### 最佳化分子親緣關係分析平台

 Phylogenetic reconstruction by Automatic Likelihood Model selector (PALM)

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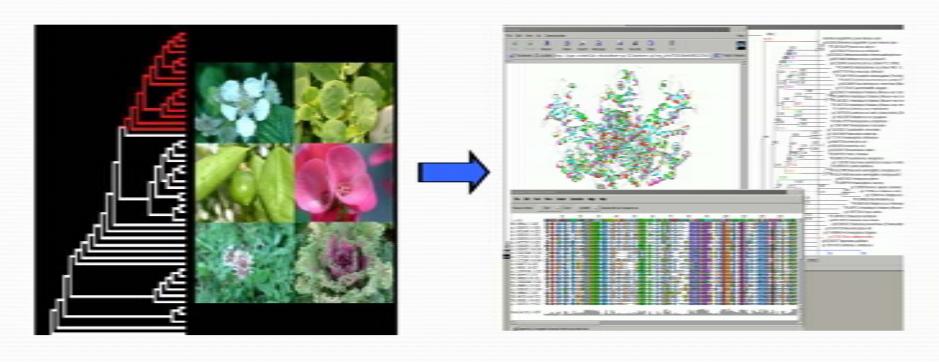


中央研究院資訊科學研究所 June 28, 2013





#### Coding Characters and Defining Homology

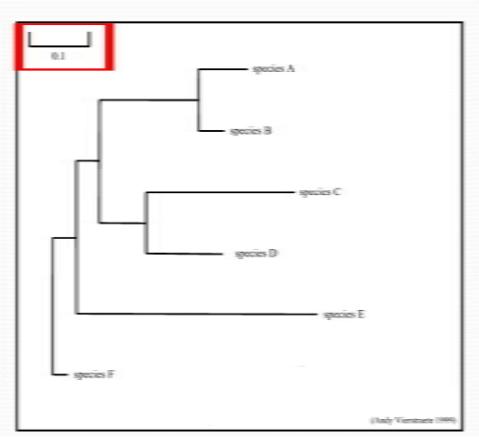


Classical phylogenetic analysis by Morphology

Molecular phylogenetic analysis By Bio-Molecules

# Phylogenetic Tree

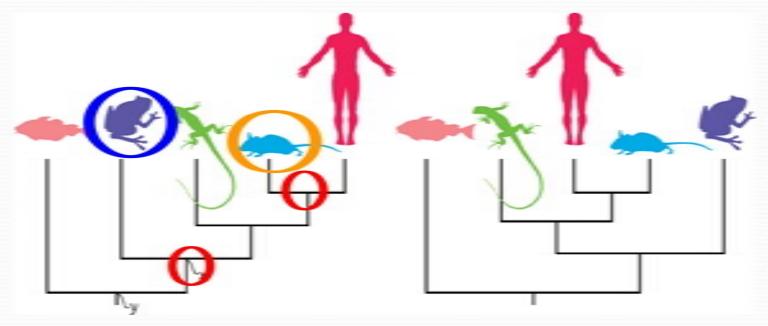
The tree is composed of nodes connected by branches.



- node : a node represents a taxonomic unit.
  - >Internal nodes
  - >External nodes
- branch (edge): defines the relationship between the taxa.
- branch length: often represents the number of changes that have occurred in that branch
- > root: is the common ancestor of all taxa.
- distance scale: scale which represents the number of differences between sequences (e.g. 0.1 means 10 % differences between two sequences)

#### Trees Only Represent The Order Of Branching

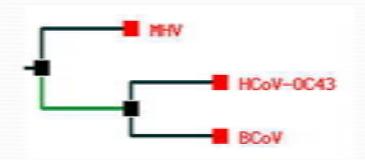
- Same topology in a different style
  - Both trees have identical topologies, with some of the internal nodes rotated.



