Phylogenetically informative mutations in genes implicated in antibiotic resistance in Mycobacterium tuberculosis complex

Abstract:
Background

A comprehensive understanding of the pre-existing genetic variation in genes associated with antibiotic resistance in the Mycobacterium tuberculosis complex (MTBC) is needed to accurately interpret whole-genome sequencing data for genotypic drug susceptibility testing (DST).

Methods

We investigated mutations in 92 genes implicated in resistance to 21 anti-tuberculosis drugs using the genomes of 405 phylogenetically diverse MTBC strains. The role of phylogenetically informative mutations was assessed by routine phenotypic DST data for the first line drugs isoniazid, rifampicin, ethambutol, and pyrazinamide from a separate collection of over 7,000 clinical strains. Selected mutations/strains were further investigated by minimum inhibitory concentration (MIC) testing.

Results

Out of 547 phylogenetically informative mutations identified, 138 were classified as not correlating with resistance to first-line drugs. MIC testing did not reveal a discernible impact of a Rv1979c deletion shared by M. africanum lineage 5 strains on resistance to clofazimine. Finally, we found molecular evidence that some MTBC subgroups may be hyper-susceptible to bedaquiline and clofazimine by different loss of function mutations affecting a drug efflux pump subunit (MmpL5).

Conclusions

Our findings underline that the genetic diversity in MTBC has to be studied more systematically to inform the design of clinical trials and to define sound epidemiologic cut-off values (ECOFFs) for new and repurposed anti-tuberculosis drugs. In that regard our comprehensive variant catalogue provides a solid basis for the interpretation of mutations in genotypic as well as in phenotypic DST assays.
Dear Dr John-Schuster,
we did the following changes as requested:
Introduction renamed to background
Method now follows background. With that the reference numbers were adjusted.
Providers of all drugs used for MIC determination are given in the methods and introduction of abbreviations was checked and corrected.
A conclusion heading was added to our conclusion paragraph
Line numbers removed.
Declaration section introduced and amended according to journal requests (including data availability)
Cover letter and response to reviewers removed, as well as text highlights in all files
Main figure removed from text file and submitted as pdf
All additional files, and captions renamed as suggested, descriptions reduced to one sentence.
Our co-authors Kristian Ångeby kristian.angeby@sll.se and Pontus Jureen pontus.jureen@folkhalsomyndigheten.se for unknown reasons did not receive the co-authorship confirmation mail and confirmed meanwhile directly to you via mail.

Additional changes made:
Corrected references to few additional files that were mixed up
Former line 138 corrected number of initially excluded mutations (25 to 26)
Former reference 36 is published meanwhile, reference updated
In Table S4 the phylogenetic background mutations were added for the new strains tested for clofazimine

Best regards
Matthias Merker
Phylogenetically informative mutations in genes implicated in antibiotic resistance in
*Mycobacterium tuberculosis* complex

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Keywords:
*Mycobacterium tuberculosis*, drug resistance, benign mutations, intrinsic resistance
**Background**

Drug-resistant *Mycobacterium tuberculosis* complex (MTBC) strains are estimated to account for one third of all deaths due to antimicrobial resistance globally[1]. Owing to the inherently slow growth rate of MTBC, the only realistic way to diagnose the majority of drug-resistant cases is to use rapid genotypic drug-susceptibility testing (gDST), which ranges from targeted assays to whole-genome sequencing (WGS)[2]. In fact, it is becoming increasingly clear that gDST assays are better suited than phenotypic DST (pDST) to rule-in resistance caused by known mechanisms that only confer modest minimum inhibitory concentration (MIC) increases, such as for ethambutol (EMB)[3–5].

