# Cost-effectiveness of screening with transcriptional signatures for incipient TB among U.S. migrants

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Running title: CEA of screening with HrTS among U.S. migrants

#### 1 ABSTRACT

Introduction: Host-response-based transcriptional signatures (HrTS) have been developed to
identify "incipient tuberculosis (TB)". No study has reported the cost-effectiveness of HrTS for
post-arrival migrant screening programs in low-incidence countries.

5 **Objectives:** To assess the potential health impact and cost-effectiveness of HrTS for post-

6 arrival TB infection screening among new migrants in the United States.

7 Methods: We used a discrete-event simulation model to compare four strategies: (1) no

8 screening for TB infection or incipient TB; (2) 'IGRA-only', screen all with interferon gamma

9 release assay (IGRA), provide TB preventive treatment for IGRA-positives; (3) 'IGRA-HrTS',

10 screen all with IGRA followed by HrTS for IGRA-positives, provide incipient TB treatment for

11 individuals testing positive with both tests; and (4) 'HrTS-only', screen all with HrTS, provide

12 incipient TB treatment for HrTS-positives. We assessed outcomes over the lifetime of migrants

entering the U.S. in 2019, assuming HrTS met the WHO Target Product Profile (TPP) optimal

14 criteria. We conducted sensitivity analyses to evaluate the robustness of results.

Results: The IGRA-only strategy dominated the HrTS-based strategies under both healthcare
 sector and societal perspectives, with an incremental cost-effectiveness ratio of \$78,943 and

17 \$89,431 per guality-adjusted life-years (QALY) gained, respectively. This conclusion was robust

to varying costs (\$15–300) and characteristics of HrTS, and the willingness-to-pay threshold

19 (\$30,000–150,000/ QALY gained), but sensitive to the rate of decline in TB progression risk

20 after U.S. entry.

Conclusions: Our findings suggest that HrTS meeting the WHO TPP is unlikely to be a cost effective component of post-arrival screening for migrants entering the U.S.

## 23 Introduction

24 Without preventive treatment, approximately 5-10% of healthy individuals infected with 25 Mycobacterium tuberculosis (Mtb) will progress to tuberculosis (TB) disease during their lifetime.<sup>1,2</sup> Current WHO guidelines recommend targeting TB preventive treatment to infected 26 27 persons at highest risk of disease progression. However, current tests for *Mtb* infection, including the interferon gamma release assay (IGRA) and tuberculin skin test (TST), have low 28 29 positive predictive values for the proximal onset of TB disease, with only 1-6% of individuals identified with these tests developing TB within two years.<sup>3-6</sup> The lack of tools for predicting TB 30 31 disease limits the ability of TB programs to target preventive treatment to those at highest risk. 32 33 In recent years, host-response-based transcriptional signatures (henceforth, HrTS) have been investigated for their potential to identify "incipient TB" based on the association between 34 changes in host transcriptome and risk of disease progression.<sup>7,8</sup> Incipient TB has been defined 35 as "*Mtb* infection that is likely to progress to TB disease in the absence of further intervention 36 37 but has not yet induced clinical symptoms, radiographic abnormalities, or microbiologic evidence consistent with TB disease".<sup>9</sup> If HrTS can distinguish incipient TB from non-38 progressing Mtb infection, these tests could facilitate more targeted delivery of interventions to 39 prevent disease progression. WHO has established a Target Product Profile (TPP) for this class 40 41 of tests, recommending sensitivity and specificity of at least 75% (minimum criteria), and ideally 42 90% (optimal criteria), for distinguishing individuals who would progress to TB disease within two years.7 43 44

One potential use case of HrTS is for targeting TB preventive treatment among migrants from countries with high TB incidence moving to lower TB incidence settings. In many low-incidence countries, migrants have elevated TB incidence rates as a result of infection acquired before or during migration.<sup>10</sup> For example, in the United States, 71% of reported TB cases between 2017

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and 2021 occurred in non-US-born persons,<sup>11</sup> and most were attributable to infection acquired 49 before entry.<sup>12</sup> Screening and treatment of *Mtb* infection in high-risk migrant populations has 50 been identified as a key component in global tuberculosis control effort.<sup>13</sup> In this setting, HrTS 51 52 may be useful as a rule-out test to reduce the need to treat all individuals with a positive IGRA result, the majority of whom are at very low risk of proximal progression. It could also be used 53 as a stand-alone rule-in test for incipient TB. To the best of our knowledge, no study has 54 evaluated the cost-effectiveness of such a test as a post-arrival screening tool for Mtb infection 55 56 among migrants to low-TB burden countries.

