



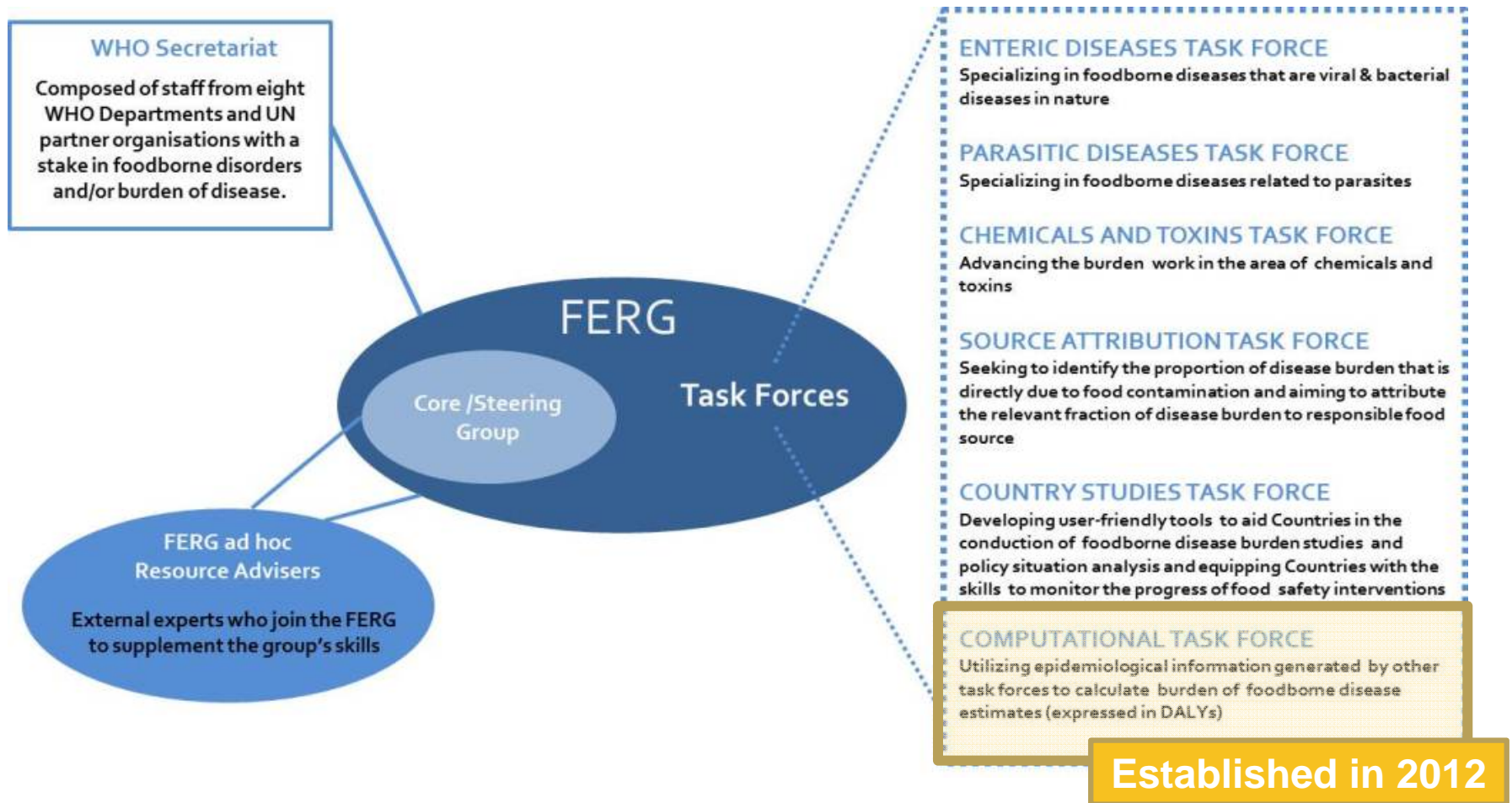
World Health  
Organization

**Methodological framework** for  
WHO estimates of the global burden  
of foodborne disease

**Brecht Devleesschauwer**



# FERG Computational Task Force



# Methodological choices

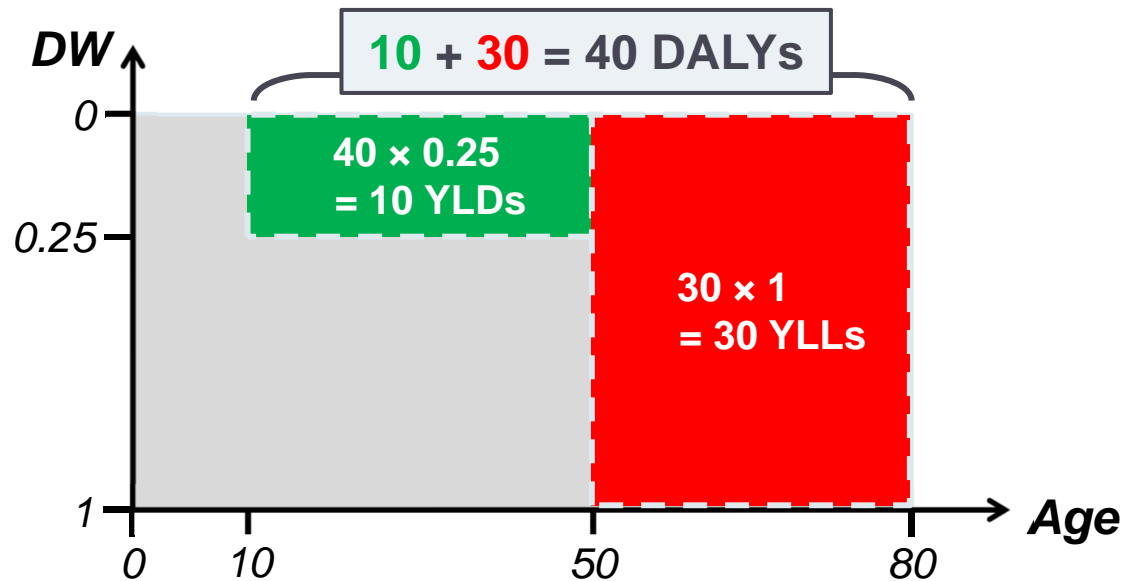
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## **Burden of foodborne disease**

