

## **Country-level TB Modelling**

benchmarks, reporting & review

#### **Nick Menzies**

#### **Overview of BRR initiative**

- $\rightarrow$  Motivation
- $\rightarrow$  Efforts to date
- $\rightarrow$  Session objectives



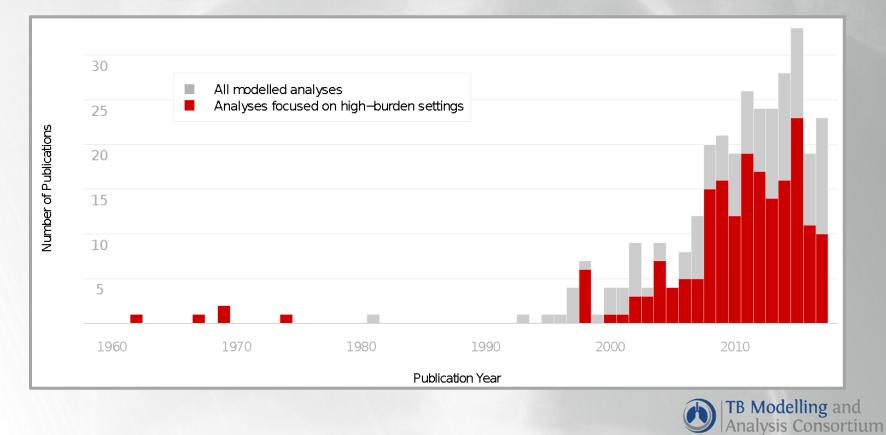
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### Motivation

- Mathematical modelling increasingly used to understand the implications of TB policy and funding decisions
  - → Supported by funders and technical orgs to facilitate objective decision-making
  - → Utilized by countries to suggest priority interventions, allocate budgets, and support funding applications
  - $\rightarrow$  Increasing professionalization of country-support modelling

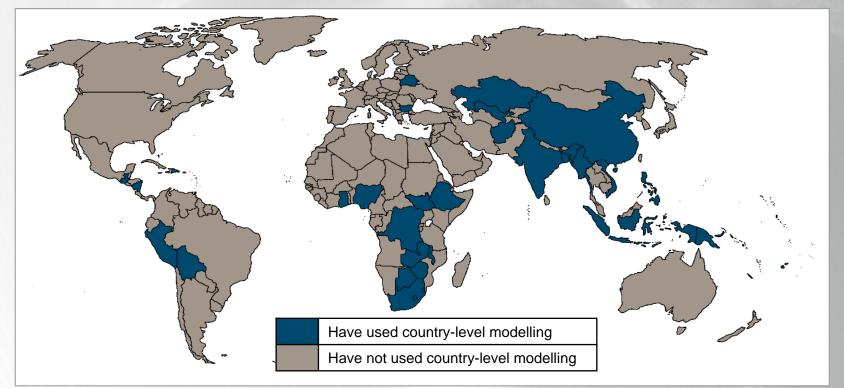


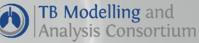
#### TB modelling in the scientific literature



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#### Country-level TB modelling applications, to 2017

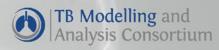




### Modelling decision-support workforce

## The past

- Small number of individuals involved
- Each application ad hoc, models developed for application
- Models simpler, constrained by computing power
- Same individuals filling multiple roles
  - Model developer also provides country-support
  - Country modelling closely tied to academic research



