

# Suboptimal Antituberculosis Drug Concentrations and Outcomes in Small and HIV-Coinfected Children in India: Recommendations for Dose Modifications

Benjamin Guiastrenec<sup>1</sup>, Geetha Ramachandran<sup>2</sup>, Mats O. Karlsson<sup>1</sup>, A.K. Hemanth Kumar<sup>2</sup>, Perumal Kannabiran Bhavani<sup>2</sup>, N. Poorana Gangadevi<sup>2</sup>, Soumya Swaminathan<sup>2</sup>, Amita Gupta<sup>3</sup>, Kelly E. Dooley<sup>3</sup> and Radojka M. Savic<sup>4</sup>

This work aimed to evaluate the once-daily antituberculosis treatment as recommended by the new Indian pediatric guidelines. Isoniazid, rifampin, and pyrazinamide concentration–time profiles and treatment outcome were obtained from 161 Indian children with drug-sensitive tuberculosis undergoing thrice-weekly dosing as per previous Indian pediatric guidelines. The exposure–response relationships were established using a population pharmacokinetic-pharmacodynamic approach. Rifampin exposure was identified as the unique predictor of treatment outcome. Consequently, children with low body weight (4–7 kg) and/or HIV infection, who displayed the lowest rifampin exposure, were associated with the highest probability of unfavorable treatment (therapy failure, death) outcome ( $P_{\text{unfavorable}}$ ). Model-based simulation of optimized ( $P_{\text{unfavorable}} \leq 5\%$ ) rifampin once-daily doses were suggested per treatment weight band and HIV coinfection status (33% and 190% dose increase, respectively, from the new Indian guidelines). The established dose-exposure–response relationship could be pivotal in the development of future pediatric tuberculosis treatment guidelines.

## Study Highlights

### WHAT IS THE CURRENT KNOWLEDGE ON THE TOPIC?

☑ India recently updated its national tuberculosis treatment guidelines and is now moving toward a once-daily dosing regimen. The optimal doses of first-line drugs for all children, in India or elsewhere, has not been firmly established.

### WHAT QUESTION DID THIS STUDY ADDRESS?

☑ What are the subpopulations at risk of unfavorable treatment outcomes (therapy failure, death), and what modifications can be made to the new once-daily Indian pediatric tuberculosis treatment guidelines to reduce this risk in these subgroups?

### WHAT THIS STUDY ADDS TO OUR KNOWLEDGE

☑ Low rifampin exposures were linked to an increased probability of unfavorable treatment outcome. Rifampin exposure was the lowest in children with low body weight or HIV coinfection.

### HOW THIS MIGHT CHANGE CLINICAL PHARMACOLOGY OR TRANSLATIONAL SCIENCE

☑ Clinical practice in India is evolving and this work provides vital information to inform dosing guidelines of the future. More specifically, our simulations suggest that higher antituberculosis drug dose levels in Indian children, especially those with low body weight or HIV coinfection, can potentially prevent treatment failure or death.

The World Health Organization (WHO) estimates that among the 10.4 million new incident cases of tuberculosis (TB) in 2015, 1 million occurred in children.<sup>1</sup> India has the highest TB burden in the world, accounting for 27% of total incident cases.<sup>1</sup> TB risk in India is increased with HIV coinfection, young age, malnutrition, and other comorbidities that can intensify disease severity and lower the overall exposure of anti-TB drugs.<sup>2,3</sup>

The introduction of India's Revised National TB Control Programme (RNTCP) has reduced the incidence of TB by providing

free diagnosis and treatment, and by using the Directly Observed Treatment Short-course (DOTS) strategy.<sup>4</sup> Studies demonstrated that the previous thrice-weekly dosing of first-line anti-TB in RNTCP guidelines could lead to suboptimal anti-TB drug concentrations in both adults and children.<sup>5,6</sup> Consequently, the RNTCP pediatric guidelines were revised in 2012, refining the dosing weight bands and increasing the rifampin (RIF) dose from 10 to 15 mg/kg, although still recommending thrice-weekly dosing.<sup>7</sup> In 2016, new RNTCP guidelines were issued to initiate the

<sup>1</sup>Department of Pharmaceutical Biosciences, Uppsala University, Uppsala, Sweden; <sup>2</sup>National Institute for Research in Tuberculosis, Indian Council of Medical Research, Chetpet, Chennai, India; <sup>3</sup>Johns Hopkins University School of Medicine, Baltimore, Maryland, USA; <sup>4</sup>University of California San Francisco, San Francisco, California, USA. Correspondence: Kelly E. Dooley (kdooley1@jhmi.edu)

transition toward a once-daily dosing regimen in an effort to align with WHO recommendations.<sup>8,9</sup> These new guidelines are currently being evaluated via pilot studies and once-daily dosing is anticipated to be rolled out throughout India by the end of 2017.<sup>9</sup> Herein, the pre-2012 and 2016 guidelines will be respectively being referred to as “previous” and “new” RNTCP guidelines.

Few studies have attempted to link the pharmacokinetic (PK) of anti-TB drug to treatment outcomes in children,<sup>10–13</sup> owing to challenges in the assessment of microbiologic treatment response, and this has resulted in a lack of exposure–response (or pharmacodynamic (PD)) data to inform dosing recommendations for children.<sup>14,15</sup> Population PK-PD modeling can be used to relate the time-course of drug exposure to drug effects (e.g., clinical outcome) while investigating sources of variability among individuals and to evaluate alternative dosing regimens through simulations.<sup>16,17</sup>

Using a population PK-PD approach, we evaluated the impact of individual-level factors associated with an increased probability of unfavorable treatment (therapy failure, death) outcome ( $P_{\text{unfavorable}}$ ) in children with drug-sensitive TB treated according to the previous thrice-weekly Indian RNTCP pediatric guidelines. We then evaluated the new once-daily Indian dosing recommendations through model-based simulations and provide suggested dose revisions.