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In this study, we assessed the potential health impact and cost-effectiveness of four post-arrival screening strategies for *Mtb* infection among new U.S. migrants, using a potential HrTS that meets the WHO TPP optimal criteria. To compare these strategies, we used a decision analytic framework with a discrete-event simulation (DES) model. We parameterized this model with data for the 2019 immigrant cohort to estimate lifetime TB-related health outcomes and health service utilization under each screening scenario.

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#### 65 Methods

*Study Population.* Our simulated study cohort (n = 2,042,225) included migrants whose annual 66 67 TB risk could be estimated from a published TB risk model as a function of migrants' country-oforigin, entry year, age at entry, and number of years since entry to the U.S.<sup>14</sup> Our study cohort 68 represented 97 countries-of-origin, accounting for 70.6% of the 2019 entry cohort and the 69 majority of TB cases among this population. The population sizes by age and country-of-origin 70 71 were estimated from 2019 American Community Survey data. We divided the study population into four risk categories based on WHO-estimated country-of-origin TB incidence rates in 2019 72 (I, 0-9.9; II, 10-99.9; III, 100-299.9; and IV, ≥300 per 100,000). We conducted our analyses for 73

the entire study cohort and by risk category (Table 1). Further details are given in Appendix 1 inthe online supplement.

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Intervention Strategies. We compared four post-arrival screening strategies: (I) no screening 77 78 for TB infection or incipient TB ('no screening'); (II) screen all with IGRA, provide TB preventive 79 treatment for individuals testing positive ('IGRA-only'); (III) screen all with IGRA followed by 80 HrTS for IGRA-positive persons, provide incipient TB treatment for individuals testing positive 81 with both tests ('IGRA-HrTS'); and (IV) screen all with HrTS, provide incipient TB treatment for individuals testing positive ('HrTS-only'). Screening was assumed to occur one month after U.S. 82 arrival. Strategies II - IV also assumed screening and treatment for TB disease prior to provision 83 of TB preventive treatment or incipient TB treatment. We assumed that, if diagnosed, TB 84 85 disease would be treated with a standard first line treatment, Mtb infection would be treated with 86 once-weekly isoniazid-rifapentine for 12 weeks, and incipient TB would be treated with one month of daily isoniazid-rifampicin followed by three months of isoniazid-rifampicin thrice 87 weekly.<sup>15</sup> Table 2 summarizes clinical decision rules, and Appendix 2 in the online supplement 88 89 provides a flowchart for each strategy.

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For IGRA, we defined sensitivity and specificity with respect to the *Mtb* infection status at the 91 92 time of testing. We assumed IGRA would be positive in 98.5% of individuals with Mtb infection and negative in 78.9% of individuals without *Mtb* infection.<sup>16</sup> For HrTS, we defined sensitivity 93 and specificity of HrTS with respect to prevalent and future TB disease. For specificity, we 94 assumed that HrTS would be negative in 90% of individuals without infection or with infection 95 that would not lead to disease before death. We assumed HrTS would have a sensitivity of 90% 96 97 for prevalent TB as well as TB cases occurring within two years of testing, and a sensitivity of 98 10% for cases occurring subsequently. This assumption implies the test cannot distinguish individuals who will from those who will not develop TB disease beyond the two-year predictive 99

period, consistent with the reported performance of current signatures.<sup>17</sup> Further, we assumed
independence in IGRA and HrTS test results, conditional on an individual's TB-related health
status at the time of testing ((1) no *Mtb* infection, (2) *Mtb* infection that will not progress to TB
disease during lifetime, (3) *Mtb* infection that will progress within two years (incipient TB), (4) *Mtb* infection that will progress after two years, (5) prevalent TB disease).

106 Discrete Event Simulation (DES) Model. Each migrant in the study population was represented as an individual in the DES model, characterized by country-of-origin, entry age. 107 and initial health state upon U.S. arrival. The three possible initial health states were: (1) no Mtb 108 109 infection, (2) Mtb infection without TB disease, (3) TB disease. Initial health states were assigned based on estimated prevalence of Mtb infection and estimated incidence of TB 110 111 disease, by age and country-of-origin. To parameterize progression from Mtb infection to TB 112 disease, we estimated individual TB risk over time by applying the demographic data of the 2019 entry cohort to the fitted TB risk model reported in Hill et al.<sup>14</sup> This empirical study 113 114 estimated TB incidence rates among U.S. migrants after entry to the country, as a function of 115 entry year, entry age, country-of-origin, and time since entry (Appendix 1 in the online 116 supplement).