- ▶ Illnesses, deaths
- ▶ Disability-Adjusted Life Years (DALYs)
  - ▶ **1 DALY = 1 healthy life year lost**
  - ▶ Summary measure of population health
    - ▶ Morbidity + mortality
    - ▶ Disease occurrence + disease severity
  - ▶ **DALY = YLD + YLL**
    - ▶ YLD = Years Lived with Disability
      - = Number of incident cases × Duration × Disability Weight
    - ▶ YLL = Years of Life Lost
      - = Number of deaths × Residual Life Expectancy

# Disability-Adjusted Life Years

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$$\text{DALY} = \text{YLD} + \text{YLL}$$

- ▶  $\text{YLD} = \text{Years Lived with Disability} = N \times D \times DW$
- ▶  $\text{YLL} = \text{Years of Life Lost} = M \times RLE$

# Methodological choices

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## **Burden of foodborne disease**

- ▶ Illnesses, deaths
- ▶ Disability-Adjusted Life Years (DALYs)
- ▶ Hazard-based
  - ▶ Burden of hazard = burden of causally related **health states**
    - ▶ Acute illness, chronic sequelae, death
    - ▶ Different severity levels
  - ▶ Represented by **disease model, outcome tree**
  - ▶ FERG: 31+6 hazards; 75 health states

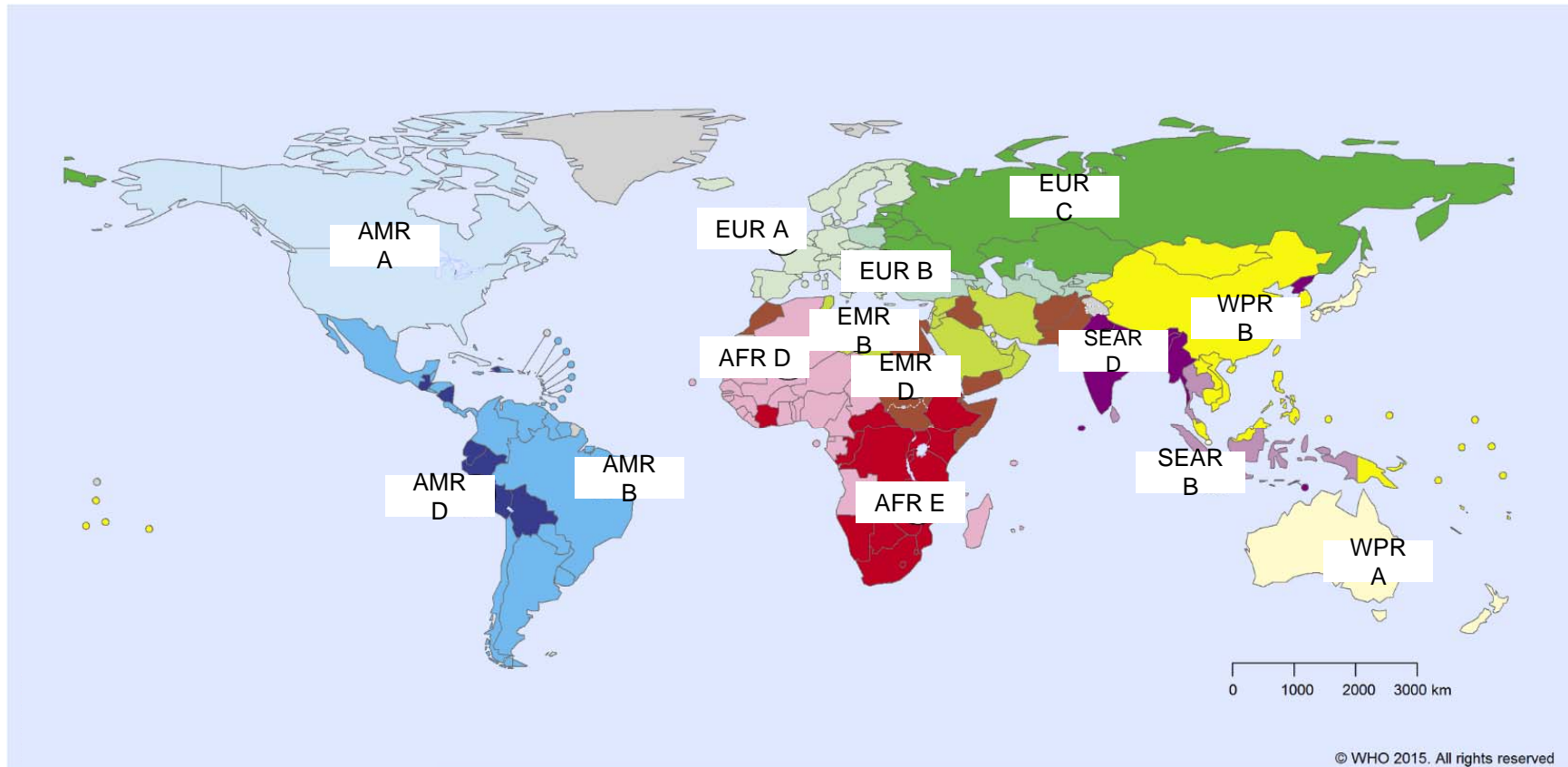
# Methodological choices

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## **Burden of foodborne disease**

