Respiratory infection

High prevalence of subclinical tuberculosis in HIV-1-infected persons without advanced immunodeficiency: implications for TB screening

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ABSTRACT

Background The prevalence of asymptomatic tuberculosis (TB) in recently diagnosed HIV-1-infected persons attending post-antiretroviral therapy (ART) clinics is not well described. In addition, it is unclear if the detection of Mycobacterium tuberculosis in these patients clearly represents an early asymptomatic phase leading to progressive disease or transient excretion of bacilli.

Objective To describe the prevalence and outcome of subclinical TB disease in HIV-1-infected persons not eligible for ART.

Methods The study was conducted in 274 asymptomatic ART-naive HIV-1-infected persons in Khayelitsha Day Hospital, Cape Town, South Africa. All participants were screened for TB using a symptom screen and spoligotyping was performed to determine genotypes.

Results The prevalence of subclinical TB disease was 8.5% (95% CI 5.1% to 13.0%) (n=18; median days to culture positivity 17 days), with 22% of patients being smear-positive. Spoligotyping showed a diverse variety of genotypes with all paired isolates being of the same spoligotype, effectively excluding cross-contamination. 56% of patients followed up developed symptoms 3 days to 2 months later. All were well and still in care 6–12 months after TB diagnosis; 60% were started on ART. A positive tuberculin skin test (OR 4.96, p=0.064), low CD4 count (OR 0.996, p=0.06) and number of years since HIV diagnosis (OR 1.006, p=0.056) showed trends towards predicting TB disease.

Conclusion This study found a high prevalence but good outcome (retained in care) of subclinical TB disease in HIV-1-infected persons. The results suggest that, in high HIV/TB endemic settings, a positive HIV-1 test should prompt TB screening by sputum culture irrespective of symptoms, particularly in those with a positive tuberculin skin test, longer history of HIV infection and low CD4 count. Operational difficulties in resource-constrained settings with respect to screening with TB culture highlight the need for rapid and affordable point-of-care tests to identify persons with clinical and subclinical TB disease.

INTRODUCTION

Tuberculosis (TB) is the most common opportunistic infection and is the leading cause of mortality in HIV-1-infected persons.1 Reducing the morbidity and mortality of TB in HIV-1 co-infected persons requires an improved understanding of the epidemiology of TB, including the prevalence of and risk factors for latent TB infection and TB disease in this population.

South Africa has a very high incidence of TB with an estimated national incidence rate of 948/100 000 population per year in 2007. Against this background of high prevalence, short course directly observed therapy, which is predominantly dependent on passive case finding, has been implemented with considerable success. However, this passive approach has some recognised weaknesses. Notably, it assumes that persons with TB will have symptoms as a trigger to seek investigation for TB. However, waiting for symptomatic persons to present for TB screening can result in a delay in investigation for TB and consequently continued transmission in the community as well as a potentially worse outcome.

TB infection is considered to lead to one of three outcomes: 5% are thought to progress to active TB disease (primary TB) while the majority develop an acquired immune response but no signs or symptoms of disease (latent TB infection). Among those with latent infection there is a 10% risk per lifetime (up to 10% risk per year in HIV-1-infected persons) of progressing to active TB (post-primary TB). It has recently been proposed that the latent TB infection phase, rather than being static, comprises a more dynamic spectrum of responses to TB.
infection that includes innate immune, acquired immune, quiescent infection, active infection or clinical disease. Of note, this spectrum predicts the existence of a minimally symptomatic phase of infection during which patients nevertheless become infectious.

**METHODS**

**Study location and design**

The study was conducted at site B Day Hospital, a primary care hospital in the informal township of Khayelitsha. Located on the outskirts of Cape Town, Khayelitsha has a population of over 400 000 and a TB case notification rate of over 1600/100 000, 70% of which are associated with HIV-1. The study was conducted as part of a larger cross-sectional TB diagnostics study.

**Participants**

Study participants were recruited from the HIV pre-anti-retroviral therapy (ART) clinic between February 2008 and March 2010. Written informed consent was obtained from all participants and the University of Cape Town research ethics committee approved the study (REC 012/2007).

