## Articles

## Potential contribution of HIV during first-line tuberculosis treatment to subsequent rifampicin-monoresistant tuberculosis and acquired tuberculosis drug resistance in South Africa: a retrospective molecular epidemiology study

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## Summary

Background South Africa has a high burden of rifampicin-resistant tuberculosis (including multidrug-resistant [MDR] tuberculosis), with increasing rifampicin-monoresistant (RMR) tuberculosis over time. Resistance acquisition during first-line tuberculosis treatment could be a key contributor to this burden, and HIV might increase the risk of acquiring rifampicin resistance. We assessed whether HIV during previous treatment was associated with RMR tuberculosis and resistance acquisition among a retrospective cohort of patients with MDR or rifampicin-resistant tuberculosis.

Methods In this retrospective cohort study, we included all patients routinely diagnosed with MDR or rifampicinresistant tuberculosis in Khayelitsha, Cape Town, South Africa, between Jan 1, 2008, and Dec 31, 2017. Patient-level data were obtained from a prospective database, complemented by data on previous tuberculosis treatment and HIV from a provincial health data exchange. Stored MDR or rifampicin-resistant tuberculosis isolates from patients underwent whole-genome sequencing (WGS). WGS data were used to infer resistance acquisition versus transmission, by identifying genomically unique isolates (single nucleotide polymorphism threshold of five). Logistic regression analyses were used to assess factors associated with RMR tuberculosis and genomic uniqueness.

Findings The cohort included 2041 patients diagnosed with MDR or rifampicin-resistant tuberculosis between Jan 1, 2008, and Dec 31, 2017; of those, 463 ( $22 \cdot 7\%$ ) with RMR tuberculosis and 1354 ( $66 \cdot 3\%$ ) with previous tuberculosis treatment. In previously treated patients, HIV positivity during previous tuberculosis treatment versus HIV negativity (adjusted odds ratio [OR]  $2 \cdot 07$ , 95% CI  $1 \cdot 35 - 3 \cdot 18$ ), and three or more previous tuberculosis treatment episodes versus one ( $1 \cdot 96$ ,  $1 \cdot 21 - 3 \cdot 17$ ) were associated with RMR tuberculosis. WGS data showing MDR or rifampicin-resistant tuberculosis were available for 1169 patients; 360 ( $30 \cdot 8\%$ ) isolates were identified as unique. In previously treated patients, RMR tuberculosis versus MDR tuberculosis (adjusted OR  $4 \cdot 96$ ,  $3 \cdot 40 - 7 \cdot 23$ ), HIV positivity during previous tuberculosis treatment ( $1 \cdot 71$ ,  $1 \cdot 03 - 2 \cdot 84$ ), and diagnosis in 2013 - 17 ( $1 \cdot 42$ ,  $1 \cdot 02 - 1 \cdot 99$ ) versus 2008–12, were associated with uniqueness. In previously treated patients with RMR tuberculosis, HIV positivity during previous treatment (adjusted OR  $5 \cdot 13$ ,  $1 \cdot 61 - 16 \cdot 32$ ) was associated with uniqueness as was female sex ( $2 \cdot 50$  [ $1 \cdot 18 - 5 \cdot 26$ ]).

Interpretation These data suggest that HIV contributes to rifampicin-resistance acquisition during first-line tuberculosis treatment and that this might be driving increasing RMR tuberculosis over time. Large-scale prospective cohort studies are required to further quantify this risk.

Funding Swiss National Science Foundation, South African National Research Foundation, and Wellcome Trust.

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## Introduction

Globally, an estimated half a million individuals develop rifampicin-resistant tuberculosis annually; among these, 82% have multidrug-resistant (MDR) tuberculosis with resistance to both rifampicin and isoniazid. The remaining 18% have rifampicin-monoresistant (RMR) tuberculosis, defined as rifampicin resistance and isoniazid susceptibility.<sup>1</sup> In South Africa, more than 13 000 individuals were diagnosed with MDR or rifampicin-resistant tuberculosis in 2019, placing South Africa in the top ten high-burden countries.<sup>1</sup> Data from two national surveys done in 2001–02 and 2012–14 suggest that although MDR tuberculosis has remained at approximately 3% of all tuberculosis cases across the decade, the proportion of RMR tuberculosis has increased from 0.5% to 1.8%, now comprising 38% of all rifampicin-resistant tuberculosis.<sup>2</sup>

Individuals might develop MDR or rifampicin-resistant tuberculosis through either direct transmission of an already drug-resistant *Mycobacterium tuberculosis* strain,





#### Lancet Microbe 2021; 2: e584–93

Published Online August 11, 2021 https://doi.org/10.1016/ S2666-5247(21)00144-0

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### Research in context

### Evidence before this study

Although there is evidence of association between HIV infection and drug-resistant tuberculosis, it is not clear whether this association is driven by increased transmission of drug-resistant tuberculosis to HIV-positive individuals or increased risk of tuberculosis resistance acquisition during tuberculosis treatment in individuals who are HIV-positive compared with HIV-negative individuals. We searched PubMed, EBSCOHost, Scopus, and Web of Science, on Jan 6, 2020, for reports describing associations between rifampicin-resistant tuberculosis (including rifampicinmonoresistant [RMR] tuberculosis and multidrug-resistant [MDR] tuberculosis), HIV, and resistance acquisition or transmission. Only full text articles in English were reviewed. Several studies suggest that HIV is associated with rifampicinresistant tuberculosis in individuals who have never been treated for tuberculosis before, suggesting direct transmission. However, data also suggest that there is a link between HIV and tuberculosis drug resistance in individuals previously treated for tuberculosis. These data are supported by small case series showing increased acquisition of rifampicin resistance, resulting in RMR tuberculosis, in HIV-positive individuals, particularly those who are severely immunocompromised. Although epidemiological studies from low tuberculosis burden settings suggest that individuals with RMR tuberculosis were more likely to be HIV-positive at diagnosis and to have been previously treated for tuberculosis, no large-scale studies in high tuberculosis and HIV burden settings assessing the risk of acquired resistance during tuberculosis treatment by HIV status were identified.

