

ISBaC: An automated pipeline for In Silico Bacterial Identification

By

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#### Abstract

The advancement in computer technologies has boosted computationally intensive data analysis in biology and medicine research. With various data processing algorithms, ready access to thousands of whole microbial genomes could facilitate the study of microbial diseases. The current high-throughput sequencing technologies and development of these sequence-based identification methods make the task of identification of microorganisms simpler and faster with better accuracy. Nevertheless, using different bioinformatics tools available for the identification of microbes is sometimes challenging, especially for the beginners. This is particularly notable in identifying mycobacterial species, common agents of many opportunistic infections in humans. Diseases caused by mycobacterial species are especially challenging because of trouble in getting suitable clinical samples, particularly from non-accessible sites and due to poor sensitivity of identifying methods. Most of the current bioinformatic workflows and pipelines available are difficult to implement because users may face some problems installing the required software's in the Linux system if users are not familiar with Bioinformatics skills. Users may also have problems performing sequencing alignment, and downloading proper reference genomes. Besides, user also required some programming language if the user wants to visualize the result properly through graphs and charts. Thus, it is not easy to implement the analysis separately to identify the identity of mycobacterial species if the users do not have any Bioinformatics knowledge.

So the designed ISBaC will be the first pipeline to automated the identification of Mycobacterium species. This pipeline can accurately identify mycobacterial species in less time is of paramount importance. The pipeline start from raw data quality check, trimming of poor-quality sequences, *de-novo* genome assembly, genome annotation, virulence gene prediction, and lastly, the identification of the species identity using *in silico* approaches: the *16S rRNA* gene analysis, multilocus sequence analysis (MLSA) and Average Nucleotide Identity (ANI) analysis. The complete analysis takes around one hour. The ISBaC pipeline script, which is written in Perl language, is user friendly with just single one command to execute the pipeline. The pipeline can analyse single end, paired end and whole genome sequence from different sequencing platforms. ISBaC pipeline showed arguably the best overall performance, combining high sensitivity with excellent specificity and accuracy by identifying mycobacterium species in the repeated samples.

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In accordance with Monash University Doctorate Regulation 17.2 Doctor of Philosophy and Research

Master's regulations the following declarations are made:

I hereby declare that this thesis contains no material which has been accepted for the award of any other

degree or diploma at any university or equivalent institution and that, to the best of my knowledge and

beliefs, this thesis contains no material previously published or written by another person, except where

due reference is made in the text of the thesis.

The core theme of the thesis is to design an automated pipeline that mainly focuses on the identification

of *mycobacterial* strains by chaining various processing and identification tools in a script that is easily

accessible, user friendly and can be run with small number of commands. The ideas, development and

writing up of the thesis were the principal responsibility of myself, the student, working with the School

of Science under the supervision of Dr. Wee Wei Yee.

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#### List of Abbreviations

**ISBaC** An automated pipeline for *In Silico* Bacterial Identification

MLSA Multilocus sequencing approach

ANI Average Nucleotide Identity

NTM Nontuberculous mycobacteria

**SGM** Slow-growing mycobacteria

**RGM** Rapidly growing mycobacteria

*mce* Mammalian cell entry

PCR Polymerase chain reaction

MALDI-TOF MS Matrix-assisted laser desorption/ionization-time of flight mass spectrometry

CLSI Clinical and Laboratory Standards Institute

*ITS* 23S rRNA internal transcribed spacer

*dnaJ* 32-kDa protein

sod Superoxide dismutase

*gyrB* β subunit of DNA gyrase

secA1 Secretory pathway protein

recA DNA recombination gene

SOS Safe our soul

hk Housekeeping genes

WGS Whole-genome sequencing

Min-wise independent permutations locality sensitive hashing scheme

**FastANI** Fast Whole-Genome Similarity Estimation

MICRA Microbial identification and characterization through reads analysis

**BIBI** Bioinformatics Bacterial Identification Tool

NCBI National Centre for Biotechnology Information

**ENA** European Nucleotide Archive

**VFDB** Virulence Factor Database

SPSS Statistical Package for the Social Sciences

CI Confidence interval

#### Chapter 1. Introduction

Mycobacterium is a genus of phylum Actinobacteria, given its family name, Mycobacteriaceae (Hartmans Sybe and de Bont 2006). The genus mycobacterium is aerobic, gram-positive, non-sporulating and bacillary. Mycobacteria are found in water, soil, and bogs. Mycobacteria are hard to kill because their division pattern is asymmetric, leading to a population of cells that differ in growth rate and vulnerability to antibiotics, which resulted in their rise (Falkinham 2009). In Mycobacteria high content of lipid compound mycolic acid in the outer membrane is responsible for the poor absorption during staining procedure (Bergey's Manual® of Systematic Bacteriology 2012).

There are over 170 species in this genus, and most are associated with human diseases (Parte 2014). Previously genus *Mycobacteria* has been split into five main monophyletic clades: *Tuberculosis-Simiae* clade, *Terrae* clade, *Triviale* clade, *Fortuitum-Vaccae* clade, and *Abscessus-Chelonae* clade. To better reflect the evolutionary relationship between the known species of mycobacteria, a proposal was made for phylogenetic classification. According to revised classification, *Mycobacterium* is split into five genera which are: *Mycobacterium* consisting of the members of *Tuberculosis-Simiae* clade, *Mycolicibacterium gen. nov.* consisting of the members of *Triviale clade. Mycobacteroides gen. nov.* consisting of the members of *Triviale clade. Mycobacteroides gen. nov.* consisting of the members of *Abscessus-Chelonae* clade (Gupta, Lo, & Son 2018).

More than 20 mycobacterial species are identified as causative agent of human diseases, but *M. tuberculosis* is by far the most reported human pathogen (Bottai & Brosch 2009; Meehan et al. 2019). *Mycobacteria* can be categorized into various groups for diagnosis and treatment. But our main focus is to study *Nontuberculous mycobacteria* (NTM) species because the frequency of NTM disease is increasing worldwide and rapidly becoming a major public health problem (Ryu, Koh, & Daley 2016). There are two types of *non-tuberculous mycobacteria* (NTM), slow-growing mycobacteria (SGM), which takes more than seven days to form colonies on agar medium, and rapidly growing mycobacteria (RGM), which takes less than seven days to form colonies on agar medium (C. J. Kim et al. 2013).

#### 1.1 Non-tuberculous mycobacteria (NTM)

Nontuberculous mycobacteria (NTM) are found in water and soil. Over 180 different species and subspecies are characterized under NTM; most species do not cause human disease, except vulnerable persons (Marras and Daley, 2002). When a person gets exposed to environmental sources of NTM, this microorganism enters the lungs and causes inflammation in the respiratory system. Although most individuals do not show symptoms, some vulnerable persons show a progressive lung infection that can be cured with continuous treatment of antibiotics for at least 12 months (Johnson & Odell 2014). The NTM are usually two types corresponding to their permit (Cook et al. 2009), which are slowly growing mycobacteria (7 days to form colonies) and rapidly growing mycobacteria (3 days to form colonies). Slowly growing mycobacteria have a prolonged growth rate and take almost seven days to form transparent colonies on agar. For Example, M. avium, M. intracellulare, M. kansasii, M. xenopi and M. simiae. The reason for slow growth of mycobacteria is outer membrane's impermeability to hydrophilic chemicals (Brennan 1995). Due to the hydrophobic nature of mycobacteria, they can form biofilms, and these biofilm-grown cells are also resistant to disinfectants. They can grow in low nutrient cultures, such as drinking water. They are even heat-resistant and can tolerate a temperature of 55°C (130°F) or higher (Steed & Falkinham 2006).

The rapidly growing mycobacteria usually take less than one week to form colonies in culture medium. Few species are also found to be associated with human disease (Schlossberg 2017). More than 80% of clinical isolates of RGM include *M. fortuitum*, *M. chelonae*, and *M. abscessus*. The most frequently isolated species, *M. abscessus* and *M. fortuitum* are isolated from clinical respiratory and non-respiratory specimens. Some RGM species, such as *M. smegmatis* and *M. chelonae* are disinfectant resistant. RGM cannot be treated with a standard therapeutic regimen. Therefore, specific antimicrobial susceptibility testing is required. Antimicrobial susceptibility can also be used to differentiate between RGM species. However, the outcomes of these therapies vary depending on the species and severity of the sickness.

RGM were classified into various groups based on nucleotide differences in the 16S rRNA gene sequence: the M. fortuitum group included M. fortuitum, M. peregrinum, M. houstonense, and M. neworleane; the M. peregrinum group included M. peregrinum, M. houstonense, and M. neworleane; and the M. septicum group included M. septicum, M. mageritense, M. mucogenicum, and M. senegalense; the M. chelonae abscessus group included M. abscessus, M. chelonae, and M. immunogenum; and the M. smegmatis group included M. smegmatis, M. wolinskyi, and M. goodii (Brown-Elliott & Wallace 2002). However, there has been some debate about the taxonomic classification of M. mucogenicum,

because its biochemical profile and antibiotic-susceptibility pattern were found to be more closely related to those of members of the *M. chelonae–abscessus* group (*M. chelonae–abscessus* group) (*M. chelonae–abscessus* group) (*M. chelonae–abscessus* group) (Brown-Elliott & Wallace 2002). A phylogenetic tree constructed using the *16S rRNA* gene indicated that *M. mageritense* was more closely linked to the *M. smegmatis* group than the *M. fortuitu*m group, despite the fact that it exhibited antibiotic sensitivity biochemical patterns similar to those of the *M. smegmatis* group (Brown-Elliott & Wallace 2002). *M. leprae* is more closely related to the NTM species *M. avium*, according to phylogenetic trees based on whole genome sequencing and *16S rRNA* gene sequences. Other approaches, on the other hand, confirm the existence of a close sister group to *M. tuberculosis* (Claeys & Robinson 2018).

The genetic reasons responsible for mycobacterial species growth rate are not well known. Recent findings imply that ancient mycobacteria exhibited a fast growth characteristic, which was followed by a single main evolutionary divergence into sub-genera that grew quickly and slowly. Among the genes they discovered were those encoding for amino acid transport/metabolism (e.g., the livFGMH operon) and transcription, as well as genes encoding for new ABC transporters. In slow-growing organisms, the loss of the livFGMH and ABC transporter operons implies that decreased cellular amino acid transport may be a limiting factor in growth. According to the results of a comparative genomic investigation, horizontal gene transfer from non-mycobacterial taxa may have contributed to the trait. It was discovered that the mammalian cell entry (mce) operon was present in all species, regardless of growth phenotype or pathogenicity, despite the fact that there was little protein sequence similarity between fast-growing and slow-growing species. As a result, this shows that the mce operon was present in ancient fast expanding species but was later repurposed by slower growing species to serve as a mechanism for establishing an intracellular lifestyle (Bachmann et al. 2020).

#### 1.2 Phenotyping Methods for identification of mycobacteria

Phenotypes are the observable traits determine by genotypes, and they include morphological, physiological, and biochemical properties of the organism. Before the advancement in molecular techniques, bacterial taxonomy was solely based on comparative studies of the phenotypic features, which require pure laboratory cultures (Lagier et al. 2015). Traditionally, mycobacterium strains and species were also identified and classified using phenotyping methods. Some RGM and SGM were determined by phenotyping methods based on growth (Brown-Elliott & Wallace 2002). The other

parameters for identification were optimum growth temperature, acid fastness, gram staining, colony morphology and absence of pigmentation. But these traditional phenotypic identification methods are laborious, challenging, and time-consuming, require many weeks for proper growth. Sometimes, findings of these phenotyping methods may lead to inaccurate identification of species because different species share similar morphological and biochemical profiles. Different culture media are utilized for the isolation of mycobacteria. The most used method is "Löwenstein-Jensen medium", which is based on eggs, and it also contains high concentrations of malachite green to overcome contamination with other bacteria. Another method is liquid culture media which is more sensitive than egg-based solid media for the isolation of mycobacteria from clinical specimens. One more method is Ziehl-Neelsen staining for the direct detection of mycobacteria. This method is also used to identify acid fast bacilli which appear bright red after staining (Palomino 2009).

### 1.3 Genotyping methods of identification of mycobacteria

The genotyping methods depends on what data is being looked for. Numerous strategies at first require amplification of the DNA sample, which is commonly done utilizing PCR. These methods are automat ed, and results are obtained very quickly, often with more precision than with phenotyping methods.

#### 1.3.1 PCR Restriction Enzyme Analysis

The restriction fragment length polymorphisms is a powerful method for the identification of SGM and RGM (Steingrube et al. 1995). In today's world, new technology such as gene sequencing and other molecular procedures are gradually displacing these more traditional approaches. The Polymerase chain reaction-Restriction Enzyme analysis technique entails amplifying a gene encoding a protein using polymerase chain reaction (PCR), followed by subjecting the PCR products to particular restriction endonuclease digestion. Gel electrophoresis is used to acquire particular patterns of digested amplicons, which are then compared with patterns of digested amplicons obtained from known species to determine whether the patterns are related (Singh & Kashyap 2012).

#### 1.3.2 Gene Sequencing

Most molecular methods use partial sequence targets, including the 16S rRNA gene, hsp65 gene, rpoB, and others to identify mycobacterium. The 16S rRNA gene is the primary gene target for mycobacterial identification and differentiation. The main reason for using this gene in molecular taxonomic studies is that there is a well-organized and robust database of 16S rRNA gene. The 16S rRNA gene is a highly

conserved gene composed of nearly 1,500 nucleotides. The first 500 bps of 5 prime end of the *16S rRNA* gene comprises two major hypervariable domains, known as regions A and B. Region A contains species-specific sequence variations ("signature sequences"). Thus, the sequencing of this region is more informative for mycobacterial species identification, while region B might be confirmatory. *16S rRNA* gene sequences of members of the genus *Mycobacterium* are closely related, but they may show a difference of few base pairs. However, the *16S rRNA* gene cannot differentiate among some closely related NTM, including *M. abscessus*, *M. chelonae*, and some species within the *M. fortuitum* group (Turenne, Tschetter, Wolfe, & Kabani 2001). *M. abscessus* and *M. chelonae* vary by 4-bp within the *16S rRNA* gene but are indistinguishable within regions A and B. Thus, for those species identification which share highly similar *16S rRNA* gene sequence, sequencing outside of regions A and B or the addition of another gene target is compulsory (Brown-Elliott & Wallace 2002).

The Clinical and Laboratory Standards Institute (CLSI) has suggested the standards for identifying mycobacterial species by the *16S rRNA* gene sequencing (S. H. Kim & Shin 2018). According to CLSI, the reference and query sequences should be compared with at least a '300 bp quality sequence'. There must be a minimum of one region of the gene where variations are expected for reliable results. The 100% sequence identity is required with reference sequences for clear species identification (Bosshard & McDaniel 2010).

Next, a 441-bp hypervariable region in 65-kDa heat shock protein gene (hsp65) is another useful gene target for species-level identification. The hsp65 gene is well conserved than the 16S rRNA gene, thus allowing species-level identification of closely related species., such as M. abscessus and M. chelonae. These two species differ by 30bp in the 441-bp hsp65 fragment. Additionally, many other species within the M. fortuitum group (M. fortuitum, M. septicum, M. peregrinum, M. houstonense and M. senegalense) are more rapidly identified by hsp65 gene. However, the lack of a well-integrated and updated database of hsp65 gene sequences is the major drawback of this identification methods.

The *rpoB* gene is a single copy gene that encodes beta subunit of the RNA polymerase. A 723-bp fragment in region V of the *rpoB* gene is most used in sequencing. Since it is less conserved, it can be useful for species discrimination that could not be differentiated by the *16S rRNA* gene or the *hsp65* gene sequence alone. *rpoB* gene being a single copy is more valuable because a single location without deletion or insertion is generally sufficient to identify many of the SGM and RGM to the species level. Thus, *ropB* can differentiate SGM and RGM at the intra- and interspecies levels (S. H. Kim & Shin 2018).

Several marker genes have been proposed for the identification of SGM and RGM including, 16S, 23S rRNA internal transcribed spacer (*ITS*) region, a 32-kDa protein gene (*dnaJ*) (Yamada-Noda et al. 2007), the superoxide dismutase (*sod*) gene (Zolg & Philippi-Schulz 1994), the *gyrB* gene encoding the β subunit of DNA gyrase (Dauendorffer et al. 2003), the *secA1* gene encoding a vital component of the major protein secretory pathway across the cytoplasmic membrane (Soini, Bottger, & Viljanen1 1994), and the *recA* gene which is crucial for homologous DNA recombination, DNA damage repair, and induction of the SOS (save our soul) response (Blackwood et al. 2000). However, the usefulness of these genetic targets is uncertain because of the insufficient literature about them and the lack of an appropriate database (Adékambi, Colson, & Drancourt 2003).

#### 1.3.3. Multilocus Sequencing Approaches (MLSA)

Recently, a new sequencing approach has been proposed for mycobacterial identification: multilocus gene sequencing (i.e., sequencing portions of multiple genes) (Devulder, de Montclos, & Flandrois 2005). Usually, this usage of about 8 to 10 gene targets unlocks the opportunity to differentiate and identify mycobacterium at the species level (Macheras et al. 2009). However, this method does not apply to clinical diagnostic laboratories because it may end up with identical findings. But they may play a part in the evaluation and identification of new species. Case-by-case studies are required to confirm the efficiency of Multilocus sequencing approach (MLSA) for the identification of bacterial species. Multilocus sequencing analysis was used to classify genus *M. abscessus* and *Salinivibrio*. These studies suggested that MLSA can replace DNA-DNA hybridization because there is a sufficient degree of similarity between them (López-Hermoso et al. 2017). Multilocus sequencing approach (MLSA) contains higher discrimination between the mycobacteria genomes than *16S rRNA* gene analysis (Liu, Lai, & Shao 2017a). because it uses a set of housekeeping genes (hk) which helps to lower the chances of horizontal gene transfer.

#### 1.3.4 Whole-genome sequencing

Recently, new methods of whole-genome sequencing (WGS) and phylogenomic analysis have emerged for analysing the genetic variations and population studies of bacteria and mycobacteria. The significant advantage of this study is that it allows analysis of multiple genetic regions associated with resistance to antibiotics and disinfectants and the general pathogenicity of strain or species. It can also identify the genetic factors responsible for species diversity and strain specificity (Chan et al. 2012). Although WGS is not widely available in clinical or reference laboratories because of lack of NGS data, but there is no doubt this technology is emerging rapidly (Brown-Elliott & Wallace 2015).