Two hundred and seventy-four asymptomatic ART-naïve HIV-1-infected persons were recruited. At recruitment all participants were screened for TB and a baseline CD4 count was performed. All participants received the tuberculin skin test (TST) using 2 TU tuberculin PPD RT23 injected intradermally into the volar aspect of the forearm. All those with a skin induration diameter of ≥5 mm had a chest x-ray performed and were started on isoniazid preventive therapy for 6 months if the x-ray was normal. For comparison, 162 HIV-1-infected patients with TB symptoms diagnosed with culture-positive TB were recruited from the TB clinic in the same setting.

**TB screening**

All participants were screened for TB using a symptom screen (cough of any duration, fever, unintentional weight loss, loss of appetite and drenching night sweats) and study-specific induced sputum samples were collected. Microscopy and culture were performed on the collected specimens and processed at a national reference laboratory in Cape Town. A TB case was defined as one with at least one culture-positive sputum specimen in the presence (symptomatic TB cases) or absence (asymptomatic subclinical TB cases) of symptoms.

**Spoligotyping**

Genomic DNA was prepared as previously described. Twenty-six heat-killed isolates were prepared from MGIT cultures and two heat-killed isolates were prepared from Lowenstein-Jensen slope cultures. The DNA was used to perform spoligotyping as previously described using a commercially available kit from Ocimum Biosolutions BV, The Netherlands. The hybridisation patterns obtained were used to assign the isolates to genotype families using the SPOTCLUST SpolDB5 database.

**Statistical methods**

Baseline characteristics were tabulated and compared between groups using the χ² test for categorical variables and Wilcoxon test for continuous variables that were not normally distributed. Predictors of disease status were analysed by logistic regression. The model was built both manually and using the stepwise method including variables with a p value <0.10. Subsequent inclusion of other variables in turn did not improve the fit of the model to the data (using the Pearson χ² goodness-of-fit test) and these variables were therefore excluded. Median CD4 counts were compared across the symptomatic TB, asymptomatic TB and asymptomatic non-TB groups using the Kruskal-Wallis test. All p values were two-sided and p values <0.05 were considered statistically significant. All data were analysed using Stata 10.0 (StataCorp) and GraphPad Prism V5.0 software.

**RESULTS**

**Prevalence of asymptomatic culture-positive TB**

Of the 274 asymptomatic HIV-1-infected persons recruited, sputum samples were obtained from 213 (figure 1). Overall, 18 (8.5%, 95% CI 5.1% to 13.0%) were diagnosed with TB disease. A summary of the characteristics and outcomes of these patients is shown in the online supplement. Seventeen were found to be TB culture-positive on at least one specimen (median days to culture positivity 17 days), with three having an abnormal x-ray. Four of the 18 (22%) were sputum smear microscopy positive. One patient was diagnosed with TB solely on the basis of an x-ray reviewed by two doctors at the TB clinic while one person was diagnosed with culture-positive TB isolated from a cold abscess of the elbow. Four patients had negative TST results and therefore did not have an x-ray performed. These patients had moderate to severe immunosuppression with CD4 counts ranging from 11 to 250. Of the 14 patients in whom an x-ray was performed, 10 patients (71%) had normal x-rays. Face-to-face interviews were conducted with 11 of the 18 patients and folder reviews were undertaken of a further five patients 1 year after TB diagnosis. Although all participants had no TB symptoms at baseline, 9 of the 16 (56%) developed symptoms 3 days to 2 months later (median 28 days after diagnosis), including one...
patient who was admitted to hospital with disseminated TB 10 days after recruitment (patient 1 in table 1 in the online supplement). Seven of the 16 received isoniazid preventive therapy for up to 3 months. There was no difference in the proportion that developed symptoms between those who did and did not receive isoniazid preventive therapy (57% vs 56%). All 16 were started on and completed TB treatment irrespective of whether symptoms subsequently developed and were still in care 6–12 months after TB diagnosis and treatment; 60% became eligible for and were started on ART in accordance with South African national guidelines.

At baseline a greater proportion of the asymptomatic TB group had a TST $\geq$5 mm than those with no TB (78% vs 56%; p = 0.051) and a higher proportion of asymptomatic TB patients had CD4 counts $\leq$ 200 compared with the non-TB group (p = 0.055). There was no statistically significant difference between the two groups at baseline with respect to all other characteristics measured (table 1).

Having found a high prevalence of asymptomatic disease, we wished to exclude cross-contamination as a possible cause of culture-positive results using spoligotyping. We found a diverse variety of genotypes (see table 1 in the online supplement), with all paired isolates being of the same spoligotype, thereby effectively excluding cross-contamination as a source of culture-positive results.