### Added value of this study

This is the first report describing an increased risk of both RMR tuberculosis and acquisition of tuberculosis drug resistance in individuals who were HIV-positive during

previous tuberculosis treatment compared with those who were HIV-negative. Given the low risk of resistance acquisition on an individual basis, retrospective analysis of a large dataset containing all individuals diagnosed with rifampicin-resistant tuberculosis in a subdistrict of Cape Town, South Africa, over a decade linked with whole-genome sequencing data from matching tuberculosis isolates, allowed estimation of the contribution of HIV infection to resistance acquisition. Additionally, the use of a health data exchange, drawing on public sector disease register, health-care facility, and laboratory data, in this high tuberculosis and HIV burden setting, enabled the inclusion of detailed and complete data on HIV status during previous tuberculosis treatment, adding a novel dimension to the analysis. We have shown that in more than 1300 individuals, those who were HIV-positive during previous tuberculosis treatment were twice as likely to have RMR tuberculosis compared with MDR tuberculosis. Among 164 individuals previously treated for tuberculosis with RMR tuberculosis, those who were HIV-positive during previous tuberculosis treatment were five times more likely to have genomically unique tuberculosis isolates compared with those who were HIV-negative, suggesting resistance acquisition rather than direct transmission.

### Implications of all the available evidence

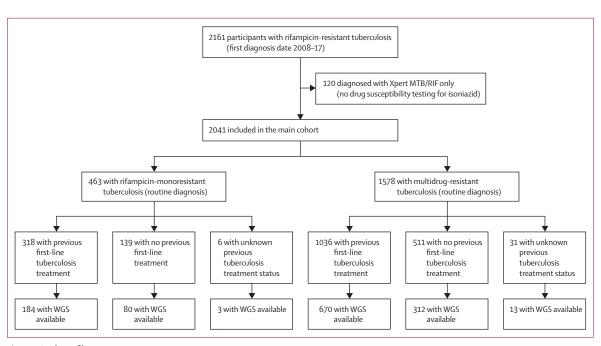
These data suggest that treatment of tuberculosis in people living with HIV results in an increased risk of rifampicin resistance acquisition. Although this risk is likely to be small at an individual level, given the large burden of HIV and tuberculosis co-infection in countries like South Africa, any increased risk could continue to fuel the drug-resistant tuberculosis epidemic. Further work on increased rifampicin dosing and optimisation of first-line tuberculosis treatment for HIV-positive individuals is required.

or the acquisition of resistance during first-line tuberculosis treatment. Modelling data describing the relative contributions of direct transmission and resistance acquisition to the MDR or rifampicin-resistant tuberculosis burden are conflicting. Some suggest that more than 90% of all MDR tuberculosis cases in high-burden settings are due to transmission,<sup>3</sup> although other models suggest that a significant proportion of the MDR or rifampicin-resistant tuberculosis burden is caused by acquired resistance.<sup>3,4</sup> In South Africa, up to 30% of resistance might be acquired, with this proportion expected to remain at approximately 20% until 2040.<sup>4</sup>

In South Africa, an estimated 7.7 million people are living with HIV and 58% of all individuals with tuberculosis are HIV-positive.<sup>1</sup> Although HIV has undoubtedly driven the broader tuberculosis epidemic, systematic reviews also suggest an independent association between HIV and MDR or rifampicin-resistant tuberculosis.<sup>5,6</sup> This association could be due to either increased resistance acquisition or increased transmission of resistant strains among people living with HIV. This group experiences a disproportional influence of nosocomial transmission, particularly in high HIV prevalence settings where exposure to MDR or rifampicin-resistant tuberculosis and increased vulnerability to tuberculosis infection due to HIV are likely to co-exist in health-care facilities.

HIV can also be specifically associated with increased resistance acquisition,<sup>7</sup> potentially due to HIV-related pharmacokinetic effects, such as malabsorption of tuberculosis drugs, an effect particularly pronounced for rifampicin.<sup>8</sup> A strong association between HIV and RMR tuberculosis in some settings supports this hypothesis.<sup>9,10</sup> In people living with HIV, acquired rifampicin resistance has been associated with advanced HIV-related immunosuppression and high bacterial burden due to disseminated tuberculosis disease.<sup>11</sup>

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**Figure 1: Study profile** WGS=whole-genome sequencing.

Data from our South African setting shows significant differences between RMR tuberculosis and MDR tuberculosis in terms of rifampicin-resistance conferring mutations and resistance to other tuberculosis drugs (unpublished data). We hypothesised that HIV infection during first-line tuberculosis treatment is a potential driver of either RMR tuberculosis, or resistance acquisition, or both. To address this hypothesis, we did a retrospective cohort study in patients diagnosed with MDR or rifampicin-resistant tuberculosis in Khayelitsha, Cape Town, South Africa.

### Methods

## Study design

This was a retrospective cohort study of individuals routinely diagnosed with MDR or rifampicin-resistant tuberculosis in Khayelitsha, Cape Town, between Jan 1, 2008, and Dec 31, 2017. Reporting of this study follows the STROME-ID guidance. Data were derived from a prospectively maintained database as previously described,12 with additional data on previous tuberculosis treatment and HIV infection during previous tuberculosis treatment accessed from the Western Cape Provincial Health Data Centre (PHDC).<sup>13</sup> To assess resistance acquisition, available *M* tuberculosis isolates stored in a prospectively maintained biobank in the Western Cape, South Africa, from patients in the main cohort underwent whole-genome sequencing (WGS). WGS data were used to define genomically unique MDR or rifampicin-resistant tuberculosis isolates, based on the assumption that unique isolates are more likely to represent acquired drug resistance.<sup>14</sup> Storage

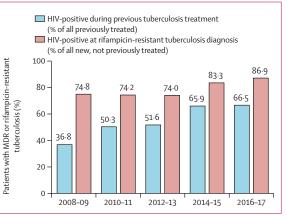


Figure 2: Percentage of previously treated patients with multidrug-resistant (MDR) or rifampicin-resistant tuberculosis who were HIV-positive during previous treatment and percentage of new patients with MDR or rifampicin-resistant tuberculosis who were HIV-positive at MDR or rifampicin-resistant tuberculosis diagnosis over the study time period

of MDR or rifampicin-resistant tuberculosis isolates in the biobank was approved by the Stellenbosch University ethics committee (N09/11/296), and linkage of WGS data to patient clinical data was approved by the University of Cape Town ethics committee (HREC 416/2014). Permission to access PHDC data was granted by the Western Cape Department of Health.