The accuracy of gDST depends on the ability to distinguish valid markers for resistance (i.e. mutations that directly confer resistance or, alternatively, play a compensatory role in resistance) from neutral mutations that do not alter the susceptibility to an antibiotic[6,7]. In this context, one of the major confounders is the pre-existing variation in genes associated with resistance, which comprises neutral mutations and, more rarely, changes that confer intrinsic/natural resistance (i.e. resistance that arose by chance/genetic drift prior to the clinical use of a drug or a related agent with a shared resistance mechanism)[8]. Because MTBC displays a strictly clonal population structure without any lateral gene transfer, these mutations are typically phylogenetically informative and unique (i.e. they are markers for a particular subgroup of the global MTBC diversity). Consequently, they form a barcode that is exploited by some targeted gDST assays to provide an epidemiological typing result at no additional cost, albeit at a limited resolution compared with WGS[9–11]. By contrast, homoplasic mutations have arisen multiple times independently in the MTBC phylogeny and are, consequently, not markers for a single subgroup. If this diversity is not considered at the design stage of a gDST assay, they can result in systematic false-resistant results. Indeed, the World Health Organization (WHO) has just revised the reporting language for line probe assays to reflect this possibility (e.g. *gyrA* A90G causes false-resistance reports for fluoroquinolones with the Hain GenoType MTBDRsl assay)[12,13].

The purpose of this study was, therefore, to catalogue phylogenetically informative mutations in 92 genes implicated in the resistance to a total of 21 antibiotics and, where possible, to identify neutral mutations amongst these changes by taking evolutionary information and pDST data into consideration. Moreover, we searched for evidence of previously unknown intrinsic resistance.
Methods

Strain collection

We analysed 405 phylogenetically diverse MTBC genomes, of which 214 of were drawn from Comas et al., who studied the evolutionary history of MTBC using isolates from 46 countries[14]. This collection was supplemented with mostly pan-susceptible strains from the Research Center Borstel (n=69)[10] and the Karolinska University Hospital in Sweden (n=122)[4].

WGS

WGS at the Research Center Borstel was performed with Illumina Technology (MiSeq, NextSeq 500, HiSeq 2500) using Nextera XT library preparation kits as instructed by the manufacturer (Illumina, San Diego, CA, USA). Fastq files (raw sequencing data) were submitted to the European nucleotide archive (Additional file 1: Table S1). All genomes were analysed with the MTBseq pipeline[15]. First, reads were mapped to the M. tuberculosis H37Rv genome (GenBank ID: NC_000962.3) with BWA[16]. Alignments were refined with the GATK[17] and Samtools[18] toolkits for base quality re-calibration and alignment corrections for possible PCR and InDel artefact. Variants (SNPs and InDels) were called if the following criteria were met: a minimum coverage of four reads in both forward and reverse orientation, four reads calling the allele with at least a phred score of 20, and an allele frequency of 75%. Deletions in Rv1979c were identified manually as the above algorithms are not optimised to call large InDels.

Phylogenetic analysis

Regions annotated as repetitive elements (e.g. PPE and PE-PGRS gene families), InDels, multiple consecutive SNPs in a 12 bp window (possible InDel artefacts or rare recombination scars), and 92 genes implicated in antibiotic resistance (Additional file 2: Table S2) were excluded for the phylogenetic reconstruction. In the combined analysis, we considered all genome positions that fulfilled the aforementioned criteria for coverage and variant frequency in 95% of all samples in the datasets as valid and used the concatenated sequence alignment to calculate a maximum likelihood tree with Fast Tree[19], employing a GTR substitution model, 1,000 resamples and Gamma20 likelihood optimization to account for rate heterogeneity among sites. The consensus tree was rooted with the “midpoint root” option in FigTree[20] and nodes were arranged in increasing order. MTBC strains were stratified into lineages and subgroups using the classification schemes by Coll et al. and/or Merker et al[9,21].
In the ML-tree we identified internal nodes/branches with very good statistical support (bootstrap values ≥0.9). Strains derived from one shared internal branch (i.e. most common recent ancestor) were assigned to groups, and group specific mutations were extracted considering sequences of 92 genes implicated in antibiotic resistance (Additional file 2: Table S2).