( David A. Baum et al., Science 11 November 2005: Vol. 310. no. 5750, pp. 979 - 980)

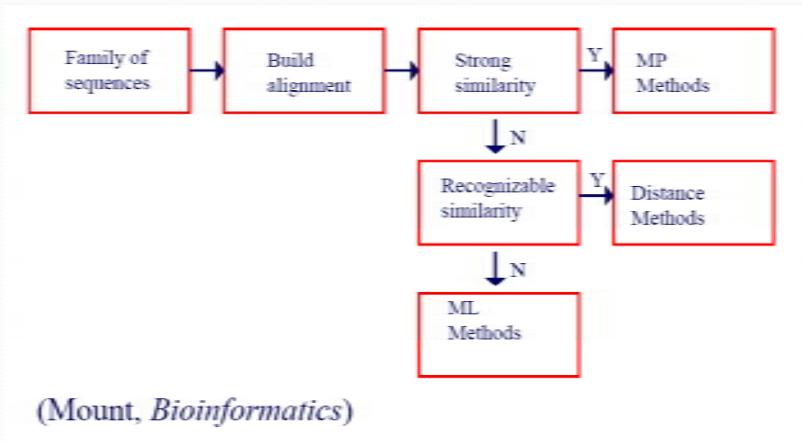
#### Methods to construct tree

	Optimality search criterion	Clustering
Character state	Maximum parsimony (MP) Maximum likelihood (ML) Bayesian inference	
Distance matrix	Fitch-Margoliash	UPGMA Neighbor-joining (NJ)



(The phylogenetic handbook 2<sup>nd</sup> Ed.)

# Flowchart of Analysis



# Distance Method, MP and ML

- Which method should we choose?
- The main disadvantage of distance-matrix methods is their inability to efficiently use information about local high-variation regions that appear across multiple subtrees.
- ML is broadly similar to the maximum-parsimony (MP) method, but maximum likelihood allows additional statistical flexibility by permitting varying rates of evolution across both lineages and sites.
- ML, a better choice?

#### Maximum Likelihood

 Conditional probability of the data (Aligned sequences) given a hypothesis (a model of substitution with a set of parameter θ, and the tree τ, including topology and branch lengths)

$$L(\tau, \theta) = Prob(Data | \tau, \theta)$$
  
Or

Prob(Aligned Sequences | tree, model of evolution)

#### Maximum Likelihood Estimates (MLE)

 The maximum likelihood estimates (MLE) of τ, θ are those making the function L as large as possible

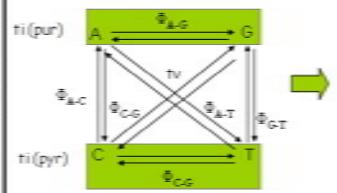
$$L(\tau, \theta) = \text{Pr (Data} \mid \tau, \theta)$$
  
= Pr (aligned sequence | tree, model of evolution)  
 $\tau', \theta' = \text{arg max } L(\tau, \theta)$ 

 Hence, what we usually call the likelihood of the tree is not the likelihood of the tree, but the probability of the data given a hypothesis (model of substitution with a set of parameters θ and the tree τ).

### Basic Substitution Model

- The models in the GTR family are distinguished by their degree of parameterization
  - I Nucleotide frequencies: nA = nC = nG = nT = 0.25 \(\delta\) nA \(\pm\) nC \(\pm\) nG \(\pm\) nT
  - models assuming = frequencies: JC69; K2P, K3P ...
  - models accomodating # frequencies: FB1, HKY85, TrN93, GTR ...

#### II. Substitution rates and types: transitions (ti) and transversions (tv)

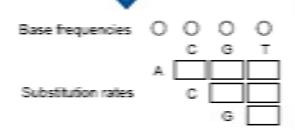


- There are 4 till and 8 tv substitution types; when ti/tv ± 0.5 there is a substitution rate bias in the data set.
  Generally till>> tv.
- The nucleotide substitution models in the GTR family are also distinguished by the number of rate parameters they use to accompdate the possible substitutions:

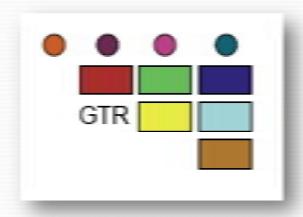
no, rat	res model(s)
1	JC69 (ti=tv)
2	K2P (tiatv)
3	TrN 6 K3P (2 ti, 1 tv)
-6	GTR (each its own rate)

