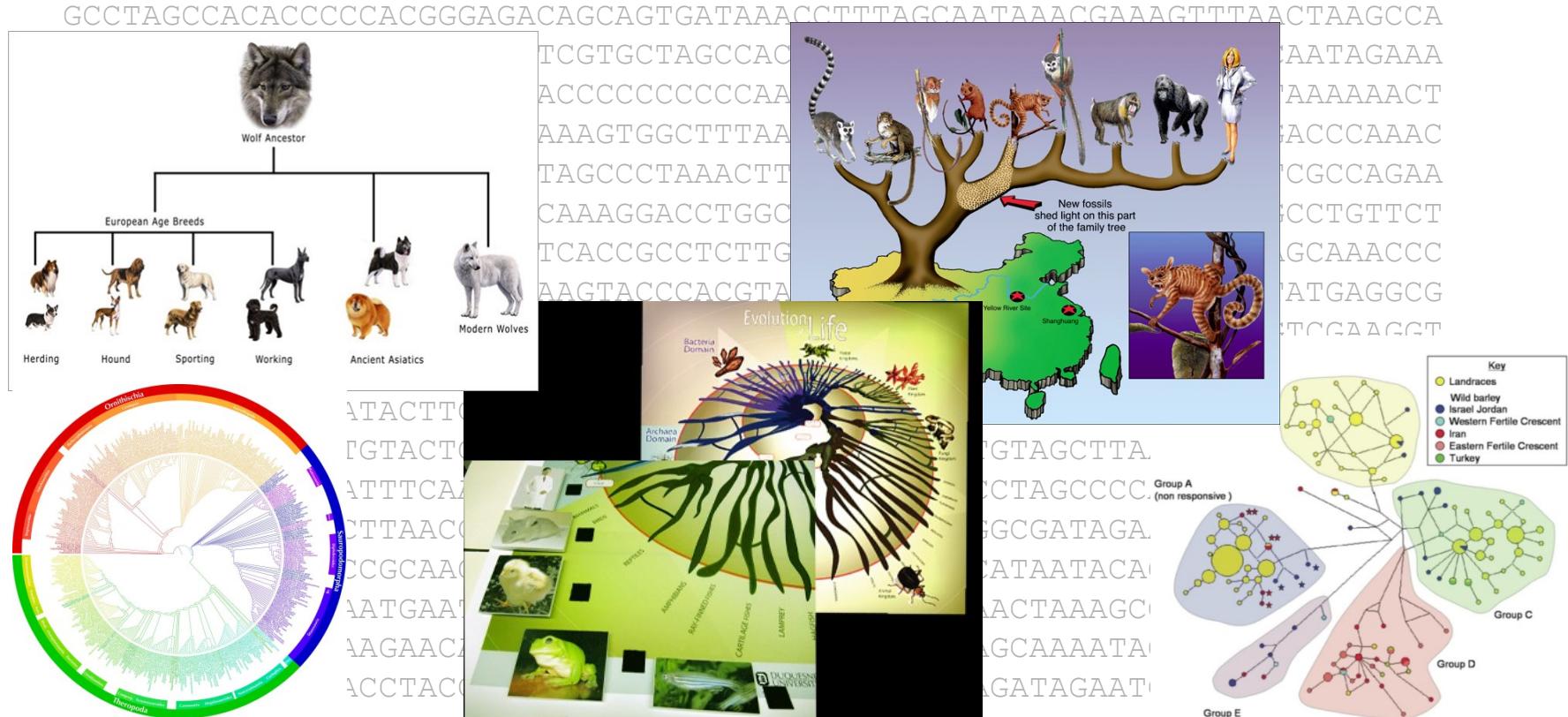


PHYLOGENETIC ANALYSIS I.



evropský
sociální
fond v ČR



Definition of basic concepts:

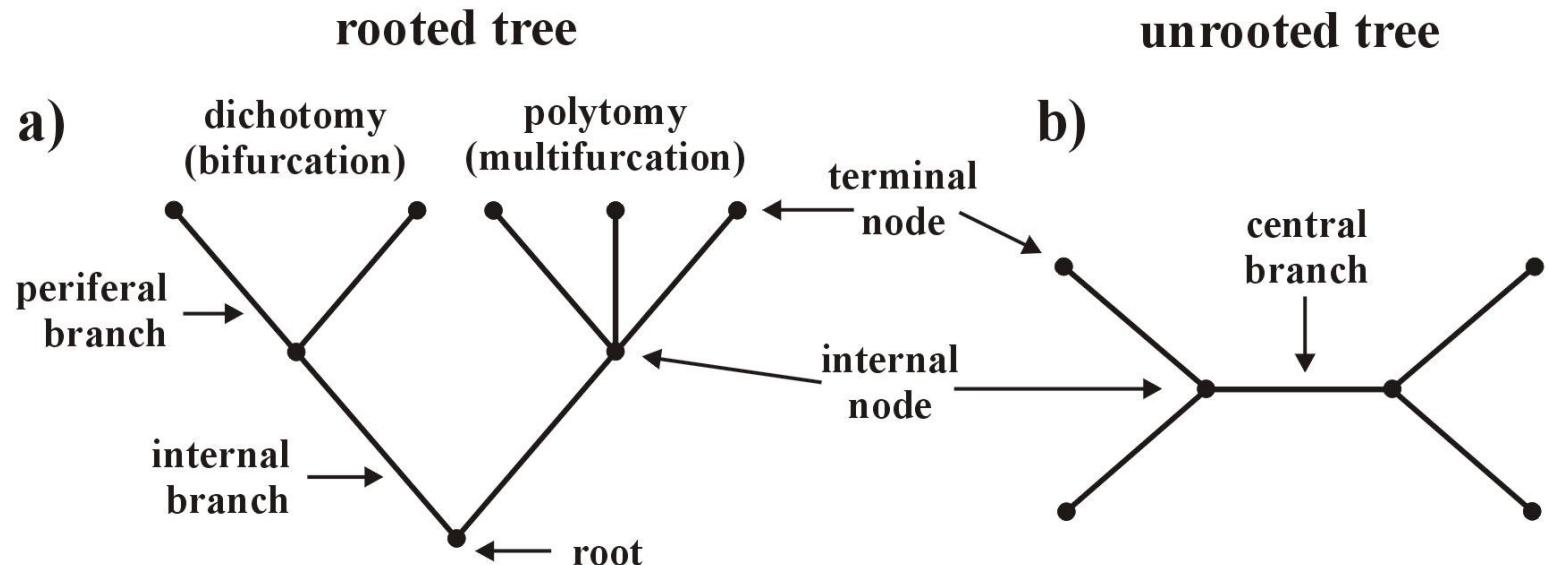
phylogenetic tree = phylogeny (fylogenie): rooted, unrooted

branches = edges (větve): peripheral, internal, central

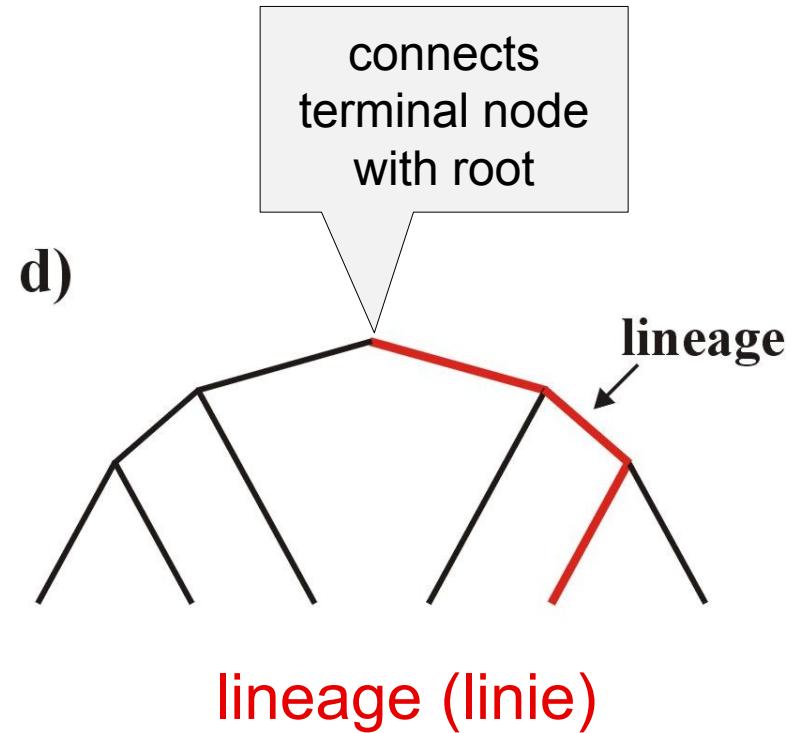
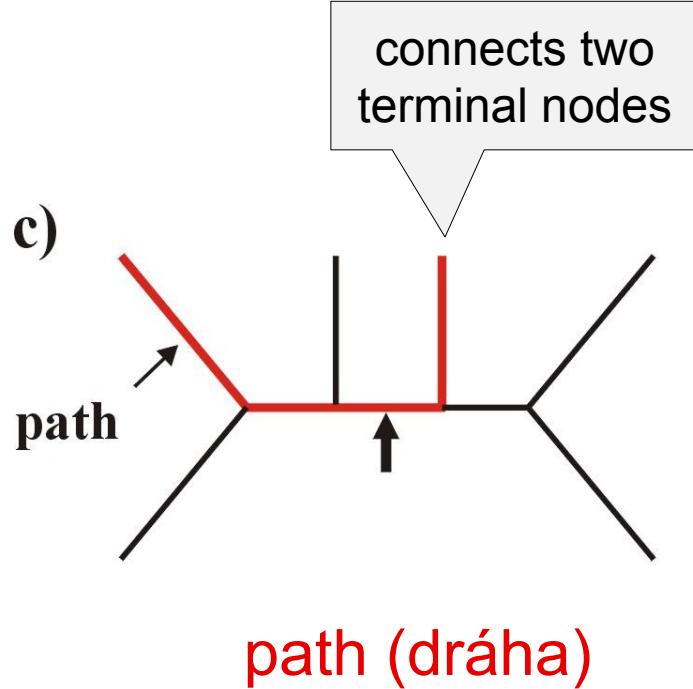
nodes = vertices (uzly): internal, terminal

dichotomy = bifurcation, polytomy = multifurcation

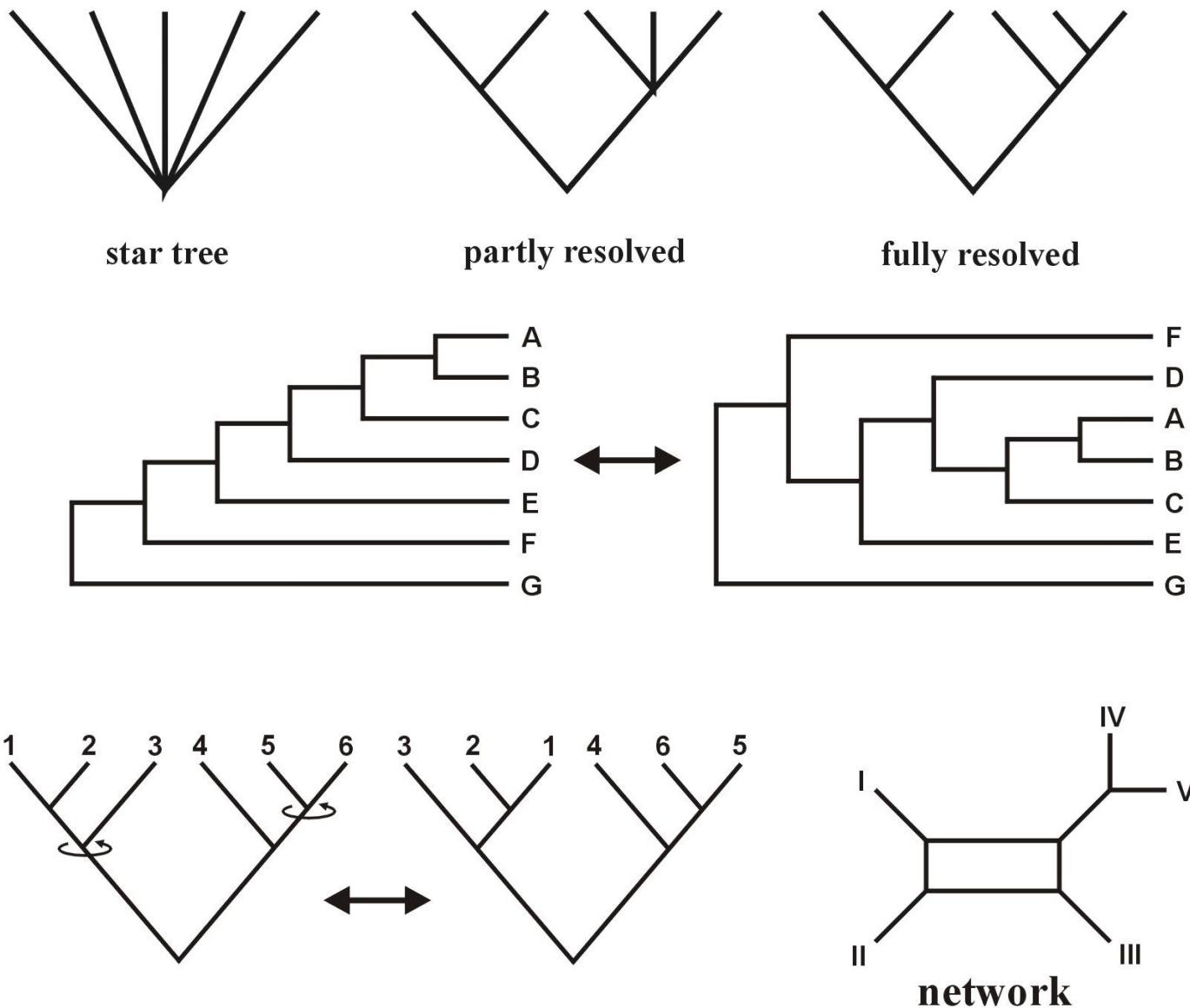
OTU = operational taxonomic unit, HTU = hypothetical taxonomic unit
tree topology

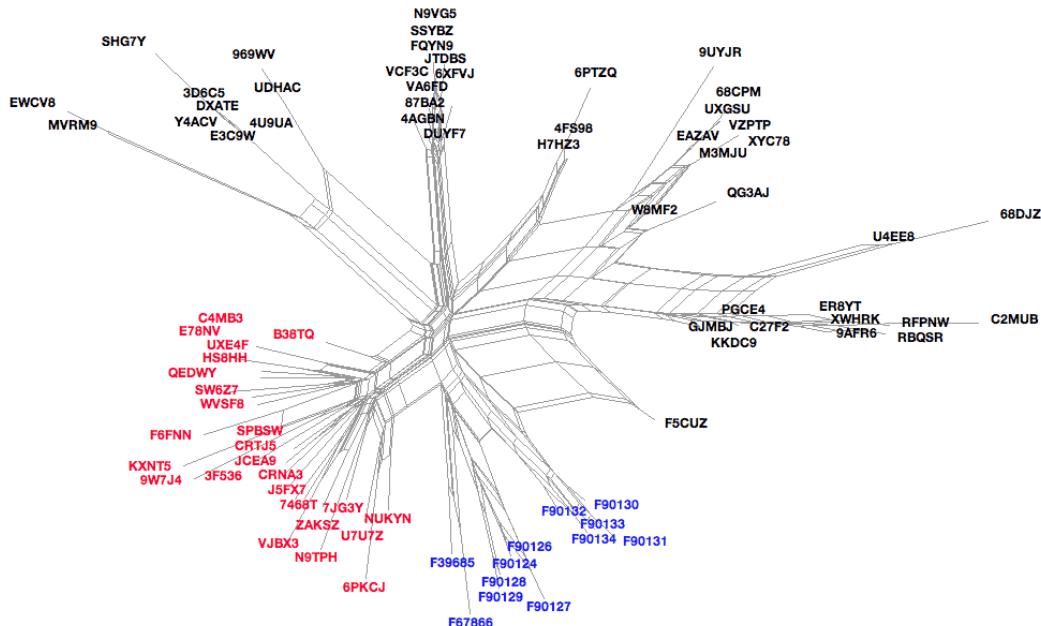
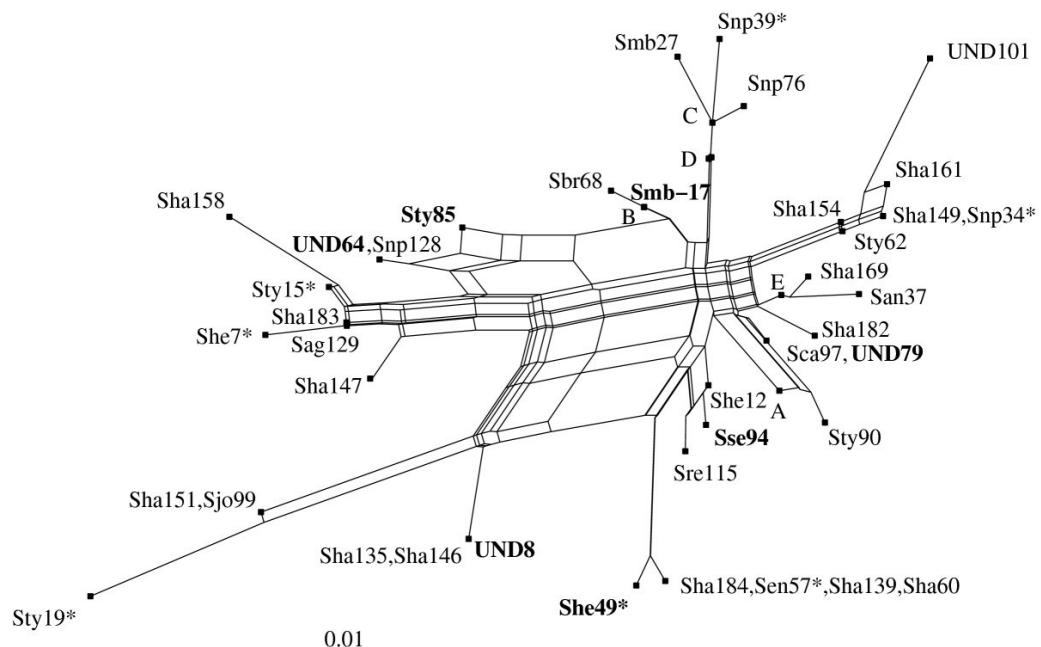


