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# PERFORMANCE COMPARISON BETWEEN KIMURA 2-PARAMETERS AND JUKES-CANTOR MODEL IN CONSTRUCTING PHYLOGENETIC TREE OF NEIGHBOUR JOINING

Hendra Prasetya<sup>1</sup>, Asep Saefuddin<sup>2</sup>, Muladno<sup>3</sup>

<sup>1</sup>Student in Department of Statistics, Bogor Agricultural University

<sup>2</sup>Lecturer in Department of Statistics, Bogor Agricultural University

<sup>3</sup>Lecturer in Department of Production Science and Technology of Animal Feeds, Bogor Agricultural University

E-mail: <sup>2</sup>asaefuddin@gmail.com

#### Abstract

Bioinformatics as a recent improvement of knowledge has made an interest for scientist to collect and analyze data to provide the best estimate of the true phylogeny. The objective of this research is to construct and compare the phylogenetic tree of Neighbour Joining (NJ) based on different models (Kimura 2-Parameters and Jukes-Cantor) and to find out which model is more reliable on constructing NJ's tree. In order to build the tree, reliable set of data is conducted from D-loop mtDNA sequences that is available in Gen Bank. The nucleotide sequences come from Bison bison (American bison), Bos taurus (European cow such as Shorthorn), Bos indicus (zebu breeds), Bos grunniens mutus (one of subspecies of cow), and Capra hircus (species of goat). The reliability of each models was measured using the Felsentein's bootstrap method. The whole bootstrap process for each models was repeated 1.000, 5.000, and 10.000 times to detect its reliability. The performance was measured on the basis of the consistency of the topology relationship, the stability of nodes, the consistency of bootstrap confidence level  $(P_B)$ , standard error of distance, change of  $P_B$  from (1.000-5.000) to (5.000-1.000), computational time, and BIC score. NJ's phylogenetic tree with kimura 2-parameters and jukes cantor model have a good node stability and is also generally successful in representing topological relationships between taxa. The increasing of bootstrap replication number in common will increase the consistency of bootstrap confidence value . It means both models have a good reliability. But, when the number of sequences is large and the extent of sequence divergence is low, it is generally difficult to construct the tree by any models. In conclusion, Kimura 2-Parameters has a better performance than Jukes-Cantor.

Key words: phylogenetic tree, Neighbour Joining, Kimura 2-Parameters, Jukes-Cantor

# INTRODUCTION

Bioinformatics as a recent improvement of knowledge has made an interest for scientist to collect and analyze data to provide the best estimate of the true phylogeny. Phylogenetics construction methods attempt to find the evolutionary history of a given set of species (Elfaizi *et al.* 2004). A phylogenetic or evolutionary tree elucidates functional relationship within living cells. It is constructed by using all

kinds from molecular data in the form of individual protein or nucleic acid sequences.

Nowadays there are three major methods for performing a phylogenetic analysis: Distance-Based method (UPGMA, ME, and NJ), Maximum Parsimony, and Maximum Likelihood (Otu *et al.* 2003). If spesifically we would like to have the information about the evolutionary distance among sequences, a distance-based method should be used. A previous research had shown that NJ (Neighbour Joining) method is better than ME (Minimum Evolution) and UPGMA (Unweighted

Pair-Group Method using Arithmetic Average) (Putri 2010). The Neighbour Joining method is a greedy algorithm because it has high accuracy on measuring a distance between two mtDNA sequences. Then, NJ method itself can be used to construct evolutionary tree by some models, such as Kimura 2-Parameters and Jukes-Cantor. Each model has its own formulation to calculate the distance matrix, so the resulted phylogenetic tree will tend to have different performance. Therefore, one of the challenges is to choose a model of DNA substitution that excellently describes the data in hand by statistical approach. Generally speaking, the aim is to pick a model that adequately explains the data (in this case an alignment of DNA sequences).

With the increasing emphasis on tree construction, questions arose as to how confident one should be in a given phylogenetic tree and how support for phylogenetic tree should be measured. Felsenstein (1985, refers to Soltis & Soltis 2003) formally proposed bootstrapping as a method for obtaining confidence limits on phylogenies.

In this paper, we used a whole D-loop mtDNA sequences. Its variations have been widely applied in population genetics study of creatures such as animals due to the maternal inheritance and high substitutions of this organelle genome. At last, in order to compare the performance of NJ's tree for each model, D-loop mtDNA sequences of five different species were used to compare the performance. They were Bison bison, Bos taurus, Bos indicus, Bos grunniens mutus, and Capra hircus. The performance was measured using some aspects: the representing of topologies relationship, computational times, consistency, the node stability, and some criterias. Otherwise, the consistency was measured using bootstrap procedure.