### Study setting and cohort selection

Khayelitsha is a predominantly poor, peri-urban subdistrict in metropolitan Cape Town. Among the population of

Var of MDR or rifampicin-resistant tuberculosis diagnosis         Vertex           2008-12         1066         219 (20.5%)         1 (ref)           2013-17         975         244 (25.0%)         1.29 (1.05-1.59)           Sex		Total (n=2041)	RMR tuberculosis (%)	Univariate OR (95% CI)
2013-17       975       244 (25.0%)       1.29 (1.05-15.9)         Sex       Female       991       223 (22.5%)       1.02 (0.83-1.26)         Male       1050       240 (22.9%)       1 (ref)         Sey       52-34       319       76 (23.8%)       1 (ref)         S2-34       634       131 (20.7%)       0.83 (0.60-1.15)         245       344       72 (20.9%)       0.85 (0.59-1.22)         HIV-regative       502       94 (18.7%)       1 (ref)         HIV-regative       502       94 (18.7%)       1.37 (1.06-1.77)         Unknown       34       82 (23.5%)       1.34 (0.59-3.04)         Previous tuberculosis treatment       1505       318 (23.5%)       1.31 (0.90-1.41)         Unknown       37       6 (16.2%)       0.71 (0.29-1.74)         Number of previous tuberculosis treatment episodes       1       1 (ref)         2       241       64 (26.6%)       1.36 (0.97-1.91)         23       92       34 (37.0%)       2.20 (1.38-3.49)         Unknown       337       76 (22.6%)       1.09 (0.80-1.50)         Time between start of most recent previous tuberculosis treatment episode and MDR or rifampicin-resistant tuberculosis diagnosis       123       52 (24.4%)       1 (ref) <td>Year of MDR or rifampicin-resistant tuberculo</td> <td>sis diagnosis</td> <td></td> <td></td>	Year of MDR or rifampicin-resistant tuberculo	sis diagnosis		
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tuberculosis diagnosis, HIV-negative during previous tuberculosis treatment HIV status, or previous tuberculosis treatment 58 13 (22·4%) 0·89 (0·45–1·79)	tuberculosis diagnosis, unknown during	291	69 (23.7%)	0.96 (0.64–1.46)
	tuberculosis diagnosis, HIV-negative during	50	12 (24.0%)	0.98 (0.48–2.01)
		58	13 (22.4%)	0.89 (0.45–1.79)

approximately 400000 people, antenatal HIV prevalence is 34% and tuberculosis case notification is 1600 per 100000 people per year, with tuberculosis and HIV coinfection of more than 70%. Since 2010, the number of patients diagnosed with MDR or rifampicin-resistant tuberculosis per year has remained consistent at approximately 180–200, resulting in an estimated MDR or rifampicin-resistant tuberculosis incidence of 80 cases per 100000 per year. Before 2011, only patients with tuberculosis at high risk for MDR or rifampicin-resistant disease were tested for tuberculosis drug resistance; subsequently all patients with presumed tuberculosis are tested with Xpert MTB/RIF (Cepheid, Sunnyvale, CA, USA), with further drug susceptibility testing as per national guidance. Data were extracted from the database to form the study cohort, which included all patients with microbiologically confirmed MDR or rifampicin-resistant tuberculosis with a first rifampicin-resistant tuberculosis diagnosis date between Ian 1, 2008, and Dec 31, 2017. Patients without routine drug susceptibility testing for isoniazid were excluded. A subset of this cohort, based on the availability of WGS data from stored MDR or rifampicin-resistant tuberculosis isolates, was used to assess resistance acquisition.

# Determination of HIV positivity during previous tuberculosis treatment

Previous first-line tuberculosis treatment and details of previous tuberculosis treatment episodes (dates, outcomes) were recorded on the MDR or rifampicinresistant tuberculosis database in Khayelitsha.12 These data were supplemented by data from the PHDC, which draws together data from patient administration systems in all fixed public sector health facilities, using unique patient health identifiers.13 Based on both routinely recorded and PHDC data, we determined whether patients had received any previous first-line tuberculosis treatment, and for those who were HIV-positive at MDR or rifampicin-resistant tuberculosis diagnosis, we determined the date that the patient was first known to be HIV-positive. This included data from enrolment into HIV care, CD4 cell count testing, and initiation of antiretroviral therapy (ART). Any patient who had at least one previous tuberculosis treatment episode, defined as registration in the tuberculosis treatment register or supply of first-line tuberculosis drugs, after they were known to be HIV-positive, was classified as HIV-positive during previous tuberculosis treatment.

## WGS and inference of acquired drug resistance

Where available, stored *M* tuberculosis isolates were recultured for DNA extraction. WGS was done on libraries prepared from purified genomic DNA using Illumina Nextera XT library (Illumina, San Diego, CA, USA) and NEBNext Ultra TM II FS DNA Library Prep Kits (New England Biolabs, Ipswich, MA, USA). Sequencing was done using the Illumina HiSeq 2500 or NextSeq 500 platforms. Sequencing data, with a minimum sequencing depth of 20× and 90% genomic coverage, were analysed using an in-house pipeline. Briefly, sequencing reads were mapped with Burrows-Wheeler Aligner to the inferred genome of the most recent common ancestor of the *M* tuberculosis complex (10.5281/zenodo.3497110) and fixed genomic

variants were identified with VarScan2 (minimum frequency 90%). A pseudoalignment of concatenated polymorphic positions was generated excluding drug resistance positions and used to calculate the genetic distances between isolates using custom scripts. Isolates were clustered using the R package cluster with a single nucleotide polymorphism (SNP) distance threshold of five used to exclude direct transmission.<sup>15</sup> To further assess the uniqueness of isolates, rifampicin-resistance conferring *rpoB* mutations were compared between unique isolates and the next closest isolate on the phylogeny. Raw FASTQ WGS data with a minimum coverage depth of 20x of the M tuberculosis H37Rv reference genome, were also analysed using TBProfiler (command line, version 2.8.12) to determine rifampicinresistance conferring mutations and to identify strain lineages.<sup>16</sup> The term isolate is used throughout to refer to patient specimens, although strain is used in reference to tuberculosis genotypic lineage.