## RESULTS

### Drug concentrations analysis

Model development was performed on the data from 161 Indian children with TB mono-infection or TB-HIV coinfection pooled from two non-interventional studies<sup>11,12</sup>; population characteristics are summarized in **Table 1**. In total, 805 plasma concentrations were collected for isoniazid (INH), 794 for rifampin (RIF), and 720 for pyrazinamide (PZA). Samples below the detection limit (INH: 148, RIF: 174, PZA: 75) were excluded from the analysis. Trough concentrations (24–72 h post previous dose) represented most of the excluded samples (INH: 125, RIF: 105, PZA: 67). Time concentration profiles are presented in **Figure 1**.

Among the tested candidate models, a two-compartment model best described INH disposition, whereas one-compartment models adequately described RIF and PZA data. Other aspects of the PK models were similar for all three drugs as highlighted hereafter. Absorption delays were described by chains of transit compartments, where significant between subject variability (INH 49.8%, RIF 64.4%, PZA 42.5% coefficient of variation (CV)) was identified in the mean transit time. Substantial between subject variability was also identified in apparent clearances (INH 74.2%, RIF 45.4%, PZA 37.4% CV) and volumes (INH 44.9%, RIF 37.3%, PZA 34.4% CV) parameters; both parameters were highly correlated (INH 86.9%, RIF 78.8%, PZA 51.7%). Residual error was best described by a combined model for INH and additive models for RIF and PZA. Equations and parameter estimates for the selected models are shown in **Supplementary Material S1**.

Throughout the search for individual-level factors influencing the PK, a pronounced nonlinear relationship described by an

allometric-type function was identified between total body weight and relative bioavailability for all three drugs (**Figure 2**), suggesting that the smallest children will have the lowest relative bioavailability. Additionally, children with TB-HIV coinfection had a substantial increase in RIF clearance (+31.6%), decrease in RIF relative bioavailability (–41.5%), and decrease in INH relative bioavailability (–19.5%) estimates in comparison to HIV-uninfected children, leading to further substantial decrease in RIF and INH plasma levels and total exposures (**Figure 2**). Furthermore, a considerable increase was observed in RIF between-subject variability in clearance (+74.0%) and volume of distribution (+106%) in TB-HIV coinfecting children, leading to large variations in drug exposure.

The selected INH, RIF, and PZA models were evaluated and shown to accurately predict drug exposure and describe the data across the different RNTCP weight bands (**Supplementary Material S2**).

### Treatment outcomes analysis

Among the 161 children included in the study, treatment outcome was favorable for 109 (68%), unfavorable for 33 (20%), and unknown for 19 (12%) (**Table 1**). For children with unknown outcome, no assumptions could be made regarding the reason behind the dropout, and these subjects were excluded from the analysis.

A covariate search was conducted to evaluate the effect of individual-level factors on the treatment outcome. Throughout this search, effects of subjects' characteristics and INH, RIF, and PZA total weekly drug exposures at steady state were tested. Area under the concentration–time curves (AUC) was preferred over peak concentration as a marker of drug exposure; both metrics were, however, highly correlated (INH: 78%, RIF: 91% and PZA: 77%). Among all tested covariates, RIF exposure (9.81–231  $\mu\text{g}\cdot\text{h}/\text{mL}$  range) was the only independent predictor ( $P < 0.01$ ) of  $P_{\text{unfavorable}}$ . No statistically significant effect of INH ( $P = 0.74$ ) or PZA ( $P = 0.81$ ) exposures could be detected on  $P_{\text{unfavorable}}$  within the ranges seen in this study (INH: 3.89–346  $\mu\text{g}\cdot\text{h}/\text{mL}$  and PZA: 351–2780  $\mu\text{g}\cdot\text{h}/\text{mL}$ ). In addition to their effects on drug PK, HIV status and body weight were also tested on  $P_{\text{unfavorable}}$ . There was a trend towards HIV status having an independent effect on outcomes ( $P = 0.075$ ), but weight had no impact on outcomes independent of its effect on RIF PK ( $P = 0.91$ ). Owing to differences in weekly RIF exposure, the model-predicted odds ratio was 2.27 (95% confidence interval: 1.27–4.05) for TB-HIV coinfection (median AUC: 36.8  $\mu\text{g}\cdot\text{h}/\text{mL}$ ) in reference to TB mono-infection (median AUC: 93.6  $\mu\text{g}\cdot\text{h}/\text{mL}$ ) and 1.68 (95% confidence interval: 1.16–2.41) for children in the 6–10 kg weight band (median AUC: 60.7  $\mu\text{g}\cdot\text{h}/\text{mL}$ ) in reference to the 26–30 kg weight band (median AUC: 96.5  $\mu\text{g}\cdot\text{h}/\text{mL}$ ).

A model-derived weekly RIF exposure (185  $\mu\text{g}\cdot\text{h}/\text{mL}$ ) to achieve a target  $P_{\text{unfavorable}}$  of 5% or less was used for dose regimen evaluation. The relationship between RIF exposure and  $P_{\text{unfavorable}}$  is illustrated in **Figure 3**. Equations, parameter estimates, and predictive performances of the selected model are provided in **Supplementary Material S3**.