The objectives of this research are:

- to construct and compare the phylogenetic tree of NJ based on different models (Kimura 2-Parameters and Jukes-Cantor),
- 2. to find out which model is more reliable on constructing NJ's tree in which case.

#### LITERATURE REVIEW

### Phylogenetic tree

Phylogenetics describes the relationship between genes, proteins, species. or phylogenics, the objects are being assumed to be evolutionary related. The evolutionary phylogenetic tree is used to show the evolutionary relationship among organisms. To build the correct evolutionary tree, we also need a correct and proper data. The correct and proper data could be (Li 2001): (1) taxa: the groups of organisms that we are interested to know the evolutionary relationship, (2) characters: a list of organism phenotype characteristics and some groups of organisms that have different phenotype characteristics. The components of the evolutionary tree are mentioned in Figure 1.

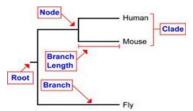


Figure 1 Phylogenetic Tree Components

There are numerous methods for constructing phylogenetic trees from molecular data (Nei *et al.* 2000). They can be classified into Distance methods, Parsimony methods, and Likelihood methods. The distance matrix are computed for all pairs of taxa, and a phylogenetic tree is constructed by considering the relationships among these distance values.

#### Mitochondrion DNA

Mitochondrion DNA (mtDNA) is the DNA constituting an organelle called mitochondria, structures within cells that convert the energy from food into a form which cells can use. The organelle is located in the cytoplasm of the cell. D-loop occurs in the main non-coding area of the mtDNA molecule, a segment called the control region. The region has proven to be useful for the study of the evolutionary history of vertebrates (Larizza A *et al.* 2002). In constructing phylogenetic tree, we use part of D-loop mtDNA sequences available in gene bank for all organisms.

# **Neighbour Joining Method**

This method (Saitou *et al.* 1987) is a simplified version of the minimum evolution (ME) method. Construction of a tree by the NJ method begins with a 'star' tree, which is produced under the assumption that there is no clustering of taxa. We then estimate the branch lengths of the 'star' tree and compute the sum of all branches ( ). This sum should be greater than the sum for the final NJ's tree ( ).

where is the total number of sequence used, is the branch length estimate between nodes and and

In practice, since we do not know which pairs of taxa are true neighbours, we consider all pairs of taxa as a potential pair of taxa are true. We then choose the taxa and that show the smallest value. This procedure is repeated until the final tree is produced.

where and

Once the smallest determined, we can create a new node ( ) that connects taxa and . The branch lengths ( ) is given by the following formula:

The next following step is to compute the distance between the new node ( ) and the remaining taxa.

A complete algorithm is given below:

1. We start off with a star tree (Figure 2).

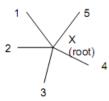


Figure 2 Example of Star Tree with Five Taxon

- 2. We define some kind of distance parameter between our nodes (1 through 5) and enter this parameter into a distance matrix (see following paragraphs). The columns and rows of the matrix represent nodes and the value i and j of the matrix represent the distance between node i and node j. Note that the matrix is symmetric and the diagonal is irrelevant. Therefore, only the top half (or lower half) are enough.
- 3. We pick the two nodes with the lowest value in the matrix defined in step 2 as neighbours. For example, assuming nodes 1 and 2 are the nearest, we define them as neighbours (Figure 3).

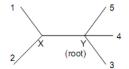


Figure 3 Example of Nodes Neighbours

- 4. The new node we have added as node X.
- 5. We now define the distance between node X and the rest of the nodes, and enter these distances into our distance matrix. We remove nodes 1 and 2 from our distance matrix.
- 6. We compute the branch lengths for the branches that have been joined (for figure 2(b), these are branches 1-X and 2-X).
- 7. We repeat the process from stage 2 once again we look for the 2 nearest nodes, and so on.

# **Kimura 2-Parameters Model**

Kimura 2-Parameters model corrects for multiple hits, taking into account transitional and transversional substitution rates, while assuming that the four nucleotide frequencies are the same and that rates of substitution do not vary among sites. The rate of transition is symbolized as  $\alpha$ , whereas the rate of transversion is as  $\beta$  (Kimura 1980). The Table 1 shows the composition of nucleotide substitution.

The matrix distance between two mtDNA sequences are computed based on the number of nucleotide substitutions (transition and transversion) per site (d), the number of transitional substitutions per site (s), and the number of transversional substitutions per site (v). We can also compute the value of transition/transversions ratio (R).