Definition of basic concepts:

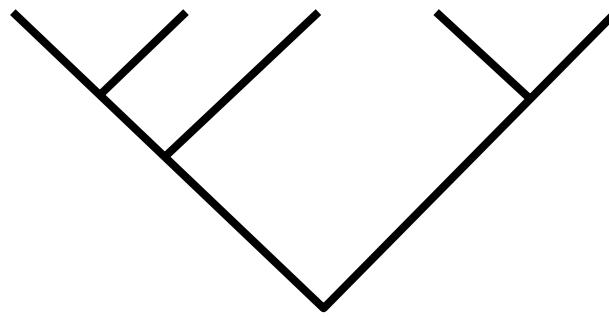
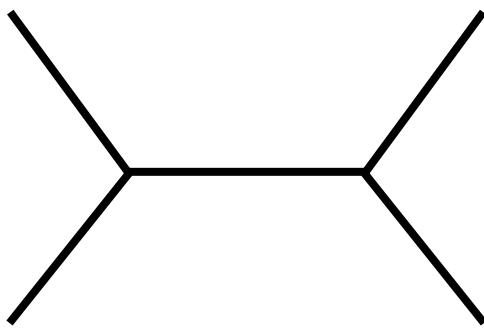


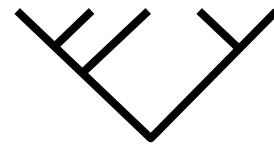
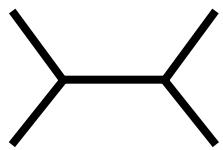
Definition of basic concepts:





How many trees?



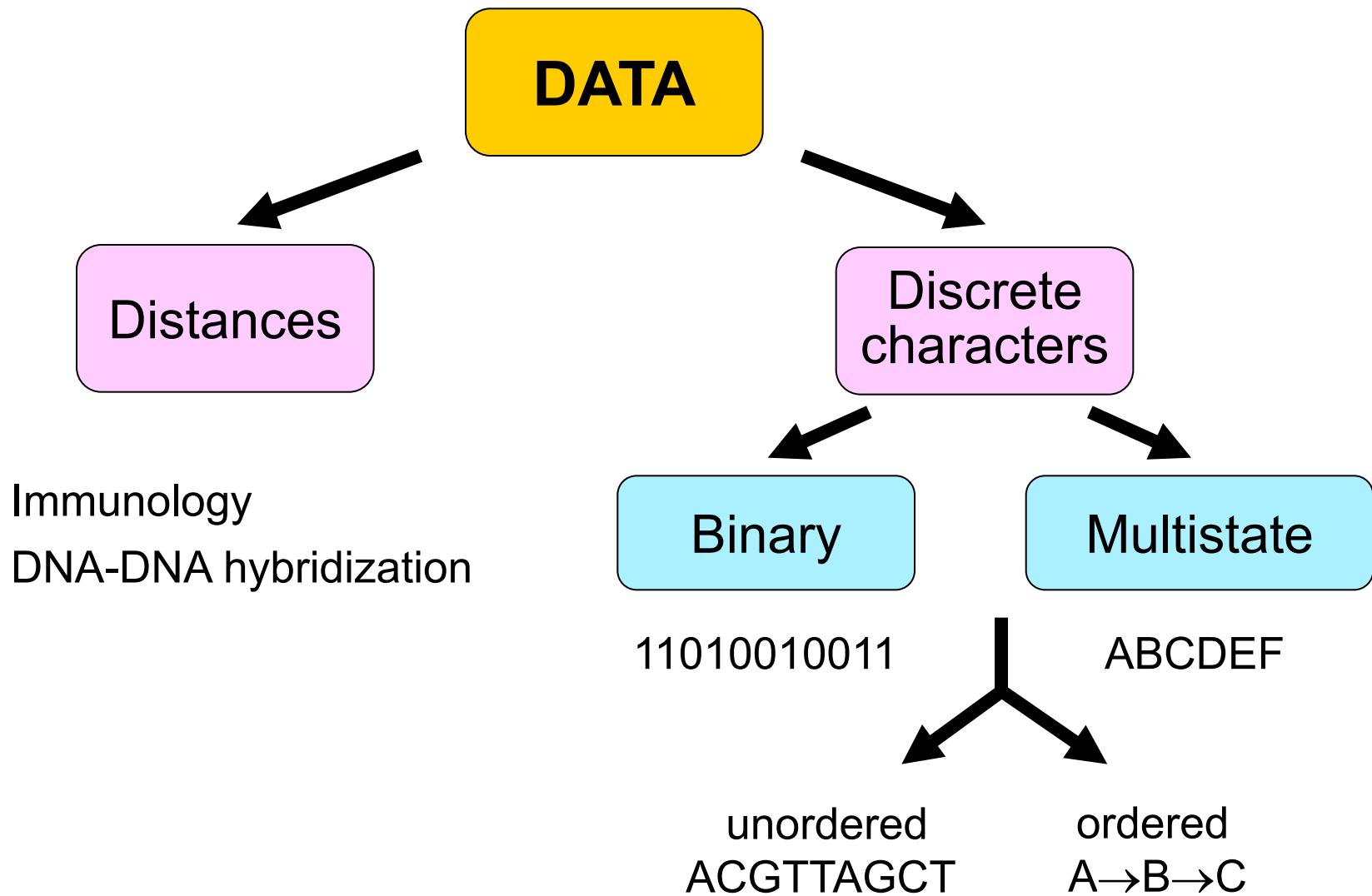


> Avogadro
constant*)

number of electrons in
visible universe
(Eddington number)

*) $6,022\,140\,76 \times 10^{23} \text{ mol}^{-1}$

What type of data can we use?



Types of data

Nucleotide and protein sequences:

H_sapiens MTPMRKINPLMKLINHSFIDLPTPSNISAWWNFGS

base = character state

P_troglod ATGACCCCCGACACGCAAAATTAAACCCACTAATAAAA



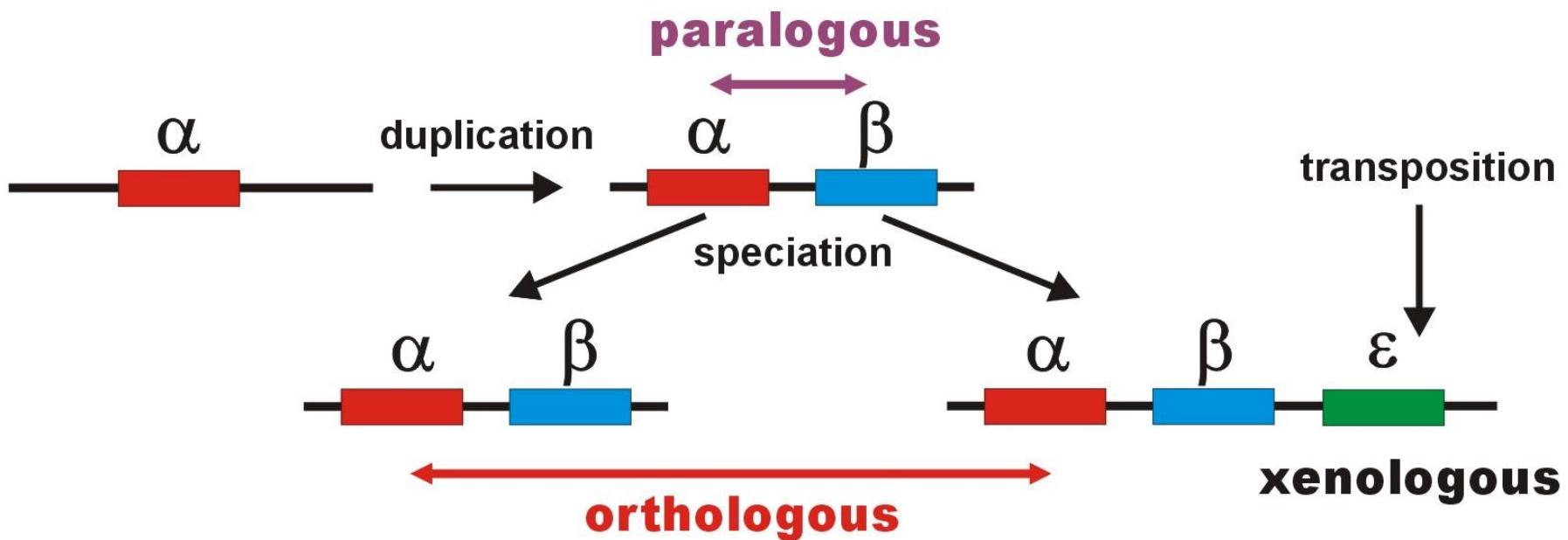
site = character

Types of data

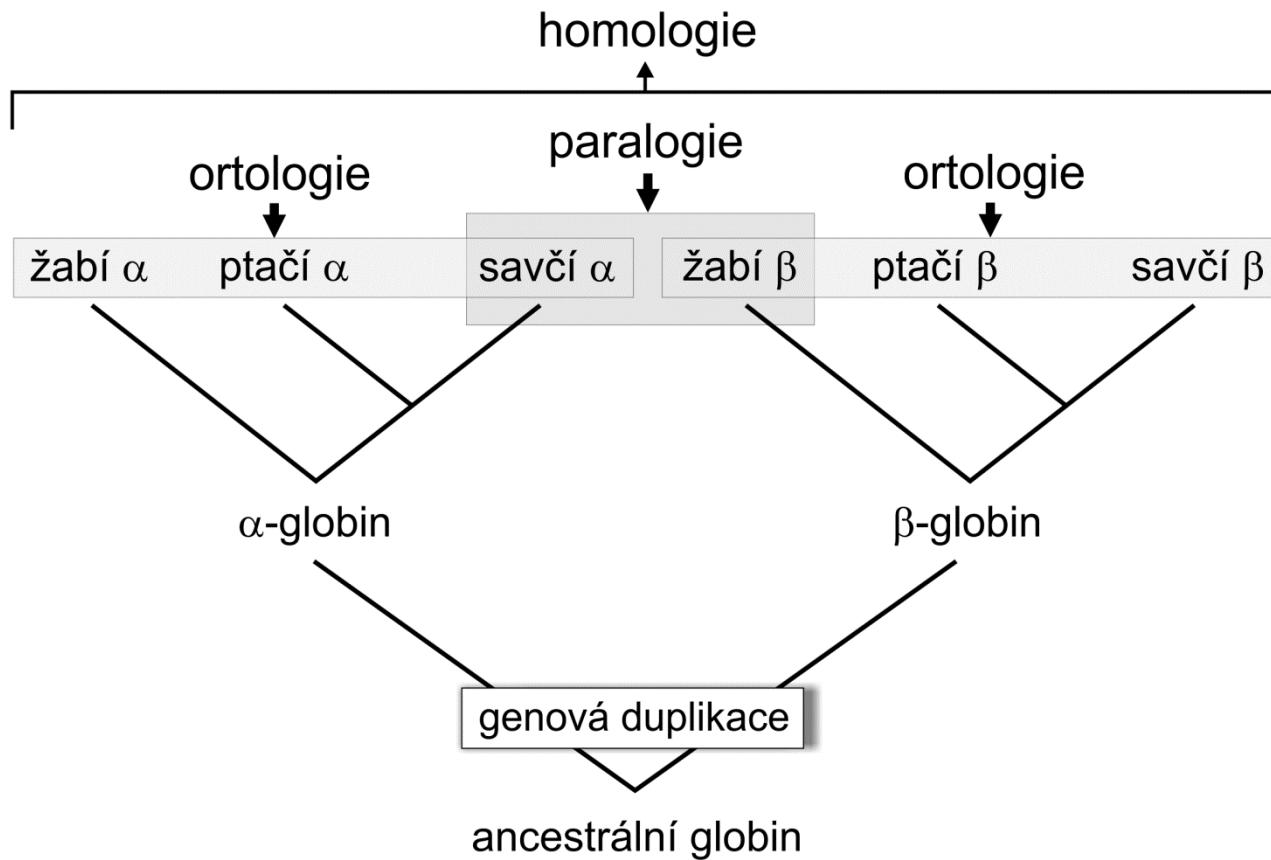
retroelements: SINE (*Alu*, B1, B2), LINE

microsatellites, SNP

Problem with homology of sequences



Problem with homology of sequences



Individual sites in DNA sequences may not be fully independent!

