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AN INTRODUCTION TO MOLECULAR PHYLOGENETIC ANALYSIS

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ABSTRACT

Phylogenetic analysis using molecular data such as DNA sequence for genes and amino acid sequence for proteins is very common not only in the field of evolutionary biology but also in the wide fields of molecular biology. The reason is that DNA sequencing became very popular and a huge amount of sequence data of genes and proteins are available in the public online database. Since many molecules (genes or proteins) which have various evolutionary rates are available, it is important to choose the suitable molecule for the phylogenetic analysis of a given lineage. For example, when the evolutionary rate of the gene (or protein) is too much higher for a given lineage, the substitution of nucleotide (or amino acid) is saturated. In this case, the accuracy of the phylogenetic analysis decreases. The methods for phylogenetic analysis are improving along with the evolution of computer science. Thus, there are many methods to infer phylogenetic tree, and many programs for each method are available. This mini review shows that general pattern of phylogenetic analysis, and explains some representative methods (Unweighted pair group method with arithmetic, Neighbor-joining method, Maximum parsimony method, maximum likelihood method, and Bayesian method). In the phylogenetic analysis, the most important feature is the interpretation of the phylogenetic tree. Therefore, several distinct points to evaluate a phylogenetic tree are also explained. These include, “validity of the tree shape”, “evolutionary distance”, and “validation of each internal branch”. Towards the end, the procedure of evaluating a phylogenetic tree with an example using MEGA 7 is presented.

Keywords: molecular evolution, phylogenetic analysis, phylogenetic tree.

Introduction

Phylogenetic analysis is a method to elucidate the evolutionary history and relationship among a group of organisms. Previously, phylogenetic analysis was based on morphological comparison among the fossils, but the information from fossils was limited. Now, molecular phylogenetic analysis using molecular data such as DNA or proteins become popular. There are several reasons (Nei and Kumar, 2000). These include, (1) popularity of DNA sequencing method, (2) establishment of methods for phylogenetic tree construction using gene or protein sequences, (3) The results of a phylogenetic analysis being treated in a quantitative pattern, (4) Availability of many programs for constructing phylogenetic tree. The knowledge from phylogenetic analysis contributes to basic biology (e.g. evolutionary history of species, the evolution of genes, and identification of sampled species) as well as applied biology (e.g. investigation of the route of the infection of pathogenic microorganisms). Phylogenetic trees are commonly constructed to figure out the evolutionary relationship among species.

Selection of the molecules (genes or proteins)

DNA sequences of genes, RNA sequences of functional RNA, or amino acid sequences of proteins are used for phylogenetic analysis. To choose the molecule for phylogenetic analysis, there are two focal points. First, the genes must be shared by all of the given species. Secondly, the genes have the proper evolutionary rates, because proteins have varied evolutionary rates (Miyata *et al.*, 1980). If a species has a distant relationship, the molecule which has low evolutionary rate should be chosen. This is because nucleotide or amino acid substitution of gene or proteins reaches to saturation between distant species when the evolutionary rate is high. Note that nucleotide sequence of a gene is easy to reach to saturation than an amino acid sequence of the coded protein. In this case, housekeeping genes which have low evolutionary rate are suitable. For example, 16SrRNA and *gyrB* for prokaryotes, 18SrRNA and Histone 3 for eukaryotes are available. If the species has a close relationship, the molecules which have high evolutionary rate should be chosen. This is because the accuracy reduces few substitution events when the evolutionary rate is low.