A molecular biology technique, DNA–DNA hybridization, is a gold standard for analysing the genomic similarity between pools of DNA sequences. Genetic distance between two organisms can be calculated using this technique (Woese 1987). Traditionally, a similarity index greater than 70% indicated that the strains being compared belong to distinct species. DNA-DNA hybridization provides more accurate results than 16S rDNA sequencing because this method uses 70% similarity criteria for distinguishing bacterial species (Wayne 1988). However, this method has not been practised much globally due to the laborious nature of pairwise cross-hybridizations, and it is not always easy to perform this technique in routine. Another disadvantage of this method is it requires a fully established central database (Cho & Tiedje 2001). DNA–DNA hybridization is currently performed *in silico* using entirely or partially sequenced genomes, allowing more in-depth classification and identification of bacteria (Castejon et al. 2018).

There are some bioinformatic approaches available to check the genomic similarity of whole genomes. Average nucleotide identity (ANI) is a convenient and straightforward measure of genetic relatedness; it compares the nucleotide sequences of conserved shared genes between genomes. A standalone software fast genome and metagenome distance estimation using MinHash (min-wise independent permutations locality sensitive hashing scheme) is currently available that estimates the fast genome and metagenome distance (Ondov et al. 2016). Minash reduces large sequences and sequences sets to small, representative sketches, from which global mutation distances can be rapidly estimated. MinHash results strongly correlate with alignment-based measures such as the Average Nucleotide Identity (ANI). MinHash distance  $\leq 0.05$  equates to an ANI of  $\geq 95$  %, and this threshold roughly corresponds to a 70 % DNA-DNA (Konstantinidis & Tiedje 2005). In 2021 MinHash was used to study the phylogeny of Escherichia coli. According to this study, MinHash reproduces known phylogroups and identified previously uncharacterized phylogroups in E. coli species (Abram et al. 2021). Another approach is the Fast Whole-Genome Similarity Estimation (FastANI) available. It estimates the average nucleotide identity between shared genomes (Jain et al. 2018). It calculates the ANI values identical to the alignment-based ANI values for complete and draft quality genomes related to 80 to 100% nucleotide identity range. The cut-off-value equal to or greater than 95% confirms that genomes descend from the same species (Goris et al. 2007).

#### 1.4 Limitations of existing traditional and bioinformatics approaches

As mentioned earlier, traditional phenotyping identification methods are laborious, complex, and timeconsuming as they may require many weeks for the proper growth of *mycobacterial* strains as it is

necessary to grow the bacterial culture sufficiently to obtain DNA for molecular analysis such as whole genome sequencing. Sometimes, the findings of these phenotyping methods may lead to inaccurate identification of species because many mycobacterial species share similar morphological and biochemical profiles. Similarly, genotyping methods also have few limitations, like these methods only identify closely related species and require specialized training and the apparatus. Moreover, these method results rely on up-to-date and high-quality databases. Based on nucleotide differences in the 16S rRNA gene sequence, RGM were classified into three groups: the M. fortuitum group consisting of M. fortuitum, M. peregrinum, M. houstonense, M. neworleansense, M. septicum, M. mageritense, M. mucogenicum and M. senegalense; the M. chelonae-abscessus group consisting of M. abscessus, M. chelonae and M. immunogenum; and the M. smegmatis group consisting of M. smegmatis, M. wolinskyi and M. goodii (Brown-Elliott & Wallace 2002). However, there has been controversy regarding the taxonomic classification of *M. mucogenicum*, since its biochemical profile and antibiotic-susceptibility pattern were more closely related to those of members of the M. chelonae-abscessus group. A 16S rRNA gene-based phylogenetic tree revealed that M. mageritense was more closely related to the M. smegmatis group than the M. fortuitum group, despite its antibiotic susceptibility biochemical patterns (Brown-Elliott & Wallace 2002). 16S rRNA gene analysis also could not differentiate the species of M.intercellulare and M.chimaera; moreover, three strains of M. peregrinum were misidentified as M. septicum (Schweickert et al. 2008). WGS-based and 16S rRNA gene-based phylogenetic trees support that M. leprae is more closely related to the NTM species M. avium. In contrast, other methods support a close sister clade to *M. tuberculosis* (Claeys & Robinson 2018).

Several open access web-based analysis is available such as Bacterial analysis pipeline (Thomsen et al. 2016), Microbial identification and characterization through reads analysis (MICRA) (Caboche et al. 2017), Bioinformatics Bacterial Identification Tool (BIBI) (Devulder et al., 2003), A comprehensive pi peline for whole genome sequence analysis of *Mycobacterium tuberculosis* complex isolates (MTBseq) (Kohl et al. 2018), A bioinformatics whole genome sequencing workflow for clinical *Mycobacterium tuberculosis* complex isolate analysis, validated using a reference collection extensively characterized with conventional methods and in silico approaches (Bogaerts et al. 2021), and a bioinformatics pipeline for *Mycobacterium tuberculosis* sequencing that cleans contaminant reads from sputum samples (Cuevas-Córdoba et al. 2021) are also available. The Bacterial analysis pipeline offers molecular typing tools and resistance and virulence gene predictions, and SNP-based phylogeny. While MICRA uses iterative mapping against reference genomes to identify genes and variations. Both the Bacterial analysis pipeline and MICRA are reference-based pipelines that cannot identify unknown bacterial species. BIBI

combines similarity search tools in the sequence databases and phylogeny display programs. But it does not offer pre-processing steps, and it also uses an online BLAST search tool which may give inaccurate results. MTBseq performs phylogenetic analysis of Illumina whole genome sequence data of *Mycobacterium tuberculosis* complex isolates. It does not cover all mycobacterium species available. A bioinformatics workflow available is also a web-based tool which perform species identification (16S, csb/RD, hsp65) and single nucleotide polymorphism (SNP)-based antimicrobial resistance prediction on *Mycobacterium tuberculosis* complex isolates. A one more bioinformatics pipeline identifies *Mycobacterium tuberculosis* reads from sputum by filtering another microorganism.

In addition, web-server-based analysis depends on the server load and needs a fast and steady internet connection to upload raw data files and requires an up-to-date database. There is also some open-source locally installable software available such as, NGSPanPipe which offers pan-genome identification using a reference sequence (Lambris and Paoletti 2018). Nullarbor produces complete public health microbiology reports from sequenced isolates and supports Illumina paired-end sequencing data from either Illumina or Ion Torrent (Seemann T 2018). However, none of the methods discussed earlier or web servers and software help to identify mycobacterial species.

# 1.5 Aims and significance of study

Using phenotyping and genotyping approaches to identify mycobacterial species is difficult since mycobacteria have a wide range of characteristics such as survival, growth, permeability, pathogenicity, and antibiotic resistance profiles. Furthermore, these approaches need specialised training as well as the necessary equipment. As a result of the advancement of high-throughput sequencing technology, microbial identification is no longer a difficult task. However, the individual use of these bioinformatics tools can be difficult, especially for those who are new to the field and have no prior understanding of bioinformatics. As a result, different tools must be used to identify mycobacteria using genomic information, when moving from one tool to another during a computational analysis of a mycobacterial genome: (1) pre-processing of the sequence data, (2) *de novo* genome assembly, (3) identification. This means that results will be less accurate when moving from one tool to another. Furthermore, if only one programme was used to do all of the necessary computing steps for this study, the approach might not be as efficient and rapid. Thus, having a pipeline that can run the whole mycobacterial characterisation process at once, without having to pause every time a new bioinformatics tool is required, would make this in-silico technique much easier to undertake in the first place.

As a result, the pipeline was designed to eliminate the inaccuracies that can occur while manually switching from one tool to another by including filtering scripts and automating the whole process. Pipeline script is written with the intention of being a user-friendly tool when used via command-line; that is, the user should be able to understand the manual provided by its developers without having difficulty understanding how to use it; this means that no additional research on how to use it should be required, and the code should not need to be modified. The designed pipeline (ISBaC) will be an open-source script capable of performing a wide range of analyses, beginning with raw data quality check, trimming of low-quality sequences, *de-novo* genome assembly, genome annotation, virulence gene prediction, and finally the identification of the species identity. These tools will provide % similarity data as well as identification of the mycobacterial species in the sample. As a result, with a single query, we may identify mycobacterial species of interest.

The promising way to test the accuracy of the pipeline is to run it with the sample where we already know the identity of the species, so if our pipeline gives the same identity at the end of the pipeline, that means our pipeline is working accurately. So we used a paired-end raw read sequence of *M.chelonae* (SSR10177528) downloaded from the public database European Nucleotide Archive (ENA) as an input. Signal end raw read sequence and assembled whole genome sequence can also be used as input. In the end, we compared ISBaC pipeline results with previously identified strain of *M.chenloae*.

#### 1.6 Objectives

- To create an automated pipeline for the identification and annotation of mycobacterial species.
- To perform statistical analysis to determine the accuracy of the pipeline by comparing the result from the pipeline with prior published data.

#### Chapter 2. Material and methods

#### 2.1 Data mining

First, we have prepared filtered reference *16S rRNA* gene sequences database (that should be 1550bp long) (Clarridge 2004) of 170 mycobacterium species downloaded from National Centre for Biotechnology Information (NCBI) for the *16S rRNA* gene analysis. We have also downloaded five housekeeping gene sequences (*gyrA*, *gyrB*, *ropB*, *groEL*, *recA*) (which are highly conserved, not vulnerable to horizonal gene transfer, long enough to contain phylogenetically useful information and could predict whole genome relationship) (Rong & Huang 2014) from National Centre for Biotechnology Information (NCBI) of 170 mycobacterium species for multilocus sequencing analysis (MLSA) and 170 mycobacterium species reference whole genome sequences from National Centre for Biotechnology Information (NCBI) for the ANI analysis. The list of *Mycobacterium* species has been listed in Appendix 1 and 2.

In order to test the ISBaC pipeline, the paired-end raw sequence of *M.chelonae* ATCC\_35752 (SRR4423483), *M.chimaera* CCUG\_50989 (SRR10394508), *M.intercellulare* ATCC\_13950 (SRR5052607), *M.kansasii* ATCC\_12475 (SRR3319297), *M.tuberculosis* ATCC\_27294 (SRR786668), *M.ulcerans* ATCC\_19423 (SRR6346326), *M.franklinii* DSM\_45524 (SRR3605312), *M.salmoniohilum* ATCC\_13758 (SRR3617054), *M.arupensis* DSM\_44942 (SRR5052611) and *M.iranicum* DSM\_45541 (SRR10143752) have been downloaded from European Nucleotide Archive (ENA), a public repository of the world's nucleotide sequencing information, covering raw sequencing data (Leinonen et al. 2011). The pipeline is suitable for all sequence data generated from different sequencing platforms for example Illumina, PacBio.

# 2.2 Raw reads pre-processing and genome assembly

The quality of the raw reads is assessed using FastQC (Andrews 2010). FastQC estimates multiple read quality statistics and calculates the Phred score of each position for the reads. If the observed mean quality is below 27, then a warning is issued and if it is below 20, then fail is given. Next, Trimmomatic (Bolger, Lohse, & Usadel 2014) is used to trim off the poor-quality sequences. Low-quality bases below the threshold quality of 20, lesser than 100 bp length, and adaptors sequences will be trimmed off. Raw reads pre-processing will ensure that the raw sequencing data is unbiased before drawing biological conclusions upon downstream analysis. SPAdes genome assembler (Bankevich et al. 2012) is a standard *de-novo* genome assembler for whole-genome sequencing data

of bacteria and other tiny microbes. The pipeline uses SPAdes to perform genome assembly. SPAdes use multi-sized de Bruijn graphs to construct the assembly graph also detects and removes chimeric reads. Next, for mapping the edges of the assembly graph, distances between the automatically selected *k*-mers (*K21*, *K33*, *K55*, *K77*, *K99*, *K127*) are calculated. In the end, a paired assembly graph is constructed, and the assembler gives contigs as output. SPAdes do not select a *k*-mer length but instead makes a combined assembly (by default) by using multiple pre-selected *k*-mer. Then the quality of assembled genome will be assessed using Quast (Gurevich, Saveliev, Vyahhi, & Tesler 2013). Quast evaluates genome assemblies both with a reference genome, as well as without a reference. QUAST produces numerous reports, outline tables and plots to assist researchers.

#### 2.3 Genome annotation

Functional elements of the assembled genome are identified using Prokka (Seemann 2014). Prokka give many output files like, gene sequence, protein sequence and functional annotation files, which are later used in pipeline. Like .fna file was used to identify the 5-housekeeping gene (*gyrA*, *gyrB*, *rpoB*, *groEL*, *and recA*), and .faa file was used to align query genome against Virulence Factor Database (VFDB) in virulent gene predication (Chen et al. 2005).

#### 2.4 Mycobacteria identification

The 16S rRNA gene was extracted from the assembled query genome using barrnap (Torsten 2014). 16S rRNA gene sequences of 170 different mycobacterial species were first built as a local database using makeblastdb (Camacho 2008). The query 16S rRNA gene sequence was aligned using the local 16S rRNA reference gene database to check the regions of local similarity. The top 30 hits of blastn results were used to draw a bar chart by R using packages like ggplot2, data.table, ggpubr (R Core Team 2021). Furthermore, a similarity matrix based on the top 10 hits was drawn by R using packages like ggplot2, data.table, ggpubr, reshape2, dplyr, tidyr to check the similarity of inter and intraspecies (R Core Team 2021).

The query genome's five housekeeping genes (*gyrA*, *gyrB*, *rpoB*, *groEL*, *and recA*) were identified through gene alignment using the *M. tuberculosis* (H37Rv) housekeeping genes as reference because H37Rv has been utilized broadly in biomedical research and it still provide the backbone for most of TB related research. The reference MLSA database is created based on the presence of the housekeeping genes in the query genome. For example, if only three housekeeping genes are present

in the query genome, then the pipeline will concatenate only those three housekeeping gene files to create the MLSA reference database. Next, the extracted housekeeping gene set was compared with the MLSA database to check the regions of local similarity. The top 30 hits of blastn results were used to draw a bar chart using R (R Core Team 2021). Then again, a database was designed for top 10 hits to check the inter and intraspecies similarity; these similarity values were used to draw a similarity matrix using R (R Core Team 2021).

For whole-genome sequence analysis, a standalone software MinHash estimates the fast genome and metagenome distance (Ondov et al. 2016). First, MinHash sketch of all reference whole genome sequence of 170 mycobacterial species was constructed then query sequence was compared with MinHash sketched references to calculate MinHash distance. The resulting MinHash distances correlate well with ANI. Where  $D \approx 1 - \text{ANI}$ , another tool, Fast Whole-Genome Similarity Estimation tool (FastANI), was used, which calculates the average nucleotide identity between shared genomes (Jain et al. 2018). First, two files Query\_path and Database\_path, were created automatically, containing paths to query genome and reference database genome of 170 mycobacterial species, respectively, one per line. Then, ANI values were computed by comparing the query genome with the reference genome. ANI values were graphically represented through heatmap using R (R Core Team 2021).

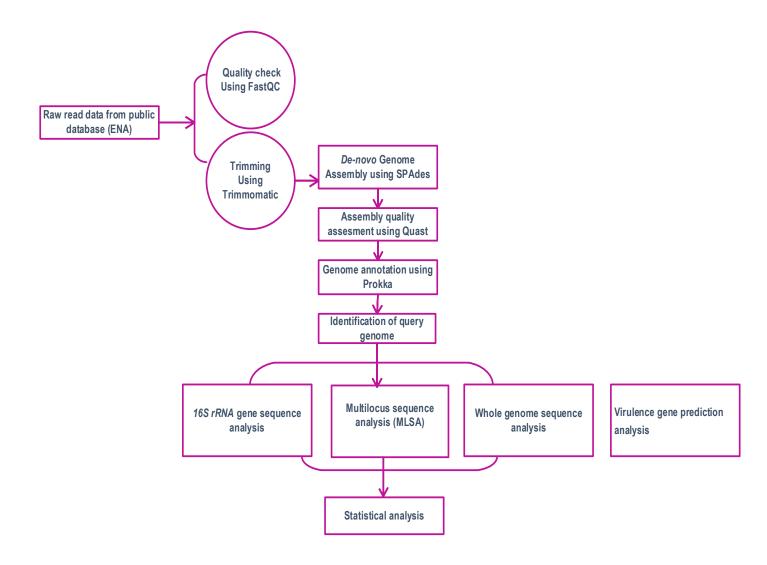
#### 2.5 Virulence gene predication

Virulence genes in the query genome were searched using the Virulence Factor Database (VFDB) (Chen et al. 2005). The annotated protein sequence in the query genome had been blasted against the VFDB database. The aligned protein with coverage and identity of more than 50% was considered the be the homolog to virulence genes. The virulence genes in the query genome will be further compared to the virulence genes of 10 other mycobacterium species (*M.abscessus* ATCC 19977, *M.africanum* GM041182, *M.avium* 104, *M.bovis* AF2122/97, *M.gilvum* PYR-GCK, *M.indicus pranii* MTCC 9506, *M.intracellulare* ATCC 13950, *M.leprae* TN, *M.ulcerans* Agy99 and *M.tuberculosis* H37Rv).

#### 2.6 Statistical analysis

The accuracy of the ISBaC pipeline was calculated using statistical analysis. First, we downloaded raw data of 10 different M.chelonae strains (SRR4423483, DRR015959, SRR3617056, SRR3617047, SRR3617048, SRR3617050, SRR3617057, SRR3617058, SRR3617059 and SRR3617060) and 10 different mycobacterium species (M.chelonae ATCC 35752 (SRR4423483), M.chimaera CCUG 50989 (SRR10394508), M.intercellulare ATCC 13950 (SRR5052607), M.kansasii ATCC\_12475 (SRR3319297), M.tuberculosis ATCC 27294 (SRR786668), M.ulcerans (SRR6346326), *M.franklinii* DSM 45524 (SRR3605312), *M.salmoniohilum* ATCC 19423 ATCC 13758 (SRR3617054), M. arupensis DSM 44942 (SRR5052611) and M. iranicum DSM 45541 (SRR10143752). All the downloaded raw data was input into the ISBaC pipeline to get the similarity values for each characterization analysis. The similarity value of the top hit for each run has been recorded. Next, the mean, standard deviation and 95% confidence interval value for the 16S rRNA, MLSA and ANI analysis were calculated, and the error bars were drawn using IBM Statistical Package for the Social Sciences (SPSS) version 26.0. Error bars showing the range of mean percentage identity values obtained from ISBaC, helps to understand either the range captures the threshold values for 16S rRNA gene analysis, MLSA and ANI analysis in repeated samples.