#### Illustration of DNA substitution Model

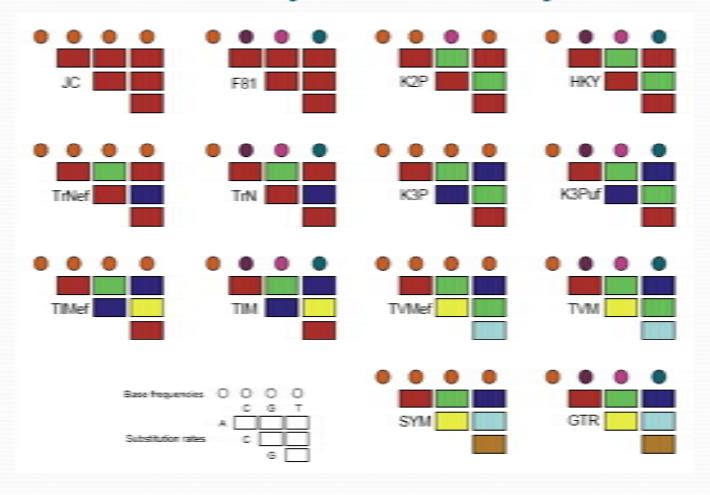
$$Q = \begin{pmatrix} -(x_1 + x_2 + x_3) & x_1 & x_2 & x_3 \\ \frac{\pi_1 x_1}{\pi_2} & -(\frac{\pi_1 x_1}{\pi_2} + x_4 + x_5) & x_4 & x_5 \\ \frac{\pi_1 x_2}{\pi_3} & \frac{\pi_2 x_4}{\pi_3} & -(\frac{\pi_1 x_2}{\pi_3} + \frac{\pi_2 x_4}{\pi_3} + x_6) & x_6 \\ \frac{\pi_1 x_3}{\pi_4} & \frac{\pi_2 x_5}{\pi_4} & \frac{\pi_3 x_6}{\pi_4} & -(\frac{\pi_1 x_3}{\pi_4} + \frac{\pi_2 x_5}{\pi_4} + \frac{\pi_3 x_6}{\pi_4}) \end{pmatrix}$$



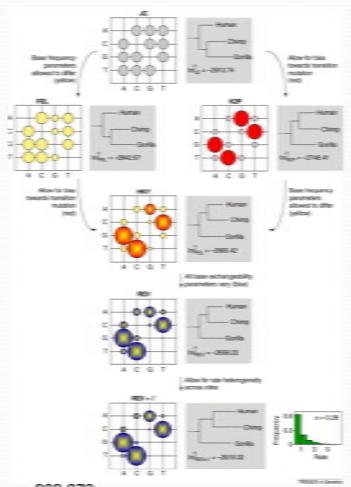
GTR (for four characters, as is often the case in phylogenetics) requires 6 substitution rate parameters (x1~x6), as well as 4 equilibrium base frequency parameters.



# Illustration of Models for DNA



## Relationships Among Some Standard Models Of Nucleotide Evolution



#### Models Used in PALM

- For DNA (56 models)
  - JC69, K80, F81, HKY, TrN, TrNef, K3P, K3Puf, TIM, TIMef, TVM, TVMef, SYM, GTR
  - +I, +G
- For Protein (112 models)
  - LG, DCMut, JTT, MtREV, MtMam, MtArt, Dayhoff, WAG, RtREV, CpREV, Blosum62, VT, HIVb, HIVw
  - +I, +G, +F

# Background for PALM

- Model fitting in phylogenetics has been suggested for many years, yet many authors still arbitrarily choose their models, often using the default models implemented in standard computer programs for phylogenetic estimation.
- Here, we want to show the way that a best-fit model can be readily identified. Consequently, given the relevance of models, model fitting should be routine in any phylogenetic analysis that uses models of evolution.

#### Motivation I

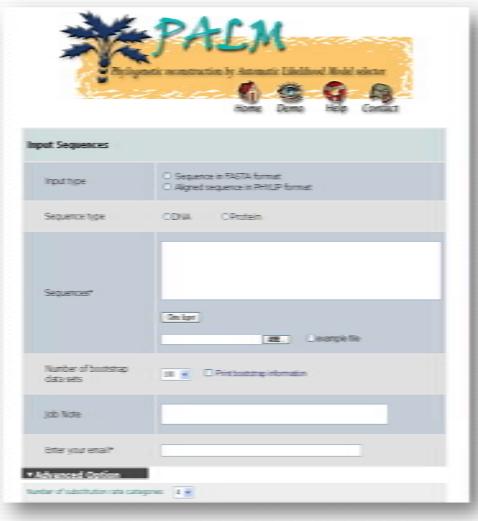
- Provide a seamless way to conduct the complex phylogenetic analysis for Biologists
- An integrated and user-optimized framework for biomolecular phylogenetic analysis
- PALM uses an open-source LAPP (Linux, Apache, PostgreSql, PHP) structure and
- PALM infers genetic distances and phylogenetic relationships using well-established algorithms (ClustalW, PhyML, ProtTest, Modeltest) in automatic pipeline.