### Table 1: Baseline characteristics by TB disease group

| Characteristic | Non-TB | Asymptomatic TB | p Value | Overall N (%) |
|---------------|--------|-----------------|---------|---------------|
| Sex           |        |                 |         |               |
| Male          | 200 (80) | 15 (83)        | 0.732   | 215 (80)      |
| Female        | 50 (20)  | 3 (17)          | 0.255   | 53 (20)       |
| Previous TB   |        |                 |         |               |
| No            | 193 (85) | 13 (75)        | 0.286   | 205 (84)      |
| Yes           | 34 (15)  | 4 (25)          | 0.386   | 38 (16)       |
| BCG scar      |        |                 |         |               |
| No            | 108 (54) | 10 (59)        | 0.699   | 118 (54)      |
| Yes           | 93 (46)  | 7 (41)          | 0.432   | 100 (46)      |
| TB contact    |        |                 |         |               |
| No            | 176 (80) | 13 (76)        | 0.756   | 189 (79)      |
| Yes           | 45 (20)  | 4 (24)          | 0.492   | 49 (21)       |
| CD4 count     |        |                 |         |               |
| $\leq$200     | 45 (20)  | 7 (39)          | 0.055   | 52 (21)       |
| $>200$        | 183 (80) | 11 (61)        | 0.194   | 194 (79)      |
| Tuberculin skin test |      |                 |         |               |
| $<5$ mm       | 98 (44)  | 4 (22)          | 0.051   | 102 (42)      |
| $\geq$5 mm    | 124 (56) | 14 (70)        | 0.115   | 138 (56)      |
| Smoker        |        |                 |         |               |
| No            | 164 (81) | 12 (75)        | 0.546   | 176 (81)      |
| Yes           | 38 (19)  | 4 (25)          | 0.421   | 42 (19)       |
| Alcohol consumption |      |                 |         |               |
| No            | 159 (79) | 11 (65)        | 0.183   | 170 (78)      |
| Yes           | 43 (21)  | 6 (35)          | 0.489   | 49 (22)       |
| Time in Khayelitsha |      |                 |         |               |
| $<6$ months   | 5 (3)    | 0 (0)           | 0.215   | 5 (2)         |
| 6–12 months   | 6 (3)    | 2 (12.5)        | 0.546   | 8 (4)         |
| 1–5 years     | 43 (22)  | 2 (12.5)        | 0.452   | 45 (21)       |
| $>5$ years    | 140 (72) | 12 (75)        | 0.521   | 152 (73)      |

### Comparison with symptomatic TB cases
We examined the CD4 count distribution, proportion of smear-negative culture-positive patients and days to culture positivity in asymptomatic TB cases and compared them with symptomatic TB cases and a control group of asymptomatic HIV-1-infected persons with no TB. Patients in all three groups came from the same setting, had similar baseline characteristics and were recruited under the same conditions. CD4 counts were highest in those with no TB (median 322, IQR 225–446) and lowest in symptomatic TB patients (median 148, IQR 64–259), with the median CD4 count of asymptomatic TB cases being between them (median 249, IQR 170–352, table 2). This trend to a decline in CD4 count was statistically significant (p < 0.001). In addition, there was a significant difference in the median days to culture positivity in the asymptomatic and symptomatic TB groups with a median of 17 days (IQR 12–39) in those with a negative TB screen and 7 days (IQR 6–12) in symptomatic TB cases (p < 0.001, figure 2). Seventy per cent of asymptomatic TB patients had smear-negative TB compared with only 16% of symptomatic TB patients (p < 0.001), suggesting that the bacterial burden is lower in patients with subclinical TB.

### Risk factors for asymptomatic TB disease
Of the asymptomatic HIV-1-infected persons recruited, 69% were recruited from the HIV pre-ART clinic and 31% from the HIV counselling and testing clinic (HCT) within 50 days of HIV-1 diagnosis. There was no significant difference in the prevalence of TB disease between persons recruited from the two clinics. In addition, there was no significant difference in CD4 counts (p = 0.600) between persons recruited from the HCT clinic (median CD4 count 326 (IQR 166–456); median time since HIV-1 diagnosis 6 days (IQR 0–13)) and those from the HIV-1 clinic (median CD4 count 305 (IQR 230–483); median time since HIV-1 diagnosis 776 days (IQR 278–1585)). These two groups did not differ significantly in other baseline characteristics measured.