Table 1 The Nucleotide Substitution Composition of Kimura 2-Parameters

	A	T	C	G
A	-	β	β	α
T	β	-	α	β
C	β	α	-	β
G	α	β	β	-

Formulas for computing these quantities are as follows:

R = s/v,

where P and Q are the proportion of sites with transitional and transversional differences respectively, and

### **Jukes-Cantor Model**

In the Jukes-Cantor model, the rate of nucleotide substitution is the same for all pairs of four nucleotides A, T, C, and G. As is shown below, the multiple hit correction equation for this model produces a maximum likelihood estimate of the number of nucleotide substitutions between two sequences. It assumes an equality of substitution rates among sites, equal nucleotide frequencies, and it does not correct for higher rate of transitional substitutions as compared to transversional substitutions. The rate of transition is symbolized as  $\alpha$  (Jukes *et al.* 1969). The Table 2 shows the composition of nucleotide substitution. Formulas for computing the distance between two mtDNA sequences are:

where p is the proportion of sites with different nucleotides.

#### **Bootstrap**

One of the most commonly used tests of the reliability of an inferred tree is Felsentein's bootstrap test (refers to Soltis & Soltis 2003). A bootstrap data matrix  $x^*$  is formed by randomly selecting n columns from the original matrix x. Then the original tree-building algorithm is applied to  $x^*$ , giving a bootstrap tree as:

Table 2 The Nucleotide Substitution Composition of Jukes-Cantor

	A	T	C	G
A	-	α	α	α
T	α	-	α	α
C	α	α	-	α
G	α	α	α	-

Then, the proportions of bootstrap trees 'agreeing' with the original tree are calculated. These proportions are the bootstrap confidence values  $(P_B)$ . When the bootstrap resampled data set is obtained, an estimate of distance is computed for each sequence. This procedure is repeated B times.

One assumption often made for the bootstrap is that all sites evolve independently. This assumption of course does not hold in the present case. However, if the number of sites examined is large (n >100) as in the present case, the effect of violation of the assumption is not important because most sites with different evolutionary rates will be represented in each bootstrap sample.

The result of bootstrap method gives information about the number of nodes formed from *B* replication of bootstrap. Boostrapping measures how consistently the data support given taxon bipartitions (Hedges 1992). This is not a test of how accurate your tree is; it only gives information about the stability of the tree topology (the branching order), and it helps assess whether the sequence data is adequate to validate the topology (Berry *et al.* 1996).

High bootstrap values mean uniform supportif the bootstrap value for a certain clade is close to 100%, nearly all of the characters informative for this group agree that it is a group (Berry *et al.* 1996). A node is stable if it has minimally a ½ ofsample size conducted. This bootstrap method measure the node stability from dendogram (Soltis 2003).

### **METHODOLOGY**

#### **Data Sources**

For this research, the dataset of D-loop mtDNA sequences was obtained from Gen Bank (www.ncbi.nlm.nih.gov) for free. The data was accessed on March, 20<sup>th</sup> 2011. The nucleotide sequences come from some organisms as taxon

Bison bison is well known as American bison. On the other hand, Bos grunniens mutus is one of subspecies of cow and Capra hircus is a species of goat. While Bos taurus is European cow such as Shorthorn and Jersey, Bos indicus is a zebu breeds such as Brahman.

#### Methods

The procedures to conduct this research are:

- 1. Access the complete D-loop mtDNA sequence which consists of five spesies, from Gen Bank. Then, copy and paste it into notepad, and save it in format .txt. The available data sets were:
  - a. Bison bison [3]
  - b. Bos taurus [8]
  - c. Bos indicus [16]
  - d. Bos grunniens mutus [4]
  - e. Capra hircus [7]

The number in parenthesis shows the amount of sequences. List of organisms, sequence length (base), and accession number will be displayed in Table 3.

- 2. Build the cases by making some groups of taxon which are:
  - a. Group A consists of: Bison bison [3], Bos taurus [8], Bos indicus [16], Bos grunniens mutus [4], Capra hircus [7].
  - b. Group B consists of: Bison bison [3], Bos taurus [3], Bos indicus [3], Bos grunniens mutus [3], Capra hircus [3].
  - c. Group C consists of: Bison bison [3], Bos taurus [1], Bos indicus [1], Bos grunniens mutus [1], Capra hircus [1].
  - d. Group D consists of: Bison bison [1], Bos taurus [8], Bos indicus [1], Bos grunniens mutus [1], Capra hircus [1].
  - e. Group E consists of: Bison bison [1], Bos taurus [1], Bos indicus[16], Bos grunniens mutus [1], Capra hircus [1].
  - f. Group F consists of: Bison bison [1], Bos taurus [1], Bos indicus [1], Bos grunniens mutus [4], Capra hircus [1].
  - g. Group G consists of: Bison bison [1], Bos taurus [1], Bos indicus [1], Bos grunniens mutus [1], Capra hircus [7].

Numbers in the brackets show the amount of sequences that was used to build the cases. The sample of species used in a group was selected randomly from available sequences.