**Table 1 Population characteristics and treatment outcomes**

	TB monoinfection study	TB-HIV coinfection study	P value <sup>a</sup>	Total
<b>Covariate<sup>c</sup></b>				
Number of participants	84	77	NA	161
Sex (male/female)	41/43	50/27	0.040	91/70
Age (years)	8 (5–11)	9 (7–11)	0.008	8 (6–11)
Weight (kg)	17.8 (12.9–22.8)	17.0 (14.2–22.4)	0.734	17.5 (13.9–22.5)
BMI (kg/m <sup>2</sup> )	14.1 (12.7–15.2)	14.4 (13.4–15.5)	0.240	14.2 (13.3–15.3)
INH acetylase (slow/rapid)	57/27	52/25	0.967	109/52
ART usage	0	45	NA	45
CD4 cell count (%)	—	11.0 (5.0–19.5)	NA	—
<b>Z-scores<sup>b</sup></b>				
HAZ	−1.2 (−2.1 to −0.29)	−3.0 (−4.1 to −2.0)	<0.001	−2.0 (−3.2 to −0.93)
WAZ	−1.8 (−2.4 to −1.1)	−2.7 (−3.4 to −1.9)	<0.001	−2.2 (−2.9 to −1.4)
Tuberculosis type			<0.001	
Pulmonary	19	49		68
Extra pulmonary	63	28		91
Both	2	0		2
Treatment outcome			0.443	
Favorable	55	54		109
Unfavorable	15	18		33
Unknown	14	5		19

ART, antiretroviral treatment; BMI, body mass index; HAZ, height for age Z-score; HIV, human immunodeficiency virus; INH, isoniazid; NA: not applicable; TB, tuberculosis; WAZ, weight for age Z-score.

<sup>a</sup>Statistical testing performed using a Mann–Whitney *U* test at 5% level of significance. <sup>b</sup>Z-scores calculated using the EPI-INFO 2002 software package (v. 3.4.3; Centers for Disease Control and Prevention, Atlanta, GA). <sup>c</sup>*n* or Median (Interquartile Range).

### RNTCP dosing regimen evaluation

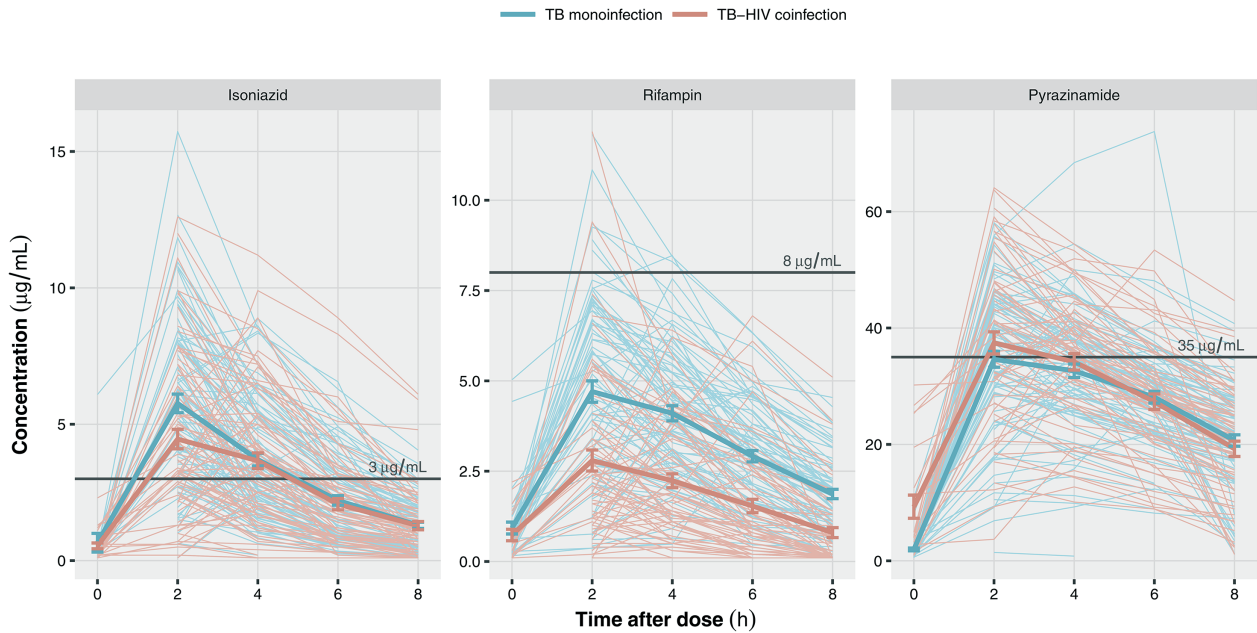
The simulation of treatment outcome under previous and new RNTCP dosing regimens (**Figure 4, Table 2**) revealed an increased  $P_{\text{unfavorable}}$  for children with low body weight (6–10 kg for previous and 4–7 kg for new RNTCP guidelines) due to sub-optimal mg/kg rifampin dose in this group or TB-HIV coinfection. Among those with HIV-TB, the median  $P_{\text{unfavorable}}$  was as high as 35%.  $P_{\text{unfavorable}}$ , however, is expected to be reasonable ( $\leq 5\%$ ) in most children with TB monoinfection under the new once-daily RNTCP dosing regimen.

Model-based optimized once-daily doses of RIF (i.e., based on the target RIF exposure to achieve  $P_{\text{unfavorable}} \leq 5\%$ ) were calculated for children based on their body weight and HIV status. These doses are summarized in **Table 3** and organized by the new RNTCP treatment weight bands and by TB-HIV coinfection status. The predicted optimal doses were increased for children with low body weight (4–7 kg) and especially for TB-HIV coinfecting children, with doses up to 43.4 mg/kg. However, for children with TB monoinfection or TB-HIV coinfection with a body weight greater than 25 kg, the model predicted that low rates of  $P_{\text{unfavorable}}$  could be achieved, even with once-daily doses as low as 5.2 mg/kg.

### DISCUSSION

The study presented herein extends the work from Swaminathan *et al.*,<sup>13</sup> who exposed a link between low antituberculosis exposure and unfavorable treatment outcome in Indian children treated according to the previous RNTCP thrice-weekly dosing recommendations. This study was tailored to evaluate the new Indian dosing recommendations, identify subgroups for whom the new recommendations will result in suboptimal drug exposures, and use modeling to suggest dosing revisions to consider. A population PK-PD modeling approach was selected to enable the establishment of the dose-exposure–response relationships, the identification of subgroups of subjects “at risk,” and the simulations of alternate dosing regimens.