# 2.7 Flowchart of Experimental Method



# Chapter 3. Results

To use ISBaC, users need to install the required software. First, the user is required to run the SoftwareInstallation.pl Perl script. The Perl script is downloaded for the installation of all the required software's into the users' system. The list of software required by ISBaC are FastQC, Trimmomatic, SPAdes, Quast, barrmap, ncbi-blast++, Prokka, R, seqkit, faSomeRecords, MinHash and FastANI with their download links are shown in (Table 3.1).

Table 3.1: List of software's with link

List of software's	Link to the software's
FastQC (v0.11.9)	http://www.bioinformatics.babraham.ac.uk/projects/fastqc/fastqc_v0.11.9.zip
Trimmomatic (v0.3 3)	http://www.usadellab.org/cms/uploads/supplementary/Trimmomatic/Trimmomatic-0.33.zip
SPAdes (v3.12.0)	http://cab.spbu.ru/files/release3.12.0/SPAdes-3.12.0-Linux.tar.gz
Quast (v5.0.1)	https://sourceforge.net/projects/quast/files/quast-5.0.1.tar.gz
Barrmap (v0.9)	https://github.com/tseemann/barrnap/archive/0.9.tar.gz
ncbi blast++ (v2.13 .0)	https://ftp.ncbi.nlm.nih.gov/blast/executables/LATEST/ncbi-blast-2.13.0+-x64-linux.tar.gz
Prokka (v1.14.5)	https://github.com/tseemann/prokka/archive/refs/tags/v1.14.5.tar.gz
R (v4.0.3)	https://cran.r-project.org/src/base/R-4/R-4.0.3.tar.gz
Seqkit (v0.14.0)	https://github.com/shenwei356/seqkit/releases/download/v0.14.0/seqkit_linux_386.tar.gz
faSomeRecords	https://hgdownload.cse.ucsc.edu/admin/exe/linux.x86_64/faSomeRecords
MinHash (v2.3)	https://github.com/marbl/Mash/releases/download/v2.3/mash-Linux64-v2.3.tar
FastANI (v1.32)	https://github.com/ParBLiSS/FastANI/releases/download/v1.32/fastANI-Linux64-v1.32.zip

Users need to provide the path to the desired working directory. The example command to run the Perl script is:

perl SoftwareInstallation.pl /home/workstation/ISBaC\_Pipeline

"/home/workstation/ISBaC\_Pipeline "is the directory where the user would like the software to be installed. The whole installation process takes around 9 minutes to complete with 4 core CUPs and

128gb RAM, it can be faster with higher operating system specifications. The user is only required to run the SoftwareInstallation.pl script once (Figure 3.1).

```
workstation@workstation-HP-Z440-Workstation: ~/ISBaC_Pipeline
 orkstation@workstation-HP-Z440-Workstation:~$ cd /home/workstation/ISBaC_Pipeline/
              orkstation-HP-Z440-Workstation:~<mark>/ISBaC_Pipeline$</mark> perl SoftwareInstallation.pl /home/workstation/I
SBaC_Pipeline
Downloading software:
Checking the path of the current directory
/home/workstation/ISBaC_Pipeline
trying URL 'https://cran.rstudio.com/src/contrib/reshape2_1.4.4.tar.gz'
Content type 'application/x-gzip' length 37307 bytes (36 KB)
______
downloaded 36 KB
 installing *source* package 'reshape2' ...
package 'reshape2' successfully unpacked and MD5 sums checked
using staged installation
+ -std=gnu++11 -shared -L/usr/lib/R/lib -Wl,-Bsymbolic-functions -Wl,-z,relro -o reshape2.so RcppExports.o m
elt.o -L/usr/lib/R/lib -lR
installing to /home/workstation/R/x86_64-pc-linux-gnu-library/3.6/00LOCK-reshape2/00new/reshape2/libs
  data
   moving datasets to lazyload DB
  inst
  byte-compile and prepare package for lazy loading
  help
   installing help indices
  building package indices
```

Figure 3.1: Calling SoftwareInstallation.pl script that automatically install all required software's of ISBaC pipeline

After completed the software installation, we can begin ISBaC by running the ISBaC.pl Perl script. ISBaC required only one command to execute the whole pipeline analysis. The example of the command to run ISBaC is shown below:

"perl ISBaC.pl 8 p /home/workstation/ISBaC\_Pipeline /home/workstation/Downloads/SRR442 3483\_1.fastq /home/workstation/Downloads/SRR4423483\_2.fastq /home/workstation/ISBaC\_Pipeline"

To start with pipeline user, need to call ISBaC.pl script which is followed by few arguments. The first argument indicated the number of threads ("8"), Next is the type of raw reads sequencing ("s" indicated single end and "p" indicated paired-end sequences), directory to the installed software, path to the input raw data (/home/workstation/Downloads/SRR4423483\_1.fastq /home/workstation/Downloads/SRR4423483\_2.fastq) and lastly is the output directory (/home/workstation/ISBaC\_Pip eline) (Figure 3.2). ISBaC takes around 48 minutes to 60 minutes to complete the whole process with

4 core CUPs and 128gb RAM, it can be faster with higher operating system specifications. The example of the output results can be seen in Figure 3.3.

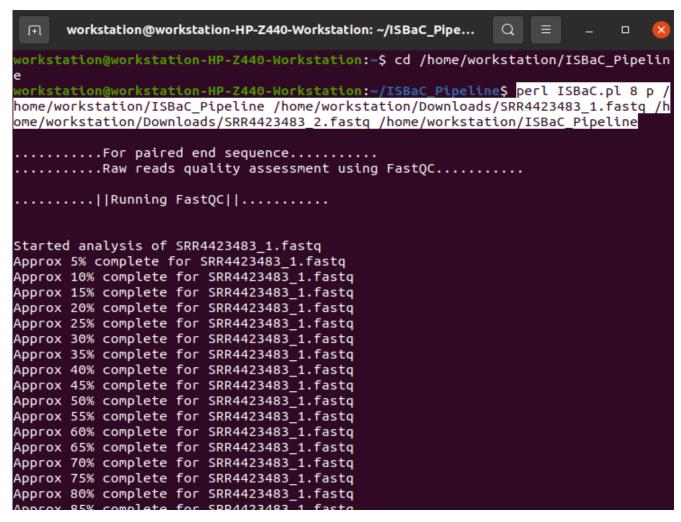


Figure 3.2: ISBaC pipeline input options.

#### 3.1 Raw reads pre-processing

Inside the "1.FastQC\_Results" folder is the result of the processed raw read. We checked the quality of the paired-end raw data of *M. chelonae* ATCC\_35752 (SRR4423483) using FastQC. The FastQC results show that a total of 922,725 sequences have a length that lies between 36-301 bp. The GC percentage is 63, and no sequences was flagged as poor quality. The per base sequence quality boxplot of *M. chelonae* shows the average range of the sequence's quality values across the read. The higher the quality score, the better the base call. The graph divides the Y-axis into excellent quality calls (green), calls of reasonable quality (orange), and calls of poor quality (red). In *M. chelonae* the quality of calls falls into red towards the end of a read.

Once the quality of the raw reads has been checked, the pipeline will proceed with trimming poorquality bases using Trimmomatic. The trimmonatic results will be stored in the folder "2.Trimmonatic\_Results" (Figure 3.3). Although the input sequence reads of *M. chelonae* are of average quality, the subsequent steps in the analysis will benefit from pre-processing, which includes trimming of adaptors, low-quality bases. After completing the adapter trimming and quality filtering steps, the sequencing reads of *M. chelonae* were assessed for the quality a second time. The per base sequence quality plot of trimmed reads shows excellent improvement in quality as the all the low-quality bases below the threshold quality of 20 and lesser than 100 bp length were trimmed off from both reads (R1 & R2). It took around two to three minutes for a single end sequence and five to six minutes for the paired-end sequence with 4 core CPUs and 128Gb RAM to perform these steps. The per base sequence quality plots before and after trimming are shown in (Figure 3.4A, 4B).

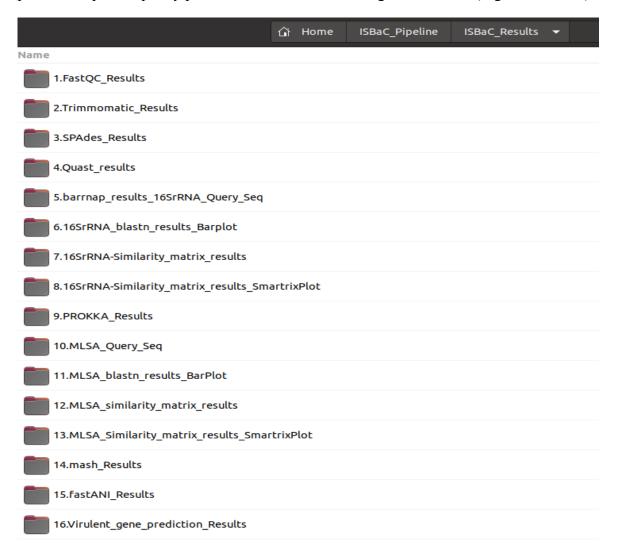
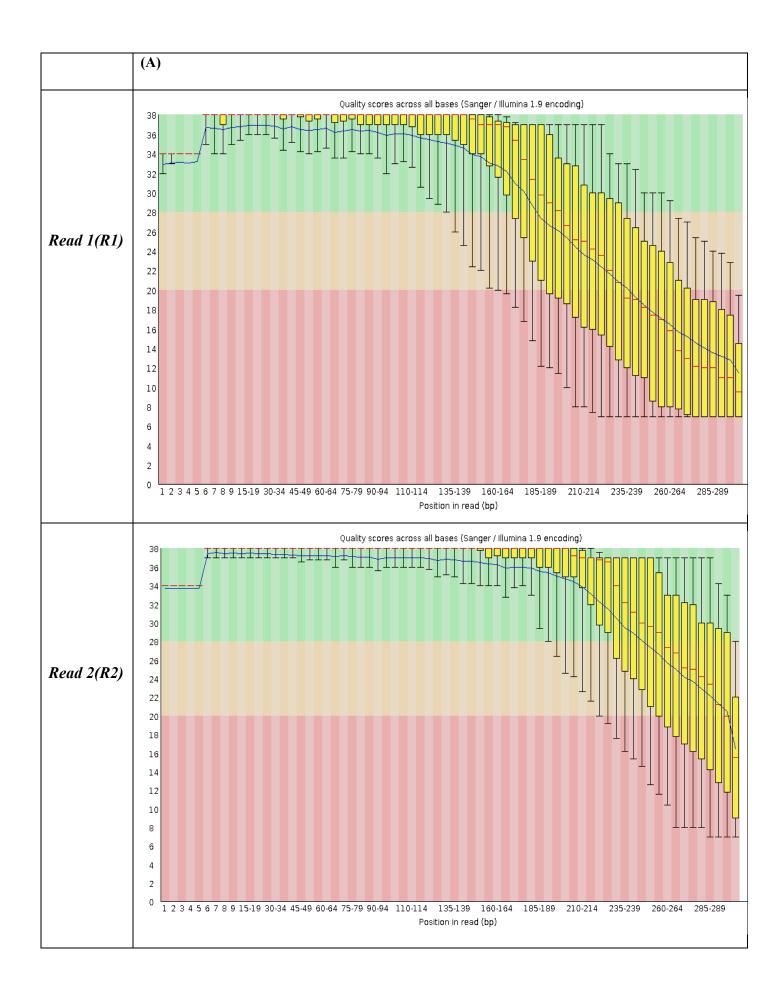


Figure 3.3: Final output directory folder containing all the ISBaC results.



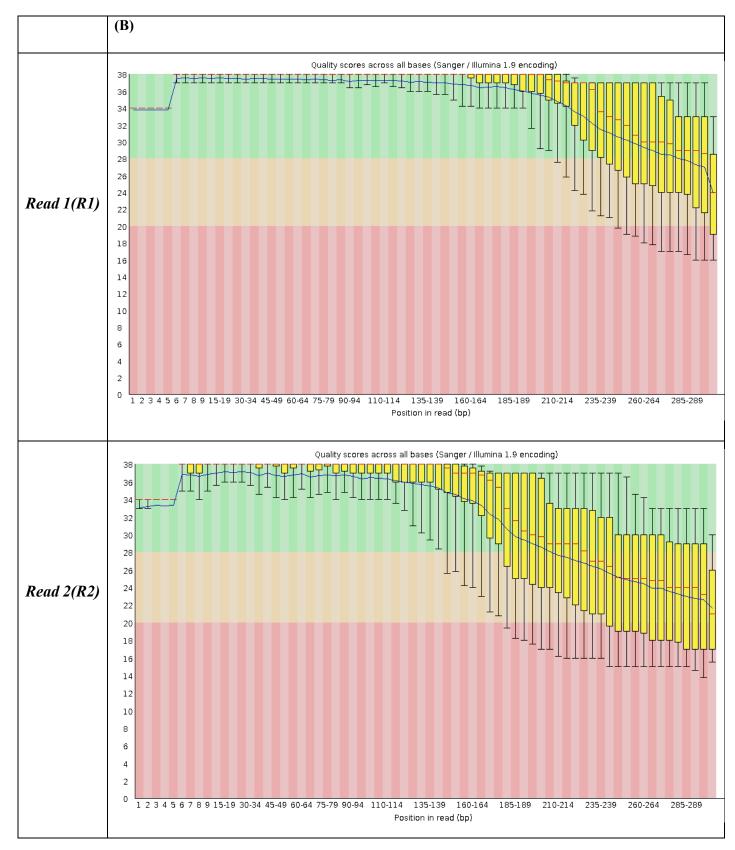


Figure 3.4: Per Base Sequence Quality in FastQC report.

(A) Per base quality plot for paired end raw data of *M. chelonae* (R1-R2) before trimming and filtering. (B) Per base quality plot for paired end raw data of *M. chelonae* (R1-R2) after trimming and filtering

#### 3.2 Genome assembly and annotation

Next, inside the "3.SPAdes\_Results" folder (Figure 3.3) is the genome assembly result using SPAdes. After the pre-processing step, the paired-end sequence of *M. chelonae* was assembled using the SPAdes assembler. The genome assembly analysis took 8 to 10 minutes with 4 core CPUs and 128GB RAM. The quality of the assembled genome was assessed using Quast. The Quast results were store in "4.Quast\_Results" (Figure 3.3). The Quast report shows that number of contig is 15 for the assembled genome. The assembled genome size is 5,035,181 bp. The largest contig size is 1,148,810 bp. The value of N50 is 981,998. The GC value is 63.9%, and there is zero number of mismatches and misassemblies.

The assembled draft genome from ISBaC has been compared with *M. chelonae* ATCC\_35752 in the NCBI, and our assembled genome have better quality in term of the N50 value. The assembled genome contains an N50 value of 981,998 compared with the N50 value of 936,739 for *M. chelonae* ATCC\_35752 in the NCBI (Hasan et al. 2015). Next, the assembled genome was annotated using Prokka. The annotation results were stored in the "9.PROKKA\_Results" folder (Figure 3.3). Prokka result contains predicted gene sequence in FASTA format with .fna extension, predicted protein sequences in FASTA format with .faa extension, master functional annotation file with .gff extension and a text file with statistics of annotated features.

# 3.3 Mycobacterial identification using the 16S rRNA gene analysis

The 16S rRNA gene sequence from the query genome is aligned to the locally created reference database of mycobacterium species to identify the regions of local similarity. The threshold level of 98% (Beye, Fahsi, Raoult, & Fournier 2018) indicates the identity of the same species. The BLAST result is stored in the "6.16SrRNA\_blastn\_results\_Barplot" folder (Figure 3.3). The BLAST result shows that both M. chelonae and M. franklini have 100% percentage identity with the query sequence (Nogueira et al. 2015). Following that, M. saopaulense has 99.78%, M abscessus has 99.73%, M. abscessus subsp bolletii has 99.73%, and M. salmoniphilum has 99.66%. These 6-identified species are all above the threshold level of 98% because many mycobacterial species share highly similar 16S rRNA gene sequences (Figure 3.5), so 16S rRNA gene analysis cannot differentiate among some closely related mycobacterium species (Turenne, Tschetter, Wolfe, & Kabani 2001). Hence, from the 16S rRNA gene analysis, the query genome can be any of the 6-identified species. Again, to check the inter and intraspecies similarity, we selected the top 10 hits from previous results and drew a similarity matrix of those values using R.

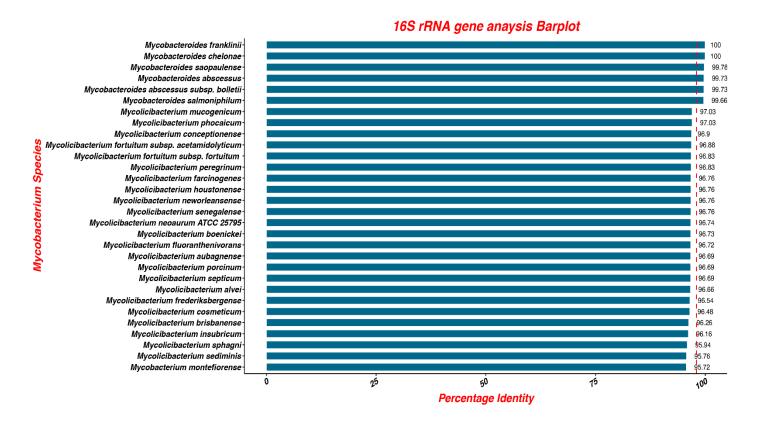


Figure 3.5: Bar chart of top 30 mycobacterial species

Bar chart of blastn results showing the top 30 hits with their percentage identity values after comparing the query sequence of *M. chelonae* with the local database. The red line indicates the threshold value of 98%, which measures species-level mycobacterial identity using 16S rRNA gene analysis.

#### 3.4 Mycobacterial Identification using Multilocus sequence analysis (MLSA)

The 5-housekeeping genes (gyrA, gyrB, rpoB, groEL, and recA) in the query genome were identified. The extracted housekeeping genes were further compared with the MLSA reference genes database to check the regions of local similarity with 170 other mycobacterial species. The output file was stored in folder "11.MLSA blastn results BarPlot" (Figure 3.3). The threshold level of 97% indicates the identity of species (Liu, Lai, & Shao 2017a). Our MLSA result shows that our query genome has the highest similarity to M. chelonae (100%), followed by M. saopaulense (92.21%), M. franklinii (91.38%) and M. salmoniphilum (91.34%). The result shows that only M. chelonae is above the threshold level of 97% (Figure 3.6). Thus, the MLSA result had identified the identity of the query genome as M. chelonae. The result has shown that ISBaC can identify the specie correctly with the MLSA sequence analysis. The similarity matrix file stored the folder "13.MLSA Similarity matrix results SmatrixPlot" (Figure 3.3). The result shows the percentage identity values of every species against all ten hits (Figure 3.7). It takes 6 to 9 minutes to perform these steps.