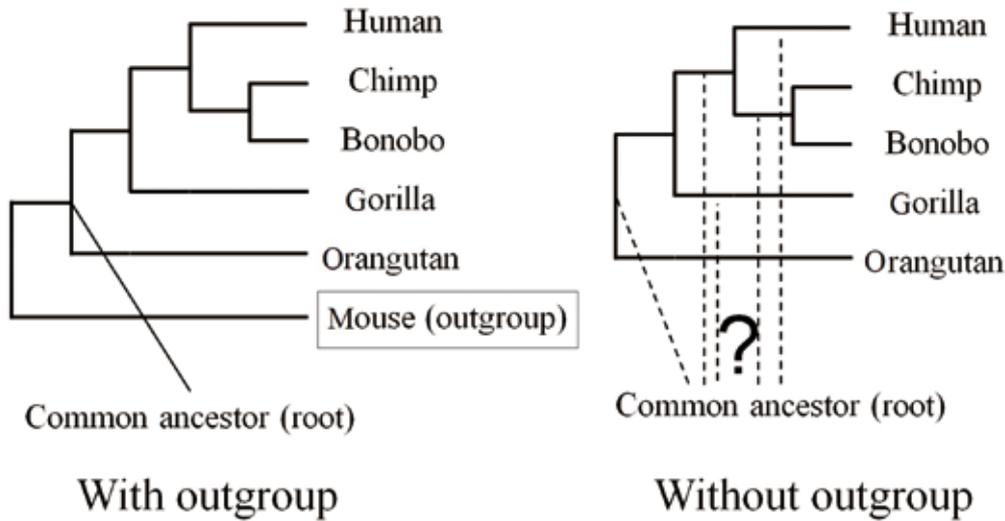


Fig.1. Phylogenetic trees with outgroup and without outgroup



Fig.2. An example of multiple alignment. Gaps are added to adjust sequences. In this example, there are 3 site matches before alignment. After multiple alignment, there are 14 site match.

introduce the elaborated evolutionary-models based on statistical method. Unfortunately, it is difficult to gain clear consensus which method is the best for inferring a phylogenetic tree. Therefore, researchers choose several methods to infer the phylogenetic tree, and compare the results. If the results are consistent, the phylogenetic tree is thought to be reliable. The software and representative methods are listed in Table 1 and Table 2, respectively.

UPGMA (Sokal and Michener, 1958) is the original method used for reconstructing phylogenetic trees using evolutionary distance matrix. Clustering is done by searching for the shortest

evolutionary distance in the distance matrix. The newly formed cluster replaces the OTUs (Operational Taxonomic Unit, the group of organisms currently being analyzed) it represents in the distance matrix, and distances between the newly formed cluster and each of the remaining OTUs are calculated. This process is repeated until all OTUs are clustered. The distance of the newly formed cluster is the average of the distances of the original OTUs. This process assumes that the evolutionary rate from the node of the two clustered OTUs to each of the two OTUs is identical. The whole process of clustering thus assumes that the evolutionary rate is the same in all branches. However, it is

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Table 1: List of programs for MSA, homology search, and phylogenetic analysis

Software	Category	Interface	OS	Web service	Remarks
BLAST	homology search	command-line	Win, Mac, Linux	available	standard program for homology search
ClustalW	MSA, phylogenetic tree	command-line	Win, Mac, Linux	available	integrated in MEGA, no maintenance
ClustalX	MSA, phylogenetic tree	graphical	Win, Mac, Linux	not available	no maintenance
Clustal Omega	MSA	command-line	Win, Mac, Linux	available	successor of ClustalW
MAFFT	MSA	command-line	Win, Mac, Linux	available	available for >2,000 sequences
MUSCLE	MSA	command-line	Win, Mac, Linux	available	integrated in MEGA, more accurate than ClustalW
PhyML	phylogenetic tree	command-line	Win, Mac, Linux	available	widely used
RAxML	phylogenetic tree	command-line	Win, Mac, Linux	available	possible to estimate the best substitution model
FastTree	phylogenetic tree	command-line	Win, Mac, Linux	not available	100–1,000 times faster than PhyML 3.0 or RAxML 7
MrBayes	phylogenetic tree	command-line	Win, Mac, Linux	not available	standard program for Bayesian method
PHYLIP	multipurpose	command-line	Win, Mac, Linux	not available	multifunctional
MEGA 7	multipurpose	graphical	Win, Mac, Linux	not available	friendly user interface, frequently updated
TOPALi v2	multipurpose	graphical	Win	not available	friendly user interface

Table 2: List of methods for inferring phylogenetic trees

Method	Group	Algorithm	Software
UPGMA	distance-matrix	Clustering for the shortest evolutionary distance	MEGA 7
Neighbor-joining	distance-matrix	Clustering for minimum total branch length	PHYLIP, Clustal X, MEGA 7
Maximum parsimony	character-based	Searching tree with minimum total number of character-state changes	PHYLIP, MEGA 7
Maximum likelihood	character-based	Searching tree with maximum likelihood	PHYLIP, PhyML, RAxML, FastTree, MEGA 7, TOPALi v2
Bayesian	character-based	Searching tree with maximum posterior probability	MrBayes, TOPALi v2

known that most evolutionary rate of molecules are not constant, thus UPGMA is not suitable in many cases. This is the demerit of UPGMA. MEGA 7 is available to infer phylogenetic tree by this method.