Sequences

DNA databases:

EMBL (European Molecular Biology Laboratory) – European Bioinformatics Institute, Hinxton, UK: <http://www.ebi.ac.uk/embl/>

GenBank – NCBI (National Center for Biotechnology Information), Bethesda, Maryland, USA: <http://www.ncbi.nlm.nih.gov/Genbank/>

DDBJ (DNA Data Bank of Japan) – National Institute of Genetics, Mishima, Japan:
<http://www.ddbj.nig.ac.jp/>

Database management: usually packages Sybase or ORACLE
outputs: ASCII (*American Standard Code for Information Interchange*)

Sequences

Protein databases:

SWISS-PROT – University of Geneve & Swiss Institute of Bioinformatics:

<http://www.expasy.ch/sprot/> a <http://www.ebi.ac.uk/swissprot/>

PIR (Protein Information Resource) – NBRF (National Biomedical Research Foundation, Washington, D.C., USA) & Tokyo University & JIPID (Japanese International Protein Information Database, Tokyo) & MIPS (Martinsried Institute for Protein Sequences, Martinsried, Germany): <http://www-nbrf.georgetown.edu/>

PRF/SEQDB (Protein Resource Foundation) – Osaka, Japan:

<http://www.prf.or.jp/en/os.htm>

PDB (Protein Data Bank) – University of New Jersey, San Diego & Super-computer Center, University of California & National Institute of Standards and Technology:

<http://www.rcsb.org/pdb/>

File formats:

FASTA:

```
>H_sapiens
ATGACCCCAATACGAAAATTAAACCCCTAATAAAATTAAATTAACCACTCATTGACCTCCCCACCC
CATCCAACATCTCCGCATGATGAAACTCGGCTCACTCCTGGCGCCTGCCTGATCCTCAAATCACCAC
AGGACTATTCTAGCCATACACTACTCACCAAGACGCCTCAACCGCTTTCATCAATGCCAACATCACT
CGAGACGTAAATTATGGCTGAATCATCCGCTACCTCACGCCAATGGCGCCTCAATATTCTTATCTGCC
TCTTCCTACACATCGGGCGAGGCCTATATTACGGATCATTCTACTCAGAACCTGAAACATCGGCAT
...
>P_troglod
ATGACCCCGACACGAAAATTAAACCCACTAATAAAATTAAATCACTCATTGACCTCCCCACCC
CATCCAACATTTCCGCATGATGGAACTCGGCTCACTCTCGGCGCCTGCCTAATCCTCAAATTACCCAC
AGGATTATTCTAGCTATACACTACTCACCAAGACGCCTCAACCGCTTCTCGATGCCAACATCACC
CGAGACGTAAACTATGGTTGGATCATCCGCTACCTCACGCTAACGGCGCCTCAATATTCTTATCTGCC
TCTTCCTACACATCGGCCGAGGTCTATATTACGGCTCATTCTACCTAGAACCTGAAACATTGGCAT
...
>P_paniscus
ATGACCCCAACACGAAAATCAACCCACTAATAAAATTAAATCACTCATTGACCTCCCCACCC
CATCCAATATTCCACATGATGAAACTCGGCTCACTCTCGGCGCCTGCCTAATCCTCAAATCACCAC
AGGACTATTCTAGCTATACACTACTCACCAAGACGCCTCAACCGCTTCTCATCGATGCCAACATTACC
CGAGACGTAAACTATGGTTGAATCATCCGCTACCTCACGCTAACGGCGCCTCAATACTTTCATCTGCC
TCTTCCTACACGTCGGTCAGGCCTATATTACGGCTCATTCTACCTAGAACCTGAAACATTGGCAT
...
```

File formats:

GenBank:

ORIGIN

```
1 taaaaatgaag atattcttctt ctcaagacat caagaagaag gaactactcc ccaccaccag
61 cacccaaaggc tggcattcta attaaactac ttcttgtgta cataaattta catagtacaa
121 tagtacattt atgtatatcg tacattaaac tattttcccc aagcatataa gcaagtacat
181 ttaatcaatg atataggcca taaaacaatt atcaacataa actgatacaa accatgaata
241 ttatactaat acatcaaatt aatgctttaa agacatatct gtgttatctg acatacacca
301 tacagtctata aactcttc ttcctatataa ctatcccctt ccccatggg tctattaatc
361 taccatcctc cgtgaaacca acaacccgcc caccaatgcc cctcttctcg ctccgggccc
421 attaaacttg gggtagcta aactgaaact ttatcagaca tctggttctt acttcagggc
481 catcaaatgc gttatcgccc atacgttccc cttaaataag acatctcgat ggtatcggt
541 ctaatcagcc catgaccaac ataactgtgg tgtcatgc tttatgggat ttatggat
601 cctactttca tcaacatagc cgtcaaggca tgaaaggaca gcacacagtc tagacgcacc
661 tacggtaag aatcattatgt ccgcggggccca caatcaccta aggctaatta ttcatgcttgc
721 ttagacataa atgctactca ataccaaatt ttaactctcc aaaccccccacccctccct
781 cttaatgcca aaccccaaaa acactaagaa cttgaaagac atatattatt aactatcaaa
841 ccctatgtcc tgatcgattc tagtagttcc caaaatatga ctcatatttt agtacttgta
901 aaaatttac aaaatcatgc tccgtgaacc aaaactctaa tcacactcta ttacgcaata
961 aatattaaca agttaatgta gcttaataac aaagcaaagc actgaaaatg ctttagatgga
1021 taattttatc cca
```

//

File formats:

PHYLIP (“interleaved” format):

```
6 1120
H_sapiens    ATGACCCCAA TACGCCAAAT TAACCCCTA ATAAAATTAA TTAACCACTC
P_troglod     ATGACCCCGA CACGCCAAAT TAACCCACTA ATAAAATTAA TTAATCACTC
P_paniscus   ATGACCCCAA CACGCCAAAT CAACCCACTA ATAAAATTAA TTAATCACTC
G_gorilla    ATGACCCCTA TACGCCAAAC TAACCCACTA GCAAAACTAA TTAACCACTC
P_pygmaeus   ATGACCCCAA TACGCCAAAC CAACCCACTA ATAAAATTAA TTAACCACTC
H_lar        ATGACCCCCC TGCGCCAAAC TAACCCACTA ATAAAACTAA TCAACCACTC

ATTCATCGAC CTCCCCACCC CATCCAACAT CTCCGCATGA TGAAACTTCG
ATTTATCGAC CTCCCCACCC CATCCAACAT TTCCGCATGA TGAAACTTCG
ATTTATCGAC CTCCCCACCC CATCCAATAT TTCCCACATGA TGAAACTTCG
ATTCAATTGAC CTCCCTACCC CGTCCAACAT CTCCCACATGA TGAAACTTCG
ACTCATCGAC CTCCCCACCC CATCAAACAT CTCTGCATGA TGAAACTTCG
ACTTATCGAC CTTCCAGCCC CATCCAACAT TTCTATATGA TGAAACTTTG
```

File formats:

NEXUS (PAUP*, “interleaved”):

```
#NEXUS
begin data;
dimensions ntax=6 nchar=1120;
format datatype=DNA interleave datatype=DNA missing=? gap=-;
matrix
P_troglod    ATGACCCCGACACGAAAATTAAACCCACTAATAAAATTAAATCACTC
P_paniscus   ATGACCCCAACACGAAAATCAACCCACTAATAAAATTAAATCACTC
H_sapiens    ATGACCCCAATACGAAAATTAAACCCCTAATAAAATTAAACCAC
G_gorilla    ATGACCCCTATACGAAAACTAACCCACTAGCAAAACTAATTAAACCAC
P_pygmaeus   ATGACCCCAATACGAAAACCAACCCACTAATAAAATTAAACCAC
H_lar        ATGACCCCCCTGCGAAAACCAACCCACTAATAAAACTAATCAACCAC
P_troglod    ATTTATCGACCTCCCCACCCCATCCAACATTCCGCATGATGGAAC
P_paniscus   ATTTATCGACCTCCCCACCCCATCCAATATTCCACATGATGAAAC
H_sapiens    ATTCAATCGACCTCCCCACCCCATCCAACATCTCCGCATGATGAAAC
G_gorilla    ATTCAATTGACCTCCCTACCCCGTCCAACATCTCCACATGATGAAAC
P_pygmaeus   ACTCATCGACCTCCCCACCCCATCAAACATCTCTGCATGATGGAAC
H_lar        ACTTATCGACCTTCCAGCCCCATCCAACATTCTATGATGAAACTTG

end;
```

File formats:

Clustal X:

```
P_troglod  ATGACCCCGACACGAAAATTAACCCACTAATAAAATTAATTAACTCATTATCGAC
P_paniscus ATGACCCCAACACGAAAATCAACCCACTAATAAAATTAATTAACTCATTATCGAC
H_sapiens   ATGACCCCAATACGAAAATTAACCCCTAATAAAATTAACCCTACTCATCGAC
G_gorilla   ATGACCCCTATAACGAAAACTAACCCACTAGAAAACTAATTAAACCACTCATTGAC
P_pygmaeus  ATGACCCCAATACGAAAACCAACCCACTAATAAAATTAATTAAACCACTCACTCATCGAC
H_lar       ATGACCCCCCTGCGAAAACTAACCCACTAATAAAACTAATCAACCACTCACTTATCGAC
*****      *****      *****  ***  ****  ***  ***  *  ***** *  **  ***

```

```
P_troglod  CTCCCCACCCCATCCAACATTTCCGCATGATGGAACCTCGGCTCACTTCTCGGCGCCTGC
P_paniscus CTCCCCACCCCATCCAATATTCACATGATGAAACCTCGGCTCACTTCTCGGCGCCTGC
H_sapiens   CTCCCCACCCCATCCAACATCTCCGCATGATGAAACCTCGGCTCACTCCTGGCGCCTGC
G_gorilla   CTCCCTACCCCGTCCAACATCTCCACATGATGAAACCTCGGCTCACTCCTGGTGCGCCTGC
P_pygmaeus  CTCCCCACCCCATCAAACATCTGCATGATGGAACCTCGGCTCACTTCTAGGCGCCTGC
H_lar       CTTCCAGCCCCATCCAACATTTCTATATGATGAAACTTGGTCACTCCTAGGCGCCTGC
**  **  ****  **  **  **  *  *****  *****  **  *****  **  **  ****

```

File formats:

FASTQ:

Line 1 begins with a '@' character and is followed by a sequence identifier and an *optional* description (like a FASTA title line).

Line 2 is the raw sequence letters.

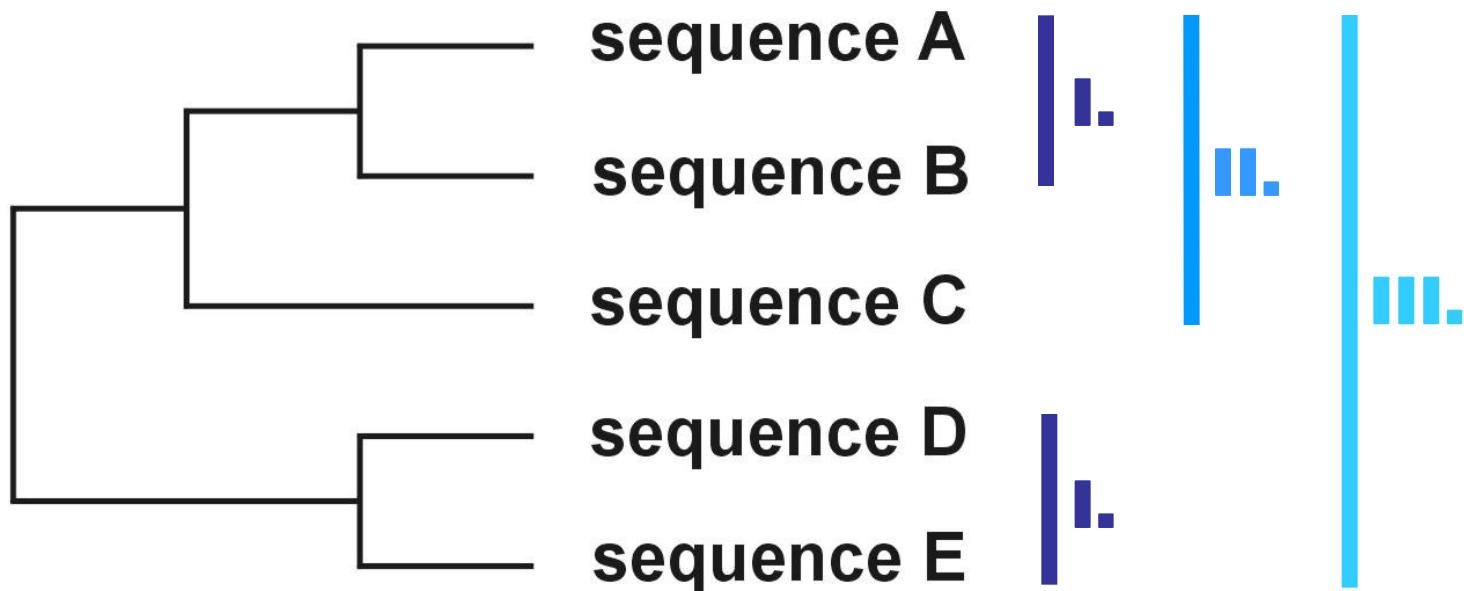
Line 3 begins with a '+' character and is *optionally* followed by the same sequence identifier (and any description) again.

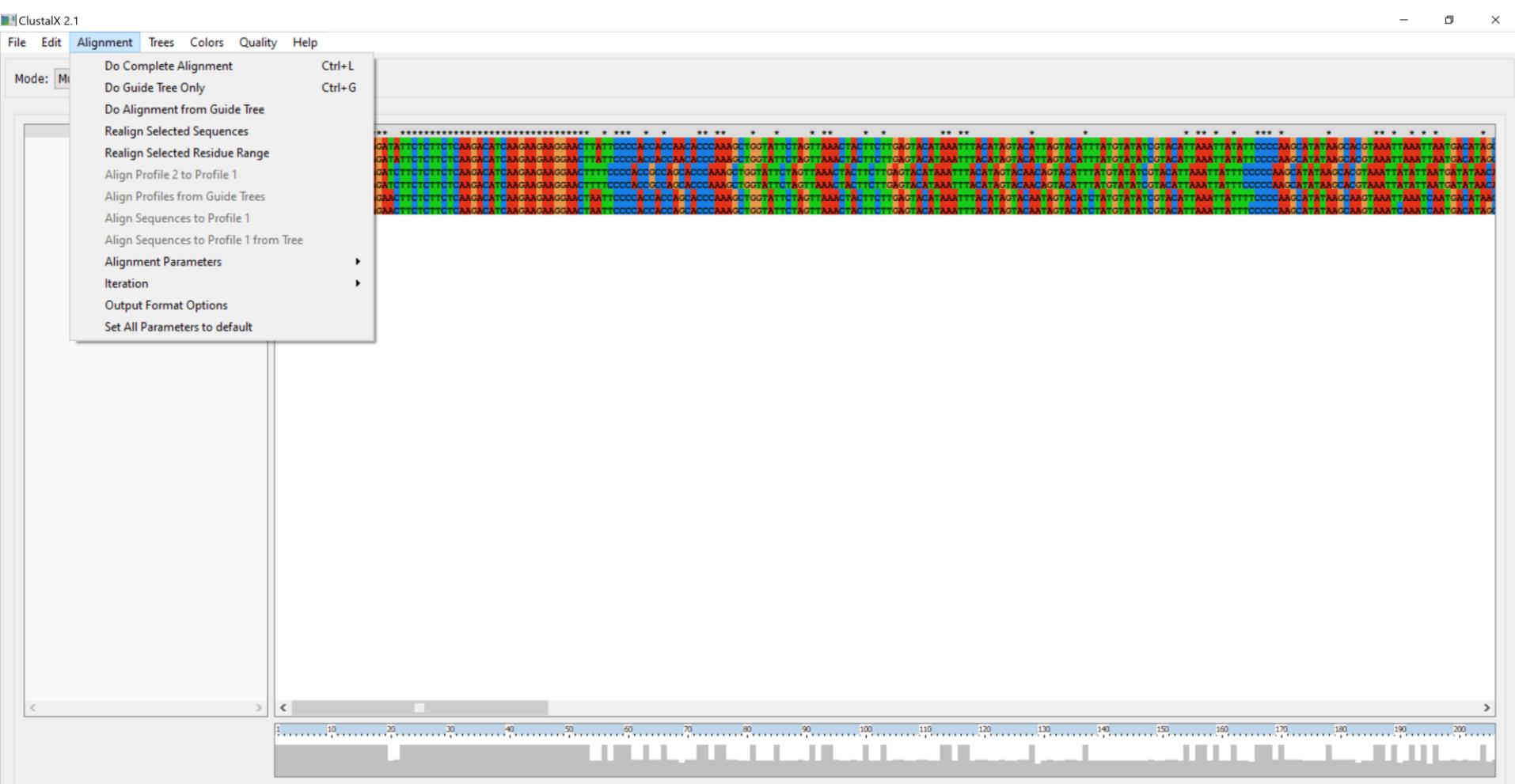
Line 4 encodes the quality values for the sequence in Line 2, and must contain the same number of symbols as letters in the sequence.

