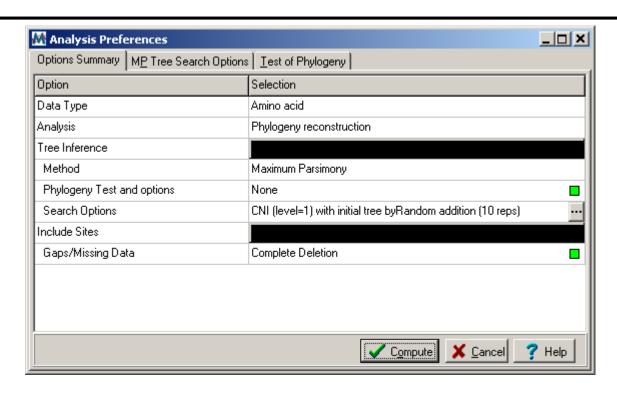
How might they have evolved from a common ancestor such as AAA?

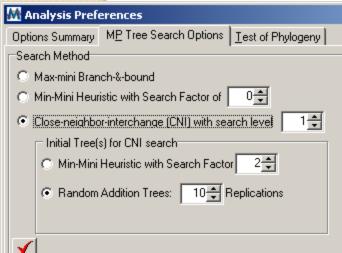
#### Tree-building methods: Maximum parsimony



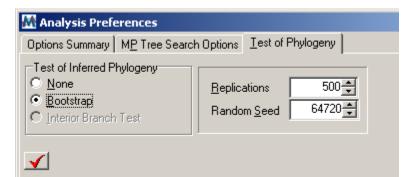
In maximum parsimony, choose the tree(s) with the lowest cost (shortest branch lengths).

## MEGA for maximum parsimony (MP) trees

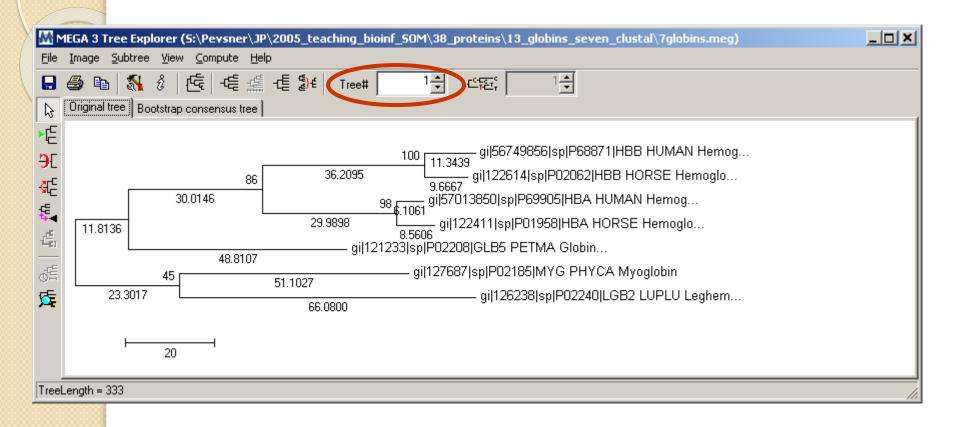




Options include heuristic approaches, and bootstrapping

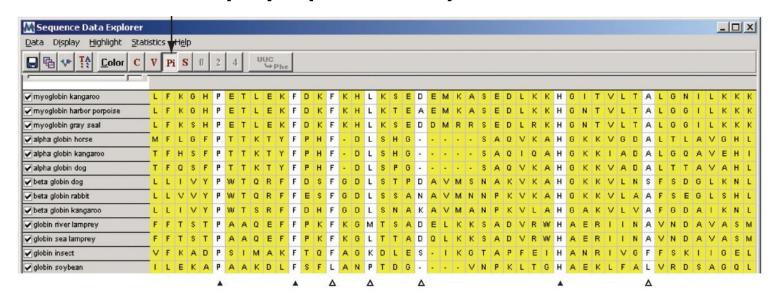


## MEGA for maximum parsimony (MP) trees

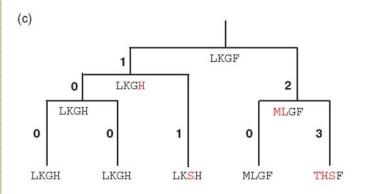


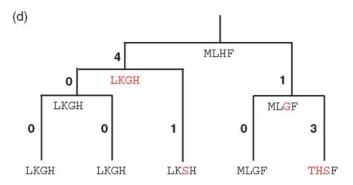
In maximum parsimony, there may be more than one tree having the lowest total branch length. You may compute the consensus best tree.