NJ method (Saitou and Nei, 1987) is a commonly used distance-based method for inferring phylogenetic trees, which overcomes the disadvantage of UPGMA. It requires an evolutionary distance matrix calculated from multiple sequence alignment but it does not require a molecular clock. The principle of NJ method is to find pairs of operational taxonomic units (OTUs) that minimize the total branch length at each stage of clustering of OTUs starting with a star-like tree. NJ method is, therefore, a special case of the star decomposition method. The merit of NJ method is fast. Therefore, it is practical to analyze a large dataset (hundreds or thousands of taxa, Tamura 2004; Niimura and Nei 2005). In case, if the taxa number is not large (<100), other methods which are not based on evolutionary distance supersede NJ method. This is because they offer superior accuracy and NJ method often assigns negative lengths to some of the branches. It is also known that the accuracy of the NJ method

is lower in case of short DNA or amino acid length (Page and Holmes 1998). PHYLIP (Felsenstein 1989), Clustalw, Clustal X and MEGA 7 are widely used for inferring phylogenetic tree by this method.

Maximum parsimony is the origin of character-based methods. It was developed by Henning (1966) using morphological data. Later, Maximum parsimony with an amino acid or nucleotide data was developed, respectively by Eck and Dayhoff (1966) as well as Fitch (1971). It finds the tree topology for a set of aligned sequences that is subject to the constraint of invoking the fewest possible evolutionary changes. The Maximum parsimony algorithm deduces for each site the minimum number of character changes required along its branches to explain the observed states at the OTUs. When some reasonable topologies have been obtained, the tree that requires the minimum number of changes is selected as the maximum parsimony tree. Maximum parsimony assumes that a common character is derived from a common ancestor and thus underestimates the real divergence between distantly related taxa. This is the disadvantage of the Maximum parsimony. PHYLIP and MEGA 7 is available to infer

phylogenetic tree by this method.

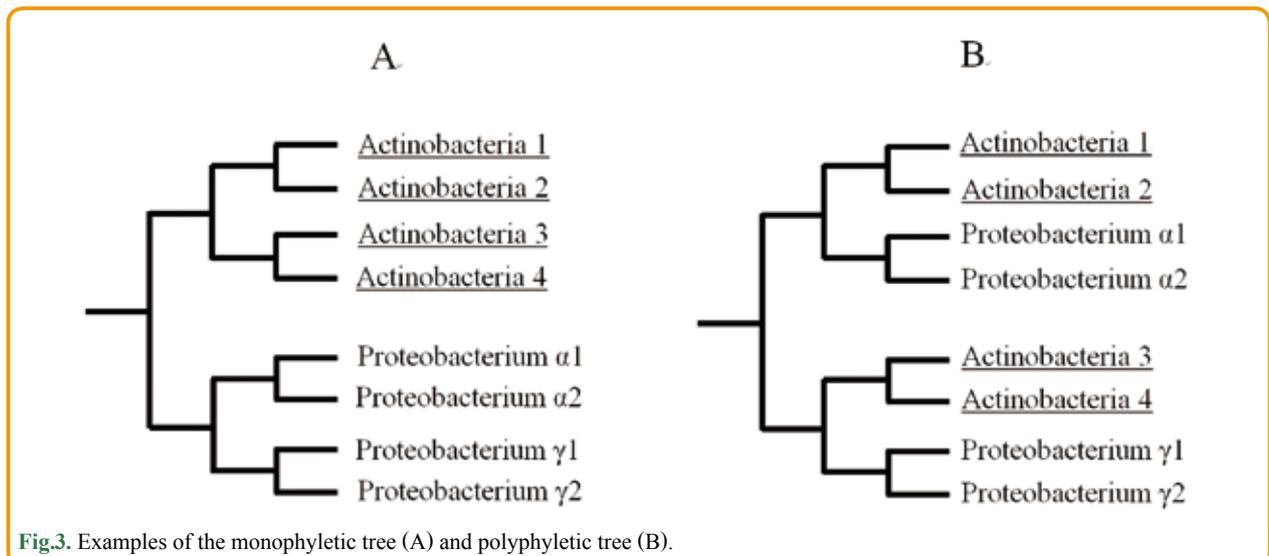
The maximum likelihood method is a statistical method (character based) for inferring phylogenetic trees (Felsenstein, 1981). It uses statistical techniques for inferring probability distributions to assign probabilities to particular possible phylogenetic trees. Therefore, the calculation time is longer than those of other methods. This method requires a substitution model to assess the probability of particular mutations. Thus, finding best substitution model have to be carried out in advance. PHYLIP and PhyML (Guindon *et al.*, 2010) are the most famous programs for maximum likelihood method. Nowadays, RAxML (Stamatakis *et al.*, 2005), MEGA 7, TOPALi V2 (Milne *et al.*, 2009) are widely used because it can find the best substitution model and use the model to infer the phylogenetic tree by maximum likelihood method. Long calculation time is the demerit of the maximum likelihood method. If the data is very large, FastTree, which infers approximately-maximum-likelihood phylogenetic trees very quickly, is useful (Price *et al.*, 2009).