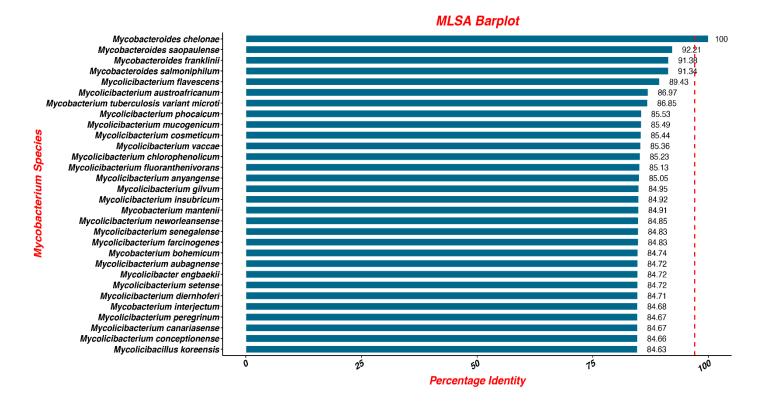


Figure 3.6: Bar chart of top 30 mycobacterial species

Bar chart of blastn results showing the top 30 hits with their percentage identity values after comparing the query sequence of *M. chelonae* with the local database. The red line indicates the threshold value of 97%, which measures species-level mycobacterial identity using multilocus sequence analysis.

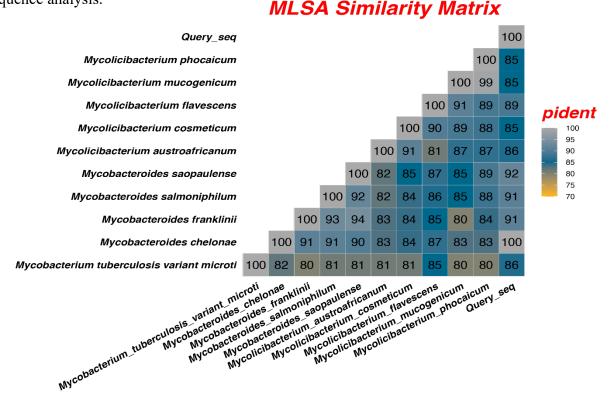


Figure 3.7: Similarity matrix of top 10 mycobacterial species

The similarity matrix of the top 10 hits of blastn results indicates the inter and intraspecies level percentage identity values, ranging from 70 to 100.

#### 3.5 Mycobacterial Identification using whole genome sequence

ISBaC included 2 softwares to identify the identity of the mycobacterial species using whole-genome sequence. The 2 softwares are Mash and FastANI.

#### 3.5.1 Mash: fast genome and metagenome distance estimation using MinHash

Mash estimates the distance from the query sequence to each database reference sequence (Ondov et al. 2016). First MinHash sketch (clustering of reference genome) of all the genome sequence of 170 reference mycobacterial species was constructed. Next, the query genome sequence was compared with the reference MinHash sketched to calculate the Mash distance. The results of MinHash were in tab-delimited lists of Reference-ID, Query-ID, Mash-distance, P-value, and Matching-Hashes stored in folder "14.mash\_Results" (Figure 3.3). These MinHash and representative sketches are ANI and approximate one minus MinHash distance...eg 1- 0.000434439 = 0.999565561 \*100 = 99.95% (Figure 3.8).

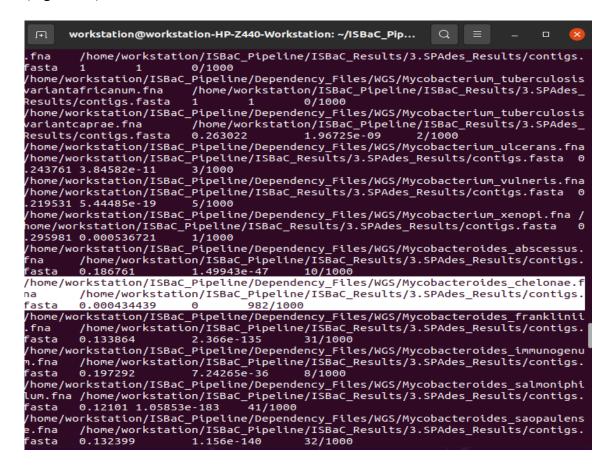


Figure 3.8: MinHash Results.

MinHash result of M. chelonge which shows Mash distance of 0.000434439.

#### 3.5.2 Fast whole genome similarity estimation tool (FastANI)

FastANI calculates the average nucleotide identity between genomes (Jain et al. 2018). ANI values are computed by comparing the whole genome sequence with the reference genome sequences. The output of FastANI is stored in the folder "15.fastANI\_Results" (Figure 3.3). The result shows that the estimated ANI value between the query genome sequence to M. chelonae reference genome is 99.9882%. The second highest match is M. salmoniphilum which is 87.49%. Strains with ANI value of  $\geq$ 95% will be considered as the same species (Konstantinidis & Tiedje 2005). Thus, our result show that ISBaC identify the identity of the query genome correctly as M. chelonae.

ISBaC has shown the top 30 hits with the highest ANI values through a heatmap. The colour in the heatmap varies according to the percentage ANI values among the mycobacterium species, and *M.chelonae* have the highest percentage identity value of 99%, and it shows green colour (Figure 3.9).

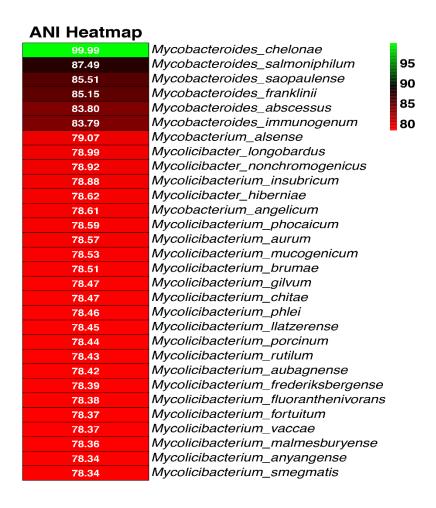


Figure 3.9: FastANI Heatmap.

The heatmap is showing that *M. chelonae* have the highest percentage identity value. Genome with ANI values range from 75 to 85 show red colour, genome with ANI values ranging from 85 to 95 show black colour and lastly genome with ANI values ranging from 95 to 100 show green colour in the heatmap.

## 3.6 Virulence gene predication

ISBaC also predicts the virulence profile of the query genome. The annotated protein sequences of the query genome from Prokka (SRR786668) were queried using the VFDB database. Result showed that a total of 267 non-redundant virulence genes were predicted across the genome. These virulence genes can be categorized into functional categories including amino acid and purine metabolism, anaerobic respiration and stress adaptation, lipid and fatty acid metabolism, phagosome arresting, culture filtrate proteins, transcriptional regulators, mammalian cell entry operons, cell envelope proteins and metal transporter proteins as shown in Table 3.2 (Ripoll et al. 2009).

Table 3.2: List of functional categories of virulence genes found in query genome

Functional categories of virulence genes	Virulence genes found in query genome	Function of virulence genes found in query genome
Amino acid and purine metabolism	glnA1, leuD, lysA, proC, purC, trpD	These genes encode for enzymes that helps in biosynthesis of some amino acids and purines.
Anaerobic respiration and stress adaptation	narX, narG, narH, narI, narK2, katG, sodC, soda, ompA	These genes encode for enzymes superoxide dismutases and catalases and these enzymes are crucial for the body's response to various external oxidative stresses.
Lipid and fatty acid metabolism	icl, lipE, panC, panD, sapM, plcA, plcB, plcC, plcD, mqtC	These genes help in modulation of lipid biosynthesis in mycobacteria.
Phagosome arresting	PE PGRS30, ptpA, mpa	These genes are involved with the arrest of phagosome trafficking.

Culture filtrate proteins	hspX, fbpA, fbpB, fbpC, eis, pknG, secA2, PE35, PPE68, eccA1, eccB1, eccCa1, eccCb1, eccD1, eccE1, espA, espB, espC, espD, espE, espF, espG1, espH, espI, espJ, espK, espL, espR, esxA, esxB, mycP1, PE36, PPE69, eccA2, eccB2, eccC2, eccD2, eccE2, espG2, esxC, esxD, mycP2, PE5, PPE4, eccA3, eccB3, eccC3, eccD3, eccE3, espG3, esxG, esxH, eccB4, eccC4, eccD4, esxT, esxU, mycP4, PE18,PE19, PPE25, PPE26, PPE27, PPE41, cyp143, eccA5, eccB5, eccCa5, eccCb5, eccD5, eccE5, esxM, esxN, mycP5, ahpC	These proteins are expected to be exposed to the environment in which bacteria grows. They encode for the enzymes that degrades ROIs and important for survival of mycobacteria during infection.
Transcriptional Regulators	devR/dosR, devS, mosR, mprA, mprB, phoP, phoR, prrA, regX3, senX3, sigA/rpoV, sigD, sigE, sigF, sigH, sigL, sigM, whiB3, lpqH	
Mammalian cell entry (mce) operons	Mce1 (mce1B, (mce1C, (mce1D, (mce1E, (mce1F) Mce2 (mce2A, mce2B, mce2C, mce2D, mce2E, mce2F) Mce3 (mce3A, mce3B, mce3C, mce3D, mce3E, mce3F) Mce4 (mce4A, mce4B, mce4C, mce4D, mce4E, mce4F) Mce5	These proteins enable mycobacteria to enter mammalian cells and survive in the macrophages.

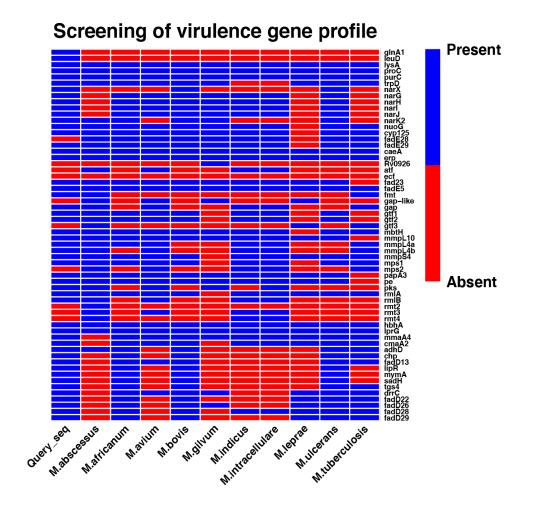
	(mce5A, mce5B, mce5C, mce5D,	
	mce5E, mce5F) Mce6 (mce6A,	
	mce6B, mce6C, mce6D, mce6E,	
	mce6F) Mce7 (mce7A, mce7B,	
	mce7C, mce7D, mc75E, mce7F)	
	Mce8 (mce8A, mce8B, mce8C,	
	mce8D, mce8E, mce8F) Mce9	
	(mce9A, mce9B, mce9C, mce9D,	
	тсе9Е, тсе9F)	
Cell envelope proteins	caeA, erp, fad23, fadE5, fmt, gap,	These genes encode for surface
	gtf1, gtf2, mbtH, mmpL4a,	proteins, and they assist in the
	mmpL4b, mmpS4, mps1, papA3,	adhesion of mycobacteria to the
	pe, pks, rmlA, rmlB, hbhA, lprG,	surface and promotes their entry into
	mmaA4, cmaA2, adhD, chp, lipR,	the host cell.
	mymA, sadH, tgs4, drrC, fadD22,	
	fadD26, fadD28, fadD29, lppx,	
	lppx, mas, mmpL7, papA5,	
	pks15/1, ppsA, ppsB, ppsC, ppsD,	
	ppsE, tesA, kefB, pcaA, mmpL8,	
	papA1, papA2, pks2, stf0, chp1,	
	fad23, icl2, lpqY, sap, sugA, sugB,	
	sugC, ctpV	
Metal transporter		
proteins	mceA, $irtA$ , $irtB$ , $exiT$ , $fxbA$ ,	These genes encode for proteins that
	fxbBC, fxuA, fxuB, fxuC, fxuD,	are involved in iron and magnesium
	mmpL11, mmpl3, ideR, fadD33,	acquisition and causes the
	fadE14, mbtA, mbtB, mbtC,	attenuation of virulence
	mbtD, mbtE, mbtF, mbtG, mbtH,	
	mbtI, mbtJ, mbtK, kasB	

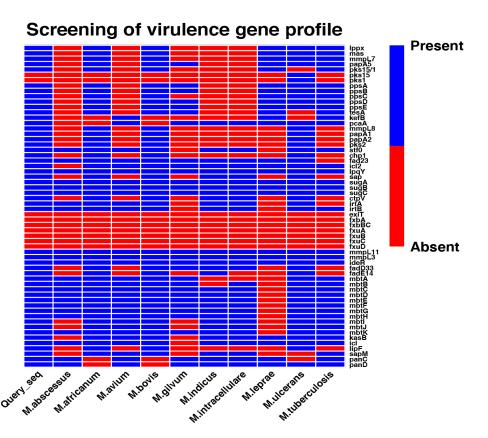
#### **Comparative pathogenomics**

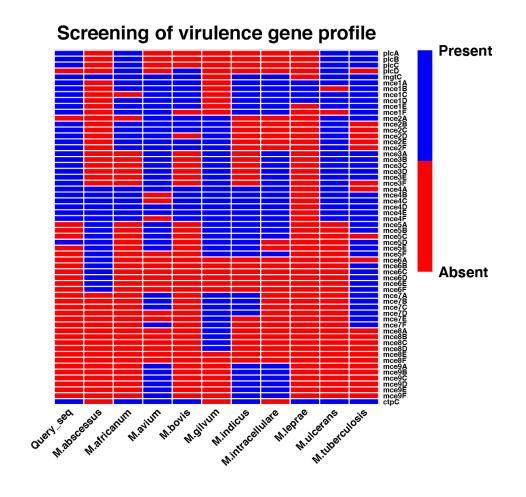
ISBaC further perform the comparative pathogenomic analysis by comparing the virulence genes in the query genome (*M.tuberculosis*) with 10 other mycobacterium species. ISBaC create a gene presence and absence matrix, and graphically presented it through a heatmap using R. The results were stored in the "16. Virulence gene prediction\_Results" folder (Figure 3.3). Each row in the heatmap represent a virulence gene. Blue colour in the heatmap indicates the presence of virulence genes while red colour indicates the absence of virulence gene (Figure 3.10). Different number of virulence genes have been observed in the query genome (*M.tuberculosis*) compare to the 10 mycobacterium species as shown in Table 3.3 and Appendix 3. 234 virulent genes have been found in query genome (*M.tuberculosis*) which is almost similar to the number of virulent genes in *M.tuberculosis* reference genome. 36 virulence genes (*lysA*, *proC*, *purC*, *caeA*, *erp*, *fadE5*, *hbhA*, *lprG*, *lpqY*, *sugA*, *sugB*, *sugC*, *mmpL11*, *mmpL3*, *ideR*, *mpa*, *relA*, *mprA*, *mprB*, *prrA*, *senX*, *sigA/rpoV*, *sigE*, *lpqH*, *pknG*, *secA2*, *espR*, *PPE4*, *eccA3*, *eccB3*, *eccD3*, *eccE3*, *espG3*, *esxH*, *mycP3*, *sodC*) were found to be shared among all the *mycobacterium* species and 2 virulence genes (*glnA1*, *leuD*) were found only in the query sequence.

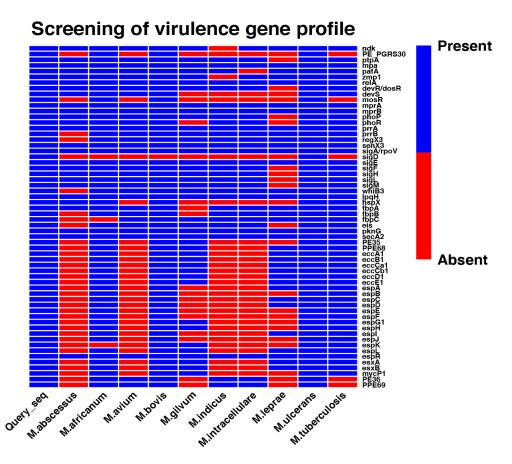
Table 3.3: Number of virulence gene in mycobacterium species

Mycobacterium species	Number of virulence genes
Query genome (SRR786668)	234
M.abscessus	125
M.africanum	216
M.avium	181
M.bovis	214
M.gilvum	151
M.indicus pranii	172
M.intracellulare	173
M.leprae	108
M.ulcerans	201
M.tuberculosis	226









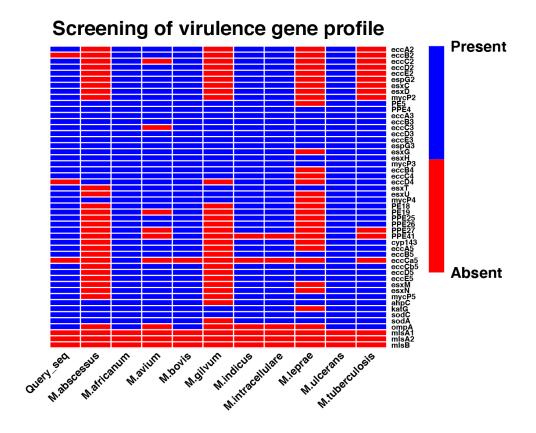


Figure 3.10: Heatmap of comparative pathgenomic analysis.

Blue color indicates presence of particular virulence gene and red color indicates absence of the virulence gene.

### 3.7 Calculation of ISBaC's accuracy through statistical analysis

The accuracy of ISBaC was first tested on the ten different *M. chelonae* samples as input. ISBaC can identify *M. chelonae* as the top hit in all the three analyses for each run. Table 3.4 shows the top hit and identity value for the three analyses in each run.