## Data analysis

Both univariate and multivariate logistic regression analyses were done to assess associations between key factors and RMR tuberculosis in the whole cohort or genomically unique isolates in the WGS subcohort. Factors were entered into multivariate models based on univariate significance or presumed importance based on literature.  $\chi^2$  analyses were used to assess trends over time, with the study period divided into two 5-year periods. All analyses were done with IBM SPSS Statistics, version 27. Classification of RMR tuberculosis versus MDR tuberculosis for the main cohort was based on routine diagnosis (primarily based on Xpert MTB/RIF or line probe assay results, or both). For the subcohort with available WGS data, classification was based on the WGS resistance profile (TBProfiler). Time from most recent previous tuberculosis treatment episode to rifampicinresistant tuberculosis diagnosis was calculated based on treatment start date of the previous episode.

## Role of the funding source

The study funders had no role in the design and conduct of the study, the analysis and interpretation of data, or in the preparation, review, or approval of the manuscript.

### Results

Overall, 2161 patients were diagnosed with microbiologically confirmed MDR or rifampicin-resistant tuberculosis between Jan 1, 2008, and Dec 31, 2017, in Khayelitsha, Cape Town; of those 120 ( $5 \cdot 5\%$ ) were excluded as they were diagnosed solely with Xpert MTB/RIF without further testing for isoniazid resistance. This exclusion left 2041 patients in the main cohort, of whom 463 ( $22 \cdot 7\%$ ) were diagnosed with RMR tuberculosis. Previous first-line tuberculosis treatment was identified in 1354 ( $66 \cdot 3\%$ ) of 2041 patients (figure 1).

	Multivariate OR (95% Cl; n=1354)
Year of MDR or rifampicin-resistant tubero	culosis diagnosis
2008–12	1 (ref)
2013–17	1.21 (0.92–1.58)
Sex	
Female	1.05 (0.81–1.37)
Male	1 (ref)
Age, years	
≤24	1 (ref)
25-34	0.75 (0.50–1.13)
35-44	0.55 (0.35-0.88)
≥45	0.58 (0.36–0.94)
Number of previous tuberculosis treatmer	nt episodes
1	1 (ref)
2	1.27 (0.90–1.81)
≥3	1.96 (1.21–3.17)
Unknown	1.21 (0.75–1.95)
HIV status during previous tuberculosis tre	eatment
HIV-negative	1 (ref)
HIV-positive	2.07 (1.35-3.18)
HIV-positive at MDR or rifampicin-resistant tuberculosis diagnosis, unknown during previous tuberculosis treatment	1.84 (1.12–3.01)
HIV-positive at MDR or rifampicin-resistant tuberculosis diagnosis, HIV-negative during previous tuberculosis treatment	2.18 (1.01-4.68)
HIV status, or previous tuberculosis treatment status, or both, unknown	5.15 (1.38–19.25)
ata are OR (95% CI). OR=odds ratio. MDR=multi	idrug-resistant.

In previously treated individuals, the percentage identified to have been HIV-positive during previous tuberculosis treatment increased across the study period ( $\chi^2$  for trend, p<0.0001, figure 2). The percentage of new, not previously treated, individuals who were HIV-positive at MDR or rifampicin-resistant tuberculosis diagnosis also tended to increase over time, but this was not statistically significant (p=0.0001, figure 2).

On univariate analysis, diagnosis in the later time period of 2013–17, being HIV-positive at MDR or rifampicinresistant tuberculosis diagnosis, and having three or more previous first-line tuberculosis treatment episodes were associated with diagnosis of RMR tuberculosis compared with MDR tuberculosis. In contrast, HIV-negative individuals with previous first-line tuberculosis treatment were less likely to have RMR tuberculosis than those with no previous tuberculosis treatment (table 1).

On multivariate analysis, in all patients with previous first-line tuberculosis treatment, three or more previous tuberculosis treatment episodes and being HIV-positive during previous tuberculosis treatment were independently associated with increased RMR tuberculosis relative For more on **custom scripts used** see https://git.scicore. unibas.ch/TBRU/tacos

	Total (n=1169)	Unique (%)	OR (95% CI)
Year of MDR or rifampicin-resistant tuberculosis	diagnosis		
2008–12	642	178 (27.7%)	1 (ref)
2013–17	527	182 (34·5%)	1.38 (1.07–1.76)
Sex			
Female	565	183 (32·4%)	1.16 (0.90–1.48)
Male	604	177 (29.3%)	1 (ref)
Age, years			
≤24	198	48 (24·2%)	1 (ref)
25-34	425	128 (30.1	1.35 (0.92–1.98)
35-44	352	127 (36.1%)	1.76 (1.19–2.61)
≥45	194	57 (29.4%)	1.30 (0.83-2.04)
HIV status at MDR or rifampicin-resistant tubero	culosis diagnosis		
HIV-negative	320	79 (24·7%)	1 (ref)
HIV-positive	834	276 (33.1%)	1.51 (1.13-2.02)
Unknown	15	5 (33.3%)	1.53 (0.51-4.50)
Previous tuberculosis treatment	2	5 (55 5 )	33 (1 5- 1 50)
No	362	103 (28·5%)	1 (ref)
Yes	793	253 (31·9%)	1.18 (0.90–1.55)
Unknown	14	4 (28·6%)	1.01 (0.31–3.28)
Number of previous tuberculosis treatment epis	•	4 (20 0 /0)	101(051520)
1	416	126 (30·3%)	1 (ref)
2	144	45 (31.3%)	1.05 (0.69–1.58)
<u>^</u> ≥3	39	20 (51·3%)	2.42 (1.25-4.70)
20 Unknown	194	62 (32·0%)	1.08 (0.75-1.56)
Time between start of most recent previous tub			
resistant tuberculosis diagnosis	ercolosis treatmen	it episode and h	NDK of manipicin-
≤1 year	221	68 (30.8%)	1 (ref)
>1 year	378	123 (35-2%)	1.09 (0.76–1.55)
Unknown	194	62 (32.0%)	1.06 (0.70-1.60)
HIV status during previous tuberculosis treatme	nt		
HIV-negative, no previous tuberculosis treatment	128	37 (28.9%)	1 (ref)
HIV-negative, previous tuberculosis treatment	190	42 (22.1%)	0.70 (0.42–1.17)
HIV-positive, no previous tuberculosis treatment	229	64 (27.9%)	0.95 (0.59–1.54)
HIV-positive during previous tuberculosis	402	144 (35·8%)	1.37 (0.89-2.12)
treatment	402	1 (55 670)	157 (005) 112)
HIV-positive at MDR or rifampicin-resistant tuberculosis diagnosis, unknown during previous tuberculosis treatment	164	56 (34·1%)	1.28 (0.77–2.10)
HIV-positive at MDR or rifampicin-resistant tuberculosis diagnosis, HIV-negative during previous tuberculosis treatment	33	10 (30·3%)	1.07 (0.46–2.47)
HIV status, or previous tuberculosis treatment status, or both, unknown	23	76 (30·4%)	1.08 (0.41-2.83)
Drug resistance profile (WGS)			
RMR tuberculosis	236	129 (54.7%)	3.66 (2.72-4.93)
MDR tuberculosis	933	231 (24.8%)	1 (ref)
Strain lineage			
Lineage 1	7	5 (71.4%)	7.87 (1.51–40.89
Lineage 2	788	190 (24·1%)	1 (ref)
Lineage 3	28	8 (28.6%)	1.26 (0.55–2.91)
Lineage 4	346	157 (45·4%)	2.61 (2.00-3.42)