- ▶ Illnesses, deaths
- ▶ Disability-Adjusted Life Years (DALYs)
- ▶ Hazard-based
- ▶ Incidence-based
  - ▶ Future burden resulting from current exposure
    - ▶ more sensitive to current epidemiological trends
    - ▶ more consistent with the estimation of YLLs
- ▶ Reference year 2010
  - ▶ Number of **incident** illnesses, deaths, DALYs **in 2010**
- ▶ Calculated at country level
  - ▶ Presented at subregion level (14)

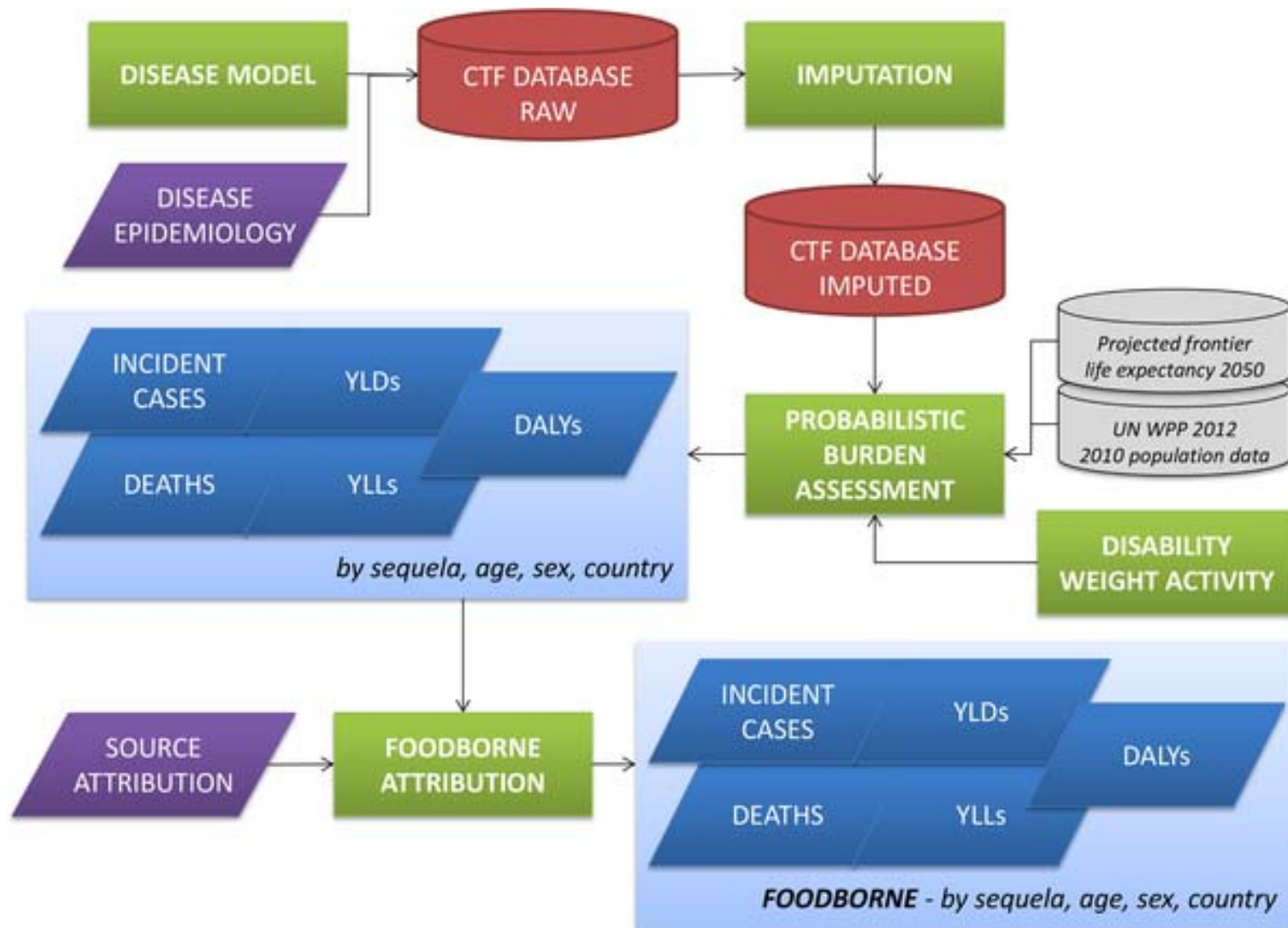
# 14 subregions



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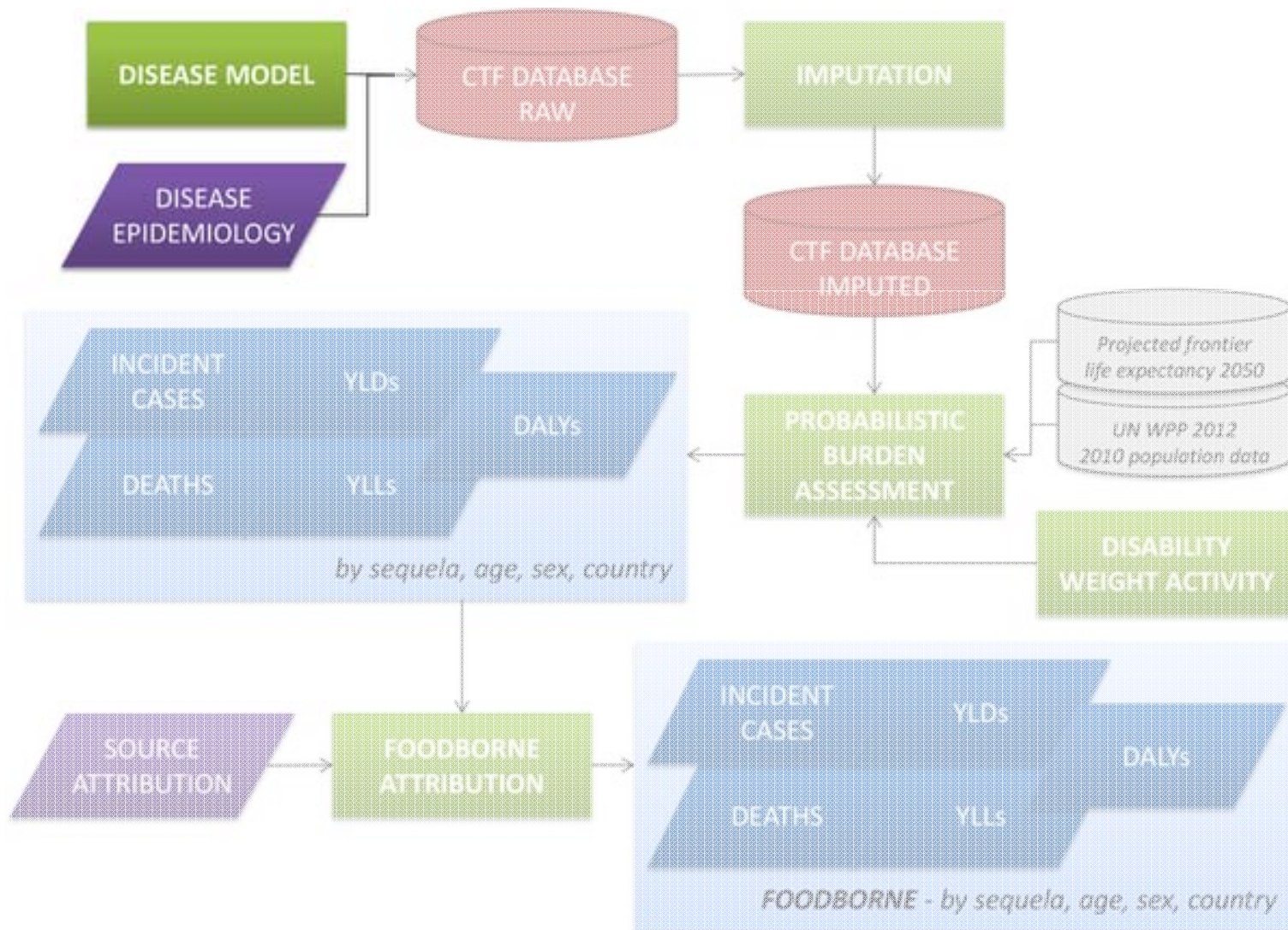
Data Source: World Health Organization  