Our main finding was that the previously recommended thrice-weekly RNTCP dosing along with constant mg/kg dosing across all pediatric weight bands resulted in an increased  $P_{\text{unfavorable}}$  in children with low body weight (6–10 kg) and/or TB-HIV coinfection due to suboptimal weekly RIF exposure. Furthermore, model-based simulations indicated that suboptimal RIF concentrations could also be expected in these subpopulations for children treated according to the new once-daily RNTCP dosing recommendations.



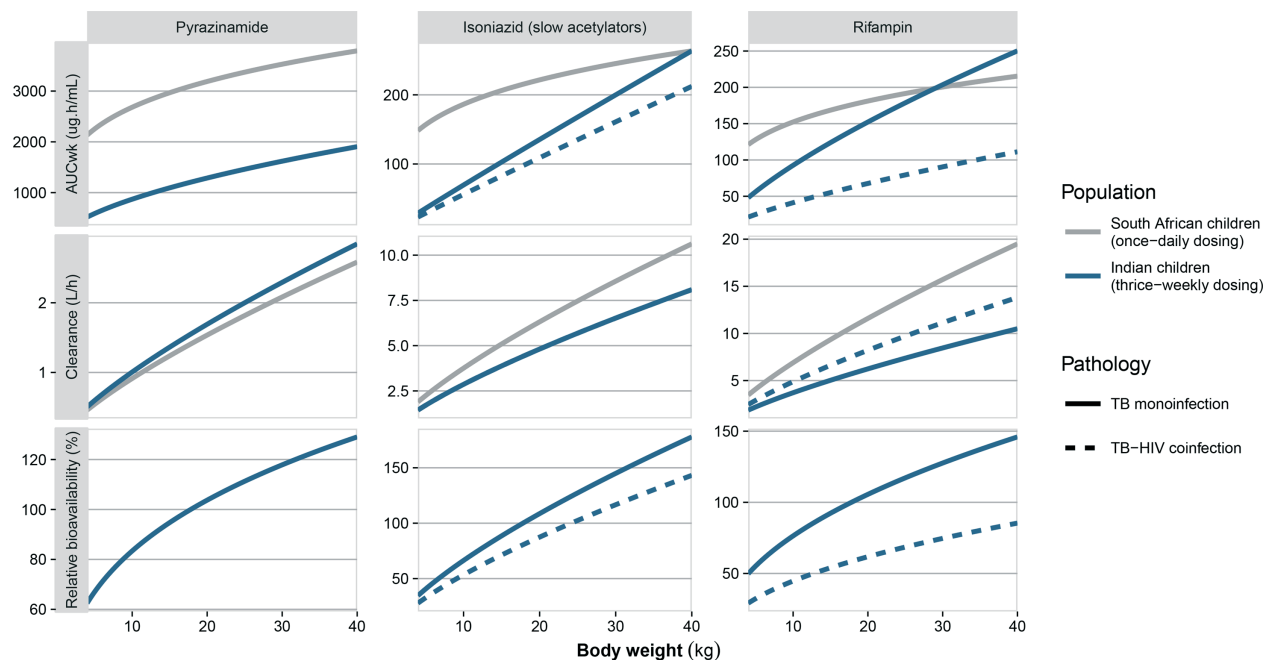
**Figure 1** Individual time–concentration profiles for isoniazid (left panel), rifampin (middle panel), and pyrazinamide (right panel). For each drug, the mean (thick line) and standard errors (error bars) are provided for subjects with tuberculosis (TB) monoinfection and TB-HIV coinfection (colors). The horizontal lines and numbers denote the commonly presumed target peak concentration for each drug.<sup>12</sup> [Color figure can be viewed at [cpt-journal.com](http://cpt-journal.com)]

Interestingly, published INH, RIF, and PZA population PK models in TB infected South African children did not adequately fit the data from Indian children.<sup>18</sup> Overall, published models in South African children indicated higher apparent clearance, shorter absorption delays, and smaller apparent volume for all three drugs compared to the Indian children studied herein. The origin of these differences (i.e., analytical, formulation, genetic or nutritional factors, magnitude of autoinduction) could not be investigated with the current study design.<sup>2</sup> Herein, relative bioavailability was found to be nonlinearly correlated with total body weight resulting in lower drug exposures in children with low body weight. Given the dosing protocol, body weight, however, was highly correlated with age and dose. Thus, beyond the effect of body size, this finding may partly be explained by differences in tablet formulation used for the 6–10 kg weight band.<sup>19,20</sup> Furthermore, as similar trends were observed for INH, RIF, and PZA, other factors such as malabsorption due to disease severity or malnutrition could also have contributed to the effect.<sup>2,15,21</sup> Whether or not TB-HIV coinfection impacts the PK of anti-TB drugs is debated.<sup>5,18</sup> Herein, HIV status had a pronounced and clinically relevant impact on TB drug pharmacokinetics observed as lower INH (–19.5%) and RIF (–41.5%) relative bioavailability, higher RIF clearance (+31.6%), and higher between-subject variability on clearance (+74%) and volume of distribution (+106%). These effects were associated with TB-HIV coinfection rather than the use of antiretroviral treatment (ART). Children in the TB-HIV coinfection study were more severely affected by malnutrition (median height for age Z-score (HAZ) = –3.0 and weight for age Z-score (WAZ) = –2.7) than children with TB monoinfection (median HAZ = –1.2 and WAZ = –1.8). Thus, the observed effects of TB-HIV coinfection

on apparent clearance and relative bioavailability were likely due to a complex combination of factors including: drug–drug interactions, malabsorption, and malnutrition, which are not independently distinguishable with the current study design.<sup>22–24</sup>