Phylogenetic (branch-specific) mutations were further classified using pDST data (mainly MGIT 960) for the first line drugs rifampicin (RIF), isoniazid (INH), EMB, and pyrazimanide (PZA) from the CRyPTIC consortium[7]. A mutation was regarded as likely neutral if >90% of strains that did not harbour known resistance mutations were phenotypically susceptible, provided that pDST results were available for at least 10 strains.

**MIC measurements**

MIC values for INH (Sigma-Aldrich, Germany), prothionamide (PTO; Riemser, Germany), bedaquiline (BDQ; Janssen, USA), and clofazimine (CFZ; Sigma-Aldrich, Germany) were determined in the BACTEC MGIT 960 system (Becton Dickinson) in conjunction with the EpiCenter TBeXiST software. The following drug concentrations were tested: 0.0125, 0.025, 0.05, 0.1, and 0.4 µg/ml for INH, 0.3125, 0.625, 1.25, 2.5, and 5 µg/ml for PTO, 0.0625, 0.125, 0.25, 0.5, 1, and 2 µg/ml for BDQ and CFZ. A strain was interpreted as resistant to a drug at a particular concentration if the drug-containing tube reached ≥100 growth units before the drug-free control tube with the 1:100 diluted suspension of the strain reached 400 growth units.

**Results**

**MTBC strain collection and phylogeny**

Our collection (n=405) featured 296 evolutionary “modern”, i.e. TbD1 region deleted [22], *M. tuberculosis* strains (i.e. lineages 2-4) and 109 evolutionary “ancestral” (TbD1 region intact) MTBC lineages, ranging from lineages 1 and 7 (*M. tuberculosis*, n=60), lineages 5 and 6 (*M. africanum*, n=35), to 14 animal-adapted species (i.e. *M. pinnipedii*, *M. microti*, *M. orygis*, *M. caprae*, *M. bovis*), including one *M. bovis* BCG vaccine strain (Additional file 1: Table S1). Of these isolates, only 40 (9.9%) had a mutation in the RIF resistance determining mutation in *rpoB* and were, consequently, RIF resistant.

A maximum likelihood (ML) tree with a general time reversible (GTR) substitution model and 1,000 resamples was calculated based on 42,760 single nucleotide polymorphisms (SNPs), excluding mutations in repetitive regions and 92 genes implicated in antibiotic resistance (Additional file 2: Table S2). Next, we identified all internal nodes/branches with a bootstrap...
support of 0.9 and higher (n=334). All isolates that shared a common node/branch with sufficient bootstrap support were grouped together and group-specific changes, i.e. SNPs and insertions and deletions (InDels), in the aforementioned 92 genes were identified (Figure 1).

Phylogenetically informative and unique mutations: overview

We found a total of 557 group-specific mutations in the 92 genes that had either been implicated in antibiotic resistance, are confirmed resistance mechanisms, or are involved in compensating for the reduced fitness of resistance mutations in other genes. Out of 557 mutations, we excluded 26 mutations as they were found in groups that only comprised strains with a pairwise distance of up to five SNPs, suggesting recent transmission. However, three H37Rv-specific mutations (4.9 subgroup) and the aforementioned gyrA A90G change (4.6.1.2 subgroup) were exempt from this rule given their phylogenetic importance[12]. This list of mutations was further supplemented with three known phylogenetic mutations (i.e. tlyA N236K in the 4.6.2 subgroup[23], cycA G122S in BCG, and mmaA3 G98D in a subgroup of BCG[8]) that confer intrinsic antibiotic resistance (Additional file 3: Table S3). These three mutations were not highlighted by our algorithm because they featured only in single strains in our collection. Where possible, we compared the resulting 539 mutations with the typing scheme by Coll et al., the most widely used method to stratify WGS data for MTBC[9]. Of the 89 SNPs that were in common, 82 results were in agreement. Subsequent personal communications with Francesc Coll revealed that the seven discrepancies were due to errors in his study and were eventually resolved (Additional file 3: Table S3).