## MEGA displays parsimony-informative sites



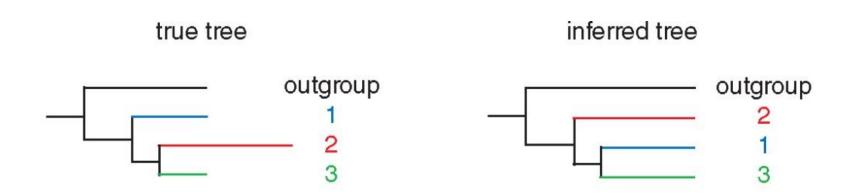
(b)  $\begin{array}{cccc} & & & & & & & LKGH \\ & porpoise & LKGH \\ & gray seal & LKSH \\ & horse \; \alpha & MLGF \\ & kangaroo \; \alpha \; THSF \end{array}$ 





Total cost: 7 Total cost: 9

#### Long-branch-chain attraction: an artifact



The true tree (left) includes taxon 2 that evolves rapidly, and shares a common ancestor with taxon 3.

The inferred tree (right) places taxon 2 separately because it is attracted by the long branch of the outgroup.

#### Outline

Introduction to molecular evolution

Principles of molecular phylogeny and evolution

Goals; historical background; molecular clock hypothesis;

positive and negative selection; neutral theory of evolution

Molecular phylogeny: properties of trees

Topologies and branch lengths of trees

Tree roots

Enumerating trees and selecting search strategies

Type of trees (species trees vs. gene/protein trees; DNA or protein)

Five stages of phylogenetic analysis

Stage 1: sequence acquisition

Stage 2: multiple sequence alignment

Stage 3: models of DNA and amino acid substitution

Stage 4: tree-building methods (distance-based; maximum

parsimony; maximum likelihood; Bayesian methods)

Stage 5: evaluating trees

Perspective

## Making trees using maximum likelihood

Maximum likelihood is an alternative to maximum parsimony. It is computationally intensive. A likelihood is calculated for the probability of each residue in an alignment, based upon some model of the substitution process.

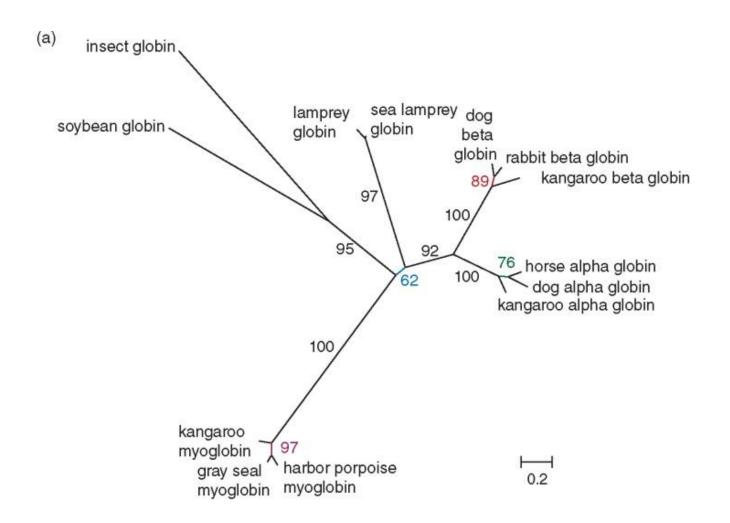
What are the tree topology and branch lengths that have the greatest likelihood of producing the observed data set?

ML is implemented in the TREE-PUZZLE program, as well as MEGA5, PAUP and PHYLIP.