Map Production: Foodborne Disease Burden Epidemiology Reference Group (FERG),  
World Health Organization

# Computational Task Force Workflow





# Computational Task Force Workflow



# Disease models and epidemiological data

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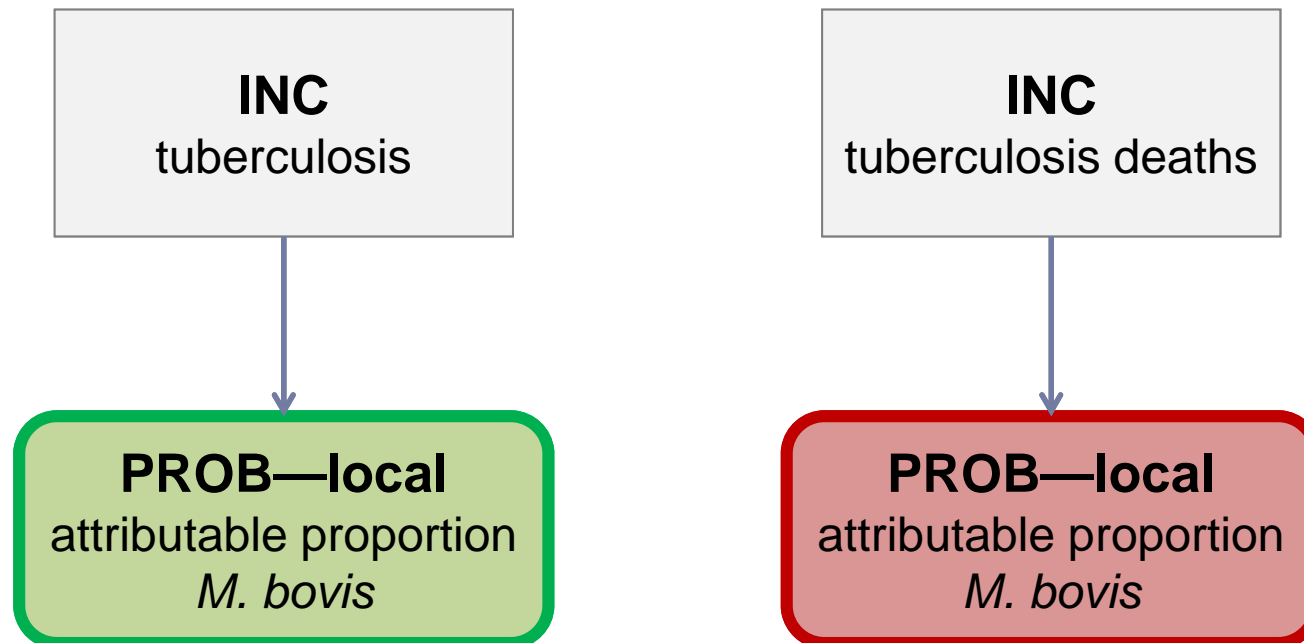
- ▶ Hazard-based task forces: systematic reviews
- ▶ **Computational** disease model
  - ▶ Disease biology + Data availability
  - ▶ Directed acyclic graphs (nodes and arrows)
- ▶ Quantifying hazard disease burden
  - ▶ Categorical attribution
  - ▶ Counterfactual analysis
  - ▶ Risk assessment