Data are n, n (%), and OR (95% CI). WGS=whole-genome sequencing. OR=odds ratio. MDR=multidrug-resistant RMR=rifampicin-monoresistant.

Table 3: Description of WGS subcohort and univariate associations with unique isolates

Using an SNP distance threshold of five, 360 (30.8%) of 1169 isolates were classified as genomically unique (not clustered with any other isolates). On univariate analysis, patients with unique isolates were more common: in the later time period, from those aged 35–44 years, from individuals who were HIV-positive at

(table 2).

35–44 years, from individuals who were HIV-positive at MDR or rifampicin-resistant tuberculosis diagnosis, those with three or more previous tuberculosis treatment episodes, those with RMR tuberculosis, and among isolates identified as lineages 1 and 4 (table 3).

to MDR tuberculosis. RMR tuberculosis was also associated with patients who were HIV-positive at MDR or rifampicin-resistant tuberculosis diagnosis but for whom HIV status during previous tuberculosis treatment was unknown, and those who were recorded as being HIVnegative during previous tuberculosis treatment. Finally, older age (35–44 years and ≥45 years) was associated with lower RMR tuberculosis compared with MDR tuberculosis

WGS data were available for 1262 (61.8%) of 2041 patients in the main cohort. WGS data were significantly more likely to be available from patients who were HIV-positive at MDR or rifampicin-resistant tuberculosis diagnosis, and from those routinely diagnosed with RMR tuberculosis, although these differences were small overall (appendix p 1). In 1262 patients with WGS data available, 93 isolates were classified as rifampicin-susceptible by TBProfiler and were excluded from further analysis, leaving 1169 isolates in the WGS subcohort. Of those 1169, 788 (67.4%) were identified as lineage 2, 346 (29.6%) as lineage 4, 28 (2.4%) as lineage 3, and seven (0.6%) as lineage 1. Phylogenetic trees for lineages 2 and 4 are given in the appendix (pp 2–3).

Of RMR tuberculosis isolates, 55% (130 of 236) were unique compared with 25% (231 of 933) of MDR tuberculosis isolates (p<0.0001). In addition, there was a strong association between drug resistance profile and *M tuberculosis* strain lineage: 32% (112 of 346) of lineage 4 isolates were RMR tuberculosis compared with only 11.8% (93 of 788) of lineage 2 isolates. Given this association, only drug resistance profile was entered into multivariate models.

In previously treated patients, in a multivariate analysis, factors associated with unique isolates were: RMR tuberculosis versus MDR tuberculosis, age 35–44 years versus 24 years or younger, HIV positivity during previous first-line tuberculosis treatment versus HIV negativity during first-line treatment, and diagnosis in 2013–17 versus 2008–12 (table 4). Given the strong association with RMR tuberculosis (odds ratio 4.96, 95% CI 3.40-7.23), a separate multivariate analysis was done in previously treated patients with RMR tuberculosis; HIV positivity during previous tuberculosis treatment (5.13, 1.61-16.32) and female sex (2.50, 1.18-5.26) were associated with uniqueness, although three or more previous tuberculosis treatment episodes also tended to be associated with uniqueness (table 4). Of the

164 previously treated patients with RMR tuberculosis, 100 (61%) were classified as unique. Of these unique isolates, 91 (91%) were identified as having a different *rpoB* mutation to that in the closest isolate (identified based on phylogenetic analysis), supporting the inference of resistance acquisition.

## Discussion

In this large cohort of patients diagnosed with MDR or rifampicin-resistant tuberculosis in Khayelitsha, Cape Town, over a 10-year period, HIV positivity during previous tuberculosis treatment was independently associated with both diagnosis of RMR tuberculosis compared with MDR tuberculosis and with identification of genomically unique *M tuberculosis* isolates based on WGS. In previously treated patients with RMR tuberculosis treatment was associated with a five-fold risk of genomic uniqueness. These data suggest that HIV infection during first-line tuberculosis treatment might be responsible for an increased risk of acquired rifampicin resistance, in turn leading to increased risk of subsequent RMR tuberculosis.