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To estimate *Mtb* infection prevalence of by country-of-origin and age group, we fit a functional relationship between *Mtb* infection prevalence and TB incidence rate using data reported by the U.S. TB Epidemiological Studies Consortium,<sup>18</sup> and calibrated this to match the overall prevalence of *Mtb* infection in the non-US-born population.<sup>19</sup> See Appendix 3 in the online supplement for details. The fraction of migrants entering the US with TB disease was based on the number of TB cases diagnosed in the 6 months following U.S. entry, estimated using the published TB risk model.<sup>14</sup>

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126 At the beginning of the simulation, each individual was assigned a time-to-TB value, drawn 127 randomly from empirical survival functions of TB incidence, described in Appendix 4 in the online supplement. Each individual was also assigned a time-to-death value, drawn from 128 survival functions derived from the 2017 U.S. Life Tables for non-US-born individuals.<sup>20</sup> Whether 129 130 a simulated individual would develop TB disease in their lifetime was determined by the Gillespie algorithm:<sup>21</sup> in the absence of intervention, those with a time-to-TB shorter than the 131 132 time-to-death were expected to develop TB during their lifetime. Event data from U.S. entry to death were simulated and recorded for all modelled individuals. The model was developed in 133 R.<sup>22</sup> Appendix 5 in the online supplement reports parameter values. 134 135 **Positive predictive value and negative predictive value.** For each screening strategy, we 136 137 calculated the positive predictive value (PPV) and negative predictive value (NPV) of ever 138 having TB in their lifetime, including prevalent TB disease at the time of testing. Additionally, we estimated the PPV and NPV of having TB disease within two years of testing, including 139 prevalent TB disease. 140

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142 Health outcomes and economic evaluation. We estimated the number of TB cases averted, guality adjusted life years (QALYs) gained, number of each test administered, and number of 143 each treatment prescribed under each strategy. In the base case scenario, IGRA and HrTS 144 were \$62 and \$30 in 2021 U.S. dollars, respectively. Other healthcare related and non-145 146 healthcare related costs are in Appendix 5 in the online supplement. We conducted a costeffectiveness analysis from both societal and healthcare sector perspectives, with costs and 147 QALYs discounted at 3% annually.<sup>23</sup> We also calculated the net monetary benefit (total 148 149 monetized health benefits minus total societal costs) for each strategy with health gains valued at US\$150,000 per QALY,<sup>24</sup> and other values considered in sensitivity analyses. Appendix 7 in 150 the online supplement provides an impact inventory and additional costing methods. 151

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153 Sensitivity Analysis. We conducted probabilistic sensitivity analysis (PSA) to determine the robustness of our results to collective uncertainty in all parameter inputs, generating 1000 154 simulated values for all cohort outcomes.<sup>25</sup> The distributions of parameters included in the PSA 155 156 are in Table E3 in the online supplement. We conducted an additional two-way sensitivity 157 analysis over the cost of HrTS (US\$15 – \$300) and willingness-to-pay threshold (\$30,000 – \$150,000 per QALY gained). We also performed a multi-way sensitivity analysis across 158 plausible ranges of sensitivity (75 - 100%), specificity (75 - 100%), and cost of HrTS (\$15 -159 300), along with the timeframe over which the sensitivity value holds (2 – 10 years) and the 160 willingness-to-pay threshold. The multi-way sensitivity analysis helps inform whether and under 161 what circumstances the HrTS strategies would be cost-effective. Finally, we estimated results 162 163 for an alternative scenario that assumed a more rapid decline in the rate of progression to TB 164 disease with increasing years since U.S. entry. In this scenario, the annual number of TB cases remained the same as in the main analysis, but the proportion of cases attributable to a pre-165 existing infection was assumed to decline by 3.4% with each additional year since entry. The 166 167 remainder were assumed to result from TB (re)infection after U.S. entry, and could not be 168 averted by the modelled interventions. See Appendix 10 for details. 169 Point estimates for all reported outcomes were calculated as the mean of the 1000 values 170

generated by the PSA, with uncertainties expressed in 95% credible intervals, unless otherwise
specified. The incremental cost-effectiveness ratio (ICER) was calculated as the ratio of the
mean of incremental cost to the mean of the incremental QALY gained.