Phylogenetically informative and unique mutations: impact on resistance

We then proceeded to identify mutations that were likely neutral (i.e. do not correlate with resistance) using previously published pDST data for RIF, INH, EMB, and PZA for over 7,000 isolates[7], yielding 138 neutral mutations (Additional file 3: Table S3).

Notably, we identified five group-specific mutations that had been linked with drug resistance in the literature. This included the ndh R268H mutation, which had been proposed as an isoniazid resistance marker and we classified it as a marker for a subgroup of lineage 1.1.2[24]. Yet, our analysis of routine pDST data and additional MIC testing demonstrated that ndh R268H was likely neutral (Tables S4). Moreover, we undertook MIC testing to investigate the roles of the ethA M1R, S266R, and G413D mutations, which had been previously associated with PTO and ethionamide (ETO) resistance (Additional file 4: Table S4)[25–27]. Of these mutations, only isolates with the ethA M1R mutation tested resistant to PTO, which was
expected as this mutation should abolish the start codon of *ethA*. This particular mutation was shared by four isolates that formed a subgroup within lineage 4.2.2 (TUR-genotype) with a median pairwise genetic distance of 22 SNPs and were at least resistant to INH. Consequently, it was unclear whether this mutation arose in response to the exposure to PTO/ETO or whether this represented an example of intrinsic resistance.

In addition, we measured the CFZ MICs for the *Rv1979c V52G* mutation, which yielded MICs in the susceptible range (Additional file 4: Table S4). This result, therefore, supported a recent study that found that this alteration, which was shared by a group of two Beijing isolates, probably does not confer CFZ resistance[28].

Our analysis supported the hypothesis that the entire MTBC branch that comprises both *M. africanum* lineages as well as the animal-adapted strains (*M. africanum*/animal branch) likely has intrinsically elevated MICs to cycloserine (DCS), owing to a 1 bp frameshift deletion in *ald*, which encodes alanine dehydrogenase (Additional file 3: Table S3)[5,29]. In addition, we expect the DCS MIC to be raised further in *M. microti* and *M. pinnipedii* given that both species harbour a frameshift in *cycA*, which should impede DCS uptake, as is the case in all BCG variants due to a G122S mutation in the same gene[5,29,30].

In contrast to these cases, this study also raised the prospect that some subgroups may be more susceptible to particular antibiotics due to their specific genetic background. For example, we observed different loss-of-function (LOF) mutations in *mmpL5* in two genetic backgrounds (in subgroups of lineages 1.1.1.1 and 4.6) that should render them hyper-susceptible to bedaquiline (BDQ) and CFZ[31]. Moreover, we observed LOF mutations in *eis* and its transcriptional activator *whiB7*, which might make the respective genotypes more susceptible to kanamycin (KAN)[4,32]. Finally, we confirmed that most lineage 2 strains share a frameshift in the *tap* efflux pump, which means that mutations that result in the over-expression of *whiB7* cannot confer streptomycin (STR) resistance in these strains[33].

**Convergent evolution: impact on resistance**

We observed 27 changes that had evolved independently in multiple genetic backgrounds and, consequently, were not markers for only one phylogenetic group (Additional file 5: Table S5), which is typically a sign of positive selection[34]. Indeed, several classical resistance mutations featured in this category, which were likely selected in response to antibiotic treatment (e.g. *rpoB* S450L and *rpsL* K43R). Another well-understood mutation affected codon 220 of *pykA*. A glutamic acid to aspartic acid change, which results in the inability to grow on glycerol as the sole carbon source, occurred at the base of the *M. africanum*/animal branch[35]. It has
already been reported that some strains within this group (i.e. *M. suricattae* and all BCG variants) independently regained the ability to grow on glycerol by reverting back to glutamic acid[29]. Here, we found that this occurred on two more occasions, i.e. in one lineage 6 strain (L6-N0060) and in our variant of *M. bovis* ATCC 19210 (9564-00)[36].