#### Motivation II

- Model can be selected by following methods including hierarchical likelihood ratio tests (hLRTs), Akaike information criterion (AIC), and Bayesian information criterion (BIC)
- PALM can help user to construct the tree with bootstrap based on best substitution model chosen by maximum likelihood.
- Through a user-friendly web interface, users can sketch a tree effortlessly in multiple steps
- Furthermore, iterative tree construction can be performed by adding sequences to, or removing them from, a previously submitted job

# Component Programs of PALM

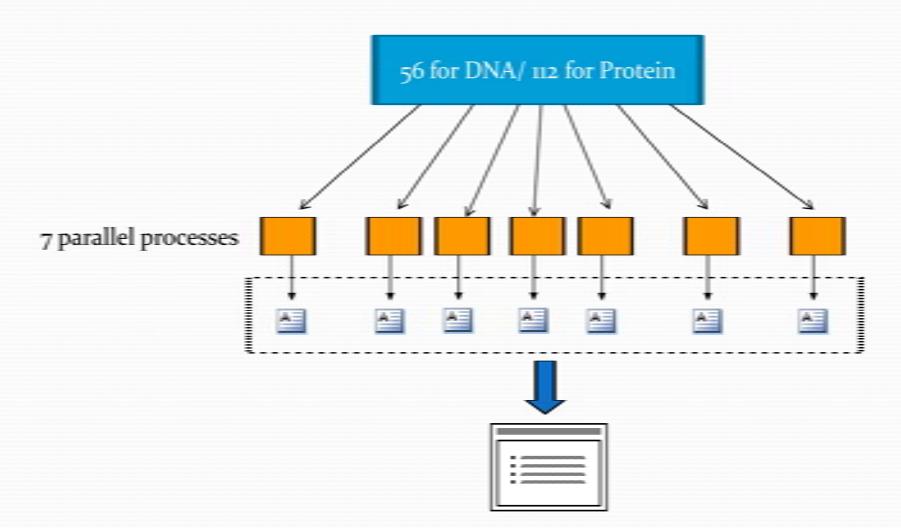
- PhyML 3.0
- ModelTest 3.7
- ProtTest 2.0
- ClustalW 2.0.8
- Seqret (EMBOSS)



#### Models Used in PALM

- For DNA (56 models)
  - JC69, K80, F81, HKY, TrN, TrNef, K3P, K3Puf, TIM, TIMef, TVM, TVMef, SYM, GTR
  - +I, +G
- For Protein (112 models), Time consuming
  - LG, DCMut, JTT, MtREV, MtMam, MtArt, Dayhoff, WAG, RtREV, CpREV, Blosum62, VT, HIVb, HIVw
  - +I, +G, +F

# Distribution Computing by PalmMonitor for Each Substitution Model



### Decreasing Time by PALMmonitor

According the algorithm used in PALM, models will take a lot of time to calculate the value of maximum likelihood.