#### Modelling decision-support workforce

#### The present

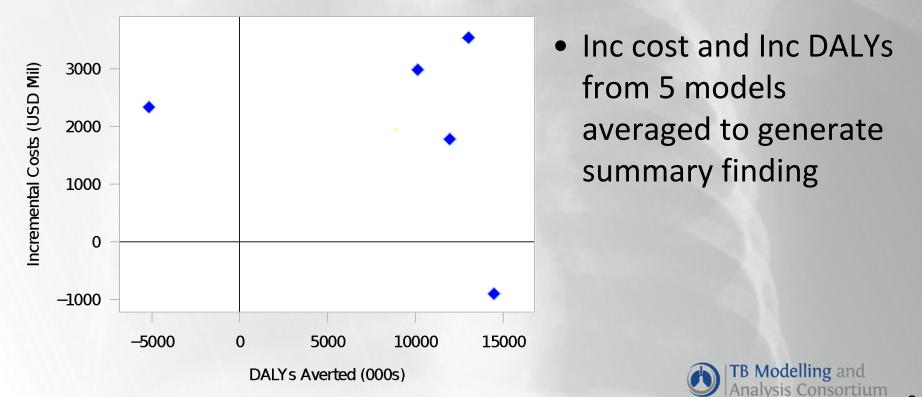
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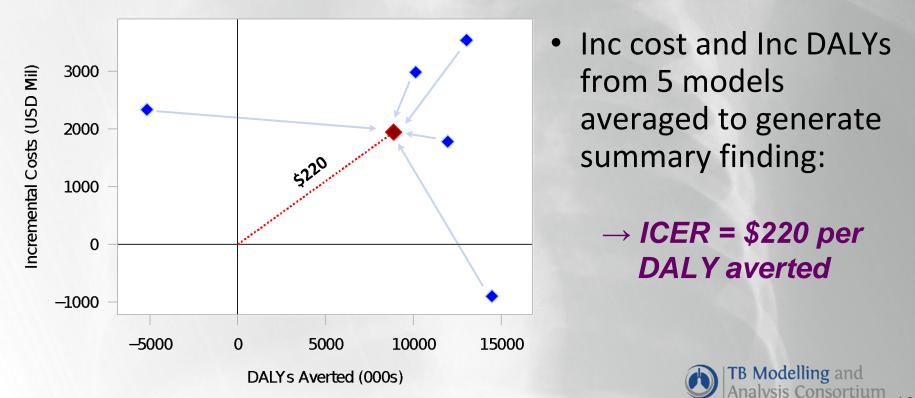
- Multiple modeling teams involved
- Investment in developing detailed models & codebases
  - Models universally more complicated
  - Models more durable, same model adapted to new settings
- Separation of functions:
  - Model development and country support by different individuals
  - Separation from traditional academic research

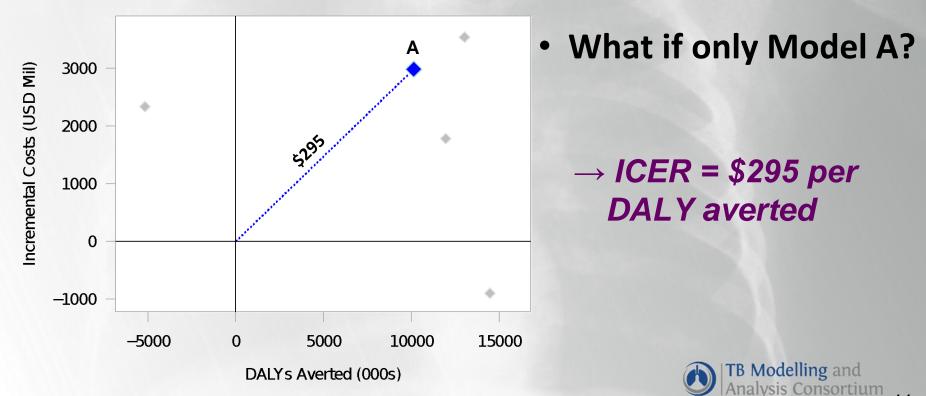
## Motivation

- Mathematical modelling increasingly used for understand the implications of TB policy and funding decisions
- Recent experience raises questions about the accuracy and reproducibility of model-based policy evaluation
  - → When tuned to the same setting and policy question, different models giving different answers
  - → When empirical evidence available to verify model projections, results don't always line up