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### 175 **Results**

176 *Expected number of TB cases identified by years since entry*. The median age at entry of
 177 the study cohort was 29 years old, and the estimated LTBI prevalence was 12.4% (95% credible

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interval (CI), 8.5 to 43.5). Under the no-screening strategy, we projected 5601 (3667 to 8177) 178 179 members of the study cohort would develop TB over their lifetime (2.7 per 1000, 2.4 to 3.1). For these individuals, the expected median time to TB was estimated to be 11.3 (IQR 3.1, 26.3) 180 years, with 20.2% (18.6 to 21.7) of cases occurring within two years of U.S. arrival. The CDC 181 182 Online Tuberculosis Information System Data reported 840 TB cases among non-US-born population within the first year they entered the U.S. in 2019, and our risk model estimated 770 183 184 (95% CI 629 to 894) cases.<sup>18</sup> 185 186 Figure 1 shows the projected number of TB cases by year under each strategy. In the noscreening and the IGRA-only strategies, the trend decreases monotonically. In contrast, the 187 IGRA-HrTS and the HrTS-only strategies show a slight rebound after year one followed by a 188 189 monotonic decrease thereafter, as HrTS identified most of the incipient TB at the time of 190 screening. For the IGRA-HrTS and HrTS-only strategies, TB incidence reductions are concentrated in the years following screening, while the TB incidence reduction accumulates 191 192 over a longer period, proportional to overall incidence trends, in the IGRA-only strategy. 193 194 Compared to the no-screening strategy, the IGRA-only strategy was estimated to result in the 195 greatest reduction (33.7%, 25.7 to 42.8) in TB cases over the lifetime of the entire study cohort, followed by the HrTS-only strategy (13.2%, 11.3 to 16.0) and the IGRA-HrTS strategy (10.4%, 196 197 9.0 to 12.2) (Table 3). This pattern was consistent across risk categories. 198 Utilization of screening and treatment resources. In the IGRA-only strategy, 11.1% (95% CI 199 9.2 to 13.4) of the study cohort tested positive with IGRA, 1.1% (95% CI 0.9 to 1.4) tested 200 201 positive with both IGRA and HrTS in the IGRA-HrTS strategy, and 10.0% (95% CI 9.99 to 202 10.02) tested positive with HrTS in the HrTS-only strategy (Online Supplement Table E4). The 203 proportions of the cohort receiving an intervention to prevent disease progression were more

204	than eight times higher in the IGRA-only strategy (8.5%, 7.1 to 10.3) and the HrTS-only strategy
205	(8.8%, 7.8 to 9.6), compared to the IGRA-HrTS strategy (1.0 %, 0.8 to 1.2) (Table 3).
206	
207	The expected proportions treated for TB disease, identified through active or passive screening,

were highest in the no-screening strategy, followed by the IGRA-HrTS strategy, and the IGRA-only strategy (Table 3).

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PPV and NPV of screening algorithms. Overall, the PPV for TB disease within two years 211 212 (3.6%, 3.0 to 4.2) and over the lifetime (5.4%, 4.5 to 6.1) were highest in the IGRA-HrTS strategy. The PPV for TB disease within two years was the lowest in the IGRA-only strategy 213 (0.4%, 0.3 to 0.5) and the PPV for TB disease over lifetime was the lowest in the HrTS-only 214 215 strategy (0.8%, 0.7 to 0.8). Comparing across risk groups, PPV values were higher among 216 migrant populations from countries with higher TB risks (Table 3). The NPV for future TB 217 disease within two years and over lifetime were greater in lower risk categories, but were high 218 overall for all strategies (Table 3).

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220 Health benefits, costs, and cost-effectiveness. Relative to the no-screening strategy, the 221 IGRA-only strategy produced the greatest per-person gain in QALYs whereas the IGRA-HrTS 222 strategy offered the least. From the healthcare sector perspective, the HrTS-only strategy 223 incurred the greatest additional costs while the IGRA-only strategy incurred the least. From the 224 societal perspective, the HrTS-only strategy was the costliest, while the IGRA-HrTS strategy was the least costly. Compared to the no-screening strategy, the IGRA-only strategy resulted in 225 an ICER of US\$78,943 per QALY gained in the healthcare sector perspective and an ICER of 226 227 \$89,431 in the societal perspective, dominating the IGRA-HrTS and HrTS-only strategies (Table 228 4). The subgroup cost-effectiveness results are in Appendix 8 in the online supplement.

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Sensitivity analysis. Two-way sensitivity analyses show that our cost-effectiveness analysis conclusion is robust to the cost of HrTS as well as the willingness to pay threshold (Online Supplement Figures E2-1, E2-2), even when the cost of HrTS is as low as \$15. Our four-way sensitivity analyses show that for the highest risk group, when the cost of HrTS is \$15, the HrTS-only strategy may be cost-effective from the societal perspective when HrTS has a >75% sensitivity for TB cases occurring seven years after testing, or nine years when analyzed from the healthcare sector perspective (Online Supplement Figures E3-1-1, E3-1-2).

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In an alternative scenario that assumed a more rapid decline in the rate of progression to TB
disease following U.S. entry, the IGRA-only strategy remained the cost-effective strategy from
both healthcare sector and societal perspectives, at a \$150,000 willingness-to-pay threshold
and a \$30 HrTS. However, at a willingness-to-pay threshold to \$100,000 the IGRA-HrTS
strategy would be cost-effective from the healthcare sector perspective (Online Supplement
Table E11).