JTT, MtREV	1h:22:2
J I I, IVILIXL V	111,22,2

MtMam, MtArt 1h:51:25

Dayhoff,WAG 1h:33:51

RtREV, CpREV 1h:33:50

Blosum62, VT 1h:15:58

HIVb, HIVw 1h:35:02

LG, DCMut 1h:38:36\_

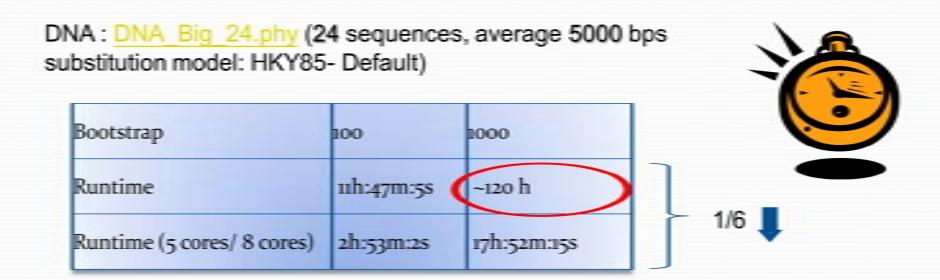


Over 10 Hours

All Models by PALMmonitor

1h:51:25

### Parallel Computing on Bootstrapping



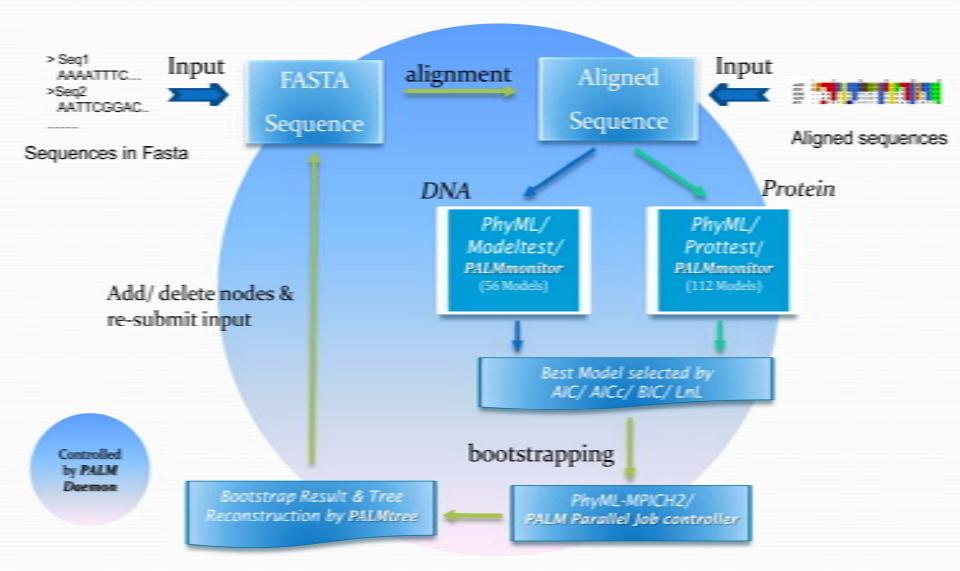
Protein: Pseq (20 sequences, average 820 a.a., substitution model: LG - Default)

Bootstrap	100	1000	
Runtime	17h:31m:33s	~175 h	_
Runtime (5 cores/ 8 cores)	5h:15m:19s	36h:55m:10s	1/6

# Input and Output of PALM

- Input format (Protein and DNA)
  - Fasta format
  - Phylip format: Aligned Sequences
  - User tree (if submitted and valid)
- Output
  - Tree topology by php and GD library
  - Tree file in Newick format
  - Aligned Sequence in phylip format
  - Best model selected by PALM

# Flowchart of PALM



# Result of PALM

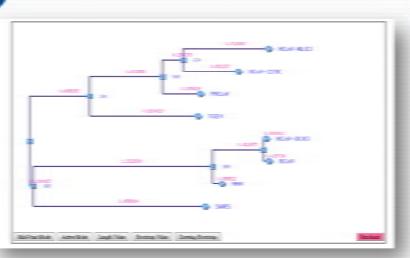




#### PALM Result

Job ID	2008082:060606361	Number of Substitution Rate Dategory	4
Jiob Mote	test for speed in postrio	Model Selection Ortanion	0.40
Sequence Type	Protein	Optimization of Tree Topology	Yes
Number of Bootstrap	100	Optimization of Branch Length	Tes
Starting Tree	890%		

В





Best Model Selected	QTT++G+F
Model Selection Criterion	Lit
AIC	2936.50
-InL	1134.25

D

Model	deltaAIC	AIC	HALT	AlCw
JITH-G-F	2.00	2336.50	1134.25	0.12
JITT+G+F	0.00	2334.50	-1134.25	0.33
WAG-H-G-F	2.78	2337.28	11134 64	80.0
N/AG-G-F	0.78	2335.78	-1134.64	0.23
NAGHAF	5.17	2339.67	-1136.83	0.03
WASHF	3.50	2338.00	1137.00	0.06

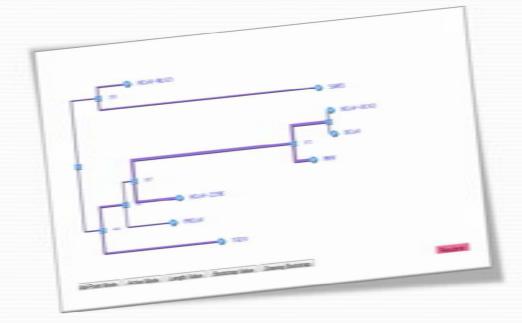
E

Original File	20080821060606361
Phylip File	20080821060606061 phy
Phylogenetic Tree (Newick)	tres20080821060606361.bt
Profilest Information	Proffest_20080821060606361.bt
Bootstrap Tree	20080821060606361 phymi boot trees to
Bootstrap Statistic data	20080821060606061 phymi boot stats.txt

The job is computed approximately in 47 minute(s).