Bayesian method is a character-state method for inferring phylogenetic tree which is based on posterior probabilities under the estimated best model. Bayesian method employs the concept of likelihood and searches for a set of plausible trees. Bayesian method requires the information of a prior distribution on the model parameters, such as substitution model parameters, branch lengths, and tree topology. Posterior probabilities are obtained by exploring tree space using a sampling technique, called Markov chain Monte Carlo (MCMC) algorithms. The Bayesian approach has become popular due to advances in computing speeds and is one of the most widely used methods now. MrBayes (Huelsenbeck *et al.*, 2001) is the most widely used program for inferring

phylogenetic tree by Bayes method. Due to its graphical user interface, TOPALi v2 has been popular as well.

Evaluation of phylogenetic tree

After the inference of a phylogenetic tree, the tree should be evaluated in some specific points. First is the validity of the tree shape. If the molecules used in the analysis are derived from the common ancestor by speciation, the phylogenetic tree may represent the species phylogeny (Fig. 3A). If two or more sequences of a species are located separately, the tree does not represent the genuine phylogeny of the species (Fig. 3B). Second is evolutionary distance. Branch length of the tree reflects the evolutionary distance of each branch. Evolutionary distance tentatively correlated with the evolutionary time. Therefore, the periods of evolutionary events such as speciation and gene duplication, and change of evolutionary rate can be estimated from the information in branch length (Fig. 4). Third is the validation of each internal branch. The bootstrap test is a commonly-used method for evaluation the reliability of specific clades in the tree. The procedure of the bootstrap test is as follows: First, an artificial alignment is obtained from the original alignment data by random choice of columns. Each column in the original alignment can be selected more than once until the same length as the original one has been constructed. Secondly, for each artificial alignment data, a tree is constructed, and the proportion of each internal branch to all the artificial trees is computed. If an internal branch has high proportion (bootstrap value), the internal branch is thought to be reliable. However, the bootstrap test is not statistical test for evaluation of each branch. Empirically, when the bootstrap value is 90 % or more, the internal branch thought to be reliable (Fig. 5).



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To infer phylogenetic tree of a gene, many programs for each method are presented in Tables 1 and 2. Researchers need to be cautious with using many programs for phylogenetic analysis which have not been updated. The process of inferring phylogenetic tree by maximum likelihood method using MEGA 7 is presented in Fig. 6, consisting of 9 components. Please see the details for these components, presented in page 45).