244

# 245 **Discussion**

246 To our knowledge, this is the first analysis to formally evaluate the cost-effectiveness of incorporating host transcriptomic signatures in post-arrival screening algorithms among 247 248 migrants in a low-incidence country. In our main analysis, we found that, compared to the 249 current recommendation of using IGRA to screen for and treat Mtb infection, it would not be 250 cost-effective to use HrTS either as a rule-out test among IGRA positives or as a stand-alone rule-in test for incipient TB among newly arrived migrants in the United States, even if these 251 252 tests meet the WHO TPP optimal criteria. In our study, HrTS was assumed to have a 90% 253 sensitivity of TB cases occurring in the first two years after U.S. arrival, which represented 20% 254 of TB cases occurring over the lifetime of our study cohort. HrTS only had a 10% sensitivity for the remaining cases. In contrast, while IGRA had a lower sensitivity for incipient cases, these 255

tests retained a 78% sensitivity for cases occurring after this initial two-year period, a key
 reason why the IGRA-only strategy dominated the other screening strategies.

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If HrTS could predict more cases with delayed onset, these new screening tools may be cost-259 260 effective. As we report in sensitivity analyses, the HrTS-only strategy would be preferred if HrTS 261 retains at least a 75% sensitivity for TB cases occurring over at least the subsequent seven 262 years. However, it is unlikely that HrTS signatures with high sensitivity over an interval longer than two years are imminent.<sup>17</sup> In addition, in an alternative scenario that assumed more rapid 263 declines in the rate of progression to TB disease following U.S. entry, the health benefits 264 estimated for the IGRA-only strategy were proportionally lower, and HrTS was found to be 265 potentially cost-effective. In this analysis, the IGRA-HrTS strategy became the preferred 266 267 strategy from the healthcare sector perspective for a willingness-to-pay threshold for \$100,000 268 per QALY, indicating that the cost-effectiveness of HrTS depends on the long-term health 269 benefits achieved with the current IGRA-only strategy. Additional studies estimating the 270 dynamics of TB progression risk many years after migration would be valuable.

271

272 We have evaluated only one specific use case of HrTS among recent migrants to low incidence 273 settings, and HrTS may have greater value in settings with higher TB incidence. A modelling 274 study by Sumner et al. showed that targeted TB preventive therapy guided by a blood transcriptomic biomarker (RISK11) may be more effective in averting TB cases than a one-off 275 universal treatment amongst people living with HIV but would require repeat testing.<sup>26</sup> The 276 modelled cohort they evaluated had a TB incidence rate much higher than in our study. They 277 278 also reported that for the signature to be cost-effective, the cost of the test would need to be 279 one-tenth of the preventive therapy regimen, assuming annual screening. HrTS could also be 280 used to screen for active TB disease in migrant populations. However, a cost-effectiveness

analysis of HrTS for TB screening in adults with suspected TB disease in the United Kingdom
 showed that it would not be cost-effective compared to the status quo.<sup>27</sup>

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We found that the IGRA-only strategy had the lowest PPV for incipient TB disease while the 284 285 HrTS-only strategy had the lowest PPV for TB disease over the remaining lifetime. This reflects 286 the assumption that after the initial two-year window, the HrTS has a 10% false positive rate. substantially higher than the 1.5% with IGRA. This result highlights that both the PPV and NPV 287 are important metrics for quantifying the overall value provided by these predictive tests. 288 289 Compared to the PPV of IGRA reported in the UK PREDICT TB study (3.0%), our study found a lower PPV of IGRA (0.4% for TB within two years). However, in our study population, the TB 290 incidence rate was 38 per 100,000 person-years in year 1 and 18 per 100,000 in year 2; in the 291 292 PREDICT study, incidence was 932 per 100,000 in year 1 and 115 per 100,000 in year 2. Given 293 that the PPV will be sensitive to the incidence rate in the population of interest, this difference in TB risk could explain the difference in PPV. 294

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296 Our study has several strengths. First, we used an individual based model with granular, time-297 dependent TB risk estimates that are a function of each migrant's age, entry-year, country-oforigin, and years since U.S. arrival. This allowed us to estimate lifetime outcomes of the study 298 cohort under different scenarios and evaluate the impact of HrTS in a real-world setting that has 299 300 direct clinical and policy implications. The fact that the analysis captured lifetime outcomes is 301 particularly important because HrTS is a predictive test for future TB disease; restricting the 302 analytic timeframe could over-estimate the comparative effect of it relative to other screening 303 tools.