Treatment outcome in Indian children has herein been linked to the PK of INH, RIF, and PZA through a population PK-PD approach. The *in vitro* activities of INH, RIF, and PZA have been shown to correlate well with both AUC and peak concentration.<sup>25,26</sup> In order to facilitate the translation from thrice-weekly to daily dosing, AUC was selected as a marker of drug exposure over peak concentration. AUC and peak concentrations were, however, highly correlated for all three drugs (INH 78%, RIF 91%, and PZA 77%). Weekly RIF exposure at steady state was the only independent predictor of treatment outcomes. This should not be interpreted as RIF being the only active drug in TB treatment, but rather that despite similar exposure trends of the INH and PZA across individuals (e.g., low body weight), RIF was likely the most severely underdosed anti-TB drug. Even though no additional covariate effect was supported by the data on the treatment outcomes, body weight and HIV coinfection substantially affected  $P_{\text{unfavorable}}$  through their impact on RIF exposure. Despite differences in the studied populations, dosing regimen, and methodology, others have also reported an increased rate of low RIF exposure or unfavorable treatment outcome in adults and children with low body weight or with TB-HIV coinfection.<sup>22,24,27–30</sup>

The treatment outcome under thrice-weekly vs. once-daily dosing in children has been the topic of a long debate, leading to conflicting conclusions.<sup>31</sup> The population PK-PD approach used in this analysis allowed us to predict treatment outcomes under different scenarios while integrating the effect of covariates and

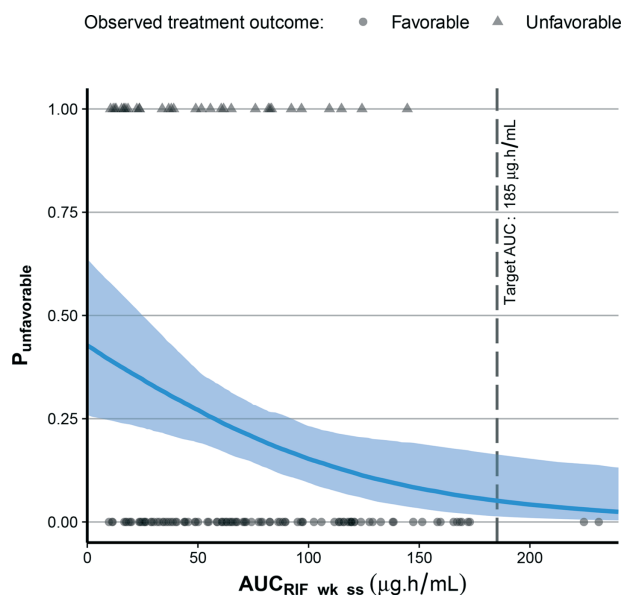


**Figure 2** Effect of total body weight on the weekly area under the concentration–time curve ( $AUC_{wk}$ ) (top row), apparent clearance (middle row), and the typical relative bioavailability (bottom row) of pyrazinamide (left column), isoniazid (middle column), and rifampin (right column) for children in the TB mono-infection study (solid lines) or in the TB-HIV coinfection study (dotted lines).  $AUC_{wk}$  and clearance in South African children (light gray lines) were predicted according to Zvada *et al.*<sup>18</sup> For  $AUC_{wk}$  calculation, once-daily doses of 35, 10, and 15 mg/kg were used for pyrazinamide, isoniazid, and rifampin, respectively. For clarity reasons, age maturation was not accounted for in the calculation of the clearances. [Color figure can be viewed at [cpt-journal.com](http://cpt-journal.com)]

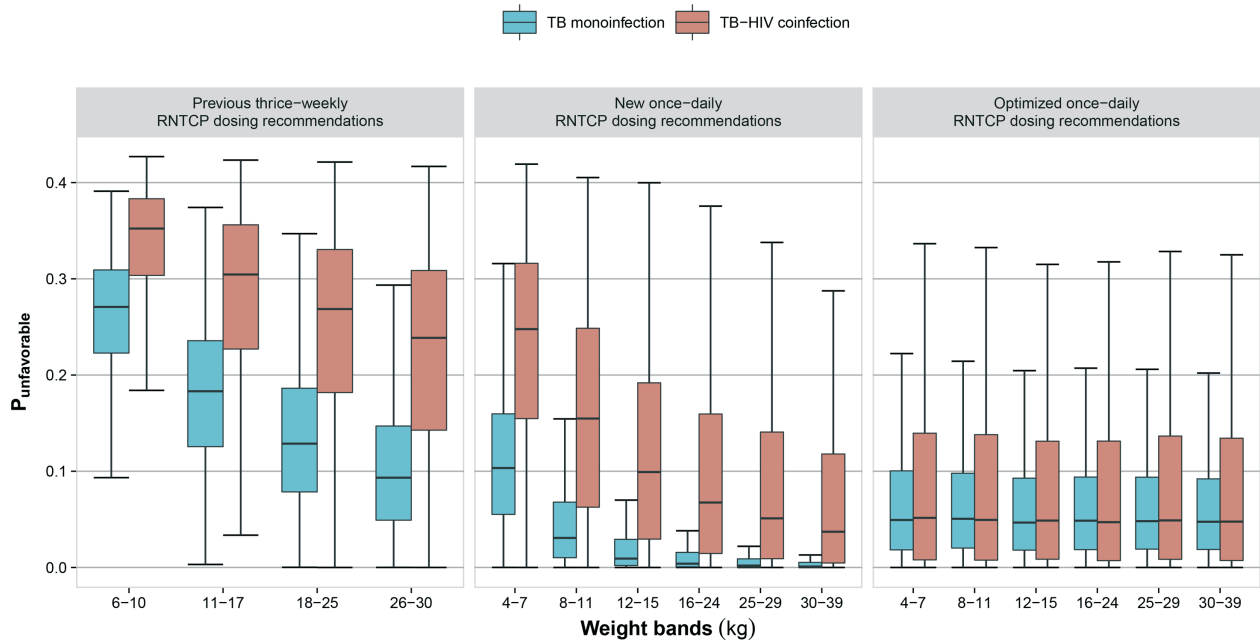
the variability in PK parameters. The model-based simulations showed a clear trend toward higher  $P_{unfavorable}$  under previous thrice-weekly dosing compared to new once-daily dosing RNTCP recommendations.<sup>7,9</sup> The new RNTCP guidelines,