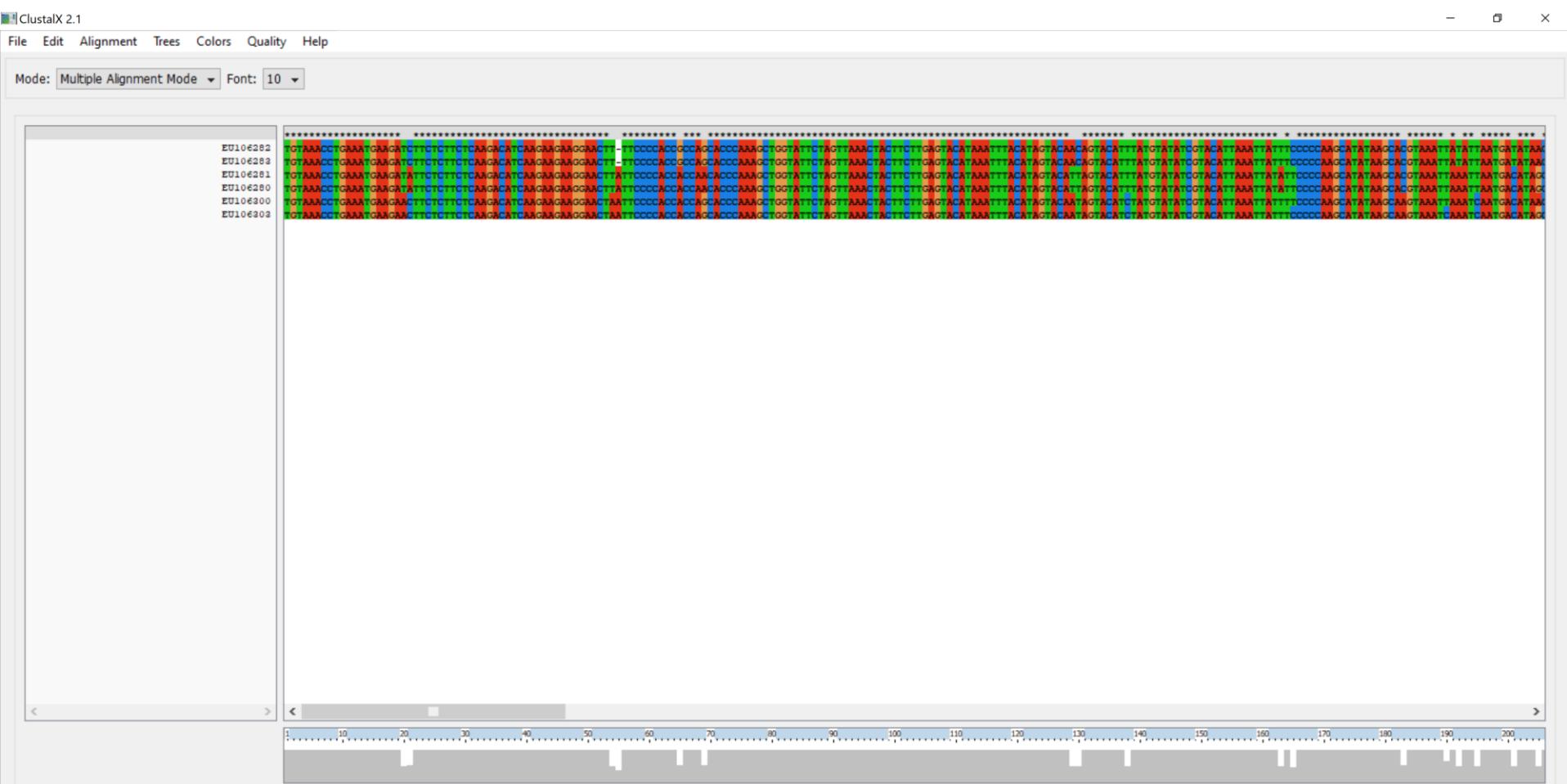
Progressive alignment - ClustalX

3 phases:

1. Alignment of sequence pairs → pairwise distances
2. Construction of guide tree (eg. Neighbor-Joining)
3. Alignment of all sequences according to guide tree







Problem with progressive alignment

6 species:

gorilla

AGGTT

penguin

A-GTT

horse

AG-TT

chicken

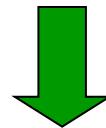
A-GTT

panda

AG-TT

ostrich

AGGTT



AGGTT

AG-TT

AG-TT

AG-TT

AG-TT

AGGTT

gorilla

horse

panda

penguin

chicken

ostrich

AGGTT

AG-TT

AG-TT

A-GTT

A-GTT

AGGTT

AGGTT

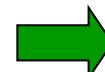
A-GTT

A-GTT

A-GTT

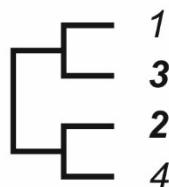
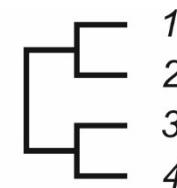
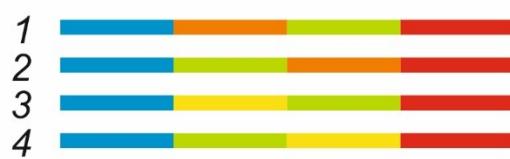
A-GTT

AGGTT

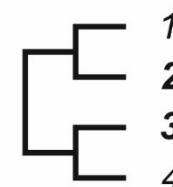
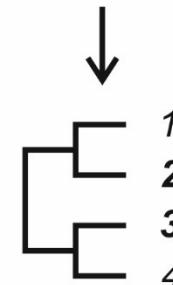


Many other alignment programs: e.g. MAFFT, MUSCLE, Geneious...

There are also methods without alignment:



fylogenetický strom



Methods

Methods of tree construction

optimality criteria

algorithms

	distances	characters
algorithms	UPGMA neighbor-joining	
optimality criteria	Fitch-Margoliash minimum evolution	maximum parsimony maximum likelihood Bayesian a.

Data types

How to assess the methods?

Efficiency: how fast is the method?

Power: how many characters we need?

Consistency: does increasing characters result in true tree?

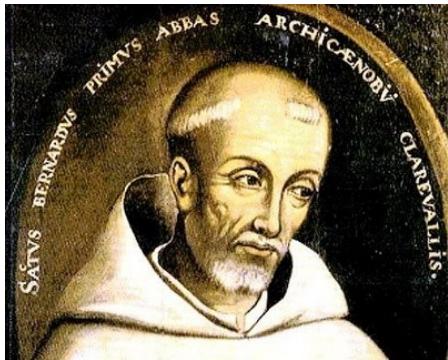
Robustness: how does it work when assumptions are violated?

Falsifiability: does it allow testing assumptions?

MAXIMUM PARSIMONY, MP (maximální úspornost)

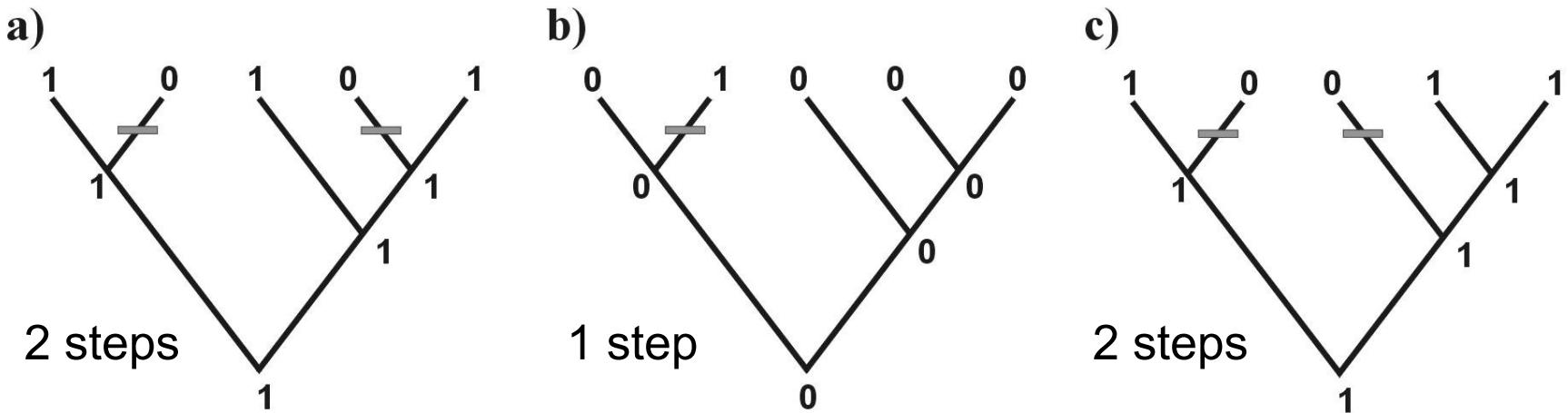
William of Ockham (c. 1287 – 1347)

Occam's razor



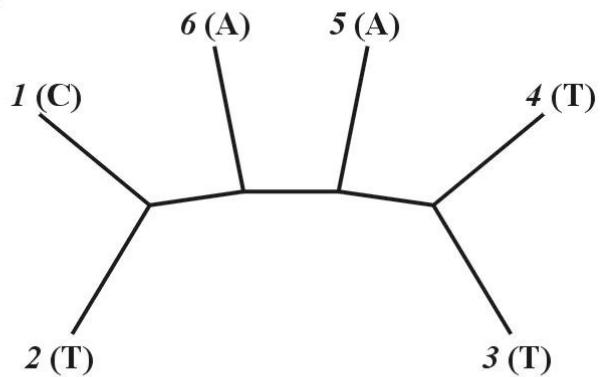
minimal number of steps = 3
real number of steps = 5
 \Rightarrow 2 extra steps \rightarrow homoplasy

	I	II	III
A	1	0	1
B	0	0	1
C	1	0	0
D	0	1	0
E	1	0	1



Estimation of number of steps: Fitch algorithm

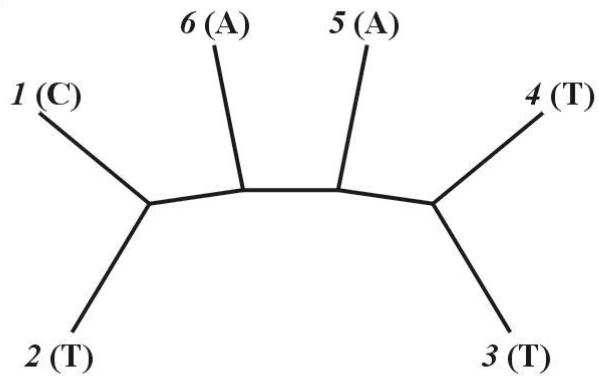
a)



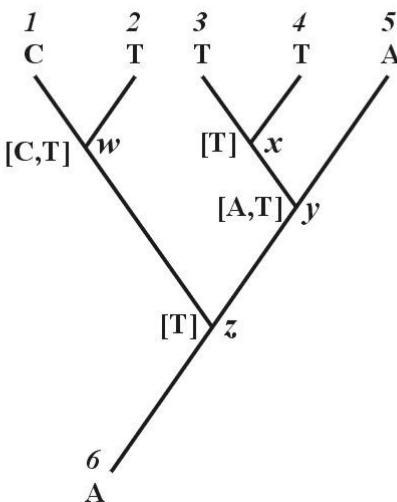
1. arbitrary root

Estimation of number of steps: Fitch algorithm

a)



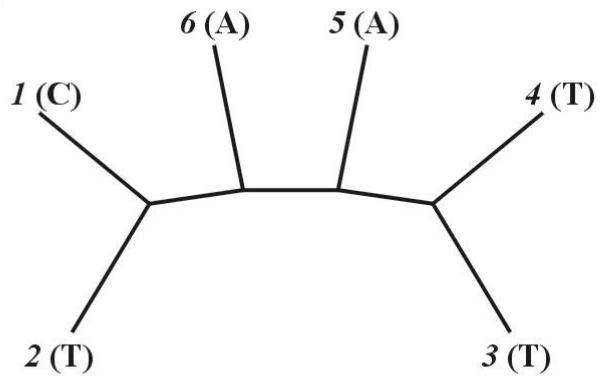
b)



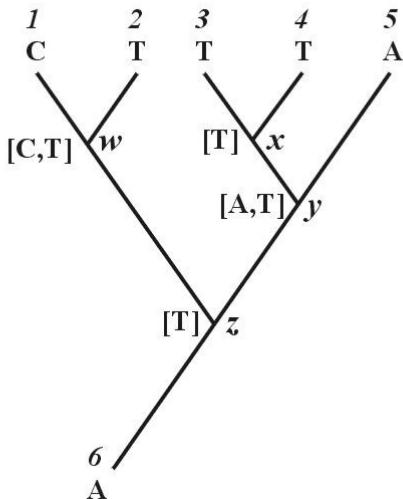
1. arbitrary root
2. Downward:
 $w = \text{C or T}$
 $x = \text{T}$
 $y = \text{A or T}$
 $z = \text{T}$

Estimation of number of steps: Fitch algorithm

a)



b)



1. arbitrary root

2. Downward:

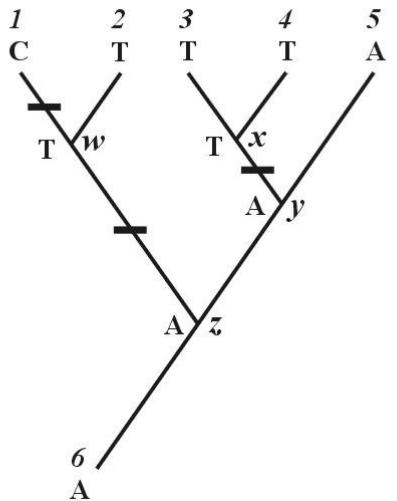
$w = \text{C or T}$

$x = \text{T}$

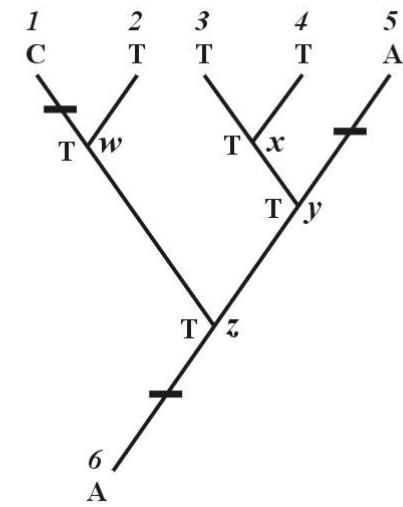
$y = \text{A or T}$

$z = \text{T}$

c)



d)



DELTRAN

(**DE**Layed **TR**ANsformation)

ACCTRAN

(**AC**Celerated **TR**ANsformation)

total length = 3

Problem of homoplasy:

parsimony-informative and non-informative characters (*sites*)

- invariant sites (*symplesiomorphies*)
- singletons (*autapomorphies*)

index of consistency, CI

retention index, RI

rescaled consistency index, RC

homoplasy index, HI

$$\mathbf{RC = CI \times RI}$$

$$\mathbf{HI = 1 - CI}$$

m = min. no. of possible steps

s = min. no. needed for explaining the tree

g = max. no. of steps for any tree

Methods of parsimony:

Fitch:

$X \rightarrow Y$ a $Y \rightarrow X$

neseřazené znaky ($A \rightarrow T$ nebo $A \rightarrow G$ etc.)

Wagner:

$X \rightarrow Y$ a $Y \rightarrow X$

seřazené znaky ($1 \rightarrow 2 \rightarrow 3$)

Dollo:

$X \rightarrow Y$ a $Y \rightarrow X$, potom nelze $X \rightarrow Y$

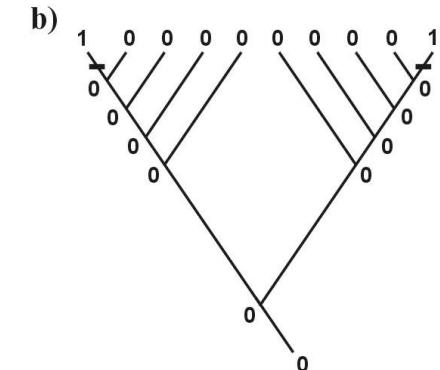
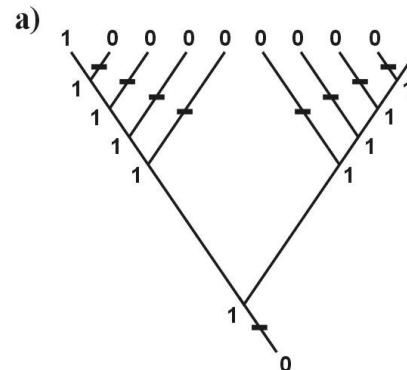
*... restriction-site and
restriction-fragment data*

Camin-Sokal:

$X \rightarrow Y$,

not $Y \rightarrow X$

... SINE, LINE



weighted = transversion p.