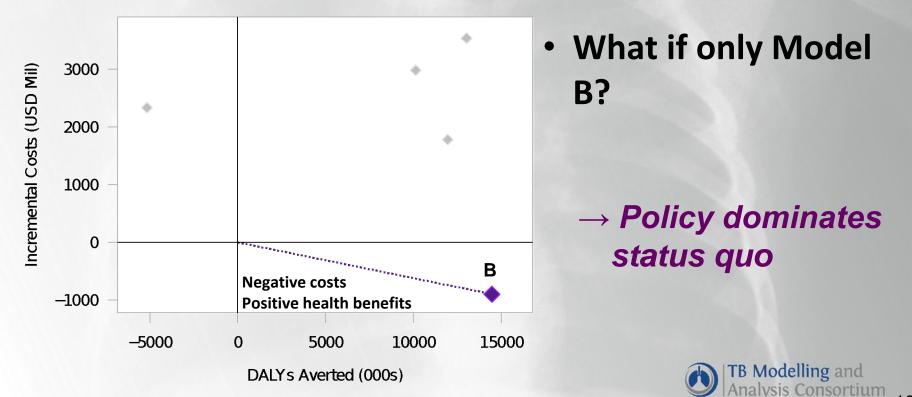


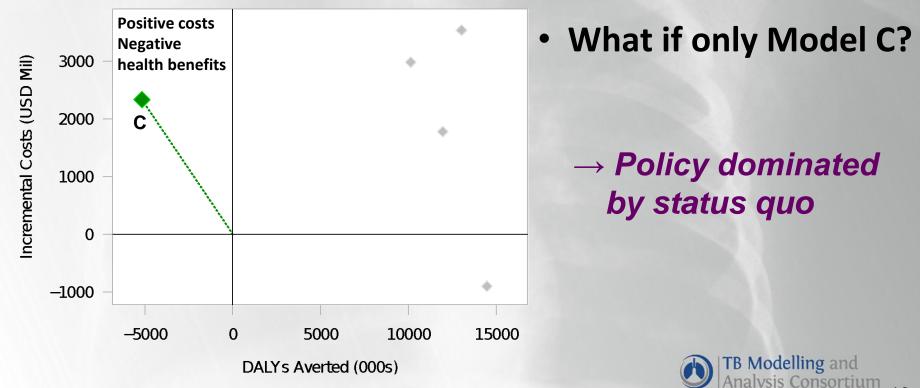






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# What is the cost-effectiveness of expanding coverage and eligibility for HIV treatment ?



\* 'Dom' = Dominant (negative costs, positive health benefits)



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Eaton et al Lancet GH 2014

### Motivation

- Mathematical modelling increasingly used for understand the implications of TB policy and funding decisions
- Recent experience raises questions about the accuracy and reproducibility of model-based policy evaluation
- → Demand for activities to improve the quality and reproducibility of modelling, confirm when models adequate for purpose



#### Response

- 1. Development of Country-level TB Modelling Guidance
  - Collaboration of TB MAC, WHO TB Dept, funders, modellers, country experts, other stakeholders
  - Developed 2017 to mid-2018
  - Published by WHO Global Taskforce on TB Impact Measurement

Guidance for country-level TB modeling



World Health Organization

#### Response

- 1. Development of Country-level TB Modelling Guidance
  - Describes 10 principles for country decision support modelling
  - Examples and good practices for implementing principles
  - Concerned with the use of models, rather than just the models themselves

Guidance for country-level TB modeling



World Health Organization

## Remaining gaps?

- Modeling guidance provides broad direction
- Does not provide mechanism to confirm that models are fit for purpose
- Countries looking for guidance on what model to use
- Funders looking for confirmation that models are valid for use



### **BRR** Initiative

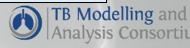
- BRR = Benchmarking, reporting, external review •
- Undertaken by TB MAC at the request of TB Roadmap • **Steering Committee and international funders**

Reveal where a modelling application is inconsistent with existing evidence or modelling best-practice

GOALS

Provide standard reporting template for describing modelling approaches and model performance

Create a system for independent evaluation of modeling approach and results



#### **BRR** Initiative

- BRR = Benchmarking, reporting, external review
- Undertaken by TB MAC at the request of TB Roadmap Steering Committee and international funders



### BRR: to do list

- 1. Develop benchmarks for country-level TB modelling applications
- 2. Develop a standard reporting approach, template, and checklist
- 3. Develop a mechanism for external review of modelling applications
- 4. Pilot these new initiatives with modelling teams
- 5. Conduct annual review to this approach, to suggest revisions and improvements