Since 2006, South Africa has seen a dramatic scale up of ART for HIV. Although this effort has contributed to decline in tuberculosis incidence overall, people living with HIV are likely to remain at higher risk of tuberculosis compared with HIV-negative individuals.17 This increased risk, combined with increased life expectancy, has resulted in increased numbers of people living with HIV developing tuberculosis and undergoing first-line tuberculosis treatment.<sup>1</sup> The increasing proportion of patients who were HIV-positive during previous first-line tuberculosis treatment shown in Khayelitsha over time demonstrates this effect. Increasing numbers of people living with HIV with multiple episodes of tuberculosis treatment combined with even a small increased risk of acquired drug resistance could account for the increase in RMR tuberculosis observed in South Africa over time.2

Data supporting the role of HIV as a direct driver of the MDR or rifampicin-resistant tuberculosis epidemic has been inconsistent. Most studies show small positive associations in both new and previously treated cohorts of patients.<sup>5,6</sup> However, many of these studies were done in countries with a low tuberculosis burden, where there might be shared risk factors for MDR or rifampicinresistant tuberculosis and HIV such as homelessness and substance misuse, compared with settings where HIV and tuberculosis are more prevalent. No association with HIV was seen in studies restricted to sub-Saharan African countries.<sup>5</sup> Similarly, there was a trend towards a negative association between HIV and acquired resistance in two African studies included in a systematic review.7 These inconclusive data could be due to relatively small sample sizes in individual studies with insufficient power to detect small increases in the risk of resistance acquisition.

	WGS subcohort (OR, 95% Cl; n=793)	WGS subcohort with RMR tuberculosis (OR, 95% Cl; n=164)	
Year of MDR or rifampicin	-resistant tuberculosis	diagnosis	
2008-12	1 (ref)	1 (ref)	
2013-17	1.42 (1.02–1.99)	0.81 (0.39–1.69)	
Sex			
Female	1.31 (0.94–1.82)	2.50 (1.18-5.26)	
Vale	1 (ref)	1 (ref)	
Age, years			
≤24	1 (ref)	1 (ref)	
25-34	1.09 (0.62–1.92)	2.37 (0.69–8.19)	
35-44	1.78 (1.00–3.17)	2.66 (0.75–9.48)	
≥45	1.43 (0.77–2.64)	0.94 (0.24–3.75)	
Drug resistance profile			See Online for apper
MDR tuberculosis	1 (ref)		See Online for apper
RMR tuberculosis	4.96 (3.40-7.23)		
Number of previous tuber	culosis treatment epis	odes	
L	1 (ref)	1 (ref)	
2	0.84 (0.53–1.31)	0.65 (0.26–1.62)	
≥3	1.48 (0.71–3.07)	4.32 (0.92–20.29)	
Unknown	1.60 (0.92–2.78)	1.94 (0.54–7.04)	
HIV status during previou	s tuberculosis treatme	nt	
HIV-negative	1 (ref)	1 (ref)	
HIV-positive	1.71 (1.03–2.84)	5.13 (1.61–16.32)	
HIV-positive at MDR or rifampicin-resistant tuberculosis diagnosis, unknown during previous tuberculosis treatment	1.18 (0.47-2.98)	2·51 (0·63-9·91)	
HIV-positive at MDR or rifampicin-resistant tuberculosis diagnosis, HIV-negative during previous tuberculosis treatment	1.18 (0.47–2.98)	1·69 (0·29-9·91)	
HIV status unknown	0.93 (0.08–10.78)		
MR=rifampicin-monoresistar atio. MDR=multidrug-resistar	-	equencing. OR=odds	
Table 4: Multivariate analys unique Mycobacterium tube previously treated for tube patients with RMR tubercu	rculosis isolates in the rculosis and separately	subcohort of patients	

Historically, incomplete adherence to tuberculosis treatment has been linked to acquired drug resistance during tuberculosis treatment, with limited direct evidence.<sup>18</sup> More recent data suggest that pharmacokinetic variability between individuals could be a larger contributor to resistance acquisition.<sup>19</sup> A number of studies have described the emergence of resistance under strict adherence, particularly in people living with HIV.<sup>20</sup> Poor adherence, in this setting, is therefore unlikely to explain the differences in association with RMR tuberculosis and risk of acquired resistance between HIV-positive and HIV-negative individuals. In contrast, data suggest that HIV, compounded by advanced immunosuppression and ART, might lead to lower concentrations of

tuberculosis drugs and variable pharmacokinetics.8,21 Individuals with low bodyweight, common in people living with HIV, might also have lower drug exposures due to higher proportional fat-free mass and weightbased dosing.<sup>22</sup> However, a systematic review was unable to find a clear association between HIV and tuberculosis drug pharmacokinetics.23 As with describing associations between HIV and acquired resistance, this lack of association could also be due to insufficiently powered and heterogeneous studies. WHO target regimen profiles for tuberculosis suggest that new resistance to tuberculosis drugs should emerge in fewer than 1% of treatment episodes when taken as prescribed.<sup>24</sup> However, few, if any, clinical trials are adequately powered to detect resistance acquisition at this level, and many trials to date have not enrolled individuals with advanced HIV. In addition, even the 1% level of resistance acquisition is predicted to result in continued high contributions of resistance acquisition to the MDR or rifampicin-resistant tuberculosis epidemic.4

While RMR tuberculosis is increasing in South Africa, lower genomic clustering in RMR tuberculosis strains, suggests that RMR tuberculosis might be less likely to be transmitted than MDR tuberculosis. The transmissibility of M tuberculosis strains is influenced by fitness costs associated with particular resistance conferring mutations.25 Previous data from this setting suggest that RMR tuberculosis isolates display a different profile of rpoB mutations conferring rifampicin resistance, including a significantly lower proportion of the common rpoB mutation Ser450Leu (unpublished data) that results in no or limited fitness cost to the bacteria, when compared with MDR tuberculosis.25 In addition, HIV infection has been shown to be associated with low-fitness rpoB mutations in a multicountry study of patients with both negative and positive HIV status.26 These data suggest that HIV could play an important role in the emergence of rifampicin-resistant and specifically RMR tuberculosis. It is also possible that inappropriate first-line treatment of RMR tuberculosis inhibits bacterial growth to a greater extent than it does for MDR tuberculosis, reducing individual infectiousness and therefore resulting in lower transmission. More detailed analysis of WGS data from this cohort will be required to discern variations in transmissibility by drug resistance profile, lineage, and patient-level factors.