“relaxed Dollo criterion”

generalized p.: cost matrix = step matrix

Wagner

a)

	a	b	c	d
a	-	1	2	3
b	1	-	1	2
c	2	1	-	1
d	3	2	1	-

Fitch

b)

	a	b	c	d
a	-	1	1	1
b	1	-	1	1
c	1	1	-	1
d	1	1	1	-

c)

	a	b	c	d
a	-	M^*	$2M$	$3M$
b	1	-	M	$2M$
c	2	1	-	M
d	3	2	1	-

Dollo

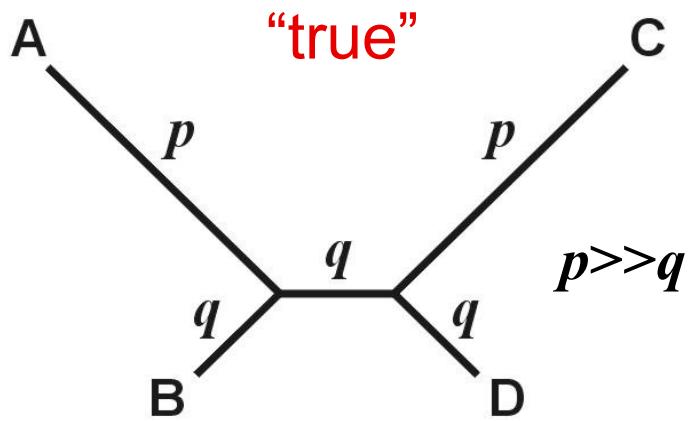
d)

	A	C	G	T
A	-	5	1	5
C	5	-	5	1
G	1	5	-	5
T	5	1	5	-

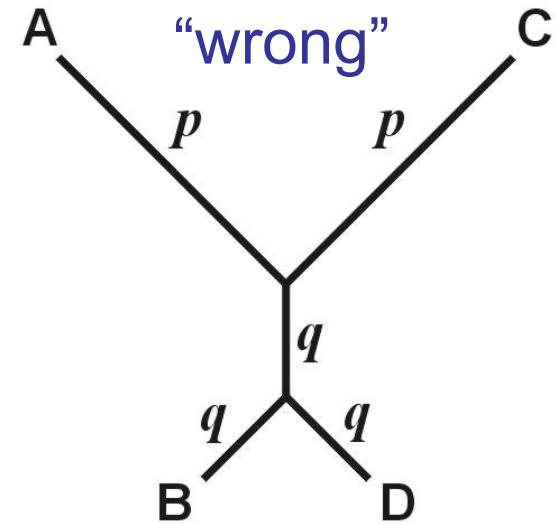
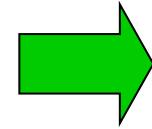
transversion

*) M is an arbitrarily large number, guaranteeing that only one transformation to each derived state will be permitted.

Parsimony and consistency



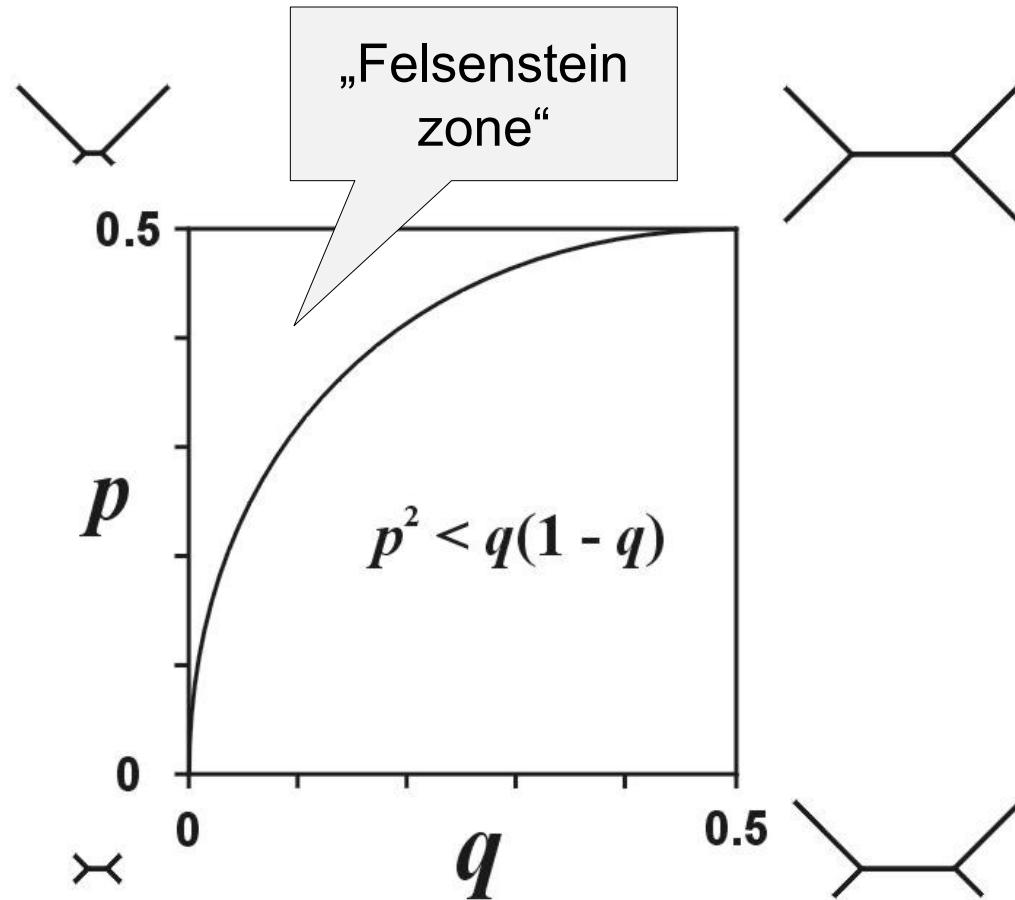
$((A,B),(C,D))^*$



$((A,C),(B,D))^*$

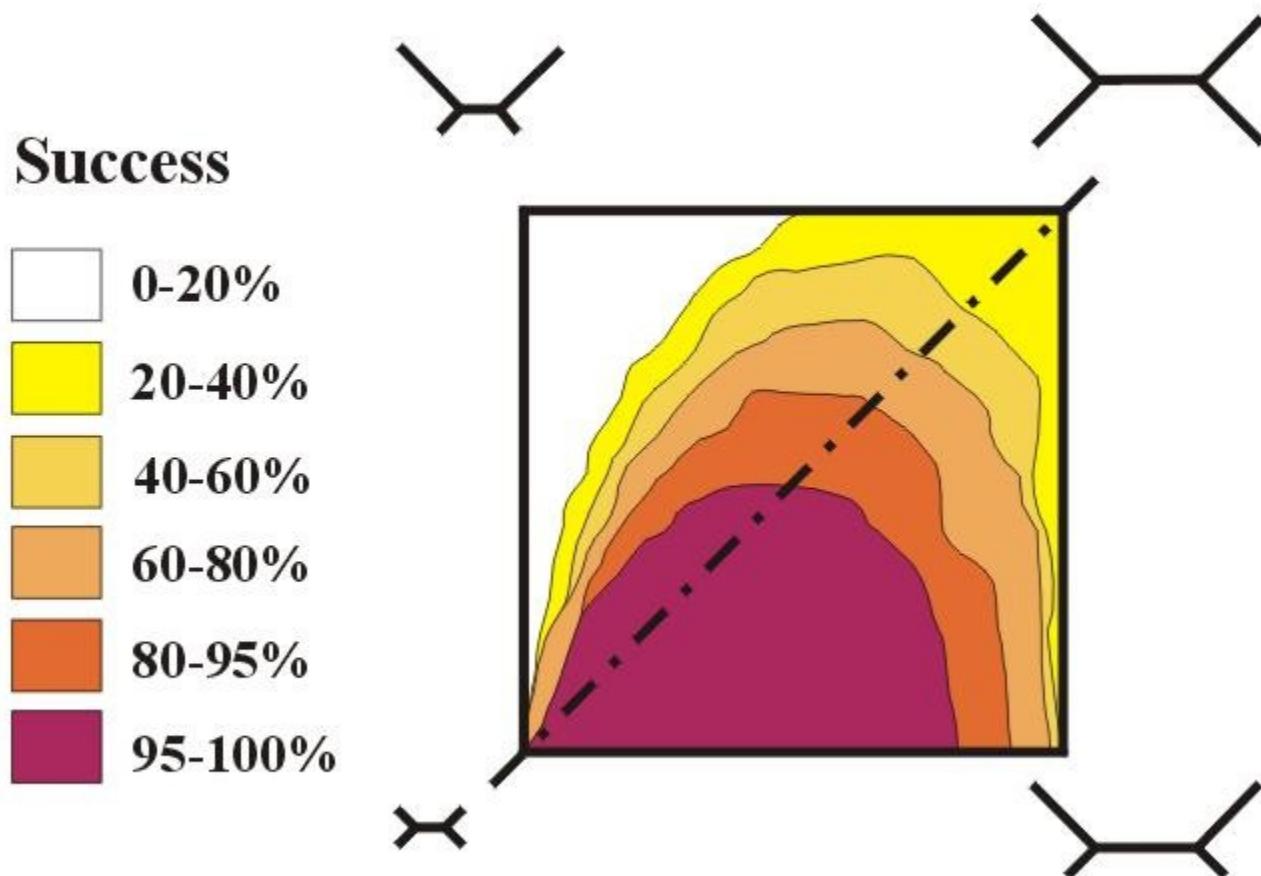
* tree written in Newick format

Parsimony and consistency

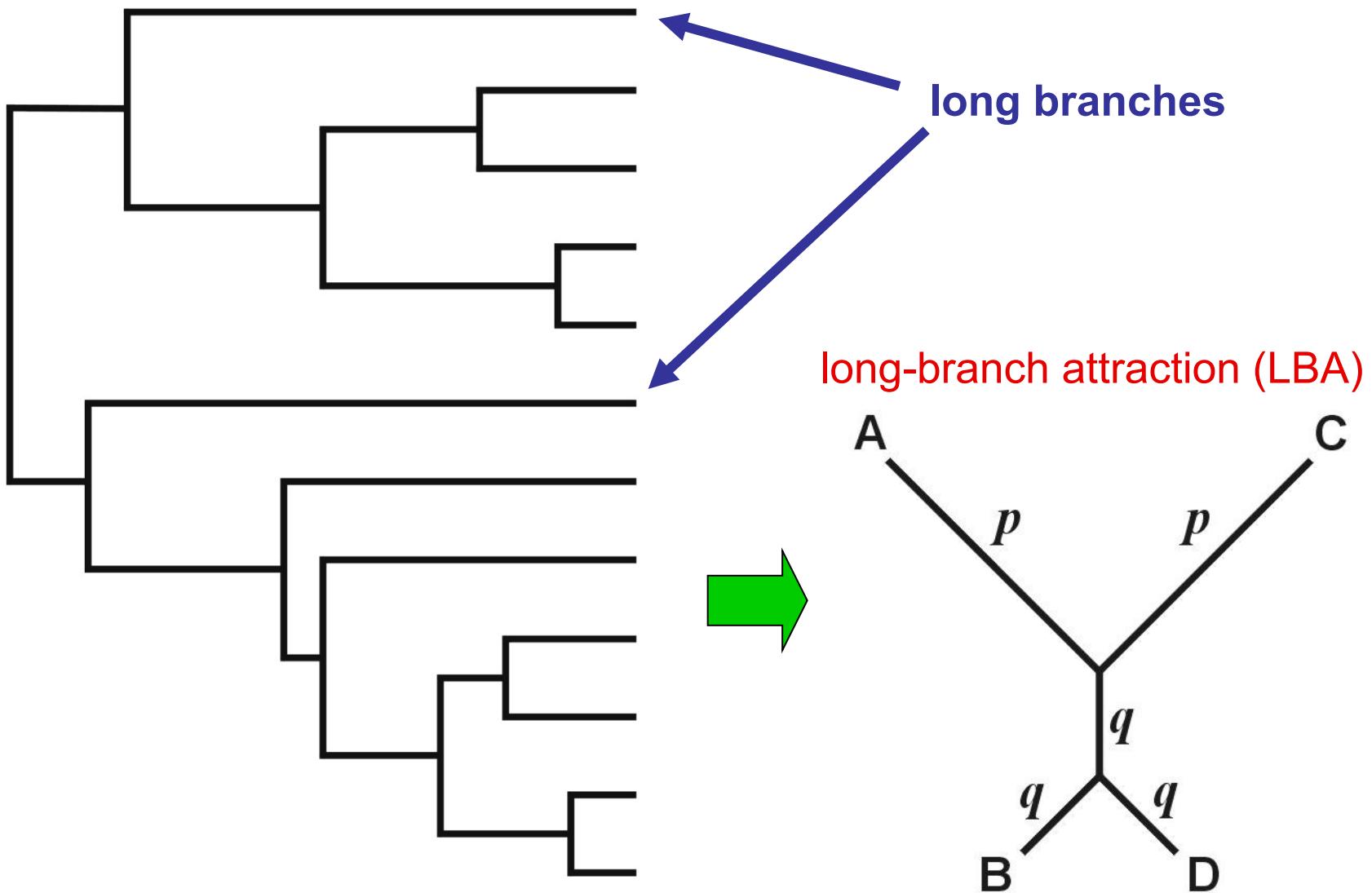


In the Felsenstein zone, parsimony is inconsistent

Parsimony and consistency



Parsimony and consistency

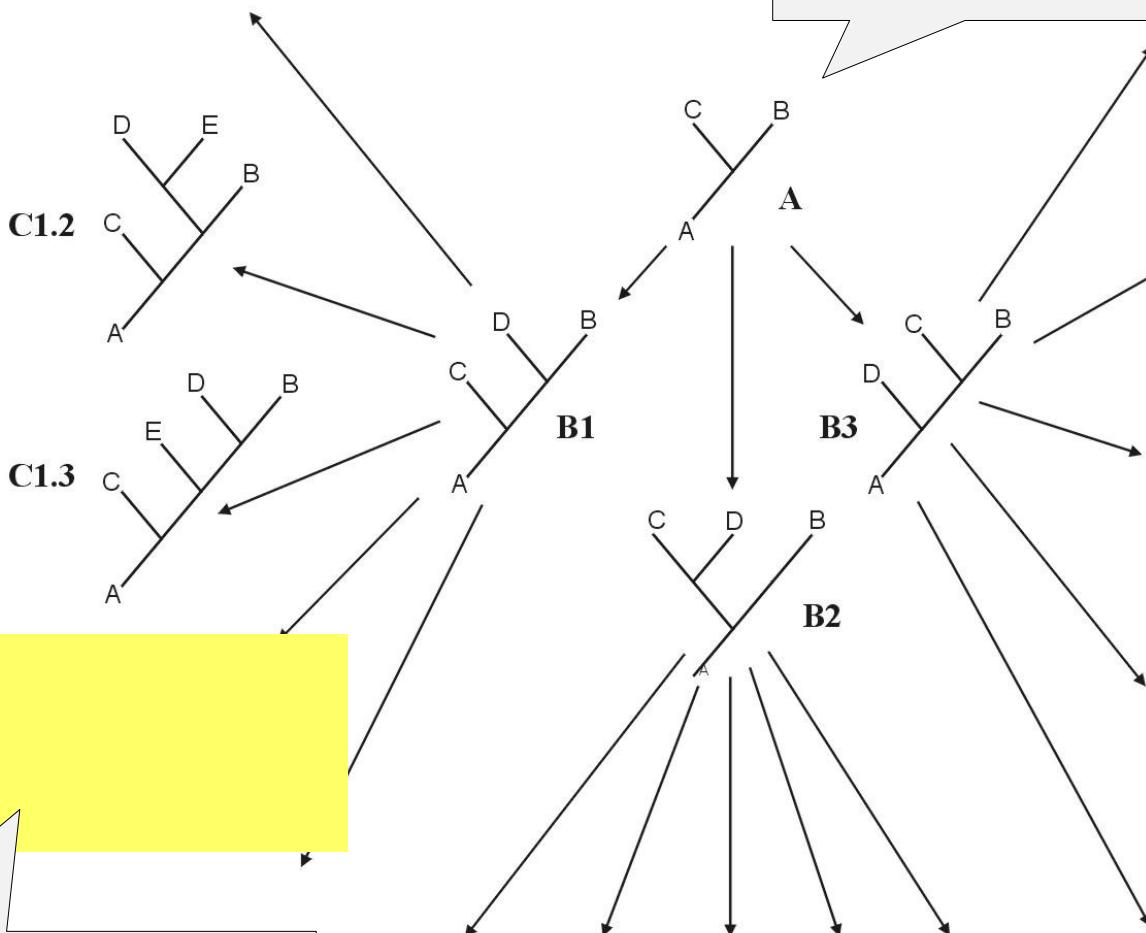


Search for optimal tree

1. Exact methods:
 - a) exhaustive search
 - b) branch-and-bound

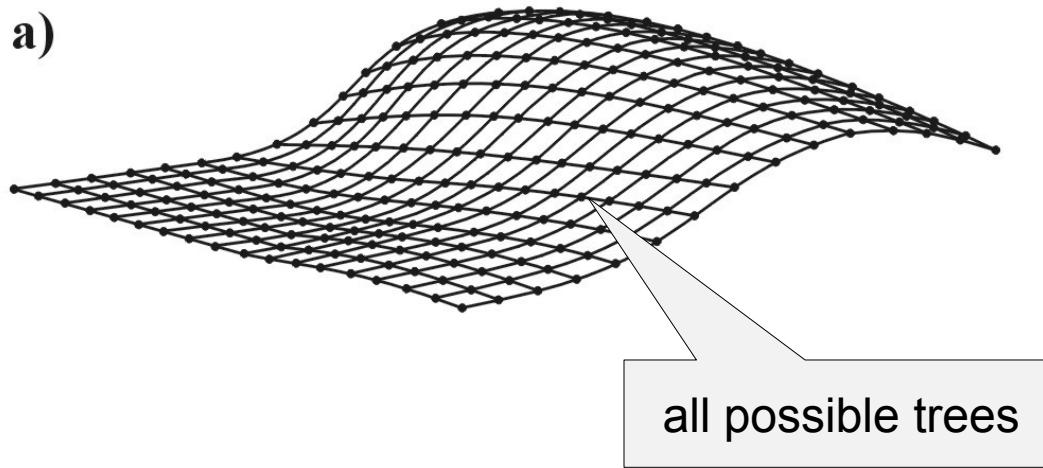
branch-and-bound

starts with 3 taxa,
sequential addition



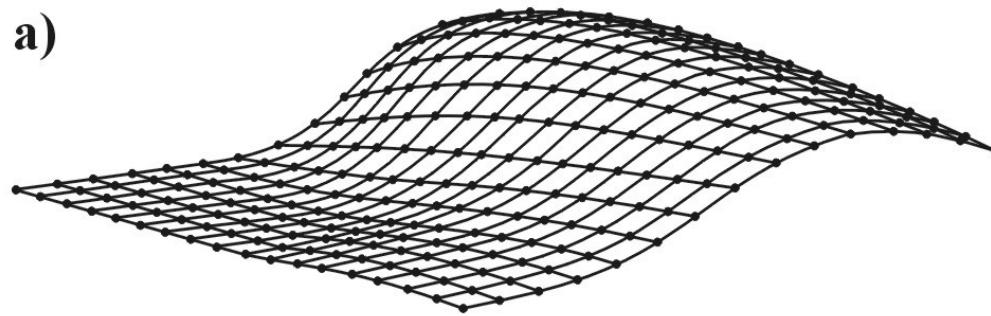
if the tree is longer than
a randomly chosen tree,
the process is terminated