- 1. Develop benchmarks for country-level TB modelling applications
- Quantitative benchmarks describing features of TB natural history, epidemiology, health services, and costs
- Modelling assumptions & results compared to benchmarks to assess appropriateness for given policy question and context
- Not enforced dogmatically: modelling application would be asked to compare their assumptions and results to the benchmarks relevant to their work, and justify/discuss major deviations



- 2. Develop a standard reporting approach, template, and checklist
  - Standard format for reporting modelling questions, approaches, and results, + checklist to assess completeness
  - Include quantitative indicators (benchmarks) and process indicators of modelling good practice
  - Final format will need to be adopted by the agencies that commission and fund modelling work
  - General trends can inform evidence gaps, future activities



- 3. Develop a mechanism for external review of modelling applications
  - Mechanism to allow expert assessment of modelling approach, for a particular application
  - TB MAC role: develop the system to link reviewing supply and demand, and approaches for how this should occur
  - Expert reviewers represent themselves, not TB MAC
  - When review needed: a decision for funder / country / modelling group



- Small working group formed to develop initial proposal for BRR components
- Draft approach developed for benchmarks, reporting template, review process
- Approach shared for comment from a range of experts, modellers, funders



 Small working group formed to develop initial proposal for BRR components

Dra Thank you!

<sup>n</sup> Ted Cohen, David Dowdy, Philippe Glaziou, Gaby Gomez, Finn McQuaid, Andrew Siroka, John Stover, Anna Vassall, Richard White

• A

modellers, funders



- Small working group formed to develop initial proposal for BRR components
- Draft approach developed for benchmarks, reporting template, review process
- Approach shared for comment from a range of experts, modellers, funders



#### More thank you!

- Small wc BRR com
   Sevim Ahmedov, Meghan Bellerose, Anna Bershteyn, Stewart Chang, Madeleine Clarkson. Frank Cobelens, Katherine Floyd, Lara Gosce, Hassan Haghparast, Rein Houben, Michael Kimberling, Marek Lalli, Emma McBryde, Nim Pathy, Carel Pretorius, Romain Ragonnet, Anna Roberts, Jamie Rudman, Nabila Shaikh, Jolene Skordis-Worrall, Karyn Sutton, James Trauer, Bradley Wagner, Shufang Zhang
- Approach shared for comment from a range of experts, modellers, funders



#### BRR: activities today and tomorrow

 Discussion of approaches with modelling groups, stakeholders, & experts

#### Today (now to mid-afternoon)

- Brief description of one aspect of initiative  $(B \rightarrow R \rightarrow R)$
- Summary of feedback received
- Issues to be resolved
- Open discussion



#### BRR: activities today and tomorrow

 Discussion of approaches with modelling groups, stakeholders, & experts

Today (late afternoon)

Something else (evidence gaps for country-level modelling)



#### BRR: activities today and tomorrow

 Discussion of approaches with modelling groups, stakeholders, & experts

#### Tomorrow (until lunchtime)

- Review feedback and progress so far
- Small group work to propose how to move forward with feedback provided
- Summaries back to whole group
- Finish

#### Stakeholder perspective

- The need for these activities
- The wider context

Daniel Chin (BMGF) Shufang Zhang (the Global Fund)







#### General epidemiological benchmarks





#### Rationale: General epidemiological benchmarks

- These benchmarks describe general features of TB epidemiology, and are assumed to apply to most settings in which TB is being modelled to evaluate policy/intervention options
- Broad ranges allow for local variation, inconsistency of the empirical evidence, and different health state definitions used by models



#### Current benchmarks

	Description	Benchmark
B1.1	<b>Cumulative incidence</b> of active TB (all forms) over the <b>first 5</b> <b>years</b> following <i>M. tb</i> infection, no reinfection (%)	4-15%
B1.2	Annual incidence of active TB (all forms) for individuals >5 years after <i>M. tb</i> infection, no reinfection (%).	<0.2%
B1.3	<b>Case fatality</b> (probability of death before self-cure) for active TB, in the absence of treatment	40-70%
B1.4	Duration of active TB in the absence of treatment (years)	1.5-4.0 years
B1.5	Reduction in the risk of primary TB afforded by prior <i>M. tb</i> infection (percent)	40-85%



