# AN EMPIRICAL ASSESSMENT OF THE BOOTSTRAP SUPPORT AS AN INDICATOR OF ROBUSTNESS IN PHYLOGENETIC TREES

SO WEI HUO

FACULTY OF SCIENCE

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# AN EMPIRICAL ASSESSMENT OF THE BOOTSTRAP SUPPORT AS AN INDICATOR OF ROBUSTNESS IN PHYLOGENETIC TREES

SO WEI HUO (SGJ 100005)

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### **UNIVERSITI MALAYA**

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Name of Candidate:	SO WEI HUO	(I.C/Passport No: 850701145175)
Registration/Matric No:	SGJ100005	
Name of Degree:	MASTER OF BIOINFO	ORMATICS

An empirical assessment of the bootstrap support as an indicator of robustness in phylogenetic trees ("this Work")

Field of Study: Bootstrapping, Phylogenetics, Bioinformatics

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#### ABSTRACT

Bootstrapping is a de-facto standard for displaying the validity of a phylogenetic tree. However this may not be the case as bootstrapping assume that the random sequence exist within the genome. In order to examine whether bootstrapping is a valid process, it must be done empirically. Across multiple taxa there are minimal fully curated genomes but there are mitochondrion genomes available to test this. A widely accepted evolutionary tree is chosen with 6 taxa - *Pan paniscus* (bonobo), *Homo sapiens* (human), *Gorilla gorilla* (gorilla), *Pongo pygmaeus* (orangutan), *Hylobates lar* (common gibbon) and *Gallus gallus* (red junglefowl) as the outgroup. A comparison of topology and bootstrap support value is executed between the phylogenetic tree of the whole mitochondrial genome with trees built from all the genes in mitochondrial genome. The result shows that bootstrap support value tend to inflate and larger than the empirical estimate. This suggests that bootstrap support in phylogenetic trees must be interpreted cautiously and not casually accepted at face value.

#### ABSTRAK

Butstrap ialah piawaian de facto untuk memaparkan kesahihan pokok evolusi. Walau bagaimanapun, ini tidak selalu berlaku kerana butstrap menganggap bahawa jujukan rawak wujud dalam genom. Untuk memeriksa sama ada butstrap adalah satu proses yang sah, ia mesti dilakukan secara empirikal. Terdapat minima genom yang dikemaskini dan dikuratorkan merentasi beberapa taksa terdapat genom mitochondrion disediakan untuk menguji situasi ini. Pokok evolusi yang diterima secara meluas dipilih dengan 6 taksa - *Pan paniscus* (bonobo), *Homo sapiens* (manusia), *Gorilla gorila* (gorila), *Pongo pygmaeus* (orangutan), *Hylobates lar* (siamang biasa) dan *Gallus Gallus* (ayam hutan merah) sebagai outgroup itu. Perbandingan nilai sokongan topologi dan bootstrap yang dimeterai antara pokok filogenetik seluruh genom mitokondria. Hasil menunjukkan bahawa nilai sokongan butstrap cenderung untuk mengembung dan lebih besar daripada anggaran empirik. Ini menunjukkan bahawa sokongan butstrap dalam pokok evolusi mesti ditafsirkan dengan berhati-hati dan tidak bersahaja diterima pada nilai muka.

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### LIST OF SYMBOLS AND ABBREVIATIONS

APE Analyses of Phylogenetics and Evolution ATP Adenosine Triphosphate CDS **Coding Sequence** CI **Confidence** Interval GI GenInfo Identifier kbp Kilo-base pair MEGA5 Molecular Evolutionary Genetics Analysis version 5 ML Maximum Likelihood MSA Multiple Sequence Alignment mtDNA Mitochondrion DNA Multiple Sequence Comparison by Log-Expectation MUSCLE NADH Nicotinamide adenine dinucleotide (reduced form) NCBI National Center for Biotechnology Information ND NADH dehydrogenase NNI Nearest-Neighbour-Interchange PyCogent Python the Comparative Genomic Toolkit **Ribonucleic Acid** RNA rRNA Ribosome Ribonucleic Acid SD Standard Deviation SE Standard Error TN93 Tamura-Nei, 93 Transfer Ribonucleic Acid tRNA Micrometer μm

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