similar to guidelines in other settings, still assumes similar mg/kg dose levels across weight bands, disregarding maturation processes occurring throughout childhood.<sup>32</sup> Thus, under previous and new RNTCP dosing recommendations,  $P_{unfavorable}$  was at the highest in the first (previous: 6–10 kg and new: 4–7 kg) weight band due to a low RIF exposure when compared to the older children. On the basis of the simulations, children with TB-HIV coinfection treated with the new RNTCP-recommended doses also displayed higher  $P_{unfavorable}$  than children with TB mono-infection across all weight bands. Although no TB treatment guidelines currently recommend an increase of RIF doses for subjects with TB-HIV coinfection, there is accumulating evidence that higher RIF doses along with nutritional supplementation may significantly improve outcomes in this population.<sup>5,22,24,33,34</sup> Optimized RIF doses based on a target weekly exposure criteria associated with a  $P_{unfavorable}$  of 5% or less are herein proposed to overcome poor treatment outcomes in some subgroups. This work represents the first step in the definition of a target exposure derived from pediatric data. Additional studies should be conducted to refine this target or extend to additional endpoint such as a target daily peak concentration. Moreover, the tolerability of dose increases in children should be carefully evaluated in appropriate clinical studies. Encouragingly, RIF has lately been tested in adults at doses up to 35 mg/kg without a significant increase in the incidence of side effects, and children are generally recognized to be more tolerant than adults to anti-TB treatment at similar mg/kg.<sup>35–37</sup>

The present study has several limitations. First, the PK sampling times at 0, 2, 4, 6, and 8 h postdose were not optimal for



**Figure 3** Median (line) and 95% confidence interval (shaded area) of the model simulated probability of unfavorable treatment outcome ( $P_{unfavorable}$ ) as a function of the weekly rifampin exposure at steady state ( $AUC_{RIF\_wk\_ss}$ ). The vertical line marks the defined target  $AUC_{RIF\_wk\_ss}$  associated with  $P_{unfavorable}$  of 5%. [Color figure can be viewed at [cpt-journal.com](http://cpt-journal.com)]



**Figure 4** Predicted probability of unfavorable treatment outcome ( $P_{\text{unfavorable}}$ ) under previous (left panel), new (central panel), and optimized (right panel) revised national TB control program (RNTCP) dosing recommendations. Rifampin weekly exposures at steady state were simulated ( $n = 1,000$ ) for children within the pediatric RNTCP weight range (i.e., 6–30 kg for previous and 4–39 kg for new and optimized dosing recommendations);  $P_{\text{unfavorable}}$  distributions were computed for each weight band, and TB-HIV coinfection status. [Color figure can be viewed at [cpt-journal.com](http://cpt-journal.com)]

estimation of absorption-related parameters and required the use of literature priors to support the estimation of the absorption rate constant of INH, RIF, and PZA.<sup>18,36</sup> The predictive performances of the models were, however, carefully evaluated (Supplementary Materials S2). Second, the developed model

may not be generalizable to other populations, as differences in the apparent clearances and volume of distribution were observed in our Indian cohort compared with South African children (Figure 2), possibly due to poor nutritional status in our study population.<sup>12,18</sup> Third, TB-HIV coinfection was associated with

**Table 2** Intensive phase pediatric dosing as recommended by the Revised National Tuberculosis Control Program (RNTCP)

Weight band kg	Isoniazid dose mg (mg/kg) <sup>a</sup>	Rifampin dose mg (mg/kg) <sup>a</sup>	Pyrazinamide dose mg (mg/kg) <sup>a</sup>	Ethambutol dose mg (mg/kg) <sup>a</sup>	$P_{\text{unfavorable}}^d$	
					TB monoinfection median (CI <sub>95</sub> )	TB-HIV coinfection median (CI <sub>95</sub> )
Previous thrice-weekly RNTCP recommendations <sup>b,7</sup>						
6–10	75 (9.4)	75 (9.4)	250 (31.3)	200 (25.0)	0.272 (0.196–0.330)	0.352 (0.261–0.395)
11–17	150 (10.7)	150 (10.7)	500 (35.7)	400 (28.6)	0.184 (0.104–0.251)	0.304 (0.202–0.367)
18–25	225 (10.5)	225 (10.5)	750 (34.9)	600 (27.9)	0.127 (0.0698–0.196)	0.268 (0.158–0.34)
26–30	300 (10.7)	300 (10.7)	1,000 (35.7)	800 (28.6)	0.092 (0.0304–0.177)	0.242 (0.0836–0.336)
New once-daily RNTCP recommendations <sup>c,9</sup>						
4–7	50 (9.1)	75 (13.6)	150 (27.3)	100 (18.2)	0.105 (0.0331–0.191)	0.241 (0.114–0.345)
8–11	100 (10.5)	150 (15.8)	300 (31.6)	200 (21.1)	0.034 (<0.01–0.0932)	0.154 (0.039–0.288)
12–15	150 (11.1)	225 (16.7)	450 (33.3)	300 (22.2)	0.0113 (<0.01–0.0519)	0.103 (0.0116–0.235)
16–24	200 (10.0)	300 (15.0)	600 (30.0)	400 (20.0)	<0.01 (<0.01–0.0178)	0.0659 (0.0102–0.181)
25–29	225 (8.3)	375 (13.9)	850 (31.5)	575 (21.3)	<0.01 (<0.01–0.0175)	0.0521 (<0.01–0.195)
30–39	250 (7.2)	450 (13.0)	1,100 (31.9)	750 (21.7)	<0.01 (<0.01–<0.01)	0.0396 (<0.01–0.123)

<sup>a</sup>Doses in mg/kg reported for the average total body weight of each weight band. <sup>b</sup>Doses administered thrice-weekly using single drug formulation. <sup>c</sup>Doses administered once-daily using fixed dose combination (FDC) tablets. <sup>d</sup>Reported as median and the 95% confidence interval (CI<sub>95</sub>) around the simulated medians ( $n = 1,000$ ). Simulations performed using the developed population PK-PD model.