#### Possible additional benchmarks

Description	Benchmark
<b>Effect of HIV</b> on TB natural history (only in high HIV settings, or where HIV-TB interventions modelled)	
Effect of age on TB natural history (only where age-based interventions modelled)	



### Feedback from initial review

- Describe how stringently benchmarks will be assessed
- State when will benchmarks be assessed
- Clarify how benchmarks apply to stochastic models, models with parameter uncertainty, and stratified health states
- Clarify requested metrics, and standardize with WHO definitions
- Addition of benchmarks for risk groups (HIV) mostly supported, but concerns these could be hard to define



#### Ease of reporting responses

Benchmark Description	Model	Model doesn't currently produce			
	already produces this value	Easy to add	Difficult to add	Impossible to add	
<b>Cumulative incidence</b> of active TB (all forms) over the <b>first 5 years</b> following <i>M. tb</i> infection, no reinfection (%)	XXX	XX			
<b>Annual incidence</b> of active TB (all forms) for individuals <b>&gt;5 years</b> after <i>M. tb</i> infection, no reinfection (%).	XXXX	X			
<b>Case fatality</b> (probability of death before self-cure) for active TB, in the absence of treatment	XXXX	х			
Duration of active TB in absence of treatment (yrs)	xxxx		X		
Reduction in the risk of primary TB afforded by prior <i>M. tb</i> infection (percent)	XXXXX		TB M Analy	lodelling and sis Consortium	

### **Discussion points**

- How stringently benchmarks to be assessed?
  - Current approach: if model results fall outside of range, warrants discussion and justification.
- Are wide ranges sufficient to allow variation between settings, and different state definitions by models?
- Should benchmarks be added for HIV and potentially other subgroups, and when would they apply?







#### Country-specific epidemiological benchmarks





### Rationale: Country-specific epidemiological benchmarks

- These benchmarks describe country-specific features of TB epidemiology
- There are multiple sources of country-level burden estimates. A given modelling application may be required to be consistent with a particular source, so need to allow flexibility on which source provides benchmarks



# **Current benchmarks**

	Description
B2.1	General population <b>TB incidence rate</b> (all forms) in the most recent available year (per 100,000)
B2.2	Change in general population TB incidence rate (all forms) over most recent available year (%)
B2.3	General population <b>TB mortality rate</b> (all forms, including TB-HIV) in the most recent available year (per 100,000)
B2.4	Change in general population TB mortality rate (all forms, including TB-HIV) over most recent available year (%)
B2.5	<b>Change in</b> general population <b>TB case fatality</b> (ratio of TB mortality to incidence) over most recent available year (%)
B2.6	General population <b>TB prevalence</b> (per 100,000), in years for which a nationally-representative TB prevalence survey is available
B2.7	<b>Prevalence of MDR-TB among treatment-naive</b> notified TB cases, in the most recent available year (%)
B2.8	Prevalence of MDR-TB among treatment-experienced notified TB cases, in the most second g and available year (%)

Description	
General population <b>TB incidence rate</b> (all forms) in the most recent available year (per 100,000)	554 (311- 866)
Change in general population TB incidence rate (all forms) over most recent available year (%)	+ 0.73%
General population <b>TB mortality rate</b> (all forms, including TB-HIV) in the most recent available year (per 100,000)	26 (22-29)
Change in general population TB mortality rate (all forms, including TB-HIV) over most recent available year (%)	- 3.7%
Change in general population <b>TB case fatality</b> (ratio of TB mortality to incidence) over most recent available year (%)	-2.3%
General population <b>TB prevalence</b> (per 100,000), in years for which a nationally-representative TB prevalence survey is available	N/A
Prevalence of MDR-TB among treatment-naive notified TB cases, in the most recent available year (%)	2.6% (1.8% - 3.3%)
Prevalence of MDR-TB among treatment-experienced notified TB cases, in the most recent available year (%)	29% (20% - 38%)
	General population TB incidence rate (all forms) in the most recent available year (per 100,000)Change in general population TB incidence rate (all forms) over most recent available year (%)General population TB mortality rate (all forms, including TB-HIV) in the most recent available year (per 100,000)Change in general population TB mortality rate (all forms, including TB-HIV) over most recent available year (%)Change in general population TB mortality rate (all forms, including TB-HIV) over most recent available year (%)Change in general population TB case fatality (ratio of TB mortality to incidence) over most recent available year (%)General population TB prevalence (per 100,000), in years for which a nationally-representative TB prevalence survey is availablePrevalence of MDR-TB among treatment-naive notified TB cases, in the most recent available year (%)Prevalence of MDR-TB among treatment-experienced notified TB