2. Heuristic search

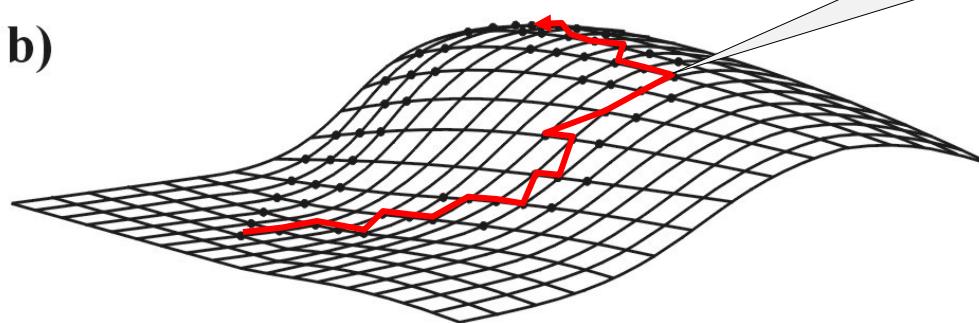


stepwise addition
star decomposition
branch swapping

a)

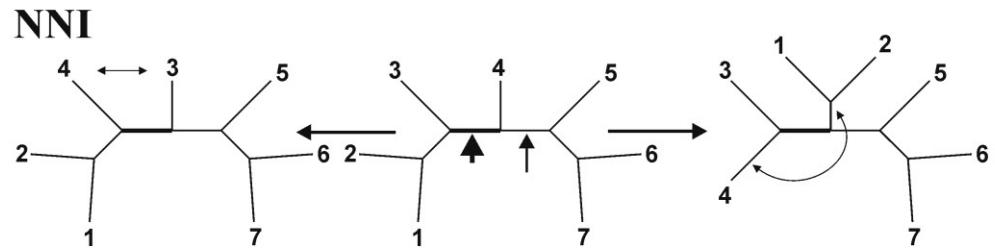


b)

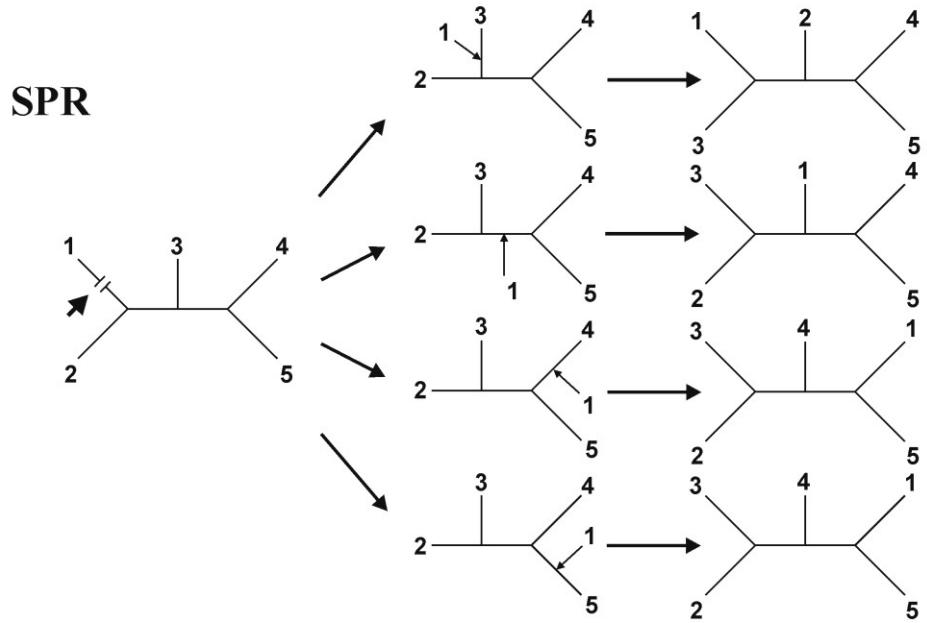


heuristic search

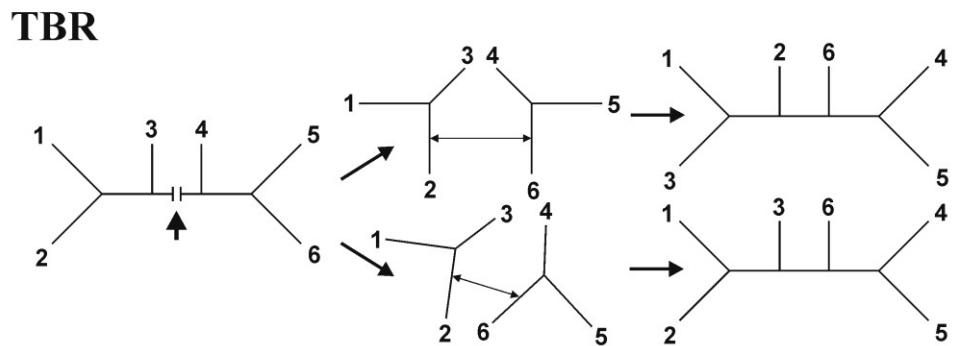
nearest-neighbor
interchanges (NNI)



subtree pruning
and regrafting (SPR)



tree bisection and
reconnection (TBR)



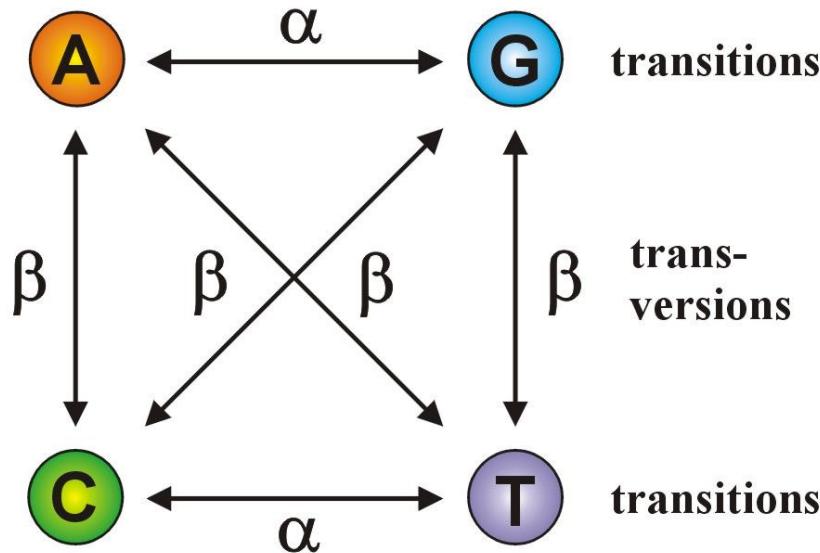
Evolutionary models and distance methods

		Base after substitution			
		A	C	G	T
Original base	A	- $\frac{3}{4}$	$\frac{1}{4}$	$\frac{1}{4}$	$\frac{1}{4}$
	C	$\frac{1}{4}$	- $\frac{3}{4}$	$\frac{1}{4}$	$\frac{1}{4}$
	G	$\frac{1}{4}$	$\frac{1}{4}$	- $\frac{3}{4}$	$\frac{1}{4}$
	T	$\frac{1}{4}$	$\frac{1}{4}$	$\frac{1}{4}$	- $\frac{3}{4}$

$$Q = \begin{pmatrix} - & \alpha & \alpha & \alpha \\ \alpha & - & \alpha & \alpha \\ \alpha & \alpha & - & \alpha \\ \alpha & \alpha & \alpha & - \end{pmatrix}$$

Jukes-Cantor (JC): equal base frequencies
equal substitution rates

Kimura 2-parameter (K2P): transitions \neq transversions



$$Q = \begin{pmatrix} - & \beta & \alpha & \beta \\ \beta & - & \beta & \alpha \\ \alpha & \beta & - & \beta \\ \beta & \alpha & \beta & - \end{pmatrix}$$

If $\alpha = \beta$, K2P = JC

Felsenstein (F81): different base frequencies

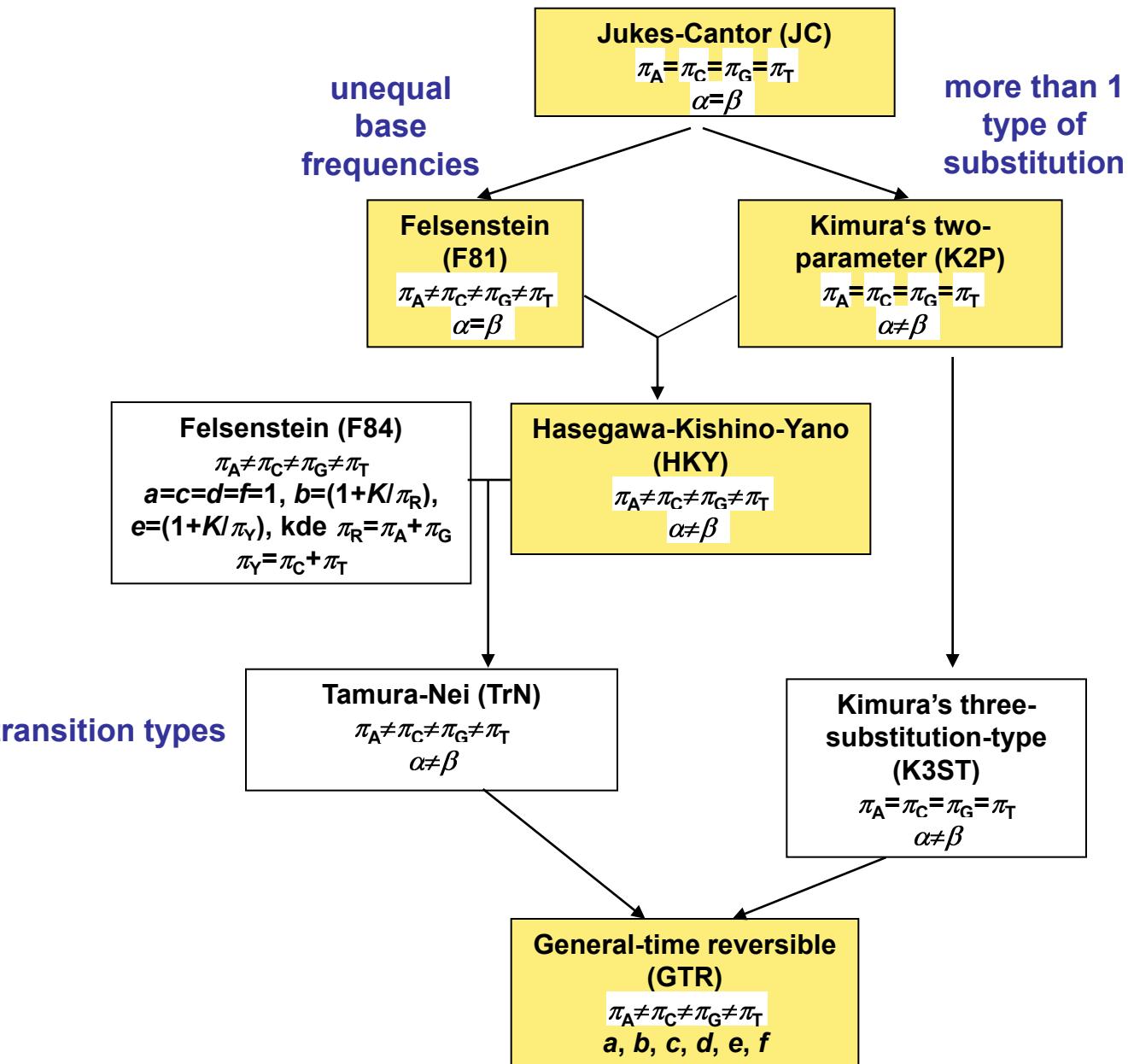
$$Q = \begin{pmatrix} - & \pi_C & \pi_G & \pi_T \\ \pi_A & - & \pi_G & \pi_T \\ \pi_A & \pi_C & - & \pi_T \\ \pi_A & \pi_C & \pi_G & - \end{pmatrix}$$

If $\pi_A = \pi_C = \pi_G = \pi_T$, F81 = JC

Hasegawa-Kishino-Yano (HKY): different base frequencies
transitions \neq transversions

$$Q = \begin{pmatrix} - & \pi_C\beta & \pi_G\alpha & \pi_T\beta \\ \pi_A\beta & - & \pi_G\beta & \pi_T\alpha \\ \pi_A\alpha & \pi_C\beta & - & \pi_T\beta \\ \pi_A\beta & \pi_C\alpha & \pi_G\beta & - \end{pmatrix}$$

General time-reversible (GTR, REV): different base frequencies
different substitution rates



Heterogeneity of substitution rates in different parts of sequences

Gamma distribution:

shape parameter α

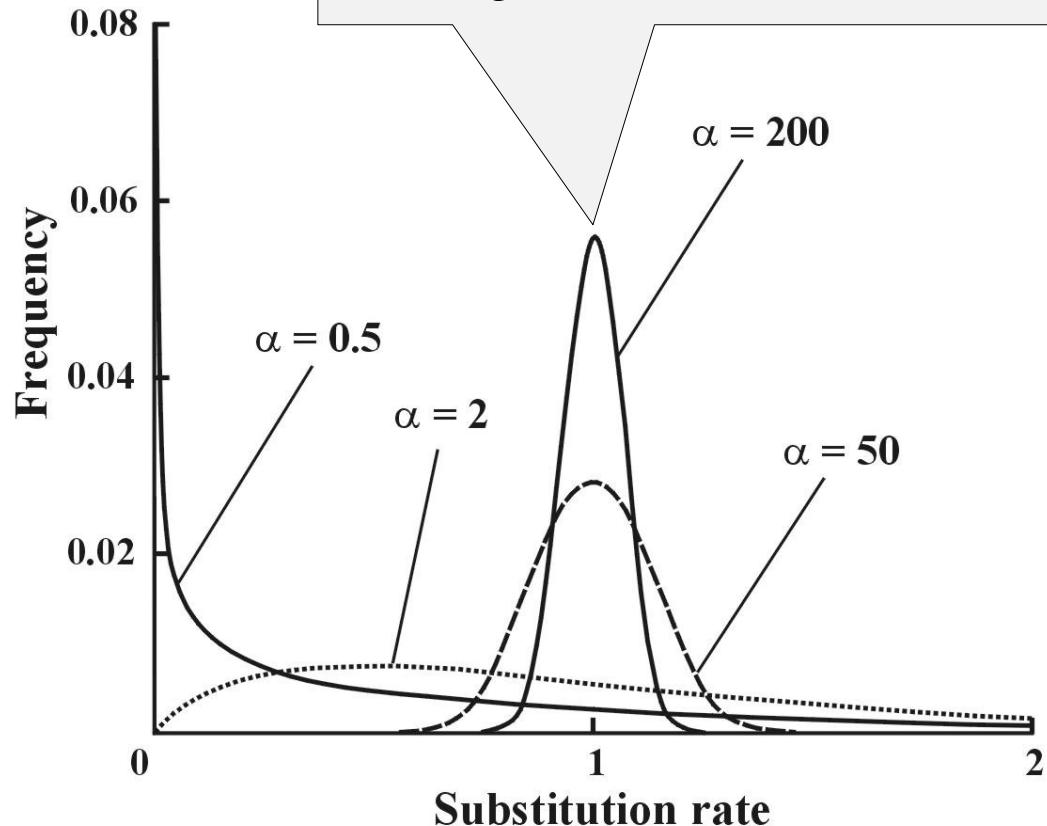
discrete gamma model

invariant sites

→ GTR+Γ+I

nebo GTR+G+I

the higher α , the more homogeneous are substitutions



Model comparison:

Likelihood ratio test (LRT):

nested models

$$LR = 2(\ln L_2 - \ln L_1)$$

χ^2 distribution, $p_2 - p_1$ degrees of freedom



Akaike information criterion (AIC):

nonnested models

$$AIC = -2\ln L + 2p, \text{ kde } p = \text{number of free parameters}$$

better model \rightarrow lower AIC

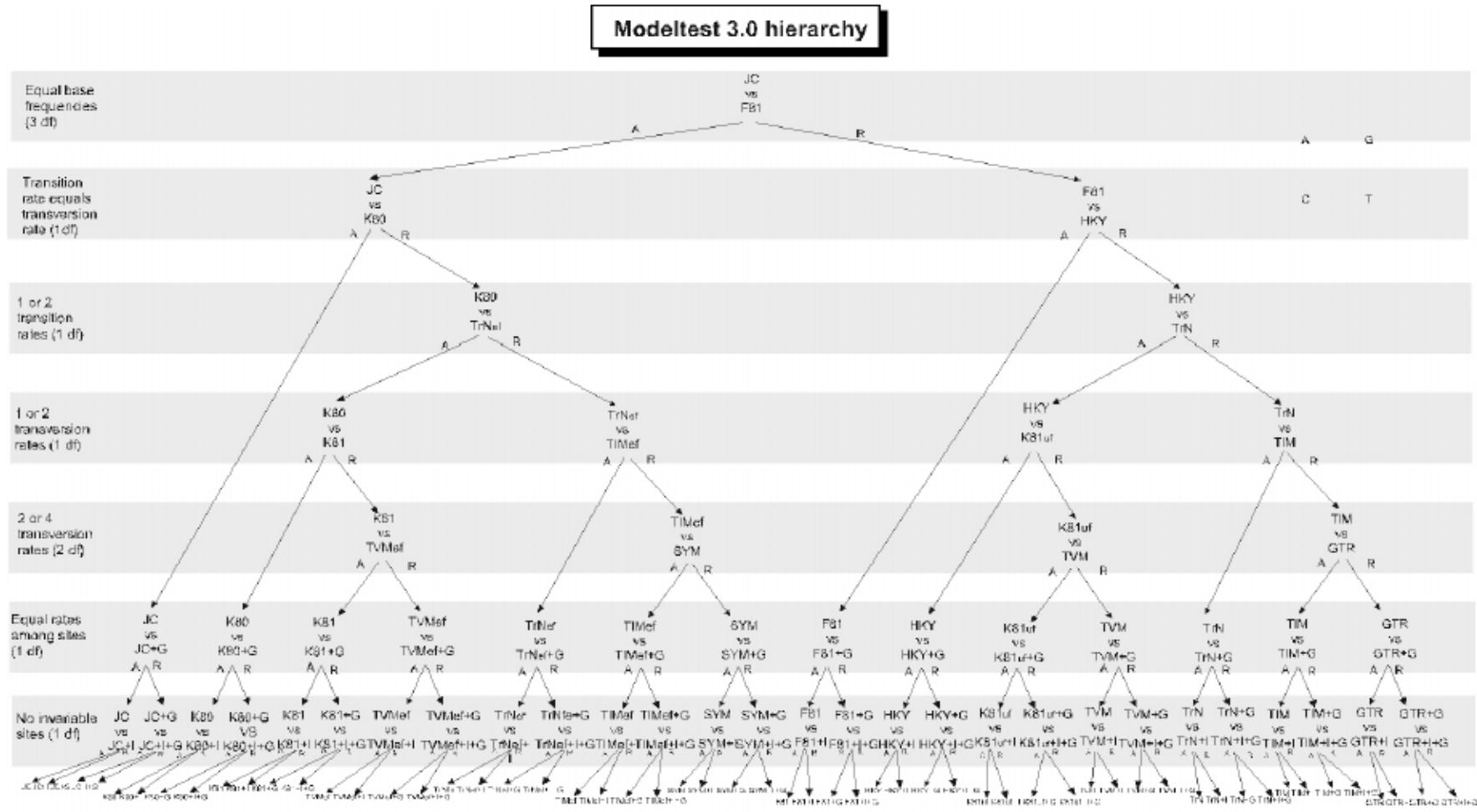
Bayesian information criterion (BIC):

nonnested models

$$BIC = -2\ln L + p\ln N, \text{ where } N = \text{sample size}$$

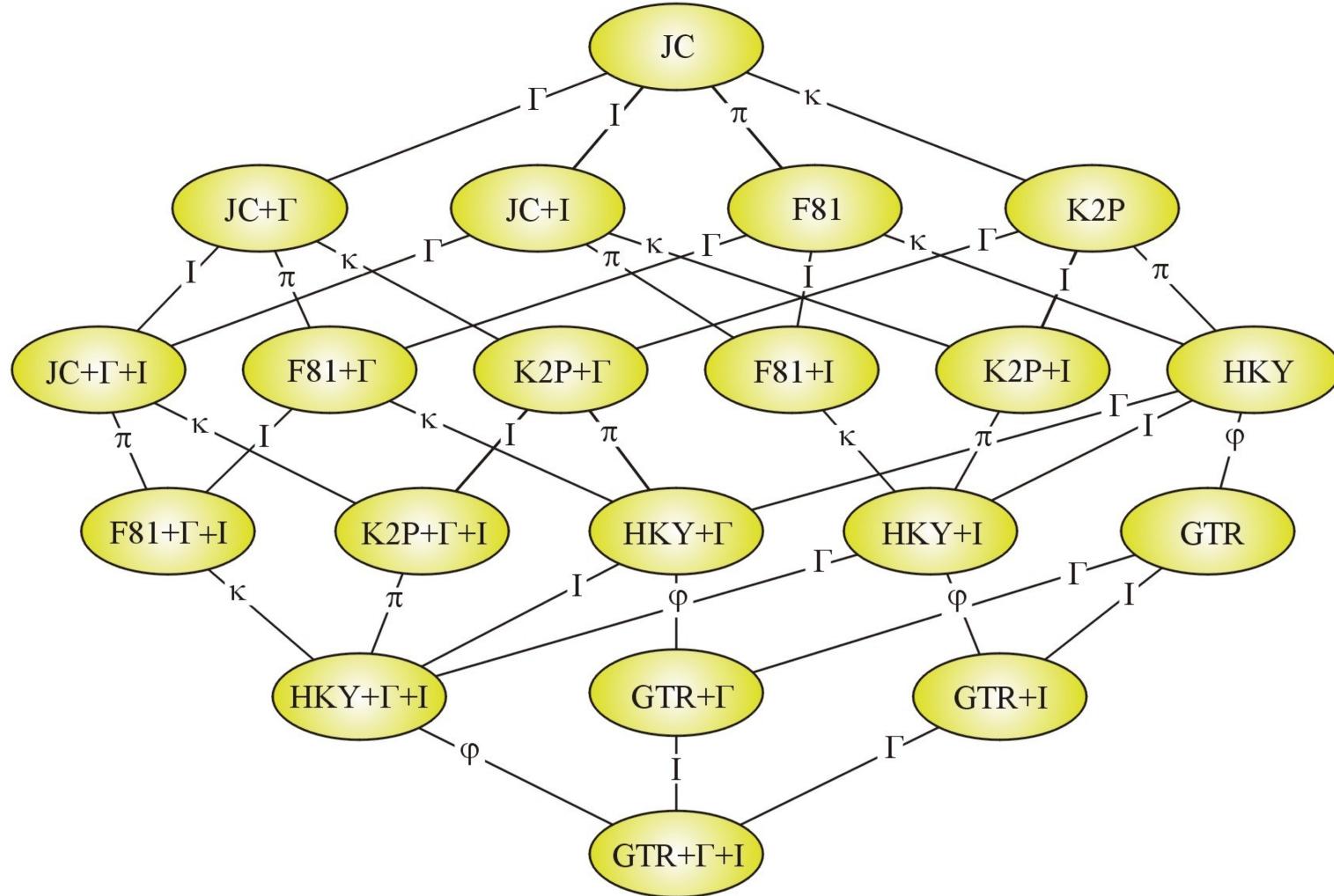
Model comparison:

hierarchical LRT – ModelTest (Crandall and Posada), jModelTest

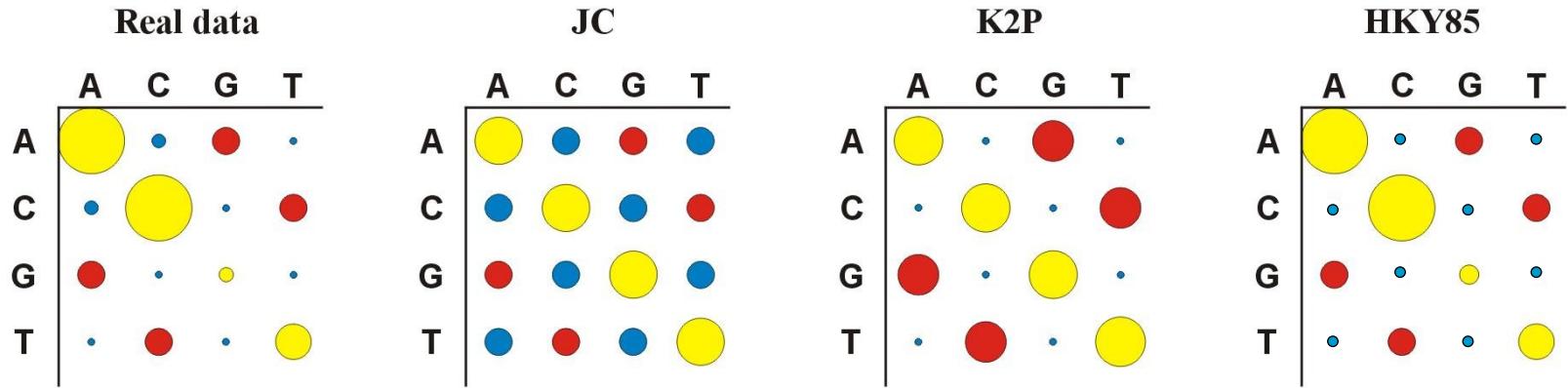


Model comparison:

dynamic LRT:



Model comparison:



More parameters \Rightarrow more realism, but ...

... also less confidence (estimates based on the same amount of data!)

Distances

computed for each pair of taxa, from distance (or similarity) matrix
– tree inference

distance methods base on assumption that if we know true distances,
we can very easily infer the true phylogeny

advantage: very fast and simple (also with a calculator)

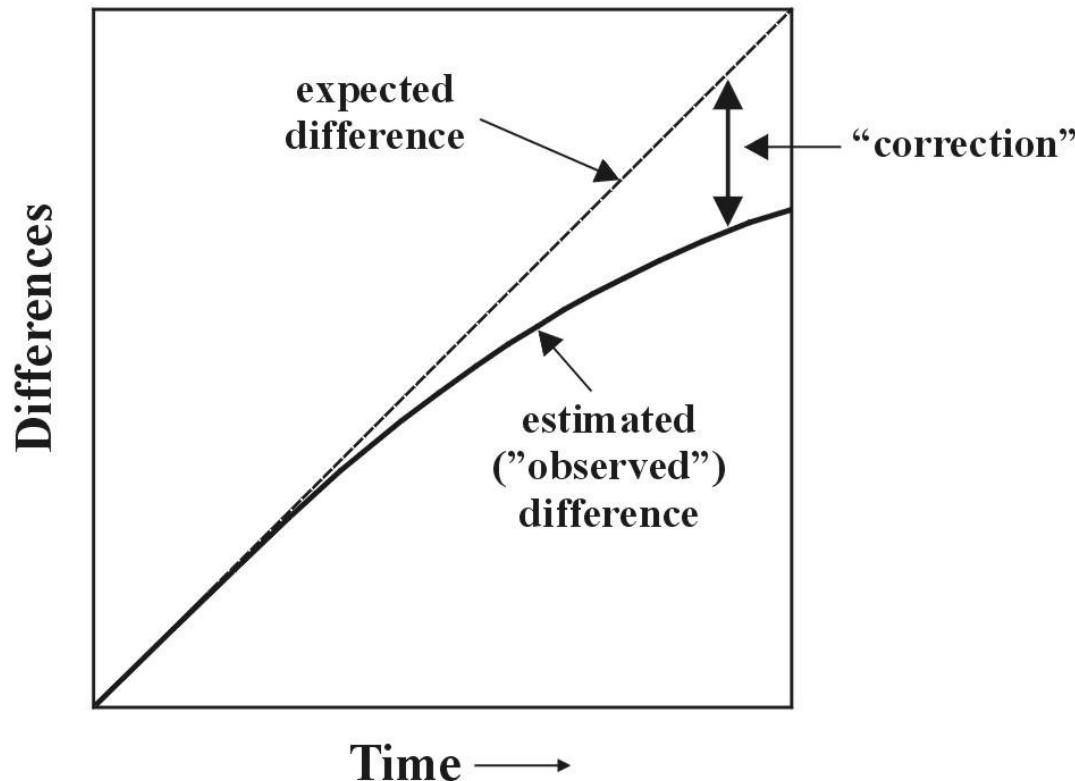
1 10 20 30

sequence 1: ACCCGTTAAGCTTAAACGTACTTGGATCGAT

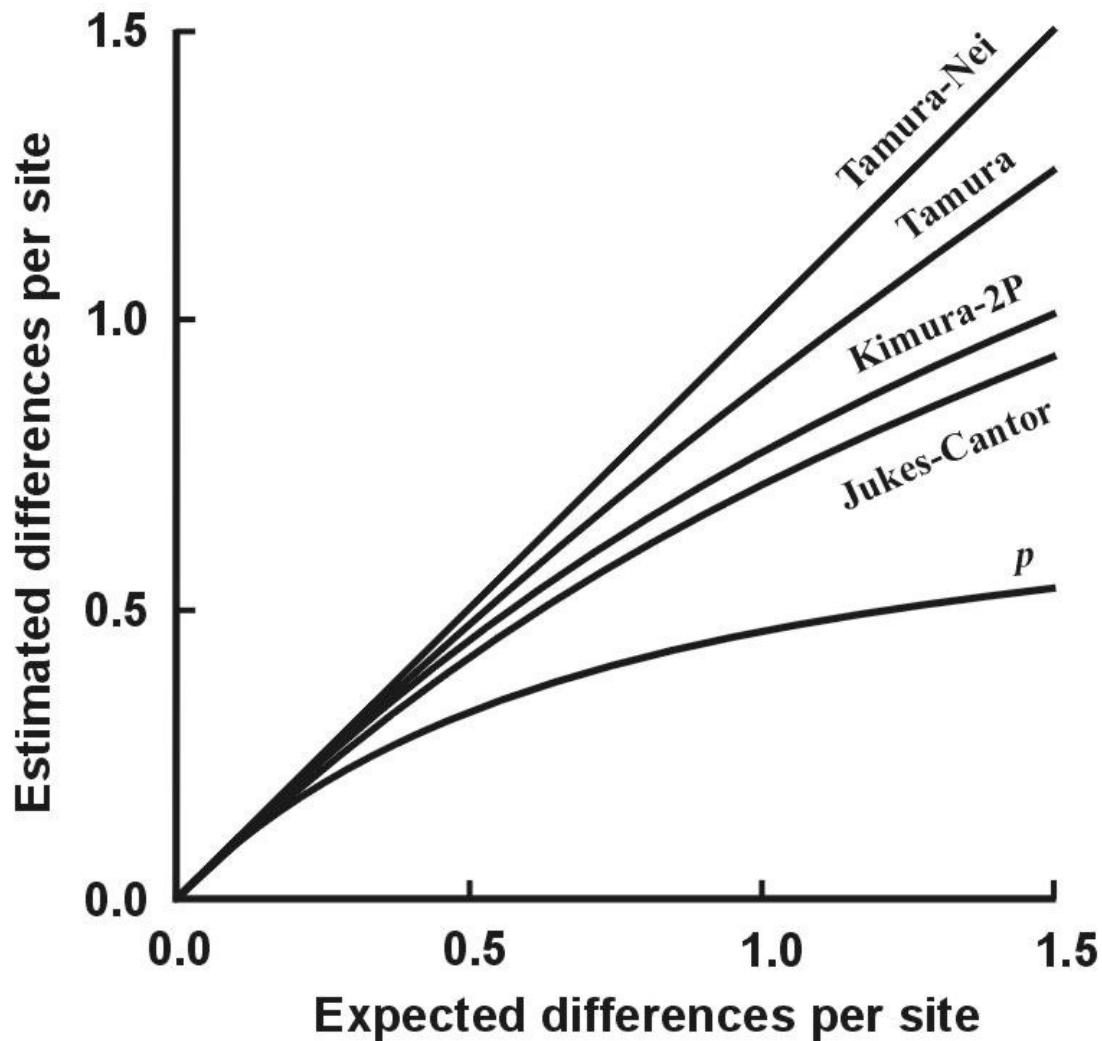
sequence 2: ACCCGTTAGGCTTAATGTACGTGGATCGAT

$$p\text{-distance: } p = k/n = 3/30 = 0,10$$

problem of
saturation:



Distances for some models:



Cluster analysis - UPGMA

	chimp	bonobo	gorilla	human	orang.
chimp (S)	--				
bonobo (B)	0,0118	--			
gorilla (G)	0,0427	0,0416	--		
human (Č)	0,0382	0,0327	0,0371	--	
orangutan (O)	0,0953	0,0916	0,0965	0,0928	--

1. Find $\min d(ij)$
2. Calculate new matrix $(SB-k) = [d(B-k)+d(S-k)]/2$
3. Repeat 1 a 2.

	ŠB	gorilla	human	orang.
ŠB	--			
gorilla (G)	0,0422	--		
human (Č)	0,0355	0,0371	--	
orangutan (O)	0,0935	0,0965	0,0928	--

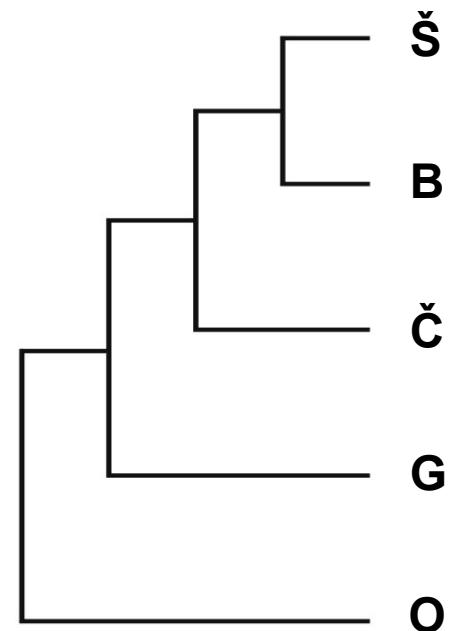
UPGMA (unweighted pair-group method using arithmetic means):

$$d[(B\check{S}\check{C})G] = \{d(BG) + d(\check{S}G) + d(\check{C}G)\}/3$$

WPGMA: $d[(B\check{S}\check{C})G] = \{d[(B\check{S})G] + d(\check{C}G)\}/2$

single-linkage (metoda nejbližšího souseda)

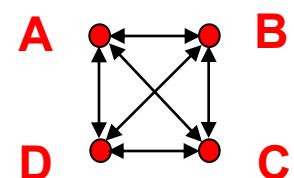
complete-linkage (m. nejvzdálenějšího souseda)



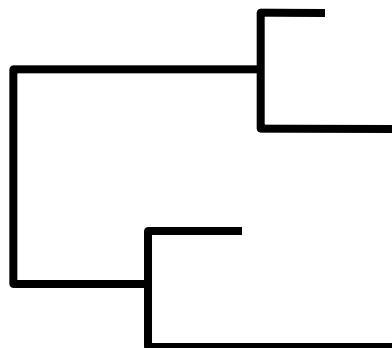
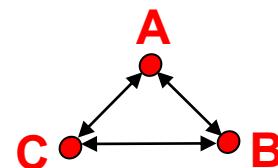
UPGMA and consistency

additive distances: $d_{AB} + d_{CD} \leq \max (d_{AC} + d_{BD}, d_{AD} + d_{BC})$

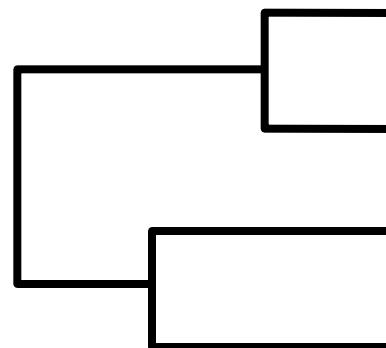
tj. distance between 2 taxa equals sum of branches connecting them



ultrametric distances: $d_{AC} \leq \max (d_{AB}, d_{BC})$

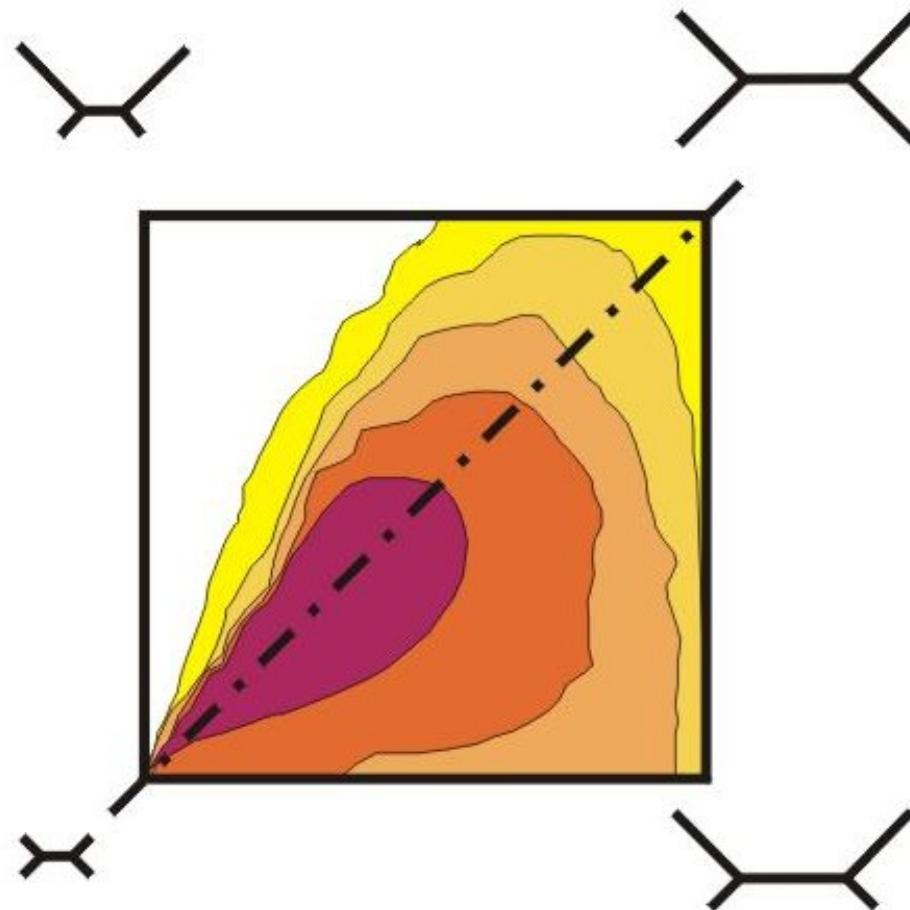


additive tree



ultrametric tree

UPGMA and consistency



Neighbor-Joining, NJ

Algorithmic method

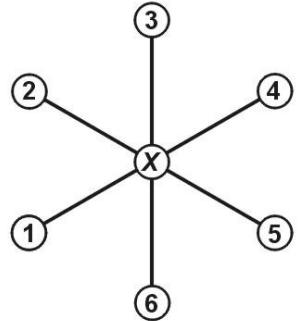
Principle of minimal evolution → minimizes sum of branch lengths S

Each pair of nodes adjusted according to its divergence from others

Single additive tree

star tree

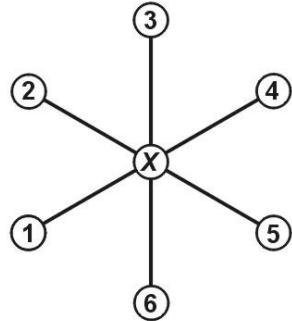
a)



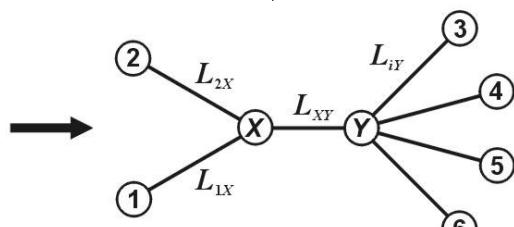
star tree

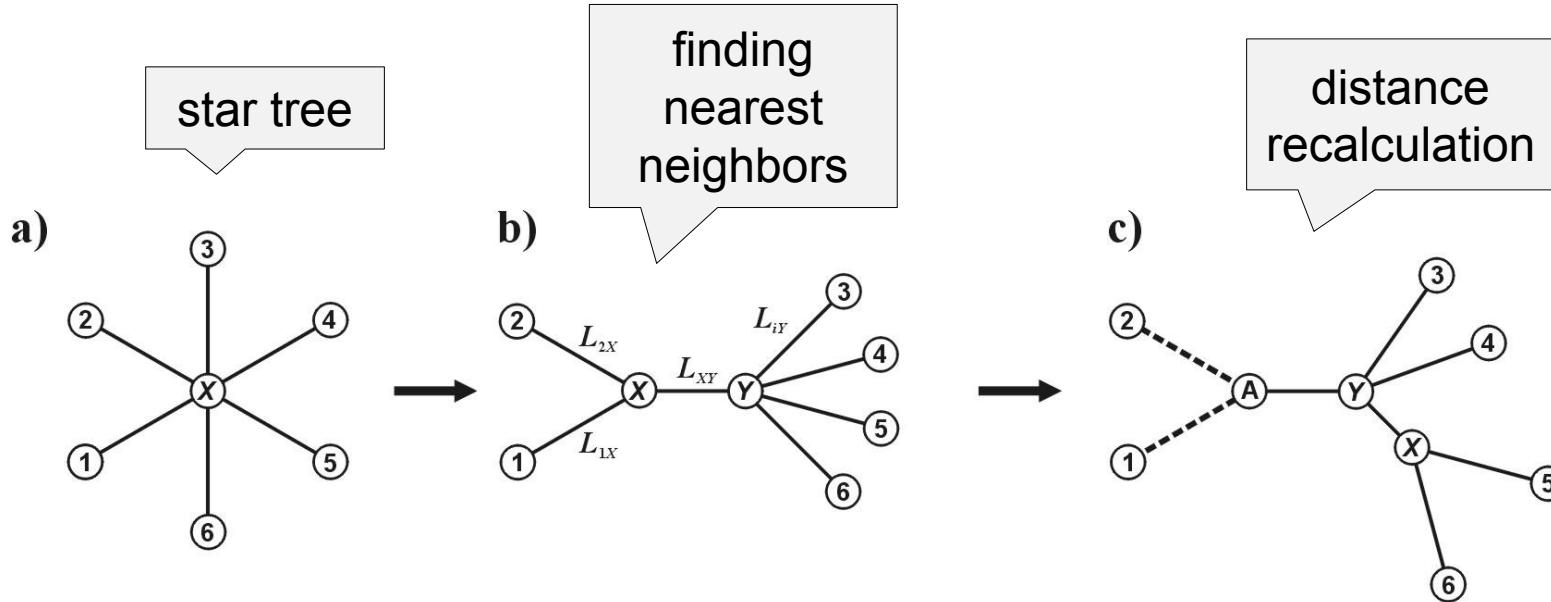
finding
nearest
neighbors

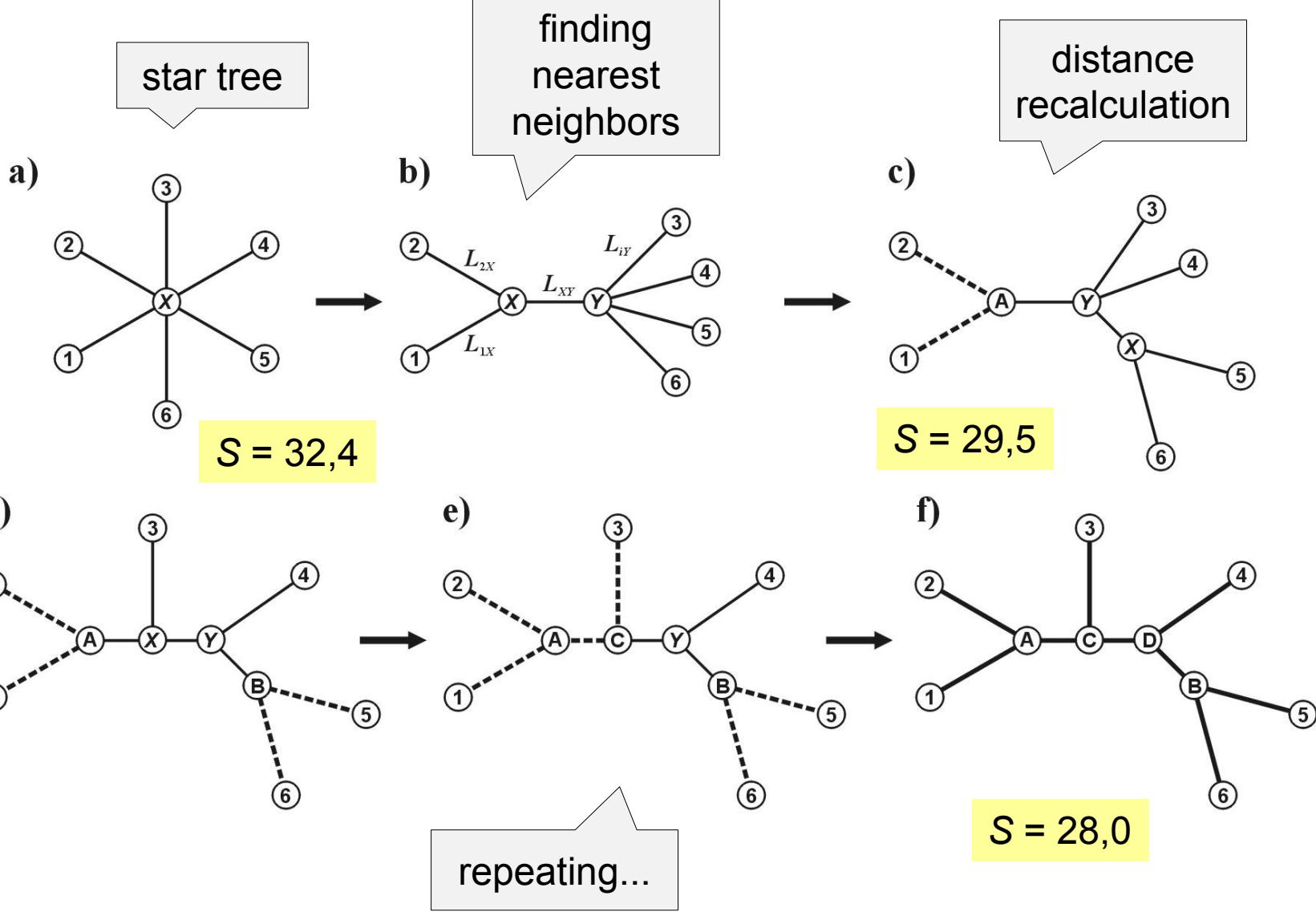
a)



b)







Drawbacks of distance data:

1. loss of information during transformation
2. after transformation to distances, we cannot infer original data
(different sequences may result in the same distance)
3. we cannot study the evolution in different parts of sequence
4. difficult biological interpretation of branch lengths
5. we cannot combine more distance matrices