3. Convert the .txt file of each taxon group into format fasta by using ClustalX2 software.

4. Align all data sets by using MEGA 5 software. It is necessary to make the numbers of nucleotide of the sequences compared to be the same. The total number of the D-loop mtDNA sequence here is around 1.223 base-pairs length (before the gaps edited). Both insertions and deletions introduce gaps in the DNA sequence alignment due to the alignment procedure, so we need to delete all gaps in the data sets. The total length of the D-loop mtDNA sequence here already been reduced to 395,46 base-pairs length.

Table 3 List of Organisms, Accession Number and Sequence Length of D-loop mtDNA

Accession	Organism Name	Sequence
Number	(number)	Length (base)
DQ452030.1	Bison bison(1)	408
DQ452026.1	Bisonbison(2)	415
DQ452027.1	Bisonbison(3)	411
FJ548840.1	Bos grunniens mutus (1)	893
FJ548841.1	Bos grunniens mutus (2)	894
FJ548842.1	Bos grunniens mutus (3)	892
FJ548843.1	Bos grunniens mutus (4)	892
EU233343.1	Bos indicus (1)	455
EU233344.1	Bos indicus (2)	455
EU233345.1	Bos indicus (3)	455
EU233346.1	Bos indicus (4)	455
EU233347.1	Bos indicus (5)	455
EU233348.1	Bos indicus (6)	455
EU233349.1	Bos indicus (7)	455
EU233350.1	Bos indicus (8)	455
EU233351.1	Bos indicus (9)	455
EU233352.1	Bos indicus (10)	455
EU233353.1	Bos indicus (11)	455
EU233354.1	Bos indicus (12)	455
EU233355.1	Bos indicus (13)	455
EU233356.1	Bos indicus (14)	455
EU233357.1	Bos indicus (15)	455
EU233358.1	Bos indicus (16)	455
HM448437.1	Bos taurus (1)	240
HM448434.1	Bos taurus (2)	240
HM448433.1	Bos taurus (3)	240
HM448435.1	Bos taurus (4)	240
HM448438.1	Bos taurus (5)	240
HM448436.1	Bos taurus (6)	240
HM448439.1	Bos taurus (7)	240
HM448440.1	Bos taurus (8)	240
DQ121577.1	Capra hircus (1)	1212
DQ121578.1	Capra hircus (2)	1212
DQ121579.1	Capra hircus (3)	1212
DQ121580.1	Capra hircus (4)	1212
DQ121581.1	Capra hircus (5)	1212
DQ121582.1	Capra hircus (6)	1212
DQ121583.1	Capra hircus (7)	1212

- 5. Do the molecular data exploration, such as: nucleotide composition, the transition/ transversion rate ratios, nucleotide pair frequency, and the overall transition/ transversion bias (R). The aim is to know the characteristics of data.
- Construct the original phylogenetic tree of NJ with Kimura 2-Parameters and Jukes-Cantor model. The mean and its standard errors of estimated distance for all groups were also counted.
- 7. Then, compare the perfomance of each model by checking the reliability of each model using the bootstrap procedure with 1.000, 5.000, and 10.000 repeated times. In addition, we also compute some values such as missedclassification to see the consistency of the topology relationship, proportion of stable nodes (%), consistency of bootstrap confident value ( $P_B$ ), change of  $P_B$  from (1.000-5.000) to (5.000-1.000), computational time, and BIC score to see the performance each method.

Note that to conduct the alignment, tree construction, and analysis (point 4-7), we use the open-sourced software, MEGA 5.

#### RESULT AND DISCUSSION

#### **Molecular Data Exploration**

A sequnces of mtDNA for each species in this research have a different sequence lengths. The length of sequence points out the number of nucleotide for a particular sequence. In this case, organism with the longest length is *Capra hircus* number 1-7 (1.212 nucleotides). Otherwise, organism with the shortest length is *Bos taurus* number 1-8 (240 nucleotides).

The average of sequence length of each group after alignment and gap deletion could be taken a look in Tabel 5(a) and 5(b). Total nucleotides in Group A is as much as 396 with a focus of analysis is the topological relationships of all species. Group B, C, E, F, and G, respectively, have the number of nucleotides of (423), (371), (261), (423), (540), and (748). Each group is a case that has been built to see the topology or taxa relationship: all species (A), captured three individuals (B), the species of *Bison bison* (C), the species of *Bos taurus* (D), the species of *Bos indicus* (E), the species of *Bos grunniens mutus* (F), and the species of *Capra hircus* (G).