To further explore the risk factors for asymptomatic TB disease, we conducted multivariable logistic regression on all asymptomatic persons with the presence or absence of TB disease as an outcome variable (table 3). A positive TST (OR 4.96, p = 0.0064), a longer history of HIV infection (OR 1.006, p = 0.064) and a low CD4 count (OR 0.996, p = 0.060) showed trends (albeit not statistically significant) towards being predictive of subclinical TB disease.

### DISCUSSION
We report an 8.5% prevalence of asymptomatic TB disease among HIV-1-infected persons not receiving ART in Cape Town. We also showed that most of these cases progressed clinically with development of symptoms a median of 28 days after diagnosis, as well as good adherence and treatment outcome at follow-up 6–12 months after TB diagnosis. This suggests an increasing bacterial load after initial screening and that screening before the likely development of symptoms was beneficial in indicating the presence of actively replicating bacilli. This early

### Table 2: CD4 count gradient across TB disease groups

| CD4 count | IQR | p Value (Kruskal–Wallis) |
|-----------|-----|-------------------------|
| Asymptomatic, no TB disease | 322 | 225–446 | <0.0001 |
| Asymptomatic, TB disease | 249 | 170–332 |
| Symptomatic, TB disease | 148 | 64–259 |
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Figure 2 Scatterplot showing a comparison of number of days to culture positivity in symptomatic and asymptomatic TB cases. ASx, asymptomatic subclinical TB cases; Sx, symptomatic TB cases.

diagnosis resulted in patients receiving treatment for TB earlier than would otherwise have occurred. This finding has potential significance for TB control programmes implemented in this setting, in addition to wider public health implications.

Our findings support the hypothesis that TB infection presents as a spectrum from innate immune clearance to clinical disease and development of symptoms. In a previous study we demonstrated a significant correlation between bacterial load (measured by degree of smear positivity in TB patients) and the interferon gamma release assay (IGRA) response, as well as a trend towards a correlation between the IGRA response and days to culture positivity. This suggested an association between bacterial load and days to culture positivity. Using days to culture positivity as a marker of bacterial load, our result showing a longer period to culture positivity in asymptomatic than in symptomatic persons suggests a higher bacterial load in asymptomatic persons than in asymptomatic persons. Our finding of a greater proportion of smear-negative TB cases in the asymptomatic cases than in the symptomatic TB cases (70% vs 16%) also supports this interpretation. In addition, by comparing asymptomatic persons with no TB, asymptomatic cases with TB and symptomatic TB cases, we demonstrate a spectrum in CD4 count distribution with decreasing CD4 counts across these three groups.

Several studies have reported subclinical asymptomatic TB disease as defined by culture-positive TB in the absence of TB symptoms. Swaminathan et al screened HIV-1-infected persons in India and reported a 4% prevalence of unrecognised TB in HIV-1-infected persons with minimal or no symptoms, normal chest x-rays, negative smears and different levels of immunosuppression. This suggested is that, in a healthcare system with a strong TB diagnosis and treatment programme, severe cases are identified early leaving TB patients with fewer clinical symptoms to be identified through provider-initiated TB screening. Results from a meta-analysis of yield of HIV-1-associated TB during intensified case-finding suggested that TB cases diagnosed by active screening might be less likely to adhere to treatment, resulting in poor outcomes. In our study, all patients started on TB treatment completed the 6-month course with good outcomes and remained in care at 6–12 months after treatment.

We also explored potential risk factors for TB disease in asymptomatic HIV-1-infected persons. We found a trend towards a TST ≥5 mm, lower CD4 count and increasing number of days since HIV-1 diagnosis being associated with an increased risk of TB disease. There was a 5% decrease in TB disease risk for every increase in the CD4 count of 10 cells/mm³, and an increase of 24% in the risk of TB disease for every year after HIV-1 diagnosis. This raises concern about the possibility of the association we report being linked to nosocomial transmission of TB. However, when we compared the prevalence of asymptomatic TB in those who had been in HIV care for <30 days with those who had received a diagnosis of HIV-1