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Second, our analytic framework can be used to evaluate the performance of other predictive
 tests with sensitivity dependent on individual patient's time to disease in a setting where the

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prevalence of a disease is also time-varying. Our approach showed that an individual-based discrete event simulation model has the flexibility to incorporate these two time-dependent elements. Third, our functional definitions of a 'positive test', a 'negative test', and a 'TB case' in PPV and NPV calculations provided a clear performance measure for a predictive test for future TB disease. This can be useful in evaluation of novel screening and diagnostic tools as the field has an increasing interest in tools that can identify individuals who are progressing from *Mtb* infection to TB disease.

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315 One limitation in our study is that we assumed conditional independence of IGRA and HrTS test results. If this assumption does not hold, we may over-estimate the sensitivity of the IGRA-HrTS 316 strategy. We estimated country-specific LTBI prevalence among migrants based on a previously 317 318 published study that focused on high-risk populations, which might not be representative of the 319 general migrant population. To address this limitation, we calibrated the estimates so that the 320 LTBI prevalence of the entire migrant population in our study matched the national non-US born 321 LTBI prevalence estimate reported in NHANES. Other key assumptions we made in our study 322 included the treatment uptake and completion rates and regimen efficacy for incipient TB. 323 Screening and treatment of incipient TB is not routine clinical practice, and there is little 324 empirical evidence to inform these estimates.

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Many signature tests have been proposed in recent years, with the goal of identifying individuals with a high proximal risk of developing TB disease.<sup>3,17</sup> Currently, none has met the WHO TPP optimal criteria. Our study suggests that even if the WHO TPP criteria were met, HrTS is unlikely to be cost-effective compared to the conventional IGRA test as a post-arrival screening tool among high-risk migrants in our setting.

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# 342 Data Sharing

- Analytic code and model inputs are available through the following link: << Link to GitHub
- repository removed for peer review. It will be made public when the manuscript is accepted and
- finalized >>. The detailed results of the TB risk model are available at << Dataverse link will be

added when the manuscript is accepted and finalized >>.

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# 348 **Declaration of interests**

349 We declare no competing interests.

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Risk category <sup>1</sup>	Number of countries/ regions	Countries/ regions <sup>2</sup>	Modelled population size, n (% of total population)	Mean entry age	
Whole cohort	97		2,042,225 (100 %)	29.0	
I	5	IDN, LBR, MMR, PHL, ZAF	100,778 (4.9 %)	34.0	
II	19	AFG, BGD, BOL, CMR, ETH, GHA, HTI, IND, KEN, KHM, LAO, NGA, NPL, PAK, PER, SLE, SOM, THA, VNM	340,454 (16.7 %)	28.9	
III	50	ALB, ARG, ARM, BGR, BIH, BLR, BLZ, BRA, CHL, CHN, COL, CPV, CRI, DOM, ECU, EGY, ESP, FJI, GTM, GUY, HKG, HND, IRN, IRQ, JPN, KOR, LBN, LKA, LTU, MAR, MDA, MEX, MYS, NIC, PAN, POL, PRT, ROU, RUS, SDN, SLV, SYR, TTO, TUR, TWN, UKR, URY, UZB, VEN, YEM	1,409,531 (69.0 %)	27.9	
IV	23	AUS, AUT, BEL, BRB, CAN, CHE, CUB, CZE, DEU, FRA, GBR, GRC, GRD, HRV, HUN, IRL, ISR, ITA, JAM, JOR, NLD, SAU, SWE	191,462 (9.4 %)	34.7	

#### Table 1. Characteristics of study cohort upon entry to the US in 2019

1 Epidemiological categorization of migrant populations based on TB incidence per 100k in 2019 for their country-oforigin: risk category I (≥300); risk category II (100-300), risk category III (10-100), risk category IV (0-10).

2 Countries highlighted in red are the top five country-of-origins that contribute to the total number of TB cases among migrants.

# Table 2. Testing and treatment decision rules

Tests performed		Test resu	ılts <sup>1</sup>	Diagnosis, conditional on	Treatment prescribed.	
	IGRA HrTS TB test re diagnosis		test results	conditional on diagnosis <sup>2</sup>		
Strategy II (IGRA → TB diagnosis)	pos		pos	TB disease	Treatment for TB disease	
	pos		neg	<i>Mtb</i> infection	Treatment for <i>Mtb</i> infection	
	neg			No Mtb infection	No treatment	
Strategy III (IGRA → HrTS → TB diagnosis)	pos	pos	pos	TB disease	Treatment for TB disease	
	pos	pos	neg	Incipient TB	Treatment for incipient TB	
	pos	neg		Non-progression <i>Mtb</i> infection	No treatment	
	neg			No Mtb infection	No treatment	
Strategy IV (HrTS → TB diagnosis)		pos	pos	TB disease	Treatment for TB disease	
		pos	neg	Incipient TB	Treatment for incipient TB	
		neg		No incipient TB	No treatment	
In all strategies, in the case of TB diagnosis that occurred outside of the post-arrival screening			pos	TB disease	Treatment for TB disease	

1 pos, positive; neg, negative; TB diagnosis is assumed to be perfect.