Table 3.4: Top hit and identity value for all the three analyses of 10 M.chelonae samples

Input sequence	Top hit	16S rRNA	MLSA	ANI
Mycobacteroides chelonae (ATCC35752)	Mycobacteroides chelonae	100.00%	100.00%	100.00%
Mycobacteroides chelonae (DRS014067)	Mycobacteroides chelonae	99.79%	99.50%	99.34%
Mycobacteroides chelonae (D16R3)	Mycobacteroides chelonae	99.79%	99.50%	99.34%
Mycobacteroides chelonae (96-1705)	Mycobacteroides chelonae	99.79%	99.50%	99.34%

Mycobacteroides chelonae (96-1717)	Mycobacteroides chelonae	99.79%	100.00%	99.97%
Mycobacteroides chelonae (D16Q24)	Mycobacteroides chelonae	100.00%	99.60%	99.59%
Mycobacteroides chelonae (D16R7)	Mycobacteroides chelonae	100.00%	99.60%	99.59%
Mycobacteroides chelonae (D16R9)	Mycobacteroides chelonae	99.79%	99.50%	99.34%
Mycobacteroides chelonae (96-1720)	Mycobacteroides chelonae	99.79%	99.50%	99.34%
Mycobacteroides chelonae (D16R10)	Mycobacteroides chelonae	100.00%	99.97%	99.99%

Based on the identity value from each run, we calculated the confidence interval (CI) value with 0.05 significant level for all the three analyses. Results show that the 95% CI for  $16S \, rRNA$  gene analysis was 99.80 to 99.95, 95% CI for MLSA was 99.51 to 99.83% and 95% CI for ANI was 99.37 to 99.79%. So, statistically, we were able to say that: say that: in repeated bacterial samples, 95% of the C.I.s for the mean share identity of ten totally different samples of M. chelonae determined by ISBaC pipeline is higher than the cutoff value of  $16S \, rRNA = 98$ , MLSA = 97, ANI =  $\geq$ 95 (Figure 3.11). Thus, ISBaC was able to capture the true identity value for all M.chelonae samples for all the three analyses.

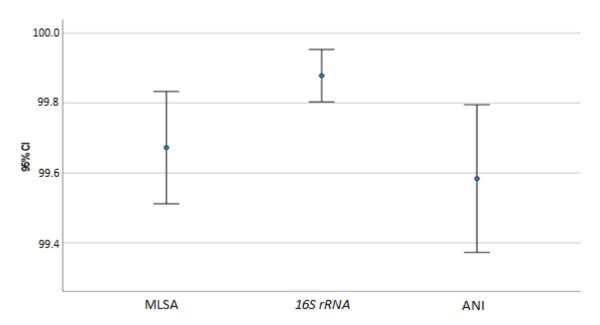


Figure 3.11: Error bar for 16S rRNA, MLSA and ANI analysis calculated by the ISBaC result on 10 M.chelonae samples

Next, the same statistical analysis was performed on ten different mycobacterium species samples as input. The Table 3.5 below show the top hit and identity value for all the three analyses in each run.

Table 3.5: Top hit and identity value for all the three analyses of 10 different *mycobacterium* species samples

		MLSA	ANI
Mycobacterium tuberculosis	100.00%	100.00%	100.00%
Mycobacterium kansasii	99.79%	99.50%	99.34%
Mycobacteroides franklinii	99.79%	99.50%	99.34%
Mycobacteroides salmoniphilum	99.79%	99.50%	99.34%
Mycobacterium intracellulare	99.79%	100.00%	99.97%
Mycolicibacter arupensis	100.00%	99.60%	99.59%
Mycolicibacterium iranicum	100.00%	99.60%	99.59%
Mycobacterium chimaera	99.79%	99.50%	99.34%
Mycobacterium ulcerans	99.79%	99.50%	99.34%
Mycobacteroides chelonae	100.00%	99.97%	99.99%
	Mycobacterium kansasii  Mycobacteroides franklinii  Mycobacteroides salmoniphilum  Mycobacterium intracellulare  Mycolicibacter arupensis  Mycolicibacterium iranicum  Mycobacterium chimaera  Mycobacterium ulcerans	Mycobacterium kansasii 99.79%  Mycobacteroides franklinii 99.79%  Mycobacteroides salmoniphilum 99.79%  Mycobacterium intracellulare 99.79%  Mycolicibacter arupensis 100.00%  Mycolicibacterium iranicum 100.00%  Mycobacterium chimaera 99.79%  Mycobacterium ulcerans 99.79%	Mycobacterium kansasii       99.79%       99.50%         Mycobacteroides franklinii       99.79%       99.50%         Mycobacteroides salmoniphilum       99.79%       99.50%         Mycobacterium intracellulare       99.79%       100.00%         Mycolicibacter arupensis       100.00%       99.60%         Mycolicibacterium iranicum       100.00%       99.60%         Mycobacterium chimaera       99.79%       99.50%         Mycobacterium ulcerans       99.79%       99.50%

Again, ISBaC was able to identity the correct mycobacterium species samples as top hit in all the three analyses for each run. Based on the identity value, we calculated the 95% CI for  $16S \ rRNA$ : (99.55%, 100.14%), MLSA: (97.58%, 100.30%) and ANI: (97.45%,100.23%). Similarly, we can say that: in repeated samples, 95% of the C.I.s for the mean percentage identity of different mycobacterium species samples determined by ISBaC pipeline were above the threshold value of  $16S \ rRNA = 98$ , MLSA = 97 and ANI =  $\geq$ 95 (Figure 3.12). Thus, ISBaC was able to capture the true identity value for different mycobacterium species samples in all the three analyses.

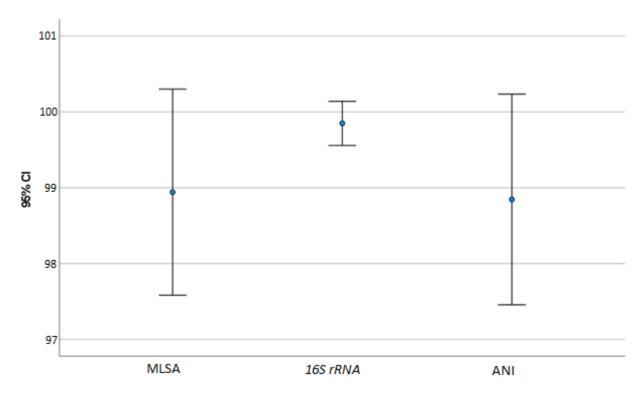


Figure 3.12: Error bar for 16S rRNA, MLSA and ANI analysis calculated by the ISBaC result on 10 different mycobacterium species samples

# 3.8 Determining the sensitivity of ISBaC pipeline by identifying closely related *mycobacterium* species

Some traditional methods like Polymerase chain reaction (PCR) and Matrix-assisted laser desorption/ionization-time of flight mass spectrometry (MALDI-TOF MS) cannot properly identify between closely related *mycobacterium* species (Prammanana 2005; Rychert 2019). Such a *M. kan sasii* and *M. gastri, M. malmoense* and *M. szulgai* who share a highly similar sequence so often traditional methods led to their misidentification (Beye, Fahsi, Raoult, & Fournier 2018; Jagielski et al. 2020).

Thus, to test the efficiency of ISBaC, we performed a comparison between *M. gastri* with *M. kansasii and M. malmoense* with *M. szulgai*. First, we used *M. malmoense* (SRR6046816) as the input sequence and ran it through ISBaC. Table 3.6 show the ISBaC result. ISBaC was able to identify SRR6046816 as *M. malmoense* correctly after the identity values in the three analyses (*16S rRNA*, MLSA and FastANI) are all above the threshold value. ISBaC was able to distinguish between *M. malmoense* and *M. szulgai* through the MLSA and FastANI result.

Table 3.6: ISBaC pipeline testing result for differentiating M. malmoense form M. szulgai.

Mycobacterium species	16S rRNA gene analysis	MLSA	FastANI
M. malmoense / M. malmoense	99.59%	98.75%	98.56%
M. malmoense / M. szulgai	99.04%	97.27%	96.54%

Next, we tested ISBaC on the *M. kansasii* (SRR3319297) raw sequence. Table 3.7 show the ISBaC result using *M. kansasii* (SRR3319297) raw data as the input sequences and it was noticed that ISBaC clearly identifies (SRR3319297) as *M. kansasii*, as the percentage identify values obtained from ISBaC were above the threshold values in three analyses (*16S rRNA*, MLSA, FastANI.). So, ISBaC was able to differentiate between *M. kansasii* and *M. gastri* through MLSA and FastANI.

Table 3.7: ISBaC pipeline testing result for differentiating M. kansasii from M. gastri

Mycobacterium species	16S rRNA gene analysis	MLSA	FastANI
M. kansasii / M. kansasii	99.86%	98.92%	98.96%
M. kansasii / M. gastri	99.84%	97.41%	96.67 %

### 3.9 Evaluating the reproducibility of ISBaC pipeline

We evaluated the reproducibility of ISBaC pipeline by using *M. chelonae* ATCC\_35752 (SRR4423483) as query sequence. We ran the same query sequence twice on the same and separate computational setting, respectively and each time it gave the same results by taking same amount of time as shown in Table 3.8.

Table 3.8: Evaluating the reproducibility of ISBaC pipeline by using M. chelonae

Query sequence	Computational setting	Time taken
M. chelonae ATCC_35752 (SRR4423483)	4 core CPUs & 128Gb RAM	1hour
M. chelonae ATCC_35752 (SRR4423483)	2 core CPUs & 64 Gb RAM	1.5 hour

#### **Chapter 4. Discussion**

Precise identification of microorganisms is required in almost every aspect of the research. Phenotypic methods present some limitations in terms of sensitivity, specificity, and time. These limitations are more evident for some types of slow-growing bacteria. Moreover, the time needed to identify a pathogen based on its phenotypic characteristics is the first challenge, as the sample must be seeded and incubated for at least 24 hours. Then, conventional biochemical tests must be performed at least another 24 hours, conditions that delay results and compromise the patient's health. Phenotypic methods cannot always identify the microorganism at species level and much less at strain level (Georghiou et al. 1995). This technique as a rule needs more than 48 hours after a colony isolation and more fourteen days are expected for the identification of many slow growing. In certain conditions, no identification can be made following quite a while of investigation, even by an accomplished technologist. Still, several aspects convolute their application in the microbial science research facility: the trouble in the segregation, the colony development, the expenses of the tests, and poor identification of bacterial species coming from complex samples, among others. They are likewise normally not accessible at research facilities of public emergency clinics and don't have an all-inclusive execution (Castro-Escarpulli et al. 2015).

The total time required for 16S rRNA gene sequencing, Multi Locus Sequence Typing (MLST) and whole genome sequencing are comparable to conventional phenotyping methods because both methods require some amount of time to grow bacterial culture for experiment. The 16S rRNA gene sequencing analysis takes around 9 hours per sample without bioinformatics work, and DNA-DNA hybridization takes 18 hours to give results (Ahmad et al. 2013; Gee et al. 2004). Besides, Multi Locus Sequence Typing (MLST) begin with PCR amplification step utilizing primers particular to the loci of the MLST scheme, followed by DNA sequencing. The strategy is both expensive and time consuming. In this modern time of high throughput sequencing, it may be more sound to utiliz e whole genome sequencing (WGS) information for genotyping. The cost of DNA sequencing has c onsistently gone down generally 10-fold each 5 a long time (Land et al. 2015), and the advancement of next- and third-generation sequencing strategies has provided equally great reductions in equipment investments, thus making the technology accessible to individual investigators and routine clinical and microbial laboratories. The challenge, however, is to extract the relevant information from the massive amount of knowledge generated by these techniques (Larsen et al. 2012). Several web-based analysis are available such as bacterial analysis pipeline (Thomsen et al. 2016), microbial identification and characterization through reads analysis (MICRA) (Caboche et al. 2017) and a Bioinformatics Bacterial Identification Tool (BIBI) (Devulder, Perrière, Baty, & Flandrois 2003).

However, these tools lack of user customization and typically require the user to enter their data into their servers, and the user can only upload raw data with limited size. The available genome analysis of a mycobacterial genome requires the usage of many bioinformatics tools. However, these tools might be complex to handle and give less accurate results during data transition from one software to another software because user need to separately set the parameters for every software.

Taken all together, the project's main objective is to develop an accurate and user-friendly pipeline for the identification of mycobacterial species. ISBaC is precise and user-friendly as the pipeline automates the whole identification process through only single command. ISBaC will take around an hour with 4 core CPUs and 128Gb RAM (can be faster depending on the computer core and system) to identify the mycobacterium species once users get the raw sequencing data. ISBaC is also designed to run on the user's computer without an internet connection, access accounts, and additional requirements. The user can upload any size of data depending on the specification of the users' system. ISBaC is designed to simplify and accelerate the bioinformatics analysis, especially for microbiology researchers and clinicians who lack of bioinformatics knowledge.

ISBaC can accept raw data from both single and paired-end sequencing generated from different sequencing platforms for example Illumina, PacBio. ISBaC includes all the required analyses to process the whole genome raw data and identify the identity of the Mycobacteria species. The pipeline includes raw reads pre-processing, genome assembly, genome annotation and mycobacterial identification using *16S rRNA* gene analysis, Multilocus sequence analysis (MLSA) and ANI analysis. All the analysis in ISBaC is automated and designed to be user-friendly. Users are required to key in only a single command to run the whole pipeline. Other than that, ISBaC is also easy to install as all the software's in ISBaC will be automatically downloaded in the user-specified directory by running a Perl script.

ISBaC integrates many mycobacterial identification steps like *16S rRNA* gene analysis, which identifies mycobacterium species based on the percentage identity values obtained from blastn. The threshold value for species identification through *16S rRNA* gene analysis is 98%. However, the *16S rRNA* gene sequences is not enough to discriminate between mycobacteria species because many mycobacterial species share highly similar *16S rRNA* gene sequences (Clarridge 2004). Thus, to further support the *16S rRNA* gene analysis result, the subsequent multilocus sequencing analysis (MLSA) has been performed. ISBaC will concatenate the housekeeping genes (*gyrA*, *gyrB*, *rpoB*, *groEL*, and *recA*) which are highly conserved, not vulnerable to horizonal gene transfer, long enough to contain phylogenetically useful information and could predict whole genome relationship (Rong & Huang 2014). ISBaC can handle the different combinations of the housekeeping genes according

to the availability of the housekeeping genes in the query genome. MLSA contains higher discrimination between the mycobacteria genomes than *16S rRNA* gene analysis (Liu, Lai, & Shao 2017b).

Other than gene level, ISBaC also identify *mycobacterium* species on the genome level. Single gene or housekeeping genes (hk) are still subjected to deletions, duplications, and mutations. The genome complexity of an organism is the complete history of genetic recombination's and other nucleotide sequence drifts that occurred during evolution (Sentausa & Fournier 2013). Thus, MinHash and FastANI have been integrated into ISBaC. ANI value of ≥95 % corresponds to a 70 % DNA-DNA hybridization (Konstantinidis & Tiedje 2005). Moreover, ISBaC provides results in the form of bar chart and heatmap for easier interpretation of results.

Other than the Mycobacterium identification analysis, ISBaC also contains genome annotation analysis. The assembled genome will be annotated using Prokka. Gene in the genome will be predicted, and the function of each gene will also be annotated. The predicted gene and protein sequence will be provided in FASTA format. Taken all together, ISBaC is designed to be executed using a simple command and is suitable for researchers lacking of bioinformatic background. In addition to that, ISBaC is intrinsically flexible to allow different customization.

In the last, we checked the accuracy and specificity of pipeline, and we found that ISBaC can identify the identity of mycobacterium species with 95% Confidence interval (CI) and it also captures the threshold values for 16S rRNA gene analysis, MLSA and ANI analysis in repeated samples. In addition to that ISBaC also showed higher sensitivity by differentiating among closely related mycobacterium species.

#### **Conclusion and future work**

An automated pipeline for *In silico* Bacterial Identification (ISBaC) has been developed to identify *mycobacterial* species. is a handy approach that can be used to identify bacterial species. ISBaC pipeline requires just one hour to identify Mycobacterium species with a 4 core CPUs and 128Gb RAM. The whole process can become even faster with higher core CPUs and RAM. ISBaC simplifies the user's task of analysing large amounts of raw read and whole-genome sequence data and provides an automated method for identification of mycobacterial species. Other than that, ISBaC also provides extra genome analysis such as genome annotation and virulence gene prediction. ISBaC pipeline is user-friendly by chains up all the required analyses to identify mycobacteria's identity with just a

single command. ISBaC has been tested with several validation cases and ISBaC manage to identify correctly the real identity of Mycobacterium species. ISBaC is designed in a way suitable for all students or microbiology researchers that lack of bioinformatics knowledge. ISBaC allows them to run Bioinformatics analysis more easily. All the embedded tools in ISBaC helps to better identify poorly described, rarely isolated *mycobacterial* species. ISBaC offers robust resolution between closely related mycobacterial species and can be routinely used for identification of mycobacteria.

Some aspects of this study still need some improvements as the pipeline can be tested with more different. Multilocus sequence analysis uses a combination of five housekeeping genes which can be increased to seven to eight genes for better accuracy. Thus multilocus sequence analysis can be refined further by incorporating more housekeeping gene data from five genes to seven to eight genes in future. Next, the developed database for the study just contains sequence data of *Mycobacterium* species which limits ISBaC to just the identification of *Mycobacterium* species. Therefore, ISBaC can be integrated into different genera by developing a database for that specific genus so the same analysis could be used for the identification of that genus. Lastly, ISBaC pipeline should also be transformed from a command-line tool to a pipeline with a graphical user interface (GUI).