Country: Philippines Source: WHO



## Possible additional benchmarks

#### Description

Percentage of **incident TB cases** (or TB deaths) arising among **HIV positive** individuals, for high HIV settings

HIV prevalence, for high HIV settings



### Feedback from initial review

- The addition of HIV benchmarks would be useful (multiple respondents)
- Consider removing case fatality (redundant given inclusion of TB incidence and mortality benchmarks)



### Ease of reporting responses

Benchmark Description	Model	Model de	Model doesn't currently produce		
	already produces this value	Easy to add	Difficult to add	Impossible to add	
General population <b>TB incidence rate</b> (all forms) in the most recent available year (per 100,000)	XXXXX				
Change in general population TB incidence rate (all forms) over most recent available year (%)	XXX	XX			
General population <b>TB mortality rate</b> (all forms, including TB-HIV) in the most recent available year (per 100,000)	XXXXX				
<b>Change in</b> general population <b>TB mortality rate</b> (all forms, including TB-HIV) over most recent available year (%)	XXX	ХХ			



### Ease of reporting responses (cont.)

Benchmark Description	Model	Model d	loesn't currently produce		
	already produces this value	Easy to add	Difficult to add	Impossible to add	
<b>Change in</b> general population <b>TB case fatality</b> (ratio of TB mortality to incidence) over most recent available year (%)	XX	XXX			
General population <b>TB prevalence</b> (per 100,000), in years for which a nationally-representative TB prevalence survey is available	XXXXX				
<b>Prevalence of MDR-TB among treatment-naive</b> notified TB cases, in the most recent available year (%)	XXXXX				
Prevalence of MDR-TB among treatment- experienced notified TB cases, in the most recent available year (%)	XXXXX			odelling and	
				ysis Consortium	

#### **Discussion points**

- Should we include HIV benchmarks?
- How should we specify ranges for each benchmark?
  - Current approach: take range given by source of burden estimates. If unavailable, use default +/- 25% of point estimate







#### Country-specific economic benchmarks





### Rationale: Country-specific economic benchmarks

- These benchmarks describe country-specific features of TB program resource utilization
- Evidence available to benchmark econ aspects of modelling currently weak, but improving. Focus on those inputs/outputs where evidence currently stronger, but even these still require some interpretation



# **Current benchmarks**

	Description
B3.1	Total <b>TB spending</b> (health service costs, including diagnostics, treatment (first line and MDR), program support and management costs) for the most recent year* * Benchmark <u>only</u> applies to modelling applications designed to inform program budget estimates
B3.2	<b>Unit cost</b> per person month of first line <b>treatment*</b> * Benchmark applies if country has previously reported in GHCC or WHO World TB Report



### Feedback from initial review

- The care cascade and TB spending don't match completely
- Why is the second benchmark restricted to 1st line treatment? Should we add additional cost categories?



#### Ease of reporting responses

Benchmark Description	Model already produces this value	Model doesn't currently produce			
		Easy to add	Difficult to add	Impossible to add	
Total <b>TB spending</b> (health service costs, including diagnostics, treatment (first line and MDR), program support and management costs) for the most recent year	XX	XX	X		
Unit cost per person month of first line treatment	XX	Х	XX		



#### **Discussion points**

- How do we benchmark cost inputs and resource need estimates given current scarcity of econ evidence?
- How do we make sure benchmarks only apply to those analyses for which they are relevant?
- Should the focus be on reporting data sources, methods (for including costs/ economic evaluation methods/ uncertainty)?