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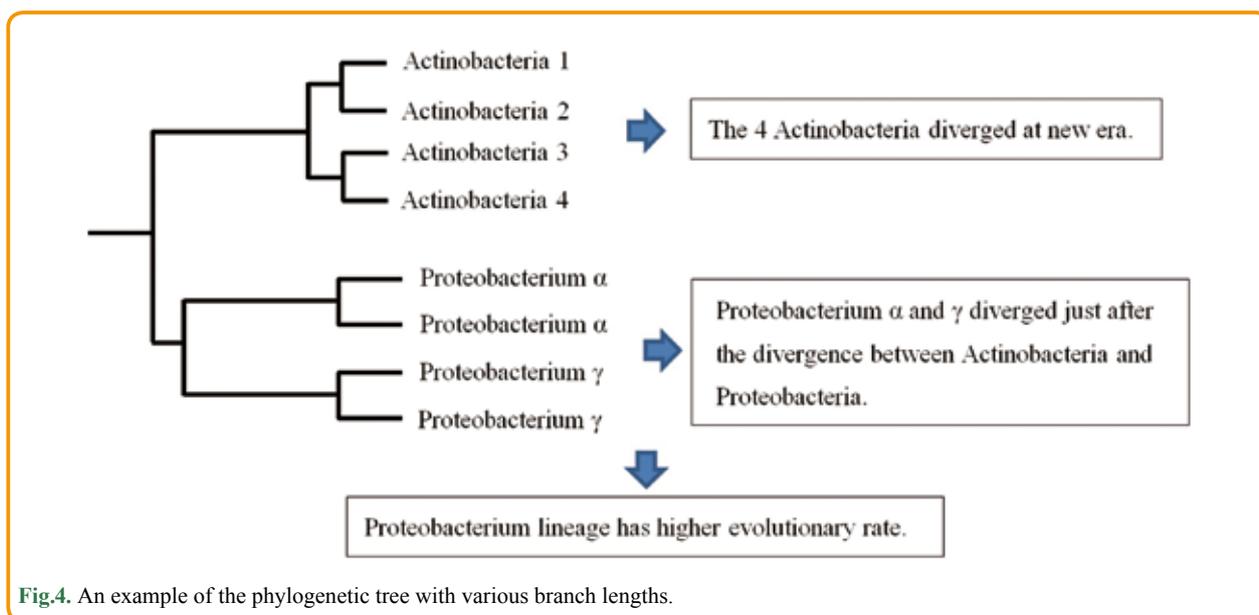


Fig.4. An example of the phylogenetic tree with various branch lengths.

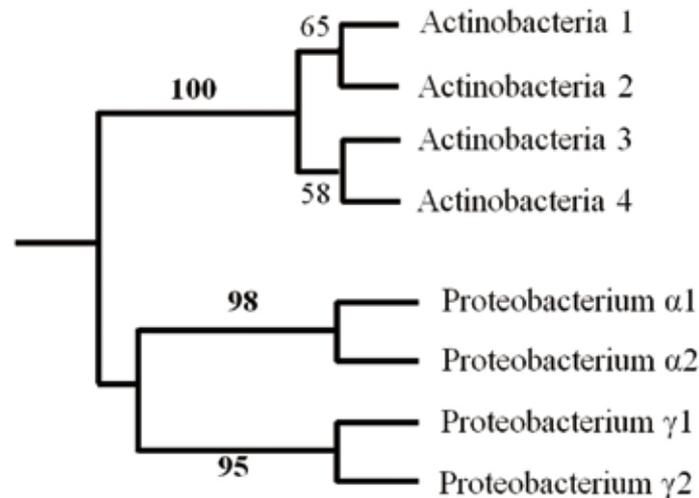


Fig.5. An example of the phylogenetic tree with bootstrap values. The internal branches with values in bold are more than 95%.

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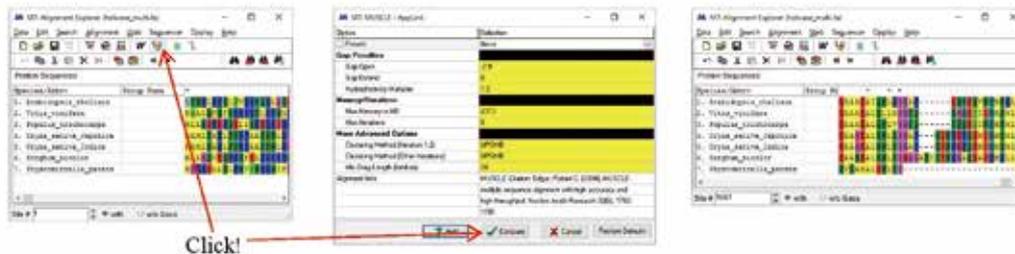
1. Prepare the sequence dataset in FASTA format
 (Example: sample_sequence.fa)

```
>Human_Triosephosphate_isomerase
APSRKFFVGGNWKMGKQSLGELIGTLNAAKVPADTEVVCAPPTAYIDFAROK
>Rabbit_Triosephosphate_isomerase
APSRKFFVGGNWKMGKQSLGELIGTLNAAKVPADTEVVCAPPTAYIDFAROK
>Yeast_Triosephosphate_isomerase
ARTFFVGGNFKLNGSKQSIKEIVERLNTASIPENVEVIFPPATYLDYSVSLVK
>E_coli_Triosephosphate_isomerase
MRHPLVGMWIKLNGSRHMVHVLVSNLRKELAGVAGCAVAIAPPENYIDWAKREA
```