# Disease models and epidemiological data

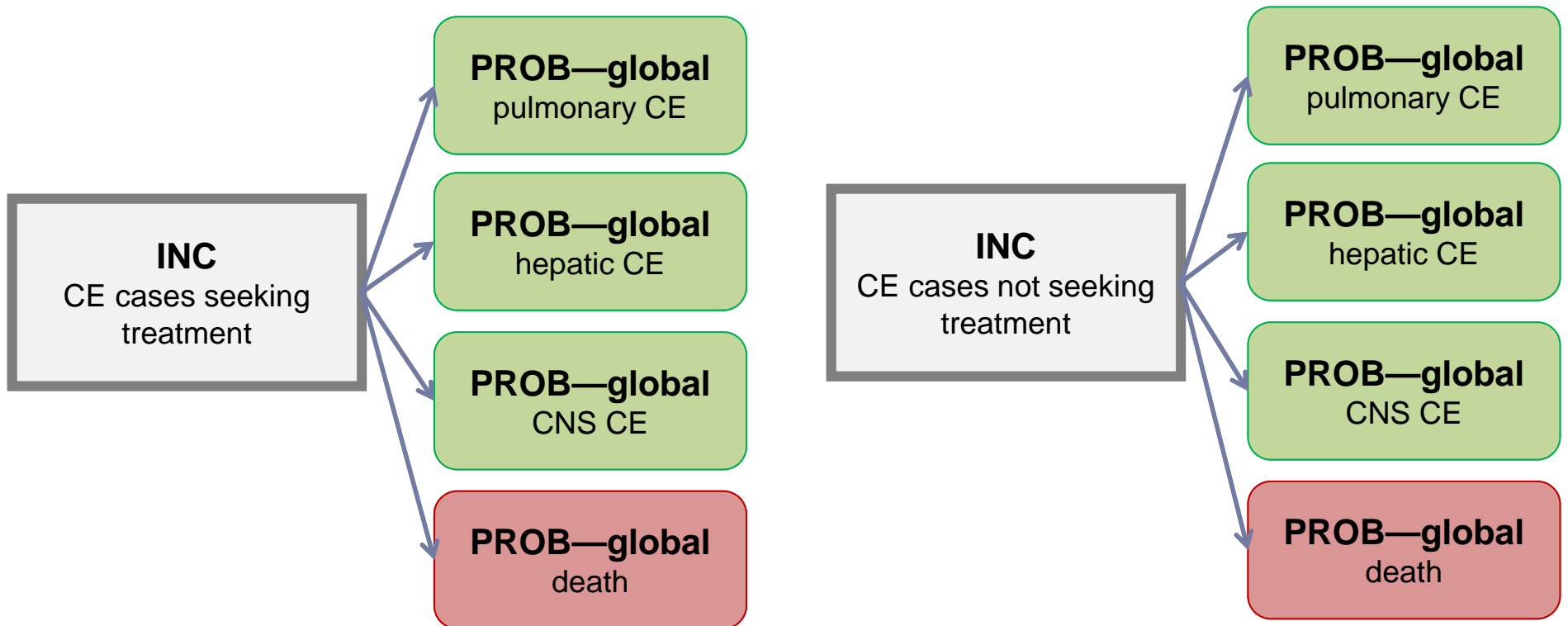
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- ▶ Hazard-based task forces: systematic reviews
- ▶ Computational disease model
- ▶ Quantifying hazard disease burden
  - ▶ **Categorical attribution**
    - ▶ Outcome identifiable as caused by hazard in individual cases
    - ▶ All viral, bacterial and parasitic hazards; cyanide in cassava, peanut allergen
    - ▶ Attributional model: symptom → hazard attribution
    - ▶ Transitional model: infection/exposure → symptom