As previously reported, *Rv1979c* was deleted independently in all *M. africanum* lineage 5 strains (del *Rv1978*-*Rv1979c* [37]), in our two *M. pinnipedii* strains (del *Rv1964*-*Rv1979c* [38]), and also in more recently derived BCG variants (*Rv1964*-*Rv1988*, i.e. RD2) [39,40]. Given that mutations in *Rv1979c* are implicated in CFZ resistance, this raised the possibility that intrinsic resistance to CFZ might have arisen on at least three occasions in MTBC [5,28,41]. However, testing of five *M. africanum* lineage 5 strains did not reveal a discernible increase of the CFZ MIC (Additional file 4: Table S4).

There was at least one example where convergent evolution was misleading. The ancestral nucleotide at position -32 upstream of *ald* is adenine whereas glycine was acquired independently by *M. africanum* lineage 5 and a group of lineage 4 strains (i.e. 4.5, 4.6, 4.7, 4.8, and 4.9). Yet, because *ald* is inactive in lineage 5, as mentioned above, this mutation cannot have the same effect in both genetic backgrounds.

**Discussion**

Compared with most bacterial pathogens, MTBC is monomorphic[42]. Nevertheless, it has been known for more than 60 years that this limited diversity can result in intrinsic resistance[43]. Indeed, if resistance to an antibiotic can arise by LOF mutations that do not have major adverse consequences for bacterial fitness, it is not a question of whether intrinsic resistance exists but, rather, how widespread this phenotype is. This, in turn, is a function of how deeply rooted this phenotype is in the phylogenetic tree of MTBC and how well these strains have subsequently transmitted. For example, the *pncA* H57D mutation, which is estimated to have evolved approximately 900 years ago[44], is shared by the vast majority of *M. bovis* strains and consequently renders them intrinsically resistant to PZA[45]. Yet, owing to the control policies introduced in well-resourced countries over the past century, *M. bovis* is responsible for fewer than 3% of human tuberculosis (TB) cases globally[46].

The remaining experimentally confirmed cases of intrinsic resistance have arisen more recently in MTBC and, therefore, are less frequent. These include the intrinsic capreomycin resistance of some lineage 4.6.2 strains (Cameroon genotype) due to the *tlyA* N236K mutation[23], the high-level DCS resistance shared by all BCG variants[29], and the intrinsic resistance to INH and ETH/PRO of BCG variants derived after 1926 as a result of *mmaA3* G98D[39]. Finally, *M.
canettii, which is not strictly speaking part of MTBC, is intrinsically resistant to PZA and pretomanid[45,47,48].

Yet, the molecular evidence from this study underscores that even more deeply rooted and thus older instances of intrinsic resistance have either not been studied sufficiently or may have been missed completely. The possibility that the entire M. africanum/animal branch likely has intrinsically elevated MICs to DCS is particularly concerning in light of the severe toxicity of DCS and terizidone[5,29]. More MIC data are urgently need to inform pharmacokinetic/pharmacodynamic (PK/PD) modelling to set a clinical breakpoint for DCS and to assess whether this increase is clinically relevant[49].

Conversely, genetic diversity may also confer hyper-susceptibility, which has not been studied systematically in the TB field as MICs are typically truncated at the lower end, i.e. sufficiently low concentrations are not typically tested to define the lower end of “susceptible” MIC distributions[5].

MIC testing of M. africanum lineage 5 strains did not confirm a role of the deletion of Rv1979c in CFZ resistance, as previously hypothesised[5]. This apparent contradiction might be explained if only specific gain-of-function mutations as opposed to LOF mutations in this gene, which includes a possible permease, confer resistance [28,41]. Knockout and complementation experiments are currently ongoing to investigate this question further.

Finally, epistatic interactions may affect the way in which mutations are interpreted, as illustrated by the effect of whiB7 promoter-up mutations, which confer cross-resistance to KAN and STR[32]. However, this is only the case in genetic backgrounds in which both eis and tap are functional, which is not always the case (e.g. in almost the entire lineage 2)[4,33].