2 In this study, we assumed individuals were given 3HP for treatment for *Mtb* infection and one month of HR daily followed by three months of HR three times a week for treatment for incipient TB, a regimen that has been used for sputum negative TB cases.<sup>1</sup>



**Figure 1. Number of TB cases, by years since entry.** The circles represent the expected number of TB cases in each year, and the lines are fitted smooth lines to show the trend.

# Table 3. Testing and treatment outcomes

PPV for future TB disease (%, 95% CI)		NPV for futu (%, 9	re TB disease 5% CI)	Percentage of	Reduction in TB cases			
	Within 2 years         Over lifetime         Within 2 years         Over lifetime		Mtb infection Incipient TB		TB disease	(%, 95% Cl)		
Whole cohort No screening IGRA only IGRA-HrTS HrTS only	NA 0.4 (0.3, 0.5) 3.6 (3.0, 4.2) 0.5 (0.5, 0.6)	NA 2.0 (1.6, 2.3) 5.4 (4.5, 6.1) 0.8 (0.7, 0.8)	NA 100 (100, 100) 100 (100, 100) 100 (100, 100)	NA 99.9 (99.9, 100) 99.8 (99.8, 99.8) 99.8 (99.8, 99.8)	NA 8.5 (7.1, 10.3) NA NA	NA NA 1.0 (0.8, 1.2) 8.8 (7.8, 9.6)	0.3 (0.2, 0.3) 0.3 (0.1, 0.2) 0.2 (0.2, 0.3) 0.2 (0.2, 0.3)	ref 33.7 (25.7, 42.8) 10.4 (9.0, 12.2) 13.2 (11.3, 16.0)
Risk category I No screening IGRA only IGRA-HrTS HrTS only	NA 1.0 (0.8, 1.2) 8.5 (7.3, 9.9) 1.7 (1.5, 1.9)	NA 4.9 (4.1, 5.5) 12.9 (11.1, 14.6) 2.6 (2.3, 2.9)	NA 99.9 (99.9, 100) 99.9 (99.9, 100) 100 (100, 100)	NA 99.8 (99.6, 99.9) 99.3 (99.2, 99.3) 99.3 (99.2, 99.3)	NA 11.3 (9.6, 13.1) NA NA	NA NA 1.4 (1.1, 1.6) 9.0 (8.0, 9.8)	0.9 (0.8, 1.0) 0.6 (0.5, 0.8) 0.8 (0.7, 0.9) 0.8 (0.7, 0.9)	ref 33.0 (25.0, 42.1) 10.8 (9.4, 12.7) 14.2 (12.0, 16.1)
Risk category II         NA           No screening         NA           IGRA only         0.7 (0.6, 0.8)           IGRA-HrTS         5.9 (4.8, 6.8)           HrTS only         1.0 (0.8, 1.1)		NA 3.1 (2.7, 3.6) 8.8 (7.4, 10.1) 1.4 (1.3, 1.6)	NA 100 (100, 100) 100 (100, 100) 100 (100, 100)	NA 99.9 (99.8, 99.9) 99.6 (99.6, 99.6) 99.6 (99.5, 99.6)	NA 10.3 (8.7, 12.1) NA NA	NA NA 1.3 (1.0, 1.5) 8.9 (7.9, 9.7)	$\begin{array}{c} 0.5 \; (0.4,  0.6) \\ 0.3 \; (0.2,  0.4) \\ 0.5 \; (0.4,  0.5) \\ 0.5 \; (0.4,  0.5) \end{array}$	ref 36.6 (27.3, 47.1) 11.5 (10.0, 12.7) 13.2 (11.2, 15.5)
Risk category III No screening IGRA only IGRA-HrTS HrTS only	category III         NA         NA         NA         NA           IGRA only         0.3 (0.3, 0.3)         1.5 (1.2, 1.7)         100 (100, 100)         100 (100, 100)           IGRA-HrTS         2.7 (2.2, 3.1)         3.9 (3.3, 4.4)         100 (100, 100)         99.8 (99.8, 99.9)           HrTS only         0.4 (0.3, 0.4)         0.6 (0.5, 0.6)         100 (100, 100)         99.8 (99.8, 99.9)		NA 100 (100, 100) 99.8 (99.8, 99.9) 99.8 (99.8, 99.9)	NA 8.4 (6.9, 10.1) NA NA	NA NA 1.0 (0.8, 1.2) 8.8 (7.8, 9.5)	0.2 (0.2, 0.2) 0.1 (0.1, 0.2) 0.2 (0.2, 0.2) 0.2 (0.2, 0.2)	<i>ref</i> 32.1 (24.8, 40.4) 9.6 (8.3, 11.6) 12.9 (11.3, 16.2)	
Risk category IV No screening IGRA only IGRA-HrTS HrTS only	NA 0.03 (0.02, 0.04) 0.3 (0.2, 0.4) 0.03 (0.03, 0.04)	NA 0.2 (0.1, 0.2) 0.3 (0.2, 0.4) 0.03 (0.03, 0.04)	NA 100 (100, 100) 100 (100, 100) 100 (100, 100)	NA 100 (100, 100) 100 (100, 100) 100 (100, 100)	NA 4.8 (3.7, 6.6) NA NA	NA NA 0.6 (0.4, 0.8) 8.6 (7.6, 9.4)	0.02 (0.01, 0.02) 0.01 (0.01, 0.02) 0.01 (0.01, 0.02) 0.01 (0.01, 0.02)	ref 32.0 (27.5, 38.1) 6.1 (2.5, 14.3) 7.7 (2.5, 14.3)