# ***Mycobacterium bovis*** Disease Model



# *Echinococcus granulosus* Disease Model



# Disease models and epidemiological data

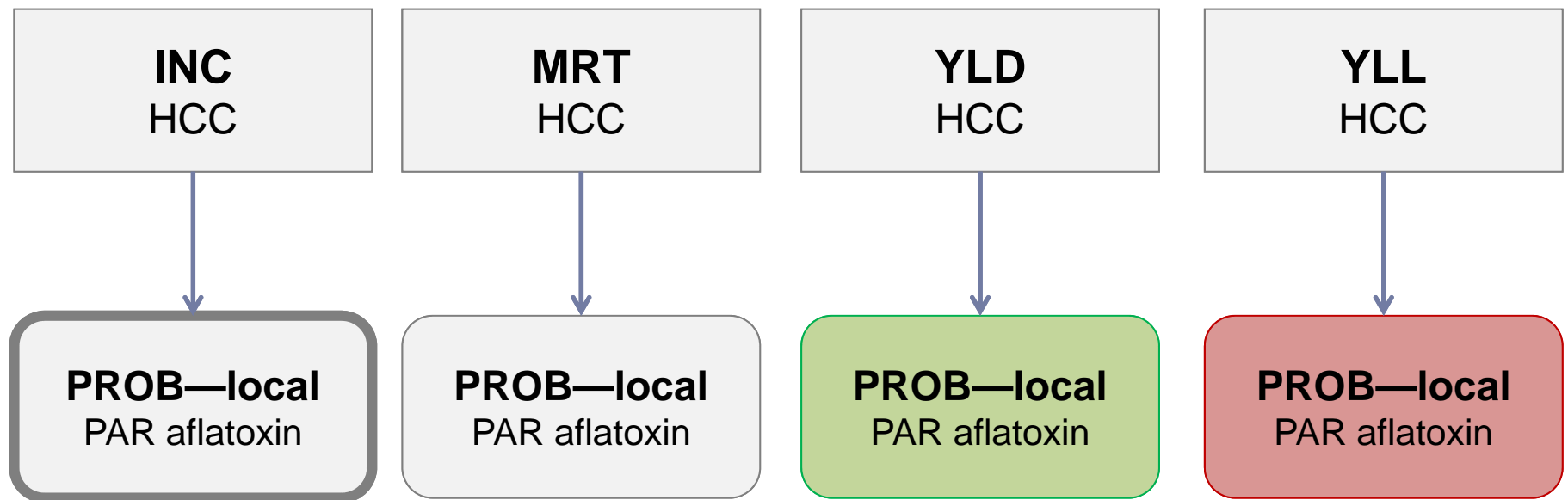
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- ▶ Hazard-based task forces: systematic reviews
- ▶ Computational disease model
- ▶ Quantifying hazard disease burden
  - ▶ Categorical attribution
  - ▶ **Counterfactual analysis**
    - ▶ Causal attribution cannot be made on an individual basis
    - ▶ Aflatoxin and hepatocellular carcinoma
    - ▶ Statistical association: Population Attributable Risk (PAR)
    - ▶ Attributional model: symptom → hazard attribution

# Counterfactual analysis; Attributional model

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## Aflatoxin Disease Model



# Disease models and epidemiological data

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- ▶ Hazard-based task forces: systematic reviews
- ▶ Computational disease model
- ▶ Quantifying hazard disease burden
  - ▶ Categorical attribution
  - ▶ Counterfactual analysis
  - ▶ **Risk assessment**
    - ▶ Combining exposure and dose-response data
    - ▶ Not necessarily consistent with existing health statistics
    - ▶ Dioxin and impaired fertility, hypothyroidy