**Table 3 Optimized once-daily dosing regimen of rifampin<sup>a</sup>**

Weight band kg	TB monoinfection		TB-HIV coinfection	
	Dose <sup>b</sup> mg (mg/kg)	P <sub>unfavorable</sub> <sup>c</sup> median (CI <sub>95</sub> )	Dose <sup>b</sup> mg (mg/kg)	P <sub>unfavorable</sub> <sup>c</sup> median (CI <sub>95</sub> )
4–7	109 (19.9)	0.0535 (0.0107–0.129)	239 (43.4)	0.0606 (<0.01–0.202)
8–11	126 (13.3)	0.0554 (0.0129–0.126)	275 (28.9)	0.0591 (<0.01–0.196)
12–15	139 (10.3)	0.0506 (0.0107–0.124)	311 (23.0)	0.057 (<0.01–0.18)
16–24	154 (7.7)	0.048 (0.0162–0.101)	346 (17.3)	0.0464 (<0.01–0.149)
25–29	166 (6.2)	0.0484 (0.0106–0.124)	383 (14.2)	0.0492 (<0.01–0.188)
30–39	180 (5.2)	0.0478 (0.0173–0.0966)	404 (11.7)	0.0509 (<0.01–0.142)

<sup>a</sup>Optimized doses given for single drug formulations. <sup>b</sup>Doses in mg/kg calculated using the average total body weight of each weight band. <sup>c</sup>Reported as median and the 95% confidence interval (CI<sub>95</sub>) around the simulated medians ( $n = 1,000$ ). Simulations performed using the developed population PK-PD model.

important changes in the RIF exposure, although all subjects with TB-HIV coinfection were recruited as part of one study<sup>11</sup> and all subjects with TB monoinfection as part of another study.<sup>12</sup> This design could have possibly contributed to the magnitude of the observed effect. Thus, caution should be used in the interpretation of the differences between subjects with TB alone vs. TB-HIV coinfection. Fourth, treatment outcome was modeled as favorable in the case of treatment completion or cure and unfavorable in the case of treatment failure or death. Therefore, the treatment outcomes model could not distinguish between death and treatment failure. This strategy, however, was selected due to the relatively small incidence of deaths (nine cases) in the studied population.<sup>11,12</sup> Furthermore, children with missing outcome (19 cases) had to be excluded from the treatment outcome analysis. While the treatment outcome in these children could not be inferred, having a treatment outcome missing was not linked with any specific characteristics associated with either favorable or unfavorable outcome, and thus were not expected to impact the conclusions. Fifth, the predicted optimized doses did not account for possible RIF PK nonlinearity in the extrapolation to high dose levels.<sup>36</sup> RIF is also known to induce its own metabolism and this should be considered when shifting from thrice-weekly to once-daily dosing and/or increasing dose levels.<sup>38</sup> Given the design of the current study, development of an RIF autoinduction model was not possible. Integration of the RIF autoinduction model from Smythe *et al.* in the treatment outcome suggested that the proposed optimized doses in **Table 3** might need to be increased by 20% on average to accommodate the expected autoinduction (data not shown).<sup>39</sup> Since the effect of maturation on RIF autoinduction has not properly been evaluated in children, the proposed doses should be confirmed clinically prior to their implementation.

In conclusion, the new Indian pediatric dosing recommendations could be evaluated through a population PK-PD approach linking the anti-TB exposure to the probability of unfavorable outcome. The main findings were an increased risk of poor treatment outcomes in children with low body weight and with TB-HIV coinfection under the previous thrice-weekly RNTCP dosing regimen. While the new once-daily RNTCP dosing

regimen showed an overall improvement of predicted treatment outcome, children with low body weight and TB-HIV coinfection are still expected to display higher than expected rates of poor outcomes due to the use of constant mg/kg doses across weight bands. Optimized RIF doses based on a weekly RIF target exposure are provided. Clinical practice in India is rapidly evolving and the work presented herein may represent a cornerstone in the use of higher RIF pediatric doses in subpopulations at risk in the future.

## METHODS

### Study population

Data were obtained from two noninterventive studies in treatment-naive Indian children aged 1–15 years, diagnosed with drug-sensitive TB monoinfection ( $n = 84$ ) or TB-HIV coinfection ( $n = 77$ ).<sup>11,12</sup> Clinical examination and phenotypic INH acetylase status determination were performed upon recruitment (**Table 1**). Children were recruited from six study sites located in India, including: Agra, Bengaluru, Chennai, and Madurai. Studies were approved by the Institutional Ethics Committees of all study sites.<sup>11,12</sup> Subjects' parent/guardian provided written informed consent; children aged 7 or older provided assent.