As defined in the main text, risk categories are the epidemiological categorization of migrant populations based on TB incidence per 100k in 2019 for their country-of-origin: risk category I (≥300); risk category II (100-300), risk category III (10-100), risk category IV (0-10).

# Table 4. Reference case cost-effectiveness results (time horizon: lifetime; costs and health effects incremental to the 'no screening' strategy, discounted at 3% annually)

Strategy	TB related HC costs	Other HC expenditures	TB related non-HC costs	Other non- HC expenditures	Productivity gain <sup>1</sup>	Total Costs <sup>2</sup> \$	Total QALY gain	Inc. Cost <sup>2</sup>	Inc. Effectiveness <sup>3</sup> (QALYs)	ICER	Inc. NMB⁴
Healthcare Sector Perspective											
IGRA only	92.4 (67.4, 121.7)	4.6 (2.4, 6.7)				97.1 (72.4, 126.4)	0.00123 (0.00083, 0.00168)	97.1	0.00123	78,943	87.4
IGRA-HrTS	71.1 (55.4, 89.0)	1.1 (0.6, 1.7)				72.2 (56.4, 90.2)	0.00082 (0.00048, 0.00120)	NA	NA	Extended dominated	50.8
HrTS only	75.4 (55.5, 101.7)	1.3 (0.7, 2.0)				76.7 (56.8, 103.0)	0.00077 (0.00038, 0.00118)	NA	NA	Dominated	38.8
Societal Perspective											
IGRA only	92.4 (67.4, 121.7)	4.6 (2.4, 6.7)	6.8 (4.4, 9.6)	16.2 (8.1, 23.6)	10.1 (4.5, 14.8)	110.0 (85.3, 140.1)	0.00123 (0.00083, 0.00168)	110.0	0.00123	89,431	74.5
IGRA-HrTS	71.1 (55.4, 89.0)	1.1 (0.6, 1.7)	1.1 (0.4, 1.7)	4.9 (2.6, 7.2)	4.7 (1.4, 8.3)	73.4 (57.6, 91.8)	0.00082	NA	NA	Extended Dominated	49.6
HrTS only	75.4 (55.5, 101.7)	1.3 (0.7, 2.0)	12.5 (9.9, 15.3)	5.6 (2.8, 8.4)	5.2 (1.7, 9.0)	89.6 (69.2, 115.9)	0.00077 (0.00038, 0.00118)	NA	NA	Dominated	25.9

Notes: HC, healthcare; QALY, quality-adjusted life years; ICER, incremental cost-effectiveness ratio; NMB, net monetary benefit

1 All costs, expenditures, productivity gain, and QALY gain were estimated relative to the "No Screening" strategy.

2 Productivity gain was attributable to mortality aversion.

3 For analysis in the healthcare sector perspective, Total Costs = (TB related healthcare costs + Other healthcare expenditures); for analysis in the societal perspective, Total Costs = (TB related healthcare costs + Other healthcare expenditures + TB related non-healthcare costs + Other non-healthcare expenditures - Productivity gain)

4 The Inc. cost and Inc. effectiveness in columns 9-10 were estimated relative to the next best strategy.

5 The NMB were based on \$150,000/QALY; Inc. NMB = (Inc. effectiveness\* \$150,000/QALY) – Inc. costs