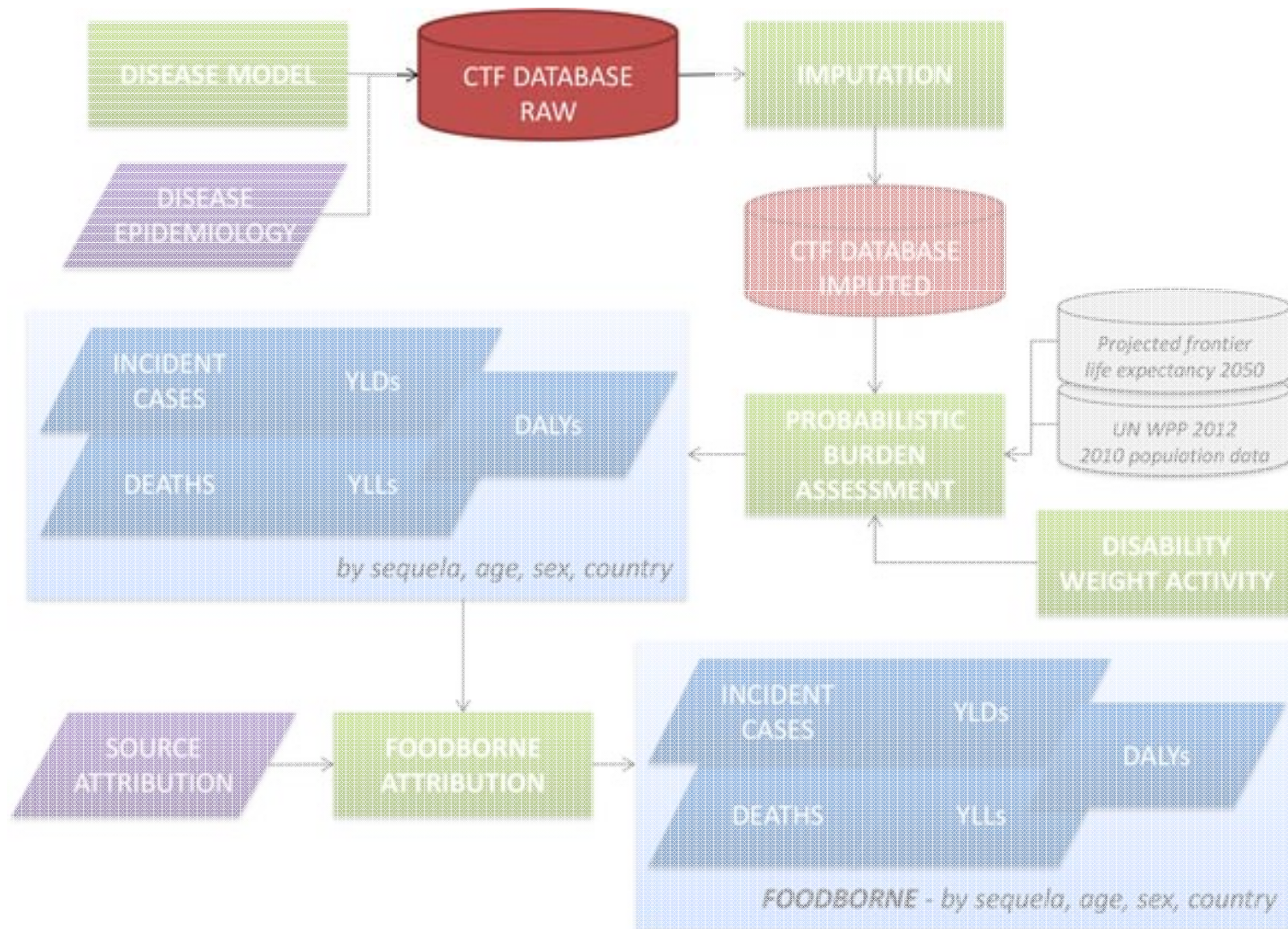


# Note: underreporting

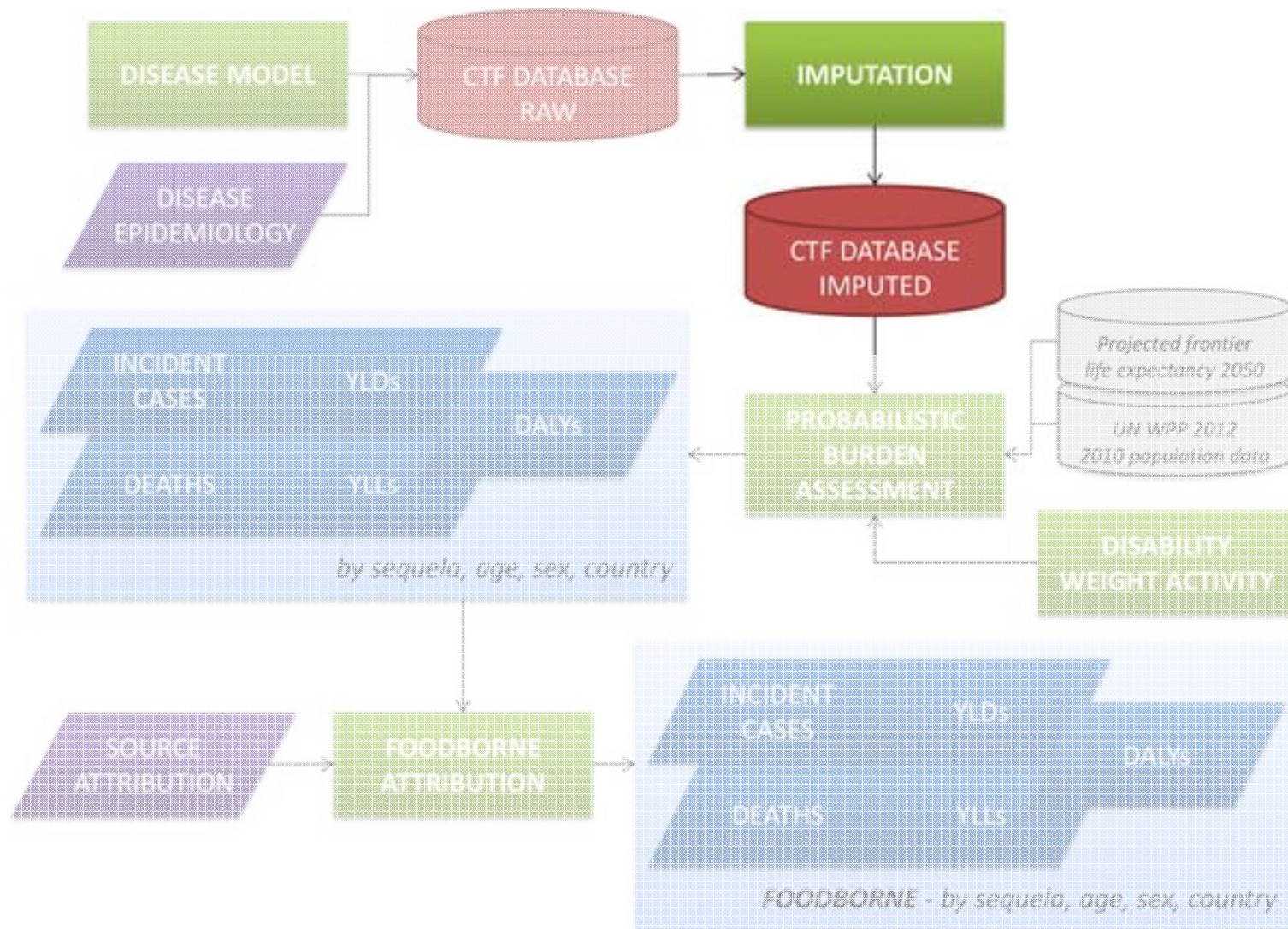
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- ▶ Not explicitly addressed in CTF framework
- ▶ Captured by framework
  - ▶ Attributional models: corrected envelopes
  - ▶ Use of survey instead of surveillance data
  - ▶ Underreporting factor included in disease model