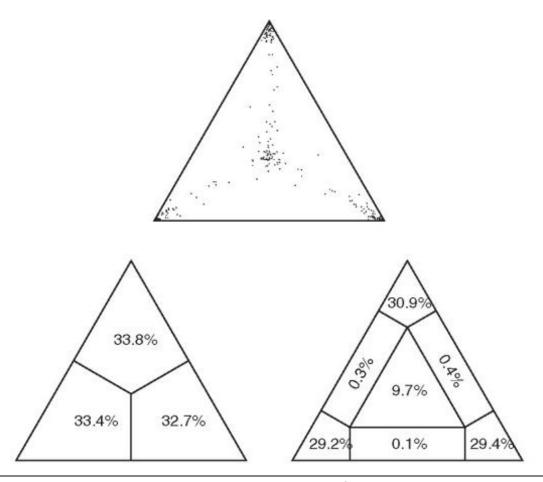
#### Maximum likelihood: Tree-Puzzle

- (I) Reconstruct all possible quartets A, B, C, D. For I2 myoglobins there are 495 possible quartets.
- (2) Puzzling step: begin with one quartet tree. N-4 sequences remain. Add them to the branches systematically, estimating the support for each internal branch. Report a consensus tree.

#### Maximum likelihood tree



## Quartet puzzling: phylogeny by maximum likelihood



Likelihood mapping indicates the frequency with which quartets are resolved. Top: all possible quartets (n=495). Each quartet has 3 posterior weights mapped in triangles. For 13 globins, only 9.7% of quartets are unresolved.

# Bayesian inference of phylogeny with MrBayes

Bayesian inference is extremely popular for phylogenetic analyses (as is maximum likelihood). Both methods offer sophisticated statistical models. MrBayes is a very commonly used program.

Notably, Bayesian approaches require you to specify prior assumptions about the model of evolution.

## Bayesian inference of phylogeny with MrBayes

Calculate:

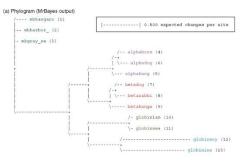
$$Pr [Tree | Data] = \frac{Pr [Data | Tree] \times Pr [Tree]}{Pr [Data]}$$

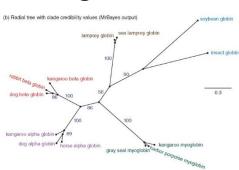
Pr [Tree | Data ] is the posterior probability distribution of trees. Ideally this involves a summation over all possible trees. In practice, Monte Carlo Markov Chains (MCMC) are run to estimate the posterior probability distribution.

## Bayesian inference of phylogeny

#### Example:

- Align I3 globin proteins with MAFFT (Chapter 6).
- In MrBayes select Poisson amino acid model with equal rates of substitution.
- Select prior parameters (e.g. equal, fixed frequencies for the states; equal probability for all topologies; unconstrained branch lengths).
- Run 1,000,000 trials for Monte Carlo Markov Chain estimation of the posterior distribution.
- Obtain phylogram.
- Export tree files and view with FigTree software.



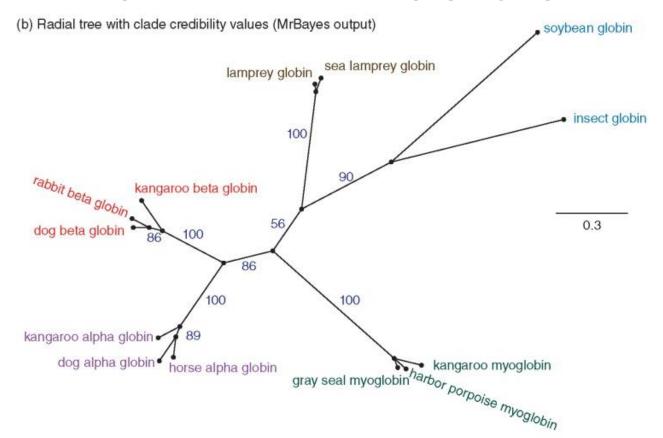


## Bayesian inference of phylogeny

```
(a) Phylogram (MrBayes output)
    /---- mbkangaro (1)
                                     ----- 0.500 expected changes per site
     -- mbharbor (2)
     - mbgray se (3)
                                          /-- alphahors (4)
                                              /- globinlam (10)
                                              \- globinsea (11)
                                           /----- globinsoy (12)
+
\----- globinins (13)
```

Phylogram shows clades (note myoglobins are unresolved).

## Bayesian inference of phylogeny



Export tree files and view with FigTree software. Unrooted radial tree is shown. Nodes are given as closed circles. Clade credibility values (along branches) give 100% support for separation of most clades. The node containing the myoglobins is multifurcating.