In this study, we used WGS to determine genomically unique MDR or rifampicin-resistant tuberculosis isolates and genomic uniqueness to infer acquired drug resistance. Given that a considerable proportion of diagnosed MDR or rifampicin-resistant tuberculosis cases over the study period did not provide WGS data, and that an additional proportion of cases were likely to have been undiagnosed, non-clustering or uniqueness does not confirm that an individual was not directly infected with an MDR or rifampicin-resistant tuberculosis strain. However, such non-clustering does increase the likelihood of resistance acquisition as the cause of MDR or rifampicin-resistant tuberculosis and therefore can be used for analyses at a population level.<sup>27</sup> This inference of acquired resistance was also supported by the observation that the majority of unique RMR tuberculosis isolates had different *rpoB* mutations when compared with the closest isolates in a phylogenetic tree. Of note, the diagnostic strategy for rifampicinresistant tuberculosis changed over the study period, with universal drug susceptibility testing with Xpert MTB/RIF implemented from late 2011. Before this implementation, only individuals at high risk of rifampicin-resistant tuberculosis, predominantly those with previous tuberculosis treatment, received drug susceptibility testing. This change, which resulted in increased numbers of patients without previous tuberculosis treatment, could have introduced bias in the estimate of genomic uniqueness over time. However, this was a large sample of close to 1200 isolates from a geographically confined area over a decade. Although there are few large-scale studies describing associations between clustering at defined SNP thresholds and known epidemiological links, particularly in high tuberculosis burden settings and with respect to drug-resistant tuberculosis, use of a lower SNP distance threshold of five SNPs should efficiently exclude recent transmission.15

This study was also premised on the availability of high-quality retrospective data that could be used to assess whether patients with MDR or rifampicinresistant tuberculosis were HIV-positive during previous first-line tuberculosis treatment. Although available data on HIV positivity from different data sources correlated well, there remains some uncertainty in the classification of patients who were known to be HIV-positive at MDR or rifampicin-resistant tuberculosis diagnosis, but were reported to be HIV-negative during previous tuberculosis treatment. These patients were primarily classified based on the recording of HIV negativity in a tuberculosis treatment register, without verification in any other data source. A proportion of these patients might have had undiagnosed HIV at the time of first-line tuberculosis treatment, potentially explaining the observed association with RMR tuberculosis in the multivariate analysis. A further limitation was the relatively poor quality and completeness of data on CD4 levels and ART during previous tuberculosis treatment. As a result, these factors, although relevant, were not included in these analyses.

Currently, tuberculosis treatment regimens for people living with HIV are largely the same as for those who are HIV-negative, and have changed little since the 1980s.<sup>28</sup> However, evidence emerging over the last decade suggests that the rifampicin dose currently recommended for both HIV-negative and HIV-positive individuals could be insufficient and can be safely increased.<sup>23,29</sup> Encouragingly, there are several trials focused on increased rifampicin doses, including in people living with HIV.<sup>30</sup> However, these trials, assessing pharmacokinetics, safety, and efficacy, are primarily focused on the potential for treatment shortening. That they will be sufficiently powered to quantify resistance acquisition overall or to detect any differences between HIV-negative and HIV-positive individuals is highly unlikely.

This study is novel as we have assessed the impact of HIV during previous tuberculosis treatment as opposed to HIV solely at the time of MDR or rifampicin-resistant tuberculosis diagnosis. Using these data, individuals who were HIV-positive during previous tuberculosis treatment were more likely to be infected with genomically unique M tuberculosis strains and these were more likely to be RMR tuberculosis compared with MDR tuberculosis. Although these data strongly suggest that HIV is driving the emergence of RMR tuberculosis during treatment in this particular setting, in the absence of clinical trials specifically addressing this issue, large-scale prospective cohort analyses across different patient populations are required to both directly quantify this additional risk and ultimately inform tuberculosis policies to mitigate the acquisition of rifampicin resistance.

### Contributors

All authors contributed to conceptual design of this study and to drafting and revising of the final manuscript. Additionally, all authors have seen and approved the final manuscript. HC and ZS-D have verified the underlying data. All authors had full access to all the data in the study and had final responsibility for the decision to submit for publication.

### **Declaration of interests**

HC reports research grants from the US National Institutes of Health and the European and Developing Countries Clinical Trials Partnership outside the submitted work. All other authors declare no competing interests.

### Data sharing

All sequencing data will be made available via online repository (European Nucleotide Archive) upon publication under accession number PRJEB45389. A limited deidentified dataset containing patientlevel data will also be made available on publication.

### Acknowledgments

Funding for this study was provided by both a Swiss-South Africa Joint Research Award (reference: 107799, South African National Research Foundation and the Swiss National Science Foundation) and a Wellcome Trust Fellowship (HC, reference: 099818/Z/12/Z). ZS-D was funded through a PhD scholarship from the South African National Research Foundation and RMW was funded through the South African Medical Research Council. Library preparations and sequencing for 94% of isolates were done in the Genomics Facility Basel of the University of Basel and ETH Zurich Department of Biosystems Science and Engineering. The remainder were sequenced through existing collaborations with the Translational Genomics Research Institute (David Engelthaler), Centre for Disease Control and Prevention (James Posey) and Serej Ley. We would also like to acknowledge the patients diagnosed with MDR or rifampicin-resistant tuberculosis in Khayelitsha, the health-care staff who provide treatment for them, and the Western Cape Public Health Data Centre for additional data provision.

#### References

- 1 WHO. Global tuberculosis report 2020. Geneva: World Health Organization, 2020.
- 2 Ismail NA, Mvusi L, Nanoo A, et al. Prevalence of drug-resistant tuberculosis and imputed burden in South Africa: a national and sub-national cross-sectional survey. *Lancet Infect Dis* 2018; 18: 779–87.