#### Additional standard outputs

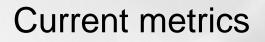




#### Rationale: Additional standard outputs

- Outputs describe features of TB epidemiology and program performance for which **no benchmark** is provided, but which are useful for interpreting model assumptions and results
- Include metrics for features of TB epidemiology for which empirical data not typically collected in high-burden settings, as well as metrics for the TB treatment cascade





	Description
	Epidemiology
B4.1	Percentage of total population infected with latent <i>M.tb</i> infection ( <b>LTBI</b> ), in most recent year (%)
B4.2	Percent of incident TB cases due to <b>recent infection</b> ( <i>M.tb</i> infection or reinfection within the last 2 years), in most recent year (%)
B4.3	Annual <b>rate of <i>M.tb</i> infection</b> for uninfected individuals, in most recent year (per 100 person-years)
B4.4	Average <b>number of new</b> <i>M.tb</i> infections/reinfections produced by an infectious case, in most recent year.
B4.5	Average <b>duration</b> of an episode of <b>active TB</b> (ie to death, self-cure, or treatment initiation), in most recent year.



# **Current metrics**

	Description
	Care cascade
B4.6	Percent of all incident TB cases that access healthcare and <b>initiate diagnosis</b> , for current year
B4.7	Percent of TB cases that initiate diagnosis who receive a <b>positive TB diagnosis</b> , for current year (ie 100 minus percentage false negative or not completing diagnostic algorithm)
B4.8	Percent of diagnosed TB cases that <b>initiate treatment</b> , for current year (ie 100 minus percent lost before treatment initiation)
B4.9	Percent of TB cases initiating treatment that <b>complete the regimen</b> , for current year (ie 100 minus percent died or discontinued)
B4.10	Percent of TB cases completing treatment that are <b>cured</b> , for current year



### Possible additional metrics

#### Description

Percent of all diagnosed TB cases false-positive



## Feedback from initial review

- Epi indicators:
  - Definition of recent infection (2 years) different from definitions in general epi benchmarks (5 years)
  - Some outcomes difficult to report for ODE models?
- Care cascade indicators:
  - Should these indicators include the private sector?

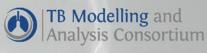


## Ease of reporting responses

Benchmark Description	Model	Model d	doesn't currently produce		
		Easy to add	Difficult to add	Impossible to add	
Epidemiology					
Percentage of total population infected with latent <i>M.tb</i> infection ( <b>LTBI</b> ), in most recent year (%)	XXXXX				
Percent of incident TB cases due to <b>recent</b> <b>infection</b> ( <i>M.tb</i> infection or reinfection within the last 2 years), in most recent year (%)	X	XXXX			
Annual <b>rate of <i>M.tb</i> infection</b> for uninfected individuals, in most recent year (per 100 person-years)	XXXXX				
Average number of new <i>M.tb</i> infections/reinfections produced by an infectious case, in most recent year.	XX	XXX	TB N Anal	odelling and sis Consortium	

# Ease of reporting responses (cont.)

Benchmark Description	Model already	Model do	Model doesn't currently produce		
	produces this value	Easy to add	Difficult to add	Impossible to add	
Average <b>duration</b> of an episode of <b>active TB</b> (ie to death, self-cure, or treatment initiation), in most recent year.	XX	XXX			
Care Cascade					
Percent of all incident TB cases that access healthcare and <b>initiate diagnosis</b> , for current year	XXXX	X			
Percent of TB cases that initiate diagnosis who receive a <b>positive TB diagnosis</b> , for current year (ie 100 minus percentage false negative or not completing diagnostic algorithm)	XX	ХХХ			



## Ease of reporting responses (cont.)

	Model already	Model doesn't currently produce			
	produces this value	Easy to add	Difficult to add	Impossible to add	
Percent of diagnosed TB cases that <b>initiate</b> <b>treatment</b> , for current year (ie 100 minus percent lost before treatment initiation)	XXX	XX			
Percent of TB cases initiating treatment that <b>complete the regimen</b> , for current year (ie 100 minus percent died or discontinued)	XXXXX				
Percent of TB cases completing treatment that are <b>cured</b> , for current year	XXXXX				



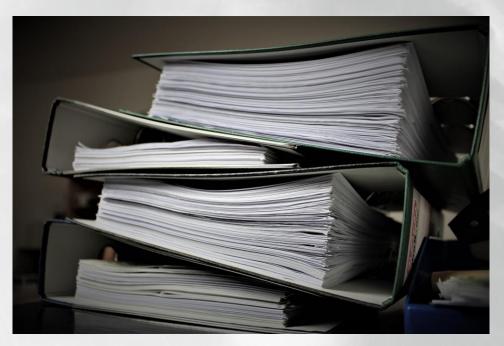
#### **Discussion points**

- How much flexibility should there be around how models calculate a given metric?
  - Current approach: models to calculate as they see fit.
- Are these the most important aspects of TB health services to report/compare?
- How should the private sector be considered in cascade indicators?