### Study design

Children received a thrice-weekly course of anti-TB treatment according to previous RNTCP guidelines for 6 months.<sup>7</sup> Treatment was provided in patient-wise boxes available in four different weight bands (**Table 2**). Children eligible for ART were treated according to the National AIDS Control Organization guidelines.<sup>40</sup> At least two weeks after treatment initiation, PK profiles of INH, RIF, and PZA were evaluated and anthropometrics measurements were recorded. Doses were administered by the study team after an overnight fast. Children continued anti-TB treatment and ART whenever required according to guideline recommendations. At the end of the study, TB treatment outcomes were reported as unfavorable (i.e., treatment failure or death), favorable (i.e., treatment completion or cure) or unknown (i.e., lost during follow-up).<sup>11,12</sup>

### Data collection

On the PK study day, 2-mL blood samples were drawn at trough and 2, 4, 6, and 8 h postdose. INH, RIF, and PZA concentrations were determined by validated high-performance liquid chromatography methods.<sup>41,42</sup> Assays were linear within the following ranges of plasma concentration: 0.25–10.0 µg/mL for INH, 0.25–15.0 µg/mL for RIF and 1.25–50.0 µg/mL for PZA. Between- and within-run variation were

below 10% for all drugs. Lower limits of quantification for INH, RIF, and PZA were 0.25 µg/mL, 0.25 µg/mL, and 1.25 µg/mL, respectively; lower limits of detection were 0.1 µg/mL, 0.1 µg/mL, and 0.5 µg/mL, respectively. Average recovery from plasma were 104%, 104%, and 102%, respectively. Additional details regarding the analytical assays can be found in prior publications.<sup>41,42</sup>

### Drug concentrations analysis

The concentration–time profiles of INH, RIF and PZA were modeled separately. For each drug, one- and two-compartment models with linear/saturable elimination and constant/saturable relative bioavailability were evaluated. Herein, the relative bioavailability was defined as the difference of bioavailability of a given individual in relation to the typical individual (i.e., 17.8 kg individual with TB mono-infection). Due to the sparseness of the data during the absorption phase, estimation of first-order oral absorption rate constants was supported by use of prior information from published models for INH,<sup>18</sup> RIF,<sup>36</sup> and PZA.<sup>18</sup> Delays in drug absorption were tested using chains of transit compartments.<sup>18,43</sup> Between-subject variability was investigated on structural model parameters and was assumed to follow a log-normal distribution. Proportional, additive, and combined (i.e., proportional and additive) error models were evaluated to describe the residual unexplained variability (e.g., measurement error).

Allometric scaling based on total body weight (normalized by the population median: 17.8 kg) was applied to apparent clearances and volumes using exponents of  $3/4$  and 1, respectively. Age-related maturation parameters for INH and RIF clearances and RIF absorption delay were set to literature values.<sup>18</sup> The effects of rapid INH acetylase genotype were implemented on clearance and the relative bioavailability based on prior information.<sup>18,44</sup> A covariate search was performed to identify the effect of influential factors on drugs exposure. As part of this process, effects of age, total body weight, dose, sex, nutritional status, TB-HIV coinfection, and ART intake were investigated on apparent clearances, volumes, and relative bioavailabilities. All covariate-parameter relationships were sequentially tested using forward selection ( $P < 0.05$ ) followed by backward deletion steps ( $P \geq 0.01$ ) to account for multiple testing. The effect of categorical covariates was implemented as fractional change in the typical parameter value in relation to the reference (i.e., most common) category. Continuous covariates were first implemented using linear relationships; nonlinear relationships were tested for upon their inclusion in the forward selection step.

### Treatment outcomes analysis

The treatment outcome was reported as either favorable for cure (based on bacteriological evidence) and therapy completion (based on clinical evaluation) or unfavorable for therapy failure (based on clinical, microbiologic, or radiographic failure) and death. Treatment outcome (favorable vs. unfavorable) was modeled using a logistic regression model, where  $P_{\text{unfavorable}}$  was expressed as a function of predictors. Odds ratios were calculated using the exponent of the estimated effect slope. Effects of INH, RIF, and PZA drug exposures implemented as the total weekly area under the concentration–time curve and subject characteristics were tested as predictors through forward selection ( $P < 0.05$ ) and backward deletion steps ( $P \geq 0.01$ ).

### Parameter estimation and model selection

Population PK-PD analyses were performed in NONMEM (v. 7.3; Icon Development Solutions, Ellicott City, MD) and aided by functionalities of the PsN toolkit (v. 4.5.2).<sup>45,46</sup> PK data were fitted using a first-order conditional estimation method with interaction. Parameter uncertainty expressed as relative standard error (RSE) was obtained from the NONMEM sandwich estimator computed with an importance sampling step. Model selection was guided by evaluation of goodness-of-fit plots, parameter estimates values, and comparison of the objective function values ( $-2\log$  likelihood) with a significance level of  $P < 0.05$  (2-sided) for nested models. Throughout their development, model predictions were

also evaluated with simulation-based diagnostics.<sup>47</sup> Finally, the capacity of the selected PK models to properly predict drug exposure was assessed using performance predictive checks plots where the observed population drug exposure median was compared to the distribution of 1,000 simulated population medians of drug exposure.<sup>48</sup>

### RNTCP dosing regimen evaluation

The selected PK-PD model was used to predict  $P_{\text{unfavorable}}$  under previous and new RNTCP dosing regimens. Accordingly, drug exposures were simulated 1,000 times for children within the RNTCP pediatric weight range (i.e., 6–30 kg for previous and 4–39 kg for new dosing recommendations).  $P_{\text{unfavorable}}$  were then individually computed and summarized for previous and new RNTCP weight bands and for each significant covariate of treatment outcomes. In line with WHO's suggested target efficacy for drug-sensitive TB, the drug exposure associated with a target  $P_{\text{unfavorable}}$  of 5% or less was used to compute the optimized dose for each simulated subject.<sup>49</sup> These optimized doses were then summarized for each of the new RNTCP treatment weight bands.<sup>9</sup>

Additional Supporting Information may be found in the online version of this article.

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### CONFLICT OF INTEREST

There are no conflicts of interest.

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### AUTHOR CONTRIBUTIONS

B.G., G.R., M.K., A.K., P.B., N.G., S.S., A.G., K.E.D., and R.M.S. wrote the article; B.G., G.R., M.K., A.G., K.E.D., and R.M.S. designed the research; B.G., M.K., and R.M.S. performed the research; B.G., M.K., and R.M.S. analyzed the data.

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