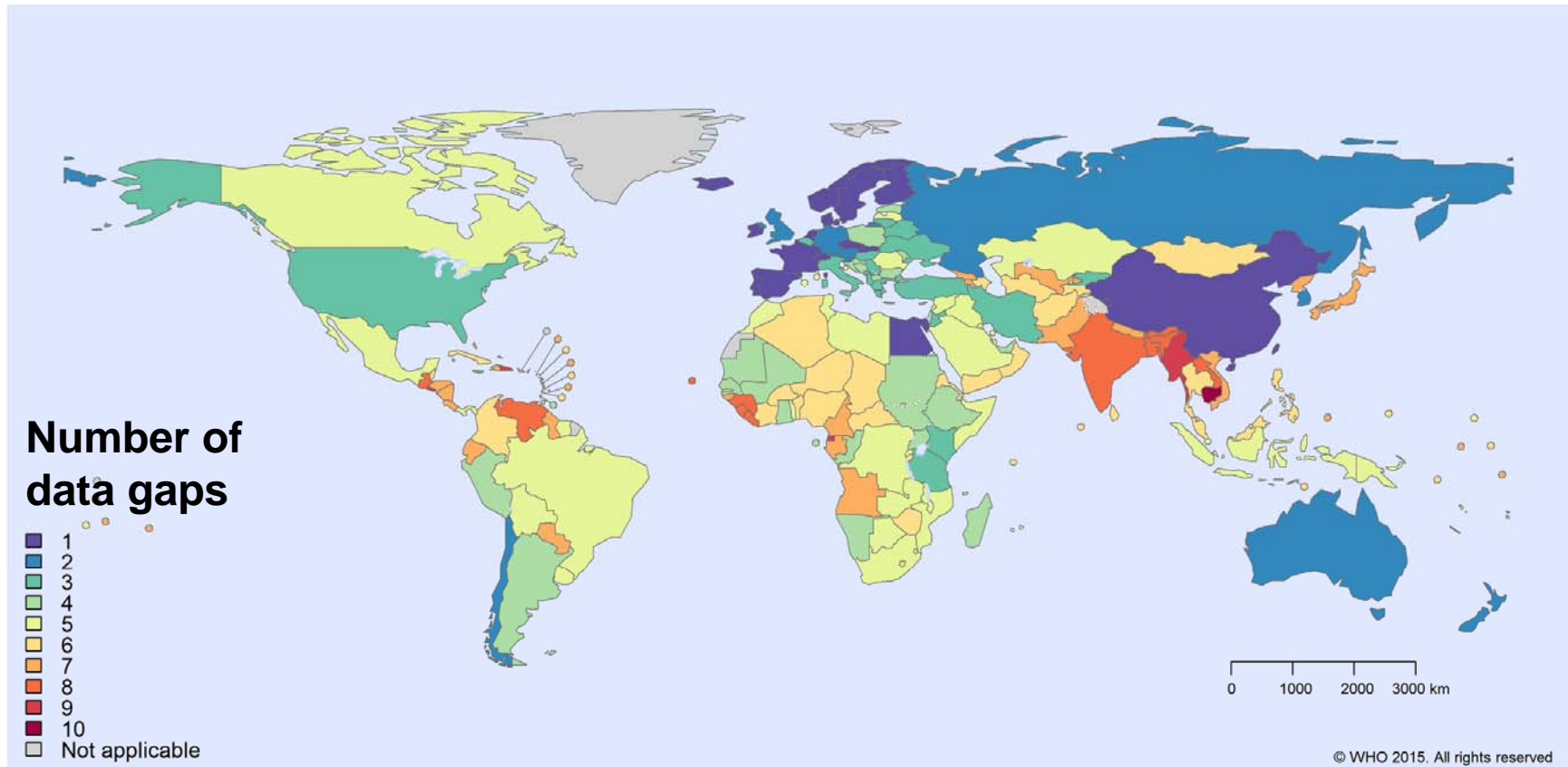
# Computational Task Force Workflow



# Computational Task Force Workflow



# Need for imputation



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Data Source: World Health Organization  
Map Production: Foodborne Disease Burden Epidemiology Reference Group (FERG),  
World Health Organization

# Imputation model

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- ▶ Provide reasonable value + uncertainty range
- ▶ Bayesian random effects log-Normal regression model

$$\log(\theta_{ij}) \sim \text{Normal}(\mu_i, \sigma_w^2)$$
$$\mu_i \sim \text{Normal}(\mu_0, \sigma_b^2)$$

$\theta_{ij}$  = incidence in country  $j$  belonging to region  $i$

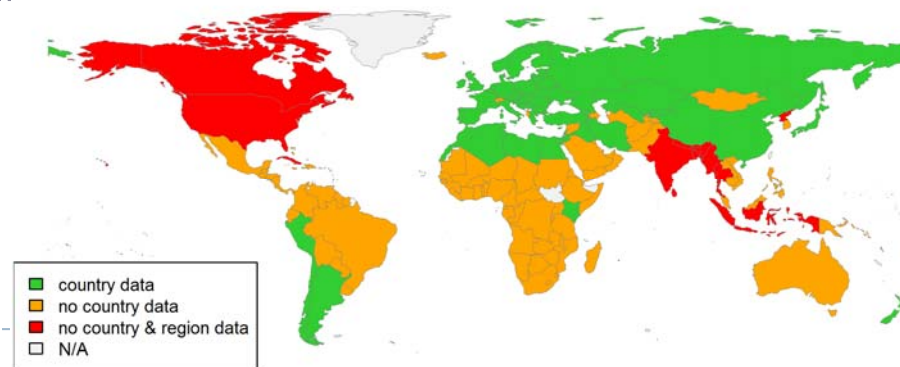
$\mu_i$  = regional mean;  $\mu_0$  = global mean

$\sigma_w^2$  = within-region variance;  $\sigma_b^2$  = between-region variance

# Imputation model

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- ▶ Provide reasonable value + uncertainty range
- ▶ Bayesian random effects log-Normal regression model
  - ▶ **green** countries: no imputation
  - ▶ **orange** countries:  $LN(\mu_i, \sigma_w^2)$ 
    - ▶ “random” country within concerned subregion
    - ▶ UI describes variability within subregions
  - ▶ **red** countries:  $LN(\mu_0, \sigma_b^2 + \sigma_w^2)$ 
    - ▶ “random” country within a “random” subregion
    - ▶ UI describes variability between and within subregions