#### Outline

Introduction to molecular evolution

Principles of molecular phylogeny and evolution

Goals; historical background; molecular clock hypothesis;

positive and negative selection; neutral theory of evolution

Molecular phylogeny: properties of trees

Topologies and branch lengths of trees

Tree roots

Enumerating trees and selecting search strategies

Type of trees (species trees vs. gene/protein trees; DNA or protein)

Five stages of phylogenetic analysis

Stage 1: sequence acquisition

Stage 2: multiple sequence alignment

Stage 3: models of DNA and amino acid substitution

Stage 4: tree-building methods (distance-based; maximum parsimony; maximum likelihood; Bayesian methods)

Stage 5: evaluating trees

Perspective

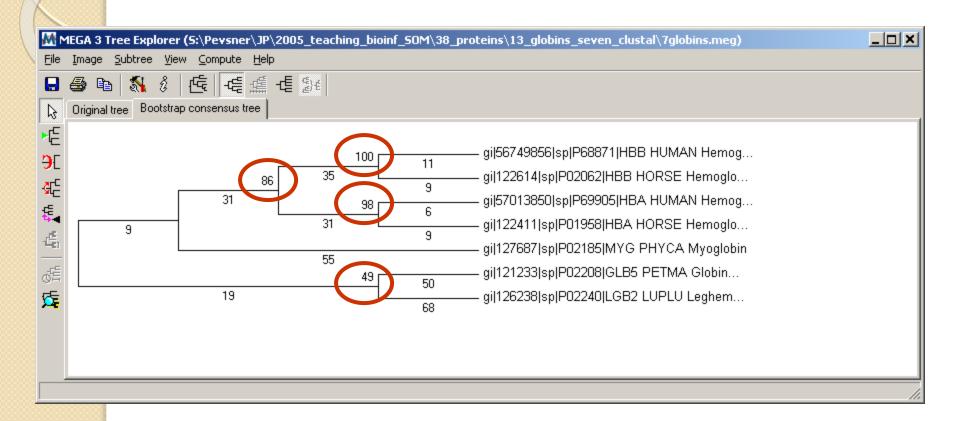
## Stage 5: Evaluating trees

The main criteria by which the accuracy of a phylogentic tree is assessed are consistency, efficiency, and robustness. Evaluation of accuracy can refer to an approach (e.g. UPGMA) or to a particular tree.

## Stage 5: Evaluating trees: bootstrapping

Bootstrapping is a commonly used approach to measuring the robustness of a tree topology. Given a branching order, how consistently does an algorithm find that branching order in a randomly permuted version of the original data set?

## MEGA trees display bootstrap values



Bootstrap values show the percent of times each clade is supported after a large number (n=500) of replicate samplings of the data.

## Stage 5: Evaluating trees: bootstrapping

To bootstrap, make an artificial dataset obtained by randomly sampling columns from your multiple sequence alignment. Make the dataset the same size as the original. Do 100 (to 1,000) bootstrap replicates. Observe the percent of cases in which the assignment of clades in the original tree is supported by the bootstrap replicates. >70% is sometimes considered significant.

#### Outline

Introduction to molecular evolution

Principles of molecular phylogeny and evolution

Goals; historical background; molecular clock hypothesis;

positive and negative selection; neutral theory of evolution

Molecular phylogeny: properties of trees

Topologies and branch lengths of trees

Tree roots

Enumerating trees and selecting search strategies

Type of trees (species trees vs. gene/protein trees; DNA or protein)

Five stages of phylogenetic analysis

Stage 1: sequence acquisition

Stage 2: multiple sequence alignment

Stage 3: models of DNA and amino acid substitution

Stage 4: tree-building methods (distance-based; maximum

parsimony; maximum likelihood; Bayesian methods)

Stage 5: evaluating trees

Perspective

#### Perspective

- We have discussed concepts of evolution and phylogeny that address the relationships of protein, genes, and species over time.
- A phylogenetic tree is essentially a graphical representation of a multiple sequence alignment.
- There are many methods for creating phylogenetic trees. Neighbor-joining is a simple trusted method (and is useful for large numbers of taxa). Maximum likelihood and Bayesian methods are commonly used because they are model-based with rigorous statistical frameworks.
- Each method is associated with errors, and it is crucial to begin with an appropriate multiple sequence alignment.