### Table 3 Risk factors for asymptomatic TB disease

|                     | Univariate analysis | Multivariable analysis |
|---------------------|---------------------|------------------------|
|                     | OR (95% CI)         | p Value                |
| CD4 cell count/mm³  | 0.996 (0.992 to 1.000) | 0.060 |
| Tuberculin skin test ≥5 mm | 4.96 (0.990 to 17.662) | 0.064 |
| Days since HIV-1 diagnosis | 1.006 (0.999 to 1.010) | 0.056 |
| Age (years)         | 0.980 (0.980 to 0.983) | 0.001 |
| Male sex            | 0.980 (0.978 to 0.983) | 0.001 |
| Body mass index     | 0.980 (0.978 to 0.983) | 0.001 |
| History of previous TB | 1.006 (0.999 to 1.010) | 0.056 |
| Smoker              | 1.006 (0.999 to 1.010) | 0.056 |
| BCG scar presence   | 1.006 (0.999 to 1.010) | 0.056 |
| Contact with TB     | 1.006 (0.999 to 1.010) | 0.056 |
| Alcohol consumption | 1.006 (0.999 to 1.010) | 0.056 |
| Time in Khayelitsha >5 years | 1.006 (0.999 to 1.010) | 0.056 |
≥30 days earlier and were established in the pre-ART clinic, there was no statistically significant difference in the prevalence of subclinical TB.

The question of the public health relevance of asymptomatic persons found to be TB culture-positive with respect to the contribution to transmission is potentially important. It has been shown that smear-negative culture-positive TB is transmissible but less infectious than smear-positive disease, with smear-negative disease being responsible for up to 17% of transmitted TB. In our study, 22% of asymptomatic cases were smear positive and therefore more infectious; 56% progressed to develop symptoms within 2 months, suggesting that they would ultimately have been likely to contribute to transmission.

Limitations of the study
The specificity of culture can be affected by contamination as a result of laboratory manipulations. We excluded cross-contamination as a cause of culture-positive results by strain typing of isolates. In addition, the reference laboratory where the samples were processed has previously reported low contamination rates; of 500 dummy sputum samples, none were false positive for Mycobacterium tuberculosis.

CONCLUSION
Our results show a high prevalence of asymptomatic TB disease in HIV-1 co-infected persons in Cape Town. These results suggest that, in high HIV/TB prevalence settings, a diagnosis of HIV-1 should prompt a TB test by sputum culture even in the absence of symptoms, particularly in persons with positive TST reactions, lower CD4 counts and a longer history of HIV. The WHO guidelines for isoniazid preventive therapy in resource-constrained settings recommend that all HIV-infected persons, irrespective of the degree of immunosuppression, should be screened for TB and isoniazid preventive therapy provided if no symptoms. A recent meta-analysis by Getahun et al aimed to develop a standardised TB screening tool for HIV-infected persons found that the clinical rule of any of the following symptoms (current cough, night sweats, fever or weight loss) excluded active TB disease with a sensitivity of 78.9% and specificity of 49.6%. However, it was noted that the negative predictive value of this screening tool was dependent on the prevalence of TB in the screened population, ranging from 97.7% at a TB prevalence of 5% to 90% at a TB prevalence of 20%. Isoniazid preventive therapy has been shown to significantly decrease the incidence of TB in HIV-infected persons, but is not widely implemented owing to reservations about effective exclusion of active TB. Therefore, in most high-burden low-resource settings, Getahun et al show that this clinical tool will be sufficient to exclude active TB, permitting implementation of isoniazid preventive therapy. However, in settings like the Western Cape of South Africa with one of the most intense TB transmission rates in the world, our results show that this clinical tool will miss 8.5% of HIV-infected persons with subclinical TB.

However, we acknowledge the operational difficulties in the majority of resource-constrained settings with respect to screening with TB culture, highlighting the need for new rapid and affordable point-of-care diagnostic tests to identify persons with clinical and subclinical TB disease.

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Competing interests None.

Ethics approval This study was conducted with the approval of the University of Cape Town.

Contributors TO contributed to data collection and was responsible for data analysis and writing of the manuscript. RB contributed to data collection and analysis. RT contributed to data collection. RS was responsible for strain typing of culture isolates. NB, HPG and KW were responsible for laboratory processing of specimens. KAW and THMO contributed to the writing of the manuscript. THMO supervised the preparation of the recombinant fusion protein used in the IGRA. RJW contributed to study design and writing of the manuscript.

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