The number of open questions raised by our study is symptomatic of the lack of rigour used to define breakpoints to anti-TB drugs[3,5,50,51]. The recent endorsement of an MIC reference method by the European Committee for Antimicrobial Susceptibility Testing (EUCAST) and associated guidelines to calibrate other methods, such as the widely used MGIT 960 system are designed to address these shortcomings[52]. Indeed, these guidelines stipulate that representatives of lineages 1-7 must be tested to define sound epidemiologic cut-off values (ECOFFs). It would be in the interest of pharmaceutical companies to follow the EUCAST guidelines as early as possible during drug development to identify agents that may not be equally effective against major MTBC genotypes[53]. These antibiotics could either be abandoned or their development adjusted to gather evidence that genotypes with intrinsically elevated MICs are treatable at either standard or increased dosing (e.g. using nonclinical models.
or by choosing clinical trial sites in countries where these genotypes are sufficiently frequent to provide enough statistical power to study these questions comprehensively[54–56]).

**Conclusion**

We provide a comprehensive catalogue of phylogenetically informative mutations in genes implicated in drug resistance in MTBC. Our analysis underlines that despite being monomorphic the genetic diversity in MTBC has to be studied systematically to inform the interpretation of gDST results for existing drugs as well as the development of urgently needed novel agents.

**Declarations**

**Ethics approval and consent to participate**

Not applicable

**Consent for publication**

Not applicable

**Availability of data and materials**

Fastq files (raw sequencing data) were submitted to the European nucleotide archive (see Additional file 1: Table S1).

**Competing interest**

CUK is a consultant for the WHO Regional Office for Europe, Becton Dickinson, and QuantuMDx Group Ltd. CUK is an unpaid advisor to GenoScreen and consulted for the Foundation for Innovative New Diagnostics, which involved work for Cepheid Inc., Hain Lifescience, and WHO. The Bill & Melinda Gates Foundation and Hain Lifescience covered CUK’s travel and accommodation to present at meetings. The Global Alliance for TB Drug Development Inc. and Otsuka Novel Products GmbH have supplied CUK with antibiotics for *in vitro* research. YD Diagnostics has provided CUK with assays for an evaluation. JP is a paid consultant to Next Gen Diagnostics. All remaining authors declare that they have no competing interests.
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Author contributions

M.M. and S.N. conceived the project. M.M., T.A.K., I.B., and T.W. analysed the genomic data. T.A.K., P.F., D.M., J.P., S.J.P., T.S., and T.W. contributed to the construction of the data. S.A., E.C., K.Ä., P.J., T.S., and F.M. generated phenotypic drug susceptibility test results. S.N. supervised the research. C.K., and T.S. assisted in assessment of resistance mediating mutations and contributed intellectual insights and guidance. M.M., T.W., C.K., S.N. wrote the paper.

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Additional files:

Additional file 1: Table S1
Metadata for 405 MTBC isolates/datasets used in this study.

(XLSX 37 KB)

Additional file 2: Table S2
92 genes (coding and upstream regions) implicated in antibiotic resistance.

(XLSX 26 KB)

Additional file 3: Table S3
Catalogue of 547 phylogenetically informative mutations in 92 genes implicated in drug resistance to 21 anti-TB drugs.

(XLSX 106 KB)

Additional file 4: Table S4
MIC results for isolates with \textit{ndh} R268H, \textit{ethA} M1R, \textit{ethA} S266R, \textit{ethA} G413D, or \textit{Rv1979c} V52G mutations, or a \textit{Rv1978-Rv1979c} deletion.

(XLSX 17 KB)

Additional file 5: Table S5

Overview of homoplastic mutations.

(XLSX 15 KB)
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**Figure legend**

**Figure 1:**

**MTBC phylogeny.**

ML-phylogeny based on 42,760 SNPs from 405 genomes using a general time reversible substitution model and 1,000 resamples. Seven major MTBC lineages and animal-adapted species are highlighted. Where warranted, these were differentiated further into subgroups (as shown on the circumference of the figure). Red dots indicate branches (n=334) with a resampling support of >0.9 and which were investigated for branch specific mutations in 92 genes implicated in antibiotic resistance.
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