2. Open the sequence file by MEGA.



3. Multiple Alignment



4. Export the alignment data as MEGA Format

5. Open the alignment data by MEGA



6. Find Best DNA/Protein Models (ML)

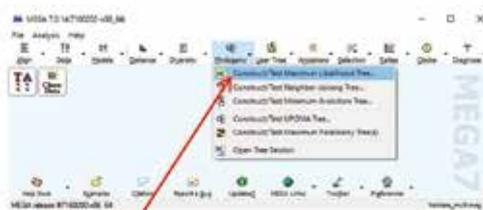


7. Result of the model inferring

Model	Parameters	BIC	ABCs	Inf	(+I)	(+G)	(A)	(R)	(N)
JTT+G	I2	14042.925	13961.280	-4968.617	ax	0.84	0.077	0.051	0.043
JTT+G+I	I3	14051.184	13962.739	-4968.742	ax	1.00	0.457	0.051	0.041
LG+G	I2	14055.924	13974.279	-4975.116	ax	0.80	0.079	0.056	0.042
LG+G+I	I3	14064.727	13976.283	-4975.114	0.01	0.83	0.079	0.056	0.042
JTT+I	I2	14065.716	13984.072	-4990.012	0.33	ax	0.077	0.051	0.043
LG+I	I2	14091.176	14009.525	-4992.736	0.33	ax	0.079	0.056	0.042

Best model

8. Set the inferred the parameters according to the inferred best model



Click!



Set Bootstrap test

Set model parameters

9. Export the tree file as the Newick Format

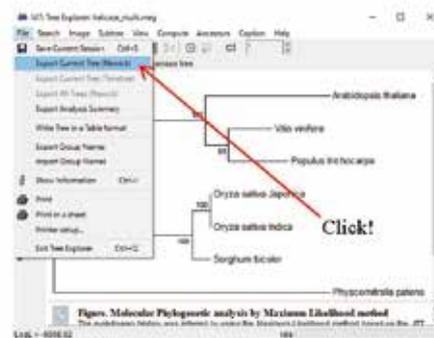
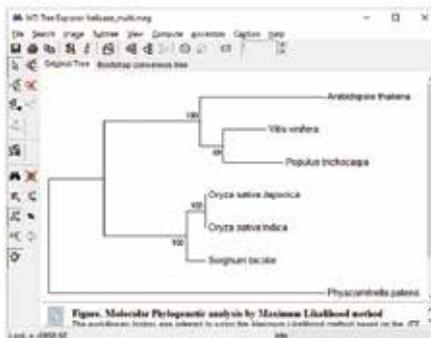


Fig.6. The process of an inferring phylogenetic tree by maximum likelihood method using MEGA 7. The steps 1 to 9 of this process are, presented in page 45.

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1. Prepare the sequence dataset in FASTA format.
The sequence data of orthologs were prepared in FASTA format. The extension of the file should be “fas”.
2. Open the sequence file by MEGA.
Click “Open A File/Session” and choose the sequence file, then click “Align” to open.
3. Multiple Alignment
Click “Align selected with MUSCLE” button, “Align Protein”, and “Compute”. The sequences are aligned by MUSCLE.
4. Export the alignment data as MEGA format.
Click “Data”, “Export”, and “MEGA format”. Then, name the file, and save. The extension of the file is “meg”. Close the MEGA window.
5. Open the alignment data by MEGA.
The multiple alignment file in MEGA format is opened.
6. Find Best DNA/Protein Models (ML).
Click “Model” and “Compute”. The best substitution model for the multiple alignment data is inferred by maximum likelihood method.
7. Result of the model inferring
The model on the top is the best substitution model for the alignment data. In this example, JTT model with gamma distribution is the best model.
8. Set the inferred the parameters according to the inferred best model
Click “Construct/Test Maximum Likelihood Tree. Set “Test of Phylogeny” as “Bootstrap method”, and “No of Bootstrap Replications” as 1000. Set “Model/Method” and “Rates among Sites” according to the result of the model inferring. In this case, they set as “Jones-Taylor-Thornton (JTT) model” and “Gamma Distributed (G)”, respectively. After setting, click “Compute”.
9. Export the tree file as the Newick Format
Click “Export Current Tree (Newick) to save the tree file in Newick format. If researchers want to save the edited tree, click “Save Current Session” to save the all information of the tree.