The proportion of nucleotide is a relative frequency of four nucleotides (T, C, A, G) which can be calculated for one or all of the chain in percentage unit. Overall, the proportion of the four nucleotides of each organism is not much different. To the average of nucleotide number from the mtDNA chains within each group can be seen in Table 4. The proportion value of nucleotides for each group shows the same composition where the

highest proportion is in the nucleotide A. Then, it is followed by nucleotide T and C. The lowest proportion is owned by nucleotide G.

Table 4 The Average of Nucleotide Composition

Cassa	Nucleotide Composition (%)			
Group	T	С	A	G
A	29,66	24,28	31,64	14,42
В	28,95	25,05	32,00	13,99
C	28,89	24,82	32,23	14,06
D	29,06	24,90	31,21	14,83
E	30,36	23,41	31,64	14,59
F	28,86	25,06	32,41	13,66
G	28,83	25,62	31,63	13,91

The frequency of nucleotide pairs describes the number of nucleotides which are identical and have the substitution of a comparison chain. In this analysis there are four indicators which are identical pairs (ii), transitional pairs (si), transversional pairs (sv), and the ratio of transition to transversion (R).

This analysis gives a result that the propotion value ii to nucleotide pairs is very high, exactly always more than 84% for all groups. Group with the highest ii value is Group C (95,70%), while Group E is a group with the lowest value (84,53%). It indicates that all D-loop mtDNA sequences havea good similarity level. On the cotrary, the proportion value of si and sv to total nucleotide pairs for each group is less than 10% for si and 6% for sv. The highest and lowest percentage of si is respectly owned by Group C (9,99%) and E (3,08%). On the other hand, the highest and lowest percentage of sv is respectly owned by Group B (5,92%) and E (1,18%).

In common the si value is always higher than the sv value. The si value represents the average of transition appears, while the sv value represents the avarage of tranversion appears in the sequences compared. A rasio from transition to tranversion is given as the R value. The R value for Group A, B, D, E, F, and G successively is as many as (1,68), (1,58), (1,85), (3,19), (2,66), (2,08), and (1,82). In other word, it can be stated that the tranversion happens in Group A, B, C, D, E, F, and G is (0,59), (0,63), (0,54), (0,31), (0,38), (0,48), and (0,55) times more of the transition frequency. More complete data has been performed in Table 5.

# **Distance Matrix**

In Table 6, we can see the overall mean of estimated distance for all groups. The standard error of both Kimura 2-Parameters model and Jukes-Cantor are relatively small and almost same for each group. Efron B *et al.* (1996) mentioned that the S.E of 0,052 in their research precisely could be stated as a small value. The standard error

is computed using bootstrap procedure with 1.000 repeated times or replications.

Table 5 The Proportion of Nucleotides Pairs

Group	% ii	R	% si	% sv
A	88,76	1,68	7,08	4,30
В	85,01	1,58	9,23	5,92
C	84,53	1,85	9,99	5,40
D	90,99	3,19	6,91	2,30
E	95,70	2,66	3,08	1,18
F	87,94	2,08	8,16	3,90
G	90,71	1,82	6,02	3,34
avg	89,09	2,13	7,21	3,76

Table 6 Overall Mean and Standard Error for Each Group

Group	Mean		S.E	
Group	K 2-P	J-K	K 2-P	J-K
A	0,121	0,118	0,014	0,014
В	0,140	0,136	0,017	0,016
C	0,128	0,125	0,016	0,015
D	0,088	0,085	0,012	0,011
E	0,056	0,054	0,007	0,007
F	0,136	0,132	0,018	0,016
G	0,137	0,134	0,017	0,017

This result shows that the two models are good enough to be used in constructing the phylogenetic tree. However, Kimura 2-Parameters model always has higher standard error than Jukes-Cantor for all groups. For more detail information of distance matrix for both models.

# Performance of NJ's Phylogenetic Tree with Kimura 2-Parameters Model

NJ's phylogenetic tree with Kimura 2-Parameters model is generally successful in representing topological relationships between taxa. They are only Group A, B, C, and D which have a missedclassification in the original tree. However, the missedclassification rate are really small {2,63% (A), 6,67% (B), 14,29% (C), 8,33% (D)}. For those four groups, the taxa of *Bison bison* 2 is classified wrongly. Based on the taxonomy knowledge, it should be in a cluster of *Bison bison*. In the phylogenetic tree, it shows an information that *Bison bison* 2 is always closer to group of *Bos taurus*.

In addition, NJ's tree with this model has a consistent topological relationship among taxa. It is indicated with a clade position which is identic in phylogenetic tree in the bootstrap phylogenetic tree of 1.000, 5.000, and 10.000 replications. There are five groups from seven groups that have a stable phylogenetic tree in describing the topological relationships for all taxa. They are Group B, C, D, E, and F. Conversely, Group A and G show

varying results (inconsistent) or there are topologies changing the sequences.