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# Appendix

# Appendix 1: List of 16S rRNA genes

Mycobacterium Species	16S rRNA gene Size (bp)
Mycobacterium mantenii strain NLA000401474	1571
Mycobacterium marinum strain ATCC 927	1562
Mycobacterium marseillense strain 5356591	1570
Mycobacterium microti	1584
Mycobacterium monacense strain B9-21-178	1573
Mycobacterium montefiorense	1731
Mycobacterium moriokaense	1593
Mycolicibacterium mucogenicum strain ATCC 49650	1582
Mycobacterium murale	1559
Mycobacterium nebraskense strain UNMC-MY1349	1506
Mycobacterium alvei	1565
Mycobacterium neoaurum	1570
Mycolicibacterium neworleansense strain ATCC 49404	1583
Mycobacterium nonchromogenicum	1566
Mycobacterium noviomagense strain NLA000500338	1578
Mycobacterium novocastrense	1517
Mycobacterium obuense	1558
Mycobacterium pallens strain czh-8	1535
Mycobacterium palustre strain E84	1823
Mycobacterium paraense strain IEC26	1580
Mycobacterium paraffinicum strain ATCC 12670	1592
Mycobacterium angelicum strain DSM 45057T	1510
Mycobacterium parafortuitum	1560
Mycobacterium paragordonae strain 49061	1593
Mycobacterium parakoreense strain 299	1565
Mycobacterium parascrofulaceum strain BAA-614	1568
Mycobacterium paraseoulense strain 31118	1522
Mycobacterium parmense	1533
Mycolicibacterium peregrinum strain CIP 105382	1583
Mycobacterium phlei	1561
Mycolicibacterium phocaicum strain CIP 108542	1582

Mycobacterium pinnipedii	1581
Mycobacterium anyangense strain QIA-38	1560
Mycolicibacterium porcinum strain CIP 105392	1583
Mycobacterium poriferae	1550
Mycobacterium pseudoshottsii	1553
Mycobacterium psychrotolerans strain WA101T	1517
Mycobacterium pulveris strain DSM 44222T	1592
Mycobacterium sp. DSM 44605	1581
Mycobacterium rhodesiae strain DSM 44223T	1585
Mycobacterium riyadhense strain NLA000201958	1575
Mycobacterium rufum strain JS14	1559
Mycobacterium rutilum strain czh-117	1578
Mycobacterium arabiense strain YIM 121001	1535
Mycobacterium salmoniphilum strain ATCC 13758	1956
Mycobacterium saopaulense strain EPM10906	1584
Mycobacterium saskatchewanense strain NRCM 00-250	1824
Mycobacterium scrofulaceum	1566
Mycobacterium sediminis strain YIM M13028	1515
Mycolicibacterium senegalense strain CIP 104941	1583
Mycobacterium senuense strain 05-832	1527
Mycobacterium seoulense strain 03-19	1522
Mycolicibacterium septicum strain DSM 44393	1583
Mycobacterium setense strain ABO-M06	1566
Mycobacterium aromaticivorans strain JS19b1	1571
Mycobacterium sherrisi	1510
Mycobacterium shimoidei	1805
Mycobacterium shinjukuense strain: GTC 2738	1505
Mycobacterium sp. M175	1591
Mycobacterium simiae	1584
Mycobacterium smegmatis strain ATCC 19420	1587
Mycobacterium sphagni strain DSM44076T	1505
Mycobacterium stomatepiae strain DSM 45059T	1571
Mycobacterium szulgai	1562
Mycobacterium terrae	1563
Mycobacterium arosiense strain T1921	1593
Mycoodcierium drosiense strain 11921	1373

Mycobacterium tokaiense	1551
Mycobacterium triplex strain 90-1019	1574
Mycobacterium triviale strain TMC 1453	1562
Mycobacterium tuberculosis	2538
Mycobacterium sp. FI-25796	1589
Mycobacterium ulcerans strain: ATCC 19423	1575
Mycobacterium vaccae	1539
Mycobacterium vanbaalenii	1908
Mycobacterium vulneris strain NLA000700772	1571
Mycobacterium arupense strain AR30097	1587
Mycolicibacterium wolinskyi strain ATCC 700010	1585
Mycobacterium xenopi	1580
Mycobacterium yongonense 05-1390	1595
Mycobacterium asiaticum	1566
Mycolicibacterium aubagnense strain CIP 108543	1582
Mycobacterium aurum	1558
Mycobacterium austroafricanum	1562
Mycobacterium avium subsp. avium	1572
Mycobacterium paratuberculosis	1563
Mycobacterium avium subsp. silvaticum strain ATCC 49884	1542
Mycobacterium bonickei strain W5998	1598
Mycobacterium bohemicum	1516
Mycobacterium botniense	1787
Mycobacterium bouchedurhonense strain 4355387	1598
Mycobacterium bourgelatii	1584
Mycobacterium branderi	1569
Mycobacterium brisbanense strain W6743	1599
Mycobacterium brumae	1549
Mycobacterium canariasense	1533
Mycobacterium caprae	1524
Mycobacterium celatum	1460
Mycobacterium celeriflavum strain AFPC-000207	1562
Mycobacteroides chelonae strain CIP 104535	1581
Mycobacterium chimaera strain FI-0169T	1766
Mycobacterium chitae	1557
Mycobacterium chlorophenolicum DSM 43826	1566

Mycobacteroides abscessus strain CIP 104536	1581
Mycobacterium chubuense	1572
Mycobacterium colombiense train:10B	1807
Mycolicibacterium conceptionense strain CIP 108544	1583
Mycobacterium confluentis strain DSM 44017T	1504
Mycobacterium conspicuum	1593
Mycobacterium cookii	1559
Mycobacterium cosmeticum strain LTA-388	1507
Mycobacterium crocinum strain czh-42	1598
Mycobacterium diernhoferi	1558
Mycobacterium doricum	1550
Mycobacteroides abscessus subsp. bolletii strain CIP 108541	1581
Mycobacterium duvalii	1502
Mycobacterium elephantis	1517
Mycobacterium engbaekii	1568
Mycobacterium europaeum strain DSM 45397	1796
Mycobacterium fallax	1570
Mycolicibacterium farcinogenes strain NCTC 10955	1583
Mycobacterium flavescens	1554
Mycobacterium florentinum strain FI-93171T	1788
Mycobacterium fluoranthenivorans strain FA-4	1594
Mycobacterium fortuitum subsp. acetamidolyticum strain DSM442	1505
Mycobacterium africanum	1533
Mycolicibacterium fortuitum subsp. fortuitum DSM 46621	1583
Mycobacterium fragae strain HF8705	1552
Mycobacterium franklinii strain CV002	1506
Mycobacterium frederiksbergense strain DSM 44346	1574
Mycobacterium gadium	1556
Mycobacterium gastri	1569
Mycobacterium genavense	1549
Mycobacterium gilvum	1528
Mycobacterium goodii	1517
Mycobacterium gordonae	1561
Mycobacterium agri strain DSM 44515T	1556
Mycobacterium haemophilum strain DSM 44634	1526
Mycobacterium hassiacum	1591

Mycobacterium heckeshornense	1527
Mycobacterium heidelbergense	1545
Mycobacterium heraklionense strain NCTC 13432	1527
Mycobacterium hiberniae	1519
Mycobacterium hippocampi strain BFLP-6T	1573
Mycobacterium hodleri	1559
Mycobacterium holsaticum strain 1406	1526
Mycolicibacterium houstonense strain ATCC 49403	1583
Mycobacterium aichiense	1556
Mycobacterium insubricum strain FI-06250	1995
Mycobacterium interjectum ATCC:51457	1531
Mycobacterium intermedium	1541
Mycobacterium intracellulare	1540
Mycobacterium iranicum strain M05	1550
Mycobacterium kansasii	1570
Mycobacterium komossense	1562
Mycobacterium koreense strain 01-305	1574
Mycobacterium kubicae	1561
Mycobacterium kumamotonense strain: CST7274	1564
Mycobacterium algericum DSM 45454	1521
Mycobacterium kyorinense strain: KUM 060204	1570
Mycobacterium lacus	1570
Mycobacterium lentiflavum	1552
Mycobacterium leprae	1585
Mycobacterium litorale strain F4	1580
Mycobacterium llatzerense	1597
Mycobacterium longobardum strain DSM 45394	1560
Mycobacterium madagascariense	1570
Mycobacterium mageritense strain DSM 44476	1597
Mycobacterium malmoense	1563
Mycobacterium alsense strain TB 1906T	1565

# Appendix 2: List of whole-genome sequence

Mycobacterium species	Genome Size (bp)
Mycobacterium alsense strain E2978	5656398
Mycobacterium angelicum strain DSM 45057	6662911
Mycobacterium aquaticum strain RW6	7927592
Mycobacterium arosiense ATCC BAA-1401	5980206
Mycobacterium asiaticum strain 1081914.2	6035124
Mycobacterium avium subsp. paratuberculosis K-10	4829781
Mycobacterium bohemicum strain DSM 44277	5420516
Mycobacterium botniense strain JCM 17322	4335050
Mycobacterium bouchedurhonense strain DSM 45439	5897311
Mycobacterium bourgelatii strain JCM 30725	6912804
Mycobacterium branderi strain DSM 44624	5903509
Mycobacterium canettii CIPT 140010059	4482059
Mycobacterium celatum strain ATCC 51131	4662053
Mycobacterium colombiense CECT 3035	5579559
Mycobacterium conspicuum strain DSM 44136	6200614
Mycobacterium cookii strain JCM 12404	5318517
Mycobacterium europaeum strain DSM 45397	5630674
Mycobacterium florentinum strain DSM 44852	6178353
Mycobacterium fragae strain DSM 45731	4731047
Mycobacterium gastri strain DSM 43505	5816659
Mycobacterium genavense ATCC 51234	4936071
Mycobacterium gordonae strain CTRI 14-8773	7552315
Mycobacterium haemophilum strain UC3	4363991
Mycobacterium heckeshornense strain RLE	5010173
Mycobacterium heidelbergense strain DSM 44471	4999105
Mycobacterium intermedium strain HMC2_M5	6854888
Mycobacterium intracellulare ATCC 13950	5328562