#### **Finn McQuaid**

# **Reporting template**





# Rationale: Reporting Template

• A standardized framework to ensure that relevant information is communicated to appropriate parties, allowing for easy review and synthesis of applications as well as assessment of the benchmarks



#### **Current template**

#### **ESSENTIAL INFORMATION**

#### **RT1. EVALUATION QUESTION**

RT1.1 What was the primary research question?

RT1.2 What policy alternatives were compared?

RT1.3 What outcomes were used to summarise health or epi effects of policy alternatives?

RT1.4 What outcomes were used to summarise economic effects of policy alternatives?

RT1.5 Over what time period/point were results estimated for?

RT1.6 How were optimal policies chosen?

#### **RT2. MODELLING PROCESS**

RT2.1 Which stakeholders participated?

RT2.2 What activities were undertaken to support local capacity building?

RT2.3 Did you seek or receive independent review?

RT2.4 Were there any conflicts of interest?

RT2.5 Is there a report or publication that provides technical details?



#### **Current template**

#### **RT3. MODELLING RESULTS**

RT3.1 Were results consistent with modelling benchmarks?
RT3.2 If there were deviations, how should these be interpreted?
RT3.3 Were other steps taken to validate the model?
RT3.4 What were the main findings and policy recommendations of the modelling?
RT3.5 What sensitivity analyses were conducted, and what conclusions were drawn from these for policy recommendations?
RT3.6 Did policy scenarios involve a substantial improvement in program coverage, quality or effectiveness?

#### **RT4. LIMITATIONS & DATA NEEDS**

RT4.1 What are major uncertainties/assumptions? RT4.2 What are major threats to success of the novel policies examined? RT4.3 What is the most urgent or important research needed to confirm these findings?

#### **RT5. NEXT STEPS**

RT5.1 Have these modelling results been accepted/endorsed by the requesting organization? RT5.2 What policy decisions were informed by this modelling?



#### Feedback from initial review

- There needs to be clarity on the audience and purpose
- A number of sections require significant additional work
- Difficult to manage openness and honesty
- Difficult to consider continuous interaction & long-term outputs



# **Discussion** points

- Does this meet the need of funders?
  - Who should mandate this template & review?
  - How could this fit into a modelling application process?
- Does sensitivity of the reports affect their wider distribution?
- How best should we reduce unnecessary reporting burden?
- How should we report on economic approaches?
- How should we report on the impact of interventions



#### David Dowdy

# **Review process**





#### **Rationale: Review Process**

• To facilitate external review of modelling applications, linking experts with requests to review



## Proposed approach

#### **RP1.INITIATION PHASE**

- RP1.1 Repository of potential reviewers established
- RP1.2 Potential reviewers contacted
- **RP1.3** List of reviewers interested and able to provide review hosted on the TB MAC website with access open to institutional and close collaborators, country expertise, intervention/activity expertise



## Proposed approach

#### **RP2. REVIEW PROCESS**

- **RP2.1** Review requests submitted on TB MAC website, including summary information
  - -- Suggested reviewers
  - -- Country/region modelled -- Modelling TA organisation
  - -- Funding source

-- Programme areas informed

-- Required timeline

- -- Decision process informed
- RP2.2 Review summary information sent to suggested reviewer(s) for decision, Col disclosed
- **RP2.3** Open review process conducted during modelling application (unless inappropriate)
- **RP2.4** Review included in final report



# Feedback from initial review

- There needs to be clarity on the audience and purpose
- We could consider inclusion of non-TB modeller reviewers



# **Discussion points**

- When should external review happen (during modelling application, after modelling application)?
- Who should mandate this process?
- How should the review be finalised?
- What should the role of TB MAC be?
- How should we avoid Col as part of external review?