- 3 Kendall EA, Fofana MO, Dowdy DW. Burden of transmitted multidrug resistance in epidemics of tuberculosis: a transmission modelling analysis. *Lancet Respir Med* 2015; 3: 963–72.
- Sharma A, Hill A, Kurbatova E, et al. Estimating the future burden of multidrug-resistant and extensively drug-resistant tuberculosis in India, the Philippines, Russia, and South Africa: a mathematical modelling study. *Lancet Infect Dis* 2017; **17**: 707–15.
- 5 Suchindran S, Brouwer ES, Van Rie A. Is HIV infection a risk factor for multi-drug resistant tuberculosis? A systematic review. PLoS One 2009; 4: e5561.
- 6 Mesfin YM, Hailemariam D, Biadgilign S, Kibret KT. Association between HIV/AIDS and multi-drug resistance tuberculosis: a systematic review and meta-analysis. *PLoS One* 2014; 9: e82235.
- 7 Rockwood N, Abdullahi LH, Wilkinson RJ, Meintjes G. Risk factors for acquired rifamycin and isoniazid resistance: a systematic review and meta-analysis. *PLoS One* 2015; **10**: e0139017.
- 8 Gurumurthy P, Ramachandran G, Hemanth Kumar AK, et al. Decreased bioavailability of rifampin and other antituberculosis drugs in patients with advanced human immunodeficiency virus disease. Antimicrob Agents Chemother 2004; 48: 4473–75.
- 9 Villegas L, Otero L, Sterling TR, et al. Prevalence, risk factors, and treatment outcomes of isoniazid- and rifampicin-mono-resistant pulmonary tuberculosis in Lima, Peru. PLoS One 2016; 11: e0152933.
- 10 Sharling L, Marks SM, Goodman M, Chorba T, Mase S. Rifampinresistant tuberculosis in the United States, 1998–2014. *Clin Infect Dis* 2019; **70**: 1596–605.
- Burman W, Benator D, Vernon A, et al. Acquired rifamycin resistance with twice-weekly treatment of HIV-related tuberculosis. *Am J Respir Crit Care Med* 2006; **173**: 350–56.
- 12 Cox H, Hughes J, Daniels J, et al. Community-based treatment of drug-resistant tuberculosis in Khayelitsha, South Africa. *Int J Tuberc Lung Dis* 2014; 18: 441–48.
- 13 Boulle A, Heekes A, Tiffin N, et al. Data Centre Profile: the Provincial Health Data Centre of the Western Cape Province, South Africa. Int J Popul Data Sci 2019; 4: 1143.
- 14 Hatherell HA, Colijn C, Stagg HR, Jackson C, Winter JR, Abubakar I. Interpreting whole genome sequencing for investigating tuberculosis transmission: a systematic review. BMC Med 2016; 14: 21.
- 15 Nikolayevskyy V, Niemann S, Anthony R, et al. Role and value of whole genome sequencing in studying tuberculosis transmission. *Clin Microbiol Infect* 2019; 25: 1377–82.
- 16 Phelan JE, O'Sullivan DM, Machado D, et al. Integrating informatics tools and portable sequencing technology for rapid detection of resistance to anti-tuberculous drugs. *Genome Med* 2019; 11: 41.
- 17 Lawn SD, Harries AD, Williams BG, et al. Antiretroviral therapy and the control of HIV-associated tuberculosis. Will ART do it? Int J Tuberc Lung Dis 2011; 15: 571–81.
- 18 Mitchison DA. How drug resistance emerges as a result of poor compliance during short course chemotherapy for tuberculosis. *Int J Tuberc Lung Dis* 1998; 2: 10–15.
- 19 Pasipanodya JG, Srivastava S, Gumbo T. Meta-analysis of clinical studies supports the pharmacokinetic variability hypothesis for acquired drug resistance and failure of antituberculosis therapy. *Clin Infect Dis* 2012; 55: 169–77.
- 20 Calver AD, Falmer AA, Murray M, et al. Emergence of increased resistance and extensively drug-resistant tuberculosis despite treatment adherence, South Africa. *Emerg Infect Dis* 2010; 16: 264–71.
- 21 Narendran G, Menon PA, Venkatesan P, et al. Acquired rifampicin resistance in thrice-weekly antituberculosis therapy: impact of HIV and antiretroviral therapy. *Clin Infect Dis* 2014; 59: 1798–804.
- 22 McIlleron H, Rustomjee R, Vahedi M, et al. Reduced antituberculosis drug concentrations in HIV-infected patients who are men or have low weight: implications for international dosing guidelines. Antimicrob Agents Chemother 2012; 56: 3232–38.
- 23 Daskapan A, Idrus LR, Postma MJ, et al. A systematic review on the effect of HIV infection on the pharmacokinetics of first-line tuberculosis drugs. *Clin Pharmacokinet* 2019; **58**: 747–66.
- 24 Lienhardt C, Nahid P, Rich ML, et al. Target regimen profiles for treatment of tuberculosis: a WHO document. *Eur Respir J* 2017; 49: 1602352.
- 25 Gagneux S, Long CD, Small PM, Van T, Schoolnik GK, Bohannan BJ. The competitive cost of antibiotic resistance in Mycobacterium tuberculosis. Science 2006; 312: 1944–46.

For the European Nucleotide Archive see https://www.ebi.ac. uk/ena/browser/hom For limited deidentified

dataset see https://datadryad. org/stash

- 26 Loiseau C, Brites D, Reinhard M, et al. HIV coinfection is associated with low-fitness *rpoB* variants in rifampicin-resistant *Mycobacterium tuberculosis*. *Antimicrob Agents Chemother* 2020; 64: e00782-20.
- 27 Clark TG, Mallard K, Coll F, et al. Elucidating emergence and transmission of multidrug-resistant tuberculosis in treatment experienced patients by whole genome sequencing. *PLoS One* 2013; 8: e83012.
- 28 Furin J, Cox H, Pai M. Tuberculosis. Lancet 2019; 393: 1642-56.
- 29 Peloquin CA, Velasquez GE, Lecca L, et al. Pharmacokinetic evidence from the HIRIF trial to support increased doses of rifampin for tuberculosis. *Antimicrob Agents Chemother* 2017; 61: 8.
- 30 Nabisere R, Musaazi J, Denti P, et al. Pharmacokinetics, SAfety/tolerability, and EFficacy of high-dose RIFampicin in tuberculosis-HIV co-infected patients on efavirenz- or dolutegravirbased antiretroviral therapy: study protocol for an open-label, phase II clinical trial (SAEFRIF). *Trials* 2020; 21: 181.