Mycobacterium kansasii ATCC 12478         6432277           Mycobacterium kubicae strain ACS1160         5618076           Mycobacterium lacus strain DSM 44577         4905288           Mycobacterium leprae TN         3268203           Mycobacterium liflandii 128FXT         6208955           Mycobacterium manienii strain E152         5836558           Mycobacterium marienii Strain E152         5836558           Mycobacterium marinum M         6636827           Mycobacterium marseillense strain 1165549.7         5255222           Mycobacterium montefiorense strain BS         5742797           Mycobacterium montefiorense strain DSM 45145         4739740           Mycobacterium palustre strain DSM 44572         6037522           Mycobacterium paraense strain IEC26         5619528           Mycobacterium paragordonae strain 49061         6730319           Mycobacterium paragordonae strain DSM 45000         6078492           Mycobacterium paraeseoulense strain DSM 44553         5891740           Mycobacterium pseudoshottsii JCM 15466         6061597           Mycobacterium riyadhense strain DSM 45176         6269850           Mycobacterium saskatchewanense strain DSM 44616         5930935           Mycobacterium shimioidei strain HMC_M2         4720739           Mycobacterium shimioidei strain CCUG 53584 <th>Mycobacterium intracellulare subsp. chimaera strain FLAC0070</th> <th>5408332</th>	Mycobacterium intracellulare subsp. chimaera strain FLAC0070	5408332
Mycobacterium lacus strain DSM 44577         4905288           Mycobacterium leprae TN         3268203           Mycobacterium liflandii 128FXT         6208955           Mycobacterium mantenii strain E152         5836558           Mycobacterium mantenii strain E152         5836558           Mycobacterium marinum M         6636827           Mycobacterium marinum M         6636827           Mycobacterium marinum M         6636827           Mycobacterium marinum M         5742797           Mycobacterium montefiorense strain BS         5742797           Mycobacterium noviomagense strain DSM 45145         4739740           Mycobacterium palustre strain DSM 44572         6037522           Mycobacterium paraense strain IEC26         5619528           Mycobacterium paragordonae strain 49061         6730319           Mycobacterium paragordonae strain 49061         6730319           Mycobacterium paraeseulense strain DSM 45000         6078492           Mycobacterium paraeseulense strain DSM 44553         5891740           Mycobacterium pseudoshottsii JCM 15466         6061597           Mycobacterium saskatchewanense strain DSM 44616         5930935           Mycobacterium seconfulaceum strain E3039         5536898           Mycobacterium shimoidei strain HMC M2         4720739	Mycobacterium kansasii ATCC 12478	6432277
Mycobacterium leprae TN         3268203           Mycobacterium liflandii 128FXT         6208955           Mycobacterium mantenii strain E152         5836558           Mycobacterium mantenii strain E152         5836558           Mycobacterium marinum M         6636827           Mycobacterium marinum M         6636827           Mycobacterium marinum M         5255222           Mycobacterium monefiorense strain BS         5742797           Mycobacterium noviomagense strain BS         4739740           Mycobacterium palustre strain DSM 445145         4739740           Mycobacterium palustre strain DSM 44572         6037522           Mycobacterium paraense strain EC26         5619528           Mycobacterium paragordonae strain 49061         6730319           Mycobacterium paragordonae strain 49061         6730319           Mycobacterium paraseoulense strain DSM 45000         6078492           Mycobacterium paraese strain DSM 44553         5891740           Mycobacterium pseudoshottsii JCM 15466         6061597           Mycobacterium sakatchewanense strain DSM 445176         6269850           Mycobacterium sakatchewanense strain DSM 44616         5930935           Mycobacterium sherrisii strain BC1_M4         5685834           Mycobacterium shinoidei strain HMC_M2         4720739	Mycobacterium kubicae strain ACS1160	5618076
Mycobacterium liflandii 128FXT         6208955           Mycobacterium mantenii strain E152         5836558           Mycobacterium marinum M         6636827           Mycobacterium marseillense strain 1165549.7         5255222           Mycobacterium montefiorense strain BS         5742797           Mycobacterium noviomagense strain DSM 45145         4739740           Mycobacterium palustre strain DSM 44572         6037522           Mycobacterium paraense strain IEC26         5619528           Mycobacterium paraffinicum strain M11         6474701           Mycobacterium paragordonae strain 49061         6730319           Mycobacterium paraintracellulare         5501090           Mycobacterium paraseoulense strain DSM 45000         6078492           Mycobacterium parmense strain DSM 44553         5891740           Mycobacterium pseudoshottsii JCM 15466         6061597           Mycobacterium riyadhense strain DSM 45176         6269850           Mycobacterium sakatchewanense strain DSM 44616         5930935           Mycobacterium seoulense strain JCM 16018         5531300           Mycobacterium shimoidei strain HMC_M2         4720739           Mycobacterium shimoidei strain HMC_M2         4720739           Mycobacterium shimiae strain MsiGto         6686819           Mycobacterium simulans strain FB-5	Mycobacterium lacus strain DSM 44577	4905288
Mycobacterium mantenii strain E152         5836558           Mycobacterium marinum M         6636827           Mycobacterium marseillense strain 1165549.7         5255222           Mycobacterium montefiorense strain BS         5742797           Mycobacterium noviomagense strain DSM 45145         4739740           Mycobacterium palustre strain DSM 44572         6037522           Mycobacterium paraense strain IEC26         5619528           Mycobacterium parafinicum strain M11         6474701           Mycobacterium paragordonae strain 49061         6730319           Mycobacterium paraseoulense strain DSM 45000         6078492           Mycobacterium paraseoulense strain DSM 44553         5891740           Mycobacterium pseudoshottsii JCM 15466         6061597           Mycobacterium riyadhense strain DSM 45176         6269850           Mycobacterium sakatchewanense strain DSM 44616         5930935           Mycobacterium seoulense strain JCM 16018         5531300           Mycobacterium shimoidei strain HMC_M2         4720739           Mycobacterium shimoidei strain HCM2         4720739           Mycobacterium simiae strain MsiGto         6686819           Mycobacterium similaen strain FB-527         6234132	Mycobacterium leprae TN	3268203
Mycobacterium marinum M         6636827           Mycobacterium marseillense strain 1165549.7         5255222           Mycobacterium montefiorense strain BS         5742797           Mycobacterium noviomagense strain DSM 45145         4739740           Mycobacterium palustre strain DSM 44572         6037522           Mycobacterium paraense strain IEC26         5619528           Mycobacterium paraffinicum strain M11         6474701           Mycobacterium paragordonae strain 49061         6730319           Mycobacterium paraintracellulare         5501090           Mycobacterium paraseoulense strain DSM 45000         6078492           Mycobacterium parmense strain DSM 44553         5891740           Mycobacterium pseudoshottsii JCM 15466         6061597           Mycobacterium riyadhense strain DSM 45176         6269850           Mycobacterium sakatchewanense strain DSM 44616         5930935           Mycobacterium seoulense strain JCM 16018         5531300           Mycobacterium sherrisii strain BC1_M4         5685834           Mycobacterium shimidei strain HMC_M2         4720739           Mycobacterium shimiae strain MsiGto         6686819           Mycobacterium simiae strain FB-527         6234132	Mycobacterium liflandii 128FXT	6208955
Mycobacterium marseillense strain 1165549.7         5255222           Mycobacterium montefiorense strain BS         5742797           Mycobacterium noviomagense strain DSM 45145         4739740           Mycobacterium palustre strain DSM 44572         6037522           Mycobacterium paraense strain IEC26         5619528           Mycobacterium paraffinicum strain M11         6474701           Mycobacterium paragordonae strain 49061         6730319           Mycobacterium paraintracellulare         5501090           Mycobacterium paraseoulense strain DSM 45000         6078492           Mycobacterium parmense strain DSM 44553         5891740           Mycobacterium pseudoshottsii JCM 15466         6061597           Mycobacterium riyadhense strain DSM 45176         6269850           Mycobacterium sakatchewanense strain DSM 44616         5930935           Mycobacterium seoulense strain JCM 16018         5531300           Mycobacterium sherrisii strain BC1_M4         5685834           Mycobacterium shimioidei strain HMC_M2         4720739           Mycobacterium shimjukuense strain CCUG 53584         4409896           Mycobacterium simiae strain MsiGto         6686819           Mycobacterium simialars strain FB-527         6234132	Mycobacterium mantenii strain E152	5836558
Mycobacterium montefiorense strain BS         5742797           Mycobacterium noviomagense strain DSM 45145         4739740           Mycobacterium palustre strain DSM 44572         6037522           Mycobacterium paraense strain IEC26         5619528           Mycobacterium paraffinicum strain M11         6474701           Mycobacterium paragordonae strain 49061         6730319           Mycobacterium paraintracellulare         5501090           Mycobacterium paraseoulense strain DSM 45000         6078492           Mycobacterium parmense strain DSM 44553         5891740           Mycobacterium pseudoshottsii JCM 15466         6061597           Mycobacterium riyadhense strain DSM 45176         6269850           Mycobacterium saskatchewanense strain DSM 44616         5930935           Mycobacterium seoulense strain JCM 16018         5531300           Mycobacterium sherrisii strain BC1_M4         5685834           Mycobacterium shimoidei strain HMC_M2         4720739           Mycobacterium shimilae strain JCM 12657         5973149           Mycobacterium similae strain MsiGto         6686819           Mycobacterium simulans strain FB-527         6234132	Mycobacterium marinum M	6636827
Mycobacterium noviomagense strain DSM 45145         4739740           Mycobacterium palustre strain DSM 44572         6037522           Mycobacterium paraense strain IEC26         5619528           Mycobacterium paraffinicum strain M11         6474701           Mycobacterium paragordonae strain 49061         6730319           Mycobacterium paraintracellulare         5501090           Mycobacterium paraseoulense strain DSM 45000         6078492           Mycobacterium parmense strain DSM 44553         5891740           Mycobacterium pseudoshottsii JCM 15466         6061597           Mycobacterium riyadhense strain DSM 45176         6269850           Mycobacterium saskatchewanense strain DSM 44616         5930935           Mycobacterium scrofulaceum strain E3039         5536898           Mycobacterium sherrisii strain JCM 16018         5531300           Mycobacterium shimoidei strain HMC_M2         4720739           Mycobacterium shinjukuense strain CCUG 53584         4409896           Mycobacterium simiae strain MsiGto         6686819           Mycobacterium simulans strain FB-527         6234132	Mycobacterium marseillense strain 1165549.7	5255222
Mycobacterium palustre strain DSM 44572         6037522           Mycobacterium paraense strain IEC26         5619528           Mycobacterium paraffinicum strain M11         6474701           Mycobacterium paragordonae strain 49061         6730319           Mycobacterium paraintracellulare         5501090           Mycobacterium paraseoulense strain DSM 45000         6078492           Mycobacterium parmense strain DSM 44553         5891740           Mycobacterium pseudoshottsii JCM 15466         6061597           Mycobacterium riyadhense strain DSM 45176         6269850           Mycobacterium saskatchewanense strain DSM 44616         5930935           Mycobacterium scoofulaceum strain E3039         5536898           Mycobacterium seoulense strain JCM 16018         5531300           Mycobacterium shimoidei strain HMC_M2         4720739           Mycobacterium shimjukuense strain CCUG 53584         4409896           Mycobacterium shiniae strain MsiGto         6686819           Mycobacterium simulans strain FB-527         6234132	Mycobacterium montefiorense strain BS	5742797
Mycobacterium paraense strain IEC265619528Mycobacterium paraffinicum strain M116474701Mycobacterium paragordonae strain 490616730319Mycobacterium paraintracellulare5501090Mycobacterium paraseoulense strain DSM 450006078492Mycobacterium parmense strain DSM 445535891740Mycobacterium pseudoshottsii JCM 154666061597Mycobacterium riyadhense strain DSM 451766269850Mycobacterium saskatchewanense strain DSM 446165930935Mycobacterium scrofulaceum strain E30395536898Mycobacterium seoulense strain JCM 160185531300Mycobacterium sherrisii strain BC1_M45685834Mycobacterium shimoidei strain HMC_M24720739Mycobacterium shinjukuense strain JCM 126575973149Mycobacterium simiae strain MsiGto6686819Mycobacterium simiae strain FB-5276234132	Mycobacterium noviomagense strain DSM 45145	4739740
Mycobacterium paraffinicum strain M116474701Mycobacterium paragordonae strain 490616730319Mycobacterium paraintracellulare5501090Mycobacterium paraseoulense strain DSM 450006078492Mycobacterium parmense strain DSM 445535891740Mycobacterium pseudoshottsii JCM 154666061597Mycobacterium riyadhense strain DSM 451766269850Mycobacterium saskatchewanense strain DSM 446165930935Mycobacterium scrofulaceum strain E30395536898Mycobacterium seoulense strain JCM 160185531300Mycobacterium sherrisii strain BC1_M45685834Mycobacterium shinjukuense strain CCUG 535844409896Mycobacterium shottsii strain JCM 126575973149Mycobacterium simiae strain MsiGto6686819Mycobacterium simulans strain FB-5276234132	Mycobacterium palustre strain DSM 44572	6037522
Mycobacterium paragordonae strain 49061         6730319           Mycobacterium paraintracellulare         5501090           Mycobacterium paraseoulense strain DSM 45000         6078492           Mycobacterium parmense strain DSM 44553         5891740           Mycobacterium pseudoshottsii JCM 15466         6061597           Mycobacterium riyadhense strain DSM 45176         6269850           Mycobacterium saskatchewanense strain DSM 44616         5930935           Mycobacterium scrofulaceum strain E3039         5536898           Mycobacterium seoulense strain JCM 16018         5531300           Mycobacterium shimoidei strain HMC_M2         4720739           Mycobacterium shimoidei strain HMC_M2         4720739           Mycobacterium shottsii strain JCM 12657         5973149           Mycobacterium simiae strain MsiGto         6686819           Mycobacterium simulans strain FB-527         6234132	Mycobacterium paraense strain IEC26	5619528
Mycobacterium paraintracellulare5501090Mycobacterium paraseoulense strain DSM 450006078492Mycobacterium parmense strain DSM 445535891740Mycobacterium pseudoshottsii JCM 154666061597Mycobacterium riyadhense strain DSM 451766269850Mycobacterium saskatchewanense strain DSM 446165930935Mycobacterium scrofulaceum strain E30395536898Mycobacterium seoulense strain JCM 160185531300Mycobacterium sherrisii strain BC1_M45685834Mycobacterium shimoidei strain HMC_M24720739Mycobacterium shinjukuense strain CCUG 535844409896Mycobacterium shottsii strain JCM 126575973149Mycobacterium simiae strain MsiGto6686819Mycobacterium simulans strain FB-5276234132	Mycobacterium paraffinicum strain M11	6474701
Mycobacterium paraseoulense strain DSM 450006078492Mycobacterium parmense strain DSM 445535891740Mycobacterium pseudoshottsii JCM 154666061597Mycobacterium riyadhense strain DSM 451766269850Mycobacterium saskatchewanense strain DSM 446165930935Mycobacterium scrofulaceum strain E30395536898Mycobacterium seoulense strain JCM 160185531300Mycobacterium sherrisii strain BC1_M45685834Mycobacterium shinoidei strain HMC_M24720739Mycobacterium shinjukuense strain CCUG 535844409896Mycobacterium shottsii strain JCM 126575973149Mycobacterium simiae strain MsiGto6686819Mycobacterium simulans strain FB-5276234132	Mycobacterium paragordonae strain 49061	6730319
Mycobacterium parmense strain DSM 44553         5891740           Mycobacterium pseudoshottsii JCM 15466         6061597           Mycobacterium riyadhense strain DSM 45176         6269850           Mycobacterium saskatchewanense strain DSM 44616         5930935           Mycobacterium scrofulaceum strain E3039         5536898           Mycobacterium seoulense strain JCM 16018         5531300           Mycobacterium sherrisii strain BC1_M4         5685834           Mycobacterium shimoidei strain HMC_M2         4720739           Mycobacterium shinjukuense strain CCUG 53584         4409896           Mycobacterium shottsii strain JCM 12657         5973149           Mycobacterium simiae strain MsiGto         6686819           Mycobacterium simulans strain FB-527         6234132	Mycobacterium paraintracellulare	5501090
Mycobacterium pseudoshottsii JCM 154666061597Mycobacterium riyadhense strain DSM 451766269850Mycobacterium saskatchewanense strain DSM 446165930935Mycobacterium scrofulaceum strain E30395536898Mycobacterium seoulense strain JCM 160185531300Mycobacterium sherrisii strain BC1_M45685834Mycobacterium shimoidei strain HMC_M24720739Mycobacterium shinjukuense strain CCUG 535844409896Mycobacterium shottsii strain JCM 126575973149Mycobacterium simiae strain MsiGto6686819Mycobacterium simulans strain FB-5276234132	Mycobacterium paraseoulense strain DSM 45000	6078492
Mycobacterium riyadhense strain DSM 451766269850Mycobacterium saskatchewanense strain DSM 446165930935Mycobacterium scrofulaceum strain E30395536898Mycobacterium seoulense strain JCM 160185531300Mycobacterium sherrisii strain BC1_M45685834Mycobacterium shimoidei strain HMC_M24720739Mycobacterium shinjukuense strain CCUG 535844409896Mycobacterium shottsii strain JCM 126575973149Mycobacterium simiae strain MsiGto6686819Mycobacterium simulans strain FB-5276234132	Mycobacterium parmense strain DSM 44553	5891740
Mycobacterium saskatchewanense strain DSM 446165930935Mycobacterium scrofulaceum strain E30395536898Mycobacterium seoulense strain JCM 160185531300Mycobacterium sherrisii strain BC1_M45685834Mycobacterium shimoidei strain HMC_M24720739Mycobacterium shinjukuense strain CCUG 535844409896Mycobacterium shottsii strain JCM 126575973149Mycobacterium simiae strain MsiGto6686819Mycobacterium simulans strain FB-5276234132	Mycobacterium pseudoshottsii JCM 15466	6061597
Mycobacterium scrofulaceum strain E30395536898Mycobacterium seoulense strain JCM 160185531300Mycobacterium sherrisii strain BC1_M45685834Mycobacterium shimoidei strain HMC_M24720739Mycobacterium shinjukuense strain CCUG 535844409896Mycobacterium shottsii strain JCM 126575973149Mycobacterium simiae strain MsiGto6686819Mycobacterium simulans strain FB-5276234132	Mycobacterium riyadhense strain DSM 45176	6269850
Mycobacterium seoulense strain JCM 160185531300Mycobacterium sherrisii strain BC1_M45685834Mycobacterium shimoidei strain HMC_M24720739Mycobacterium shinjukuense strain CCUG 535844409896Mycobacterium shottsii strain JCM 126575973149Mycobacterium simiae strain MsiGto6686819Mycobacterium simulans strain FB-5276234132	Mycobacterium saskatchewanense strain DSM 44616	5930935
Mycobacterium sherrisii strain BC1_M45685834Mycobacterium shimoidei strain HMC_M24720739Mycobacterium shinjukuense strain CCUG 535844409896Mycobacterium shottsii strain JCM 126575973149Mycobacterium simiae strain MsiGto6686819Mycobacterium simulans strain FB-5276234132	Mycobacterium scrofulaceum strain E3039	5536898
Mycobacterium shimoidei strain HMC_M24720739Mycobacterium shinjukuense strain CCUG 535844409896Mycobacterium shottsii strain JCM 126575973149Mycobacterium simiae strain MsiGto6686819Mycobacterium simulans strain FB-5276234132	Mycobacterium seoulense strain JCM 16018	5531300
Mycobacterium shinjukuense strain CCUG 535844409896Mycobacterium shottsii strain JCM 126575973149Mycobacterium simiae strain MsiGto6686819Mycobacterium simulans strain FB-5276234132	Mycobacterium sherrisii strain BC1_M4	5685834
Mycobacterium shottsii strain JCM 126575973149Mycobacterium simiae strain MsiGto6686819Mycobacterium simulans strain FB-5276234132	Mycobacterium shimoidei strain HMC_M2	4720739
Mycobacterium simiae strain MsiGto6686819Mycobacterium simulans strain FB-5276234132	Mycobacterium shinjukuense strain CCUG 53584	4409896
Mycobacterium simulans strain FB-527 6234132	Mycobacterium shottsii strain JCM 12657	5973149
	Mycobacterium simiae strain MsiGto	6686819
	Mycobacterium simulans strain FB-527	6234132
Mycobacterium stomatepiae strain JCM 17783 6210822	Mycobacterium stomatepiae strain JCM 17783	6210822

Mycobacterium szulgai strain DSM 44166	6672659
Mycobacterium timonense strain CCUG 56329	6009989
Mycobacterium triplex strain DSM 44626	6366285
Mycobacterium tuberculosis H37Rv	4411532
Mycobacterium tuberculosis variant africanum K85 supercont1.1	4432952
Mycobacterium tuberculosis variant caprae strain MB2	4278564
Mycobacterium ulcerans Agy99	5631606
Mycobacterium vulneris strain DSM 45247	6266718
Mycobacterium xenopi RIVM700367	4434836
Mycobacteroides abscessus strain FLAC013	5074222
Mycobacterium chelonae	4898027
Mycobacteroides franklinii strain 1559	5023635
Mycobacteroides immunogenum strain SMUC14	5566491
Mycobacteroides salmoniphilum strain D16Q15	4934017
Mycobacteroides saopaulense strain EPM10906	4649175
Mycolicibacillus koreensis strain HMC_M3	3873226
Mycolicibacillus trivialis strain DSM 44153	3591083
Mycolicibacter algericus DSM 45454	4619277
Mycolicibacter arupensis strain GUC1	4441410
Mycolicibacter engbaekii strain ATCC 27353	4521435
Mycolicibacter heraklionensis strain Davo	5109649
Mycolicibacter hiberniae strain ATCC 49874	4342192
Mycolicibacterium aichiense strain JCM 6376	5925482
Mycolicibacterium alvei strain JCM 12272	5712683
Mycolicibacterium anyangense strain JCM 30275	5696751
Mycolicibacterium arabiense strain JCM 18538	6017160
Mycolicibacterium aromaticivorans JS19b1 = JCM 16368 strain JS19b1	6297623
Mycolicibacterium aubagnense strain DSM 45150 6191255	6191255
Mycolicibacterium aurum isolate liquid 6038730	6038730

Mycolicibacterium boenickei strain CCUG47580	6544811
Mycolicibacterium brisbanense strain JCM15654	7387429
Mycolicibacterium brumae strain CIP1034565	3878367
Mycolicibacterium canariasense strain JCM15298	6734449
<i>Mycolicibacterium celeriflavum</i> strain 852002-51296_SCH5728562-a	4927128
Mycolicibacterium chitae strain JCM 12403	5482061
Mycolicibacterium chlorophenolicum strain DSM 43826	7379285
Mycolicibacterium chubuense NBB4	5583723
Mycolicibacterium conceptionense strain MLE	7098887
Mycolicibacterium confluentis strain DSM 44017	5841691
Mycolicibacterium cosmeticum strain DSM 44829	6446106
Mycolicibacterium diernhoferi strain Bard	5981922
Mycolicibacterium doricum strain DSM 44339	3952103
Mycolicibacterium duvalii strain IP141180004	5603691
Mycolicibacterium elephantis strain Lipa	5187616
Mycolicibacterium fallax strain DSM 44179	4232450
Mycolicibacterium farcinogenes strain DSM 43637	6062162
Mycolicibacterium flavescens strain M6	5972870
Mycolicibacterium fluoranthenivorans strain DSM 44556	6408998
Mycolicibacterium fortuitum subsp. fortuitum DSM 46621 = ATCC 6841 strain DSM 46621	6300050
Mycolicibacterium frederiksbergense strain LB 501T	6086872
Mycolicibacterium gadium strain JCM 12688	5964999
Mycolicibacterium gilvum PYR-GCK	5619607
Mycolicibacterium goodii strain X7B	7105933
Mycolicibacterium hassiacum DSM 44199	5000164
Mycolicibacterium helvum strain JCM 30396	6400811
Mycolicibacterium hippocampi strain JCM 30996	6160733
Mycolicibacterium hodleri strain S5.20	6384412
Mycolicibacterium holsaticum strain M7	5748336

Mycolicibacterium houstonense strain ATCC 49403T	5525743
Mycolicibacterium insubricum strain DSM 45130	4553680
Mycolicibacterium iranicum strain H39	6484789
Mycolicibacterium komanii strain GPK 1020	5378970
Mycolicibacterium litorale strain CGMCC 4.5724 Ga0104440_101	2126661
Mycolicibacterium llatzerense strain CLUC14	6091591
Mycolicibacterium madagascariense strain JCM 13574	5712088
Mycolicibacterium mageritense strain JCM 12375	8006721
Mycolicibacterium malmesburyense strain WCM 7299	5470555
Mycolicibacterium monacense strain 852013-50142_SCH4511227	5627631
Mycolicibacterium moriokaense strain CIP105393	6217364
Mycolicibacterium mucogenicum strain CSUR P2099	6210127
Mycolicibacterium murale strain JCM 13392	6838280
Mycolicibacterium neoaurum VKM Ac-1815D	5421267
Mycolicibacterium neworleansense strain ATCC 49404T	3252791
Mycolicibacterium novocastrense strain GA-2617	5639806
Mycolicibacterium obuense strain UC1	6381451
Mycolicibacterium parafortuitum strain CCUG 20999	6136108
Mycolicibacterium peregrinum strain CSUR P2098	7109636
Mycolicibacterium phlei RIVM601174	5681954
Mycolicibacterium phocaicum strain DSM 45104	5771543
Mycolicibacterium porcinum strain ACS3670	6778270
Mycolicibacterium poriferae strain JCM 12603	5712830
Mycolicibacterium psychrotolerans strain JCM 13323	5732362
Mycolicibacterium pulveris strain JCM 6370	5484749
Mycolicibacterium rhodesiae NBB3	6415739
Mycobacterium rufum strain JS14	6176413
Mycolicibacterium rutilum strain DSM 45405	5987931
Mycolicibacterium sarraceniae strain JCM 30395	4828255
Mycolicibacterium sediminis strain JCM 17899	6250641
	<u>I</u>

Mycolicibacterium senegalense strain CK1	6738555
Mycolicibacterium septicum DSM 44393 strain type strain: DSM 44393	6872299
Mycolicibacterium setense strain Manresensis	6065527
Mycolicibacterium smegmatis MC2 155	6988209
Mycolicibacterium sphagni strain ATCC 33027	6066978
Mycolicibacterium thermoresistibile ATCC 19527	4870742
Mycolicibacterium tokaiense strain JCM 6373	6328149
Mycolicibacterium tusciae JS617	7306213
Mycolicibacterium vaccae ATCC 25954	6223660
Mycolicibacterium vanbaalenii PYR-1	6491865
Mycolicibacterium wolinskyi strain CDC_01	7449739
Mycolicibacter kumamotonensis strain Roo	5329013
Mycolicibacter longobardus strain DSM 45394	4812247
Mycolicibacter minnesotensis strain DSM 45633	4187822
Mycolicibacter nonchromogenicus strain DSM 44164	4465329
Mycolicibacter senuensis strain DSM 44999	4534628
Mycolicibacter sinensis	4643668
Mycolicibacter terrae strain CIP 104321	4524815