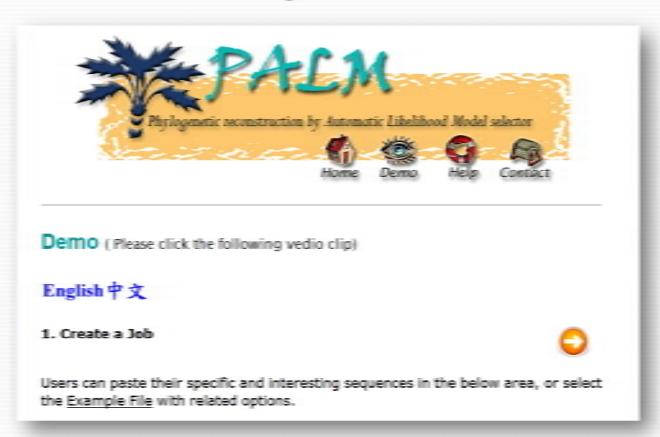
# Demonstration of PALM





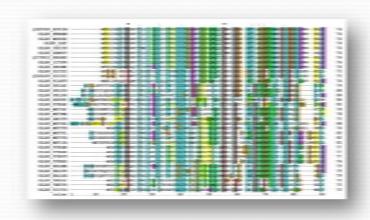
Access: http://palm.iis.sinica.edu.tw

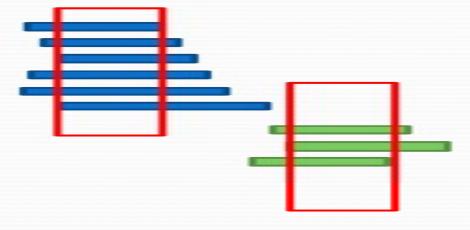
# Demo Flash of PALM



# Some Suggestions

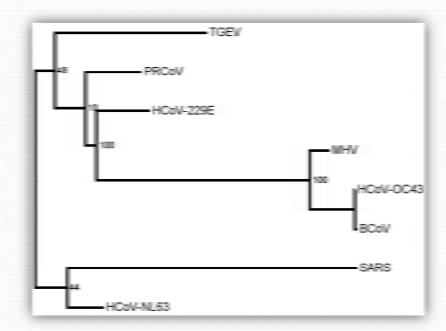
- Please be careful to choose the sequences
- Only well aligned sequences lead to meaningful results.
- RNA editing may introduce bias during analysis.
  - Avoid those regions that may have biases





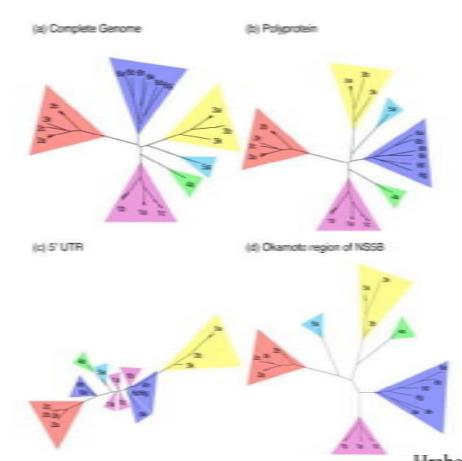
# Bootstrap (BS) Analysis

- Bootstrap analysis is the most often used method for statistical evaluation of phylogenies.
- In general:
  - BS >95%: Often close to 100% confidence in that branch
  - BS>75%: Often close to 95% confidence in that branch
  - BS<75%: Maybe a correct clade due to the original bias cannot be corrected by the re-sampling process.



#### Input Sequences Make the Tree Different

HIV

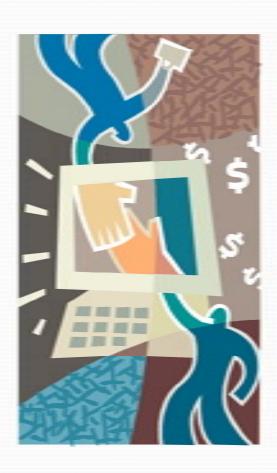


Hraber et al. Virology Journal 2006 3:103 doi:10.1186/1743-422X-3-103

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