In Group A some of consistent topological relationships are only clade (Bison bison 1-Bison bison 3); taxon (Bos taurus 3-(Bos taurus 6-(Bos taurus 1-(Bison bison 2-(Bos taurus 7-(Bos taurus 4-(Bos taurus 5))))); taxon Bos indicus 3-Bos indicus 7-Bos indicus 1-Bos indicus 2; taxon (((Bos indicus 9-Bos indicus 11)-Bos indicus 9)-Bos indicus 9); and taxon (Bos grunniens mutus 2-(Bos grunniens mutus 3-(Bos grunniens mutus 4))). In Group G some consistent topological relationship is only valid in describing the taxon (((Bison bison 2-Bos taurus 1)-Bos indicus 14)-Bos grunniens mutus 4).

This NJ's tree has a good node stability. A stable node has a bootstrap confidence value ( at least 0.5 or 50% (Lesvian 2010). From the seven groups have been built as the case, only one group that has a proportion of low nodes stability, namely Group E (Figure 4) as many as 35,29% for 1.000 replications of bootstrap and 29,41% for the replication of 5.000 and 10.000. While the six other groups have a proportion greater than or equal to 50%. This can happen because in general the evolutionary distance in Group E, especially between organisms *Bos indicus*, are very small and close to 0.

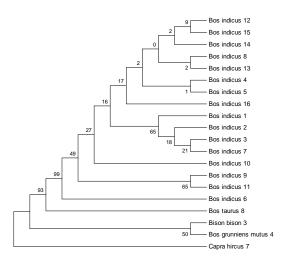


Figure 4 Phylogenetic Tree with Kimura 2-Parameters Model for Group E

The bootstrap confidence value ( for Kimura 2-Parameters model is not always stable or always experience a change for every increase of bootstrap replications. Sometimes it went up and down. In addition, a changes in the consistency of bootstrap confidence value ( from (1.000-5.000) to (5.000-10.000) also decreases, but only happened in Group B (from 91,67% to 66,67%), C (from 75% to 50%), and G (from 62,5% to 12,5%).

Nevertheless, the consistency of bootstrap confidence value ( , both on changes in the

bootstrap replications of 1.000-5.000 and 5.000-1.000 show the proportion of consistency is more than 50%. Moreover, the percentage of consistency change for bootstrap confidence value ( moves up when the repeated times raises from 1.000-5.000 to 5.000-10.000. It means that when the variation among the used sequence is high, the increase of bootstrap repeated times will increase the percentage of consistency change for bootstrap confidence value ( . Therefore, the reability of NJ's tree with Kimura 2-Parameters model averagely is fine.

# Performance of NJ's Phylogenetic Tree with Jukes-Cantor Model

As with Kimura 2-Parameters, NJ's phylogenetic tree with Jukes-Cantor model is also generally successful in representing topological relationships between taxa. They are only Group A, B, C, and D which have a missedclassification in the original tree. However, the missed classification rate are really small {2,63% (A), 6,67% (B), 14,29% (C), 8,33% (D)}. For those four groups, the taxa of Bison bison 2 is classified wrongly. Based on the taxonomy knowledge, it should be in a cluster of Bison bison. In the phylogenetic tree, it shows an information that Bison bison 2 is always closer to group of Bos taurus.

NJ's phylogenetic tree with Jukes-Cantor model has a high nodes stability too because the value of bootstrap confidence value ( is more than 50% in seven groups, namely A, B, C, D, F, and G. Only Group E (same with Figure 2) has a lower proportion of stable nodes, that is equal to 35,29% for 1.000 times of bootstrap replication and 29,41% for 5.000 and 10.000 replication. In general it is due to the evolutionary distances that develops in Group E, in particular among organisms *Bos indicus*, are very small and close to 0

In addition, NJ's tree with Jukes-Cantor model is also generally successful in representing topological relationships between taxa. A consistent topological relationship among taxa is indicated with a clade position which is identic in phylogenetic tree in the bootstrap phylogenetic tree of 1.000, 5.000, and 10.000 replications. There are only three from seven groups that have a stable phylogenetic tree in describing the topological relationships for all taxa. They are Group B, C, and F. Conversely, Group A, D, E, and G show varying results (inconsistent) or there are topologies changing the sequences.

In Group A some of consistent topological relationships are only clade (*Bison bison 1-Bison bion 3*); taxon (*Bos taurus 3-(Bos taurus 6-(Bos taurus 1-(Bison bison 2-(Bos taurus 7-(Bos taurus 4-(Bos taurus 5))))*); taxon *Bos indicus 3-Bos indicus 7-Bos indicus 1-Bos indicus 2*; taxon (((*Bos indicus 9-Bos indicus 11)-Bos indicus 9)-Bos indicus 9)-*

indicus 9); and taxon (Bos grunniens mutus 2-(Bos grunniens mutus 3-(Bos grunniens mutus 4))).

In Group D the inconsistent topology relationship is only valid in describing the taxon Bison bison 2, Bos taurus 7, and Bos indicus 1. On the other hand, in Group E the consistent topology relationship is the relationship between the taxon (Capra hircus 7-((Bos grunniens mutus 4-Bison bison 3)-(Bos taurus 8-(Bos indicus 6-((Bos indicus 11-Bos indicus 9)-Bos indicus 10)))). In Group G the consistent topology relationship just happens in describing the taxon (((Bison bison 2-Bos taurus 1)-Bos indicus 14)-Bos grunniens mutus 4).

The bootstrap confidence value ( of Jukes-Cantor model is slightly different with Kimura 2-Parameters model. In this model, not all groups have an unstablevalue of ( . Group E was the only group that has a stable value of ( or 100%. It occurs in the increase of bootstrap replications from 5.000 to 10.000 times. Therefore, on an increase of bootstrap replications from 5.000 to 10.000 times, the phylogenetic tree of Group E actually is unique due to it's low proportion of nodes stability, but the value of is extremely stable (100%).

The consistency of bootstrap confidence value in the 1.000-5.000 and 5.000-1.000 bootstrap replications change for the model shows a consistency proportion more than 50%. In addition, changes in consistency of bootstrap confidence in general also experiences an increase when the repeated times raises from 1.000-5.000 to 5.000-10.000. A decrease in consistency changes of bootstrap confidence value ( from (1.000-5.000) to (5.000-10.000) happens in Group B (from 83.33% to 75%) and G (from 50% to 75%). It means that when the variation among the used sequence is high, the increase of bootstrap repeated times will be increasing the percentage of consistency change for bootstrap confidence value . Therefore, the reability of NJ's tree with Jukes-Cantor model averagelly is fine.

# Performance Comparison Both Models in Constructing NJ's Tree

Kimura 2-Parameters model has longer computational time if compared with Jukes-Cantor. It is caused by the distance calculation between two mtDNA sequences in Kimura 2-Parameters which involve even more computation steps campared to Jukes-Cantor. Formulation to compute the distance of Kimura 2-Parameters is

{
with and , where P
and Q are the frequencies of sites with transitional
and transversional differences respectively, while
Jukes-Cantor has a rather simpler formulation
{
 }.

NJ's phylogenetic trees with Kimura 2-Parameters and Jukes-Cantor model are also successful in representing topological relationships between taxa. For both models, there are only Group A, B, C, and D which have a missedclassification in the original tree. However, the missed classification rate are really small (Table 7). For those four groups, the taxa of *Bison bison* 2 is classified wrongly. Based on the taxonomy knowledge, it should be in a cluster of Bison bison. In the phylogenetic tree, it shows an information that Bison bison 2 is always closer to group of Bos taurus. The distance between Bison bison 2 and Bos taurus is so close and near to 0. For example is in the case of Group B where the distances between Bison bison 2 with Bos taurus 4, 6, and 7 are (0,004), (0,004), (0,009) for both models. They are relatively small if we compare to other distances. This taxa from its cluster need to be learned more by biologist.

Table 7 Missedclassification Between Taxa in NJ's Tree for Both Models

	Missedclassification				
Group	Kimura	Kimura 2-Parameters		Jukes-Cantor	
%		Taxa	%	Taxa	
A	2,63	Bison bison 2	2,63	Bison bison 2	
В	6,67	Bison bison 2	6,67	Bison bison 2	
C	14,29	Bison bison 2	14,29	Bison bison 2	
D	8,33	Bison bison 2	8,33	Bison bison 2	
E	0	No	0	No	
F	0	No	0	No	
G	0	No	0	No	

The result shows the consistence comparison among the two models, Kimura 2-Paramaters and Jukes-Cantor, through the changing of repeated times from 1.000 to 5.000 and from 5.000 to 10.000 that has been applied to all built cases. Kimura 2-Parameters has more consistence value compared to Jukes-Cantor for almost every group eventhough actually sometimes it went up and went down for a particular group or in unstable condition. In overall replication change from 1.000 5.000 Kimura 2-Paramaters, bootstrap confidence value ( is above 50%. While for Jukes-Cantor, it is below 50%. When the replication change was added up into 5.000-10.000. the value tended to increase for both models. The NJ phylogenetic tree in the repeated times of 5.000-10.000 shows higher consistency than in the repeated times of 1.000-5.000. So, generally it can be concluded that Kimura 2-Parameters performs a better consistency.

Then, NJ's phylogenetic tree with Kimura 2-Parameters and the Jukes-Cantor model have a good nodes stability. Both of them have the bootstrap confidence value ( of at least 0,5 or

50% for the six groups. A comparison of stable nodes percentage for each group has been displayed in Figure 5. There is only one group that has a low proportion of stable nodes and it is Group E. It has a proportion 35,29% (for 1.000 times of bootstrap replication) and 29,41% (for 5.000 and 10.000 times of bootstrap replication). This is caused by the evolutionary distances that are developed in Group E, both for Kimura 2-Parameters or Jukes-Cantor, are small and close to 0, especially in a case ofdistances among *Bos indicus*. If we compare with another groups (Group A, B, C, D, F, dan G), Group E is involved in a unique case.

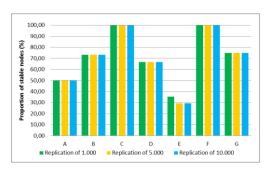


Figure 5 A Comparison of Stable Nodes
Percentage for Each Group

Both models failed in reconstructing a reliable phylogenetic tree for Group A and for Kimura 2-Parameters. Kimura 2-Parameters shows slightly different topologies relationships with Jukes-Cantor for Group D and E whereas Kimura 2-Parameters model could give the constant topologies relationship, while Jukes-Cantor give the varied tolopogies relationship. In Group B, C, and F the two models could represent the canstant topologies relationship. In case of topologies relationship, Kimura 2-Parameters models is able to give more constant topologies relationship.

Relating to the condition of being failed in a consistence for the topologies, unfortunately, further understanding about this case is needed. The results shows the nucleotide composition's means and variances for all built cases. This information shows that compared to other cases, the nucleotide variance for group A and G was relatively small for each nucleotide compositions. The nucleotide variance of Group A for T(U), C, A, G respectively are (1,26), (1,31), (0.82), and (0.47) whereas the composition for Group G are (0,58), (1,32), (1,00), and (0,52). Those are relatively small comparing to group B, C, and F as a groups with constant topologies relationship.

While in group D model Kimura 2-Paramaters showed inconsistency in construct the topologies, especially in describing the relationship between *Bison bison* 2, *Bos taurus* 1, and *Bos taurus* 7. When the repeated times are 1.000 and 5.000, *Bos* 

taurus 1 and Bos taurus 7 siblings into a clade and result a small bootstrap confidence value ( as many as 30% (for 1.000 replications) and 27% (for 5.000 replication). The clade of Bos taurus 1-Bos taurus 7 then is connected with Bison bison 2 with a small bootstrap confidence value ( , 47% (for 1.000 replications) and 45% (for 5.000 replication).

This conditions is caused by the nucleotide composition between those three organisms. They have a slight different between Adenines (A) and Guanine (G) where the percentage of Adenines in Bos taurus 1 and Bos taurus 7 is 30% while in Bison bison 2 is 34%. Otherwise, the percentage of Guanine in Bos taurus 1 and Bos taurus 7 is 15,8% while in Bison bison 2 is 14,5%. In addition, the percentage of Cytosines (C) and Timine (T) is really different at all. The same thing also happened in Group E where topology relationship among Bos indicus couldn't be explained well as for Kimura 2-Parameters and Jukes-Cantor. In theory, Jukes-Cantor is weaker to cover this condition than Kimura 2-Paramaters because in the reality the event of transversion is more often to happened than transition. Therefore, substitution rate of transversion should be different with transition.

As an additional information, the value of BIC also has been computed to compare the performance of NJ's tree. BIC has been widely used to any set of maximum likelihood-based models and developed by Gideon E.S. (Schwarz 1978). At commonly the formula for the BIC is:

where n= the number of observations or equivalently, the sample size; k= the number of free parameters to be estimated; L= the maximized value of the likelihood function for the estimated model. Kimura 2-Parameters always has the lower value of BIC than Jukes-Cantor for each group as a built cases. Model with the lower value of BIC is better than those with higher value in the substitution pattern.

#### CONCLUSION

NJ's phylogenetic tree with Kimura 2-Parameters and Jukes-Cantor model have a good node stability and is also generally successful in representing topological relationships between taxa. The increasing of bootstrap replication number in common will increase the consistency of bootstrap confidence value ( . It means that both models have a good reliability.

When the number of sequences is large and the extent of sequence divergence is low, the realized tree may have many interior branches with zero length unless a large number of nucleotides are examined. Generally it will be difficult to construct the tree by some models. However, phylogenetic

tree with Kimura 2-Parameters has a better performance than Jukes-Cantor.

#### RECOMMENDATION

In order to improve a better knowledge relating to this research topic, some recommendations are given as follow:

- 1. It would be nice if another distance model could be applied for the next research.
- 2. Some built cases can be developed by combining more various species with more closeness level of various relationship.

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