Appendix 3: Screening of virulence gene profile

Relate genes	Query _seq	M.abs cessus	M.afric anum	M.avi um	M.b ovis	M.gilv um	M.in dicu s	M.intr acellu lare	M.lep rae	M.ulc erans	M.tub erculo sis
glnAl	1	0	0	0	0	0	0	0	0	0	0
leuD	1	0	0	0	0	0	0	0	0	0	0
lysA	1	1	1	1	1	1	1	1	1	1	1
proC	1	1	1	1	1	1	1	1	1	1	1
purC	1	1	1	1	1	1	1	1	1	1	1
trpD	1	1	1	1	1	1	0	0	1	1	1
narX	1	0	0	0	1	0	0	0	0	1	0
narG	1	0	1	1	1	1	1	1	0	1	0
narH	1	0	1	1	1	1	1	1	0	1	0
narI	1	0	1	1	1	1	1	1	0	1	0
narJ	1	0	1	1	1	1	1	1	0	1	0
narK2	1	1	1	0	1	1	0	0	0	1	0
nuoG	1	1	1	1	1	1	1	1	0	1	1
cyp125	1	1	1	1	1	1	1	1	0	1	1
fadE28	0	1	1	1	1	1	1	1	0	1	1
fadE29	1	1	1	1	1	1	1	1	0	1	1
caeA	1	1	1	1	1	1	1	1	1	1	1
erp	1	1	1	1	1	1	1	1	1	1	1
Rv0926	0	0	0	0	0	1	0	0	0	0	0
atf	0	1	0	1	0	0	1	1	0	0	0
ecf	0	0	0	0	0	0	0	0	0	0	0
fad23	1	1	1	1	1	1	1	1	1	1	0
fadE5	1	1	1	1	1	1	1	1	1	1	1
fmt	1	1	0	0	0	0	0	0	0	0	1
gap-like	0	1	0	1	0	1	0	0	1	0	0
gap	1	1	0	1	0	0	1	1	0	0	1

gtfl	1	1	1	1	1	0	1	1	0	1	0
gtf2	1	1	1	1	1	0	1	1	0	1	0
gtf3	0	1	0	0	0	0	0	0	1	0	1
mbtH	1	1	1	1	1	1	1	1	0	1	1
mmpL10	1	1	1	1	1	1	1	1	1	1	0
mmpL4a	1	1	1	1	0	0	1	1	0	0	1
mmpL4b	1	1	0	1	0	0	1	1	0	0	1
mmpS4	1	1	1	1	1	0	1	1	1	1	1
mps1	1	1	1	1	1	0	1	1	0	1	1
mps2	0	1	0	1	0	0	1	1	0	0	1
papA3	1	1	1	1	1	1	1	1	1	1	0
pe	1	1	1	1	1	1	1	1	1	1	0
pks	1	1	0	1	0	1	0	1	0	0	0
rmlA	1	1	1	1	1	0	1	1	1	1	1
rmlB	1	1	0	1	0	0	1	1	0	0	0
rmt2	0	1	0	0	0	0	0	0	0	0	0
rmt3	0	1	0	1	0	0	1	1	0	0	0
rmt4	0	1	0	0	0	0	1	1	0	0	0
hbhA	1	1	1	1	1	1	1	1	1	1	1
lprG	1	1	1	1	1	1	1	1	1	1	1
mmaA4	1	0	1	1	1	1	1	1	1	1	1
cmaA2	1	0	1	1	1	0	1	1	1	1	1
adhD	1	1	1	0	1	0	0	0	0	1	1
chp	1	0	1	0	1	0	0	0	0	1	1
fadD13	1	0	1	1	1	0	0	0	0	1	1
lipR	1	0	1	0	1	0	0	0	0	1	0
mymA	1	0	1	0	1	0	0	0	0	1	0
sadH	1	0	1	0	1	0	0	0	0	1	0
tgs4	1	0	1	0	1	0	0	0	0	1	1
drrC	1	0	1	1	1	1	0	0	1	1	1

fadD22	1	0	1	0	1	0	0	0	1	1	1
fadD26	1	0	1	0	1	1	0	0	1	1	1
fadD28	1	0	1	0	1	0	1	1	1	1	1
fadD29	1	0	1	0	1	0	0	0	1	1	1
lppx	1	0	1	0	1	0	0	0	1	1	1
mas	1	0	1	0	1	0	0	0	1	1	1
mmpL7	1	0	1	0	1	0	0	0	1	1	1
papA5	1	0	1	0	1	1	0	0	1	1	1
pks15/1	1	0	1	0	1	0	0	0	1	0	1
pks15	0	0	0	0	0	0	0	0	0	1	0
pks1	0	0	0	0	0	0	0	0	0	1	0
ppsA	1	0	1	0	1	1	0	0	1	1	1
ppsB	1	0	1	0	1	1	0	0	1	1	1
ppsC	1	0	1	0	1	0	0	0	1	1	1
ppsD	1	0	1	0	1	1	0	0	1	1	1
ppsE	1	0	1	0	1	1	0	0	1	1	1
tesA	1	0	1	0	1	1	0	0	1	0	1
kefB	1	0	0	1	0	0	0	0	1	0	1
pcaA	1	0	0	1	0	1	1	1	1	1	1
mmpL8	1	0	1	0	1	0	0	0	0	1	0
papA1	1	0	1	0	1	0	0	0	0	1	0
papA2	1	0	1	0	1	0	0	0	0	1	0
pks2	1	0	1	0	1	0	0	0	0	1	0
stf0	1	1	1	1	1	0	1	1	0	1	1
chp1	1	0	1	0	1	0	0	0	0	1	0
fad23	1	1	1	1	1	1	1	1	1	1	0
icl2	1	0	1	1	1	1	1	1	1	1	1
lpqY	1	1	1	1	1	1	1	1	1	1	1
sap	1	0	1	0	1	0	1	1	0	1	0
sugA	1	1	1	1	1	1	1	1	1	1	1

sugB	1	1	1	1	1	1	1	1	1	1	1
sugC	1	1	1	1	1	1	1	1	1	1	1
ctpV	1	0	1	0	1	0	1	1	0	1	0
irtA	1	1	1	1	1	0	1	1	0	1	0
irtB	1	1	1	1	1	0	1	1	0	1	1
exiT	0	0	0	0	0	0	0	0	0	0	0
fxbA	0	0	0	0	0	0	0	0	0	0	0
fxbBC	0	0	0	0	0	0	0	0	0	0	0
fxuA	0	0	0	0	0	0	0	0	0	0	0
fxuB	0	0	0	0	0	0	0	0	0	0	0
fxuC	0	0	0	0	0	0	0	0	0	0	0
fxuD	0	0	0	0	0	0	0	0	0	0	0
mmpL11	1	1	1	1	1	1	1	1	1	1	1
mmpL3	1	1	1	1	1	1	1	1	1	1	1
ideR	1	1	1	1	1	1	1	1	1	1	1
fadD33	1	0	1	0	1	1	1	1	0	1	0
fadE14	1	0	1	0	1	0	1	0	0	1	0
mbtA	1	1	1	1	1	1	0	0	0	1	1
mbtB	1	1	1	1	1	1	0	1	0	1	1
mbtC	1	1	1	1	1	1	1	1	0	1	1
mbtD	1	1	1	1	1	1	1	1	0	1	1
mbtE	1	1	1	1	1	1	1	1	0	1	1
mbtF	1	1	1	1	1	1	1	1	0	1	1
mbtG	1	1	1	1	1	1	1	1	0	1	1
mbtH	1	1	1	1	1	1	1	1	0	1	1
mbtI	1	0	1	1	1	0	1	1	0	1	1
mbtJ	1	0	1	1	1	0	1	1	0	1	1
mbtK	1	1	1	1	1	1	1	1	0	1	1
kasB	1	0	1	1	1	0	1	1	1	1	1
icl	1	1	1	1	1	0	1	1	1	1	1

lipF	1	0	1	0	1	0	0	0	0	1	0
sapM	1	0	1	1	1	0	1	1	0	0	1
panC	1	1	0	1	0	1	1	1	1	0	1
panD	1	1	0	1	0	1	1	1	1	1	1
plcA	1	0	1	0	0	0	0	0	0	1	1
plcB	1	0	1	0	0	0	0	0	0	1	1
plcC	1	0	1	0	0	0	0	0	0	1	1
plcD	0	0	1	0	1	0	0	0	0	1	0
mgtC	1	1	1	1	1	0	1	1	0	1	1
mce1A	1	0	1	1	1	0	1	1	1	1	1
mce1B	1	0	1	1	1	0	1	1	1	0	1
mce1C	1	0	0	1	1	0	1	1	1	1	1
mce1D	1	0	1	1	1	0	1	1	1	1	1
mce1E	1	0	1	1	1	0	1	1	0	1	1
mcelF	1	0	1	1	0	0	1	1	0	0	1
mce2A	0	0	0	1	1	1	0	0	0	1	1
mce2B	1	0	1	1	1	1	0	0	0	1	0
mce2C	1	0	1	1	1	1	0	0	0	1	0
mce2D	1	0	1	1	0	1	0	0	0	1	0
mce2E	1	0	1	1	1	1	0	0	0	1	0
mce2F	1	0	1	1	1	1	0	0	0	1	0
mce3A	1	0	0	1	0	1	0	1	0	1	1
тсе3В	1	0	0	1	0	1	0	1	0	1	1
mce3C	1	0	0	1	0	1	0	1	0	1	1
mce3D	1	0	0	1	0	1	0	1	0	1	1
тсе3Е	1	0	0	1	0	1	0	1	0	1	1
mce3F	1	0	0	1	0	1	0	1	0	1	0
mce4A	1	1	1	1	1	1	1	1	0	1	0
mce4B	1	1	1	0	1	1	1	1	0	1	1
mce4C	1	1	1	0	1	1	1	1	0	1	1

mce4D	1	1	1	1	1	1	1	1	0	1	1
mce4E	1	1	1	1	1	1	1	1	0	1	1
mce4F	1	1	1	0	1	1	1	1	0	1	1
mce5A	0	1	0	1	0	1	1	1	0	0	1
тсе5В	0	1	0	1	0	1	1	1	0	0	1
mce5C	0	1	0	1	0	1	1	1	0	0	0
mce5D	1	1	0	1	0	1	1	0	0	0	1
mce5E	0	1	0	1	0	1	1	0	0	0	1
mce5F	0	1	0	0	0	1	1	1	0	0	1
тсе6А	0	1	0	0	0	0	0	0	0	0	0
тсе6В	0	1	0	0	0	0	0	0	0	0	1
тсе6С	0	1	0	0	0	0	0	0	0	0	1
mce6D	0	1	0	0	0	0	0	0	0	0	1
тсе6Е	0	1	0	0	0	0	0	0	0	0	1
тсе6F	0	1	0	0	0	0	0	0	0	0	1
mce7A	0	0	0	1	0	1	1	0	0	0	1
тсе7В	0	0	0	1	0	1	1	0	0	0	1
mce7C	0	0	0	1	0	1	1	0	0	0	1
mce7D	0	0	0	0	0	1	1	0	0	0	1
mce7E	0	0	0	0	0	1	0	0	0	0	1
mce7F	0	0	0	1	0	1	0	0	0	0	1
mce8A	0	0	0	0	0	1	0	0	0	0	0
mce8B	0	0	0	0	0	1	0	0	0	0	0
mce8C	0	0	0	0	0	1	0	0	0	0	0
mce8D	0	0	0	0	0	1	0	0	0	0	0
mce8E	0	0	0	0	0	0	0	0	0	0	0
mce8F	0	0	0	0	0	0	0	0	0	0	0
mce9A	0	0	0	1	0	0	1	1	0	0	0
тсе9В	0	0	0	1	0	0	1	1	0	0	0
тсе9С	0	0	0	1	0	0	1	1	0	0	0

mce9D	0	0	0	1	0	0	1	1	0	0	0
тсе9Е	0	0	0	1	0	0	1	1	0	0	0
mce9F	0	0	0	1	0	0	1	1	0	0	0
ctpC	1	0	1	1	1	0	1	0	1	1	1
ndk	1	1	1	1	1	1	0	1	1	1	1
PE_PGR S30	1	0	1	0	1	0	0	0	0	1	0
ptpA	1	1	1	1	1	1	1	1	0	1	1
тра	1	1	1	1	1	1	1	1	1	1	1
pafA	1	1	1	1	1	1	1	0	1	1	1
zmp1	1	1	1	1	1	1	0	1	1	1	1
relA	1	1	1	1	1	1	1	1	1	1	1
devR/dos R	1	1	1	1	1	1	1	1	0	1	1
devS	1	1	1	1	1	0	0	0	0	1	1
mosR	1	0	1	0	1	0	0	0	0	1	0
mprA	1	1	1	1	1	1	1	1	1	1	1
mprB	1	1	1	1	1	1	1	1	1	1	1
phoP	1	1	1	1	1	1	1	1	0	1	1
phoR	1	1	1	1	1	0	1	1	0	1	1
prrA	1	1	1	1	1	1	1	1	1	1	1
prrB	1	0	1	1	1	1	1	1	1	1	1
regX3	1	0	1	1	1	1	1	1	1	1	1
senX3	1	1	1	1	1	1	1	1	1	1	1
sigA/rpo V	1	1	1	1	1	1	1	1	1	1	1
sigD	1	0	0	0	0	0	0	0	0	1	0
sigE	1	1	1	1	1	1	1	1	1	1	1
sigF	1	1	1	1	1	1	1	1	0	1	1
sigH	1	1	1	1	1	1	1	1	0	1	1
sigL	1	1	1	1	1	1	1	1	0	1	1

sigM	1	1	1	1	1	1	1	1	0	1	1
whiB3	1	0	1	1	1	1	1	1	1	1	1
lpqH	1	1	1	1	1	1	1	1	1	1	1
hspX	1	1	1	0	1	0	0	0	0	1	1
fbpA	1	1	1	1	1	0	1	1	1	1	1
fbpB	1	0	1	1	1	0	1	1	1	1	1
fbpC	1	0	0	1	1	1	1	1	1	1	1
eis	1	0	1	1	1	1	1	1	0	1	1
pknG	1	1	1	1	1	1	1	1	1	1	1
secA2	1	1	1	1	1	1	1	1	1	1	1
PE35	1	0	1	0	1	1	0	0	0	1	1
PPE68	1	0	1	0	1	1	0	0	1	1	1
eccA1	1	0	1	0	1	1	0	0	1	1	1
eccB1	1	0	1	0	1	1	0	0	1	1	1
eccCa1	1	0	1	0	1	1	0	0	1	1	1
eccCb1	1	0	1	0	1	1	0	0	1	1	1
eccD1	1	0	1	0	1	1	0	0	1	1	1
eccE1	1	0	1	0	1	1	0	0	1	1	1
espA	1	0	1	0	1	0	0	0	1	1	1
espB	1	0	1	0	1	0	0	0	0	1	1
espC	1	0	1	0	1	0	0	0	1	1	1
espD	1	0	1	0	1	0	0	0	1	1	1
espE	1	0	1	0	1	0	0	0	0	1	1
espF	1	0	1	0	1	0	0	0	0	1	1
espG1	1	0	1	0	1	1	0	0	0	1	1
espH	1	0	1	0	1	1	0	0	0	1	1
espI	1	0	1	0	1	0	0	0	1	1	1
espJ	1	0	1	0	1	0	0	0	0	1	1
espK	1	0	0	0	1	1	0	0	0	1	1
espL	1	0	1	0	1	1	0	0	1	1	1

espR	1	1	1	1	1	1	1	1	1	1	1
esxA	1	0	1	0	1	1	0	0	1	1	1
esxB	1	0	1	0	1	1	0	0	1	1	1
mycP1	1	0	1	0	1	1	0	0	0	1	1
PE36	1	0	1	1	1	0	1	1	0	1	0
PPE69	1	0	1	1	1	0	1	1	0	1	0
eccA2	1	0	1	1	1	0	1	1	0	1	0
eccB2	0	0	1	1	1	0	1	1	0	1	0
eccC2	1	0	1	0	1	0	1	1	0	1	0
eccD2	1	0	1	1	1	0	1	1	0	1	0
eccE2	1	0	1	1	1	0	1	1	0	1	0
espG2	1	0	1	1	1	0	1	1	0	1	0
esxC	1	0	1	1	1	0	1	1	0	1	0
esxD	1	0	1	1	1	0	1	1	0	1	0
mycP2	1	0	1	1	1	0	1	1	0	1	0
PE5	1	1	1	1	1	1	1	1	0	1	1
PPE4	1	1	1	1	1	1	1	1	1	1	1
eccA3	1	1	1	1	1	1	1	1	1	1	1
ессВ3	1	1	1	1	1	1	1	1	1	1	1
eccC3	1	1	1	0	1	1	1	1	1	1	1
eccD3	1	1	1	1	1	1	1	1	1	1	1
eccE3	1	1	1	1	1	1	1	1	1	1	1
espG3	1	1	1	1	1	1	1	1	1	1	1
esxG	1	1	1	1	1	1	1	1	0	1	1
esxH	1	1	1	1	1	1	1	1	1	1	1
тусР3	1	1	1	1	1	1	1	1	1	1	1
eccB4	1	1	1	1	1	1	1	1	0	1	1
eccC4	1	1	1	1	1	1	1	1	0	1	1
eccD4	0	1	1	1	1	0	1	1	0	1	1
esxT	1	0	1	1	1	1	1	1	1	1	1

esxU	1	0	1	1	1	1	1	1	0	1	1
тусР4	1	1	1	1	1	1	1	1	0	1	1
PE18	1	0	1	1	1	0	1	1	0	1	1
PE19	1	0	1	0	1	0	1	1	0	1	1
PPE25	1	0	1	1	1	0	1	1	0	1	1
PPE26	1	0	1	1	1	0	1	1	0	1	1
PPE27	1	0	1	0	1	0	1	1	0	1	0
PPE41	1	0	1	0	1	0	0	0	0	1	0
cyp143	1	0	1	1	1	0	1	1	0	1	1
eccA5	1	0	1	1	1	0	1	1	0	1	1
ессВ5	1	0	1	1	1	0	1	1	1	1	1
eccCa5	0	0	1	0	0	0	0	0	0	1	0
eccCb5	1	0	1	1	1	0	1	1	1	1	1
eccD5	1	0	1	1	1	0	1	1	1	1	1
eccE5	1	0	1	1	1	0	1	1	1	1	1
esxM	1	0	1	1	1	0	1	1	0	1	1
esxN	1	0	1	1	1	0	1	1	0	1	1
mycP5	1	0	1	1	1	0	1	1	1	1	1
ahpC	1	1	1	1	1	0	1	1	1	1	1
katG	1	1	1	1	1	1	1	1	0	1	1
sodC	1	1	1	1	1	1	1	1	1	1	1
sodA	1	1	1	1	1	0	1	1	1	1	1
ompA	1	0	1	0	1	0	0	0	0	1	1
mlsA1	0	0	0	0	0	0	0	0	0	0	0
mlsA2	0	0	0	0	0	0	0	0	0	0	0
mlsB	0	0	0	0	0	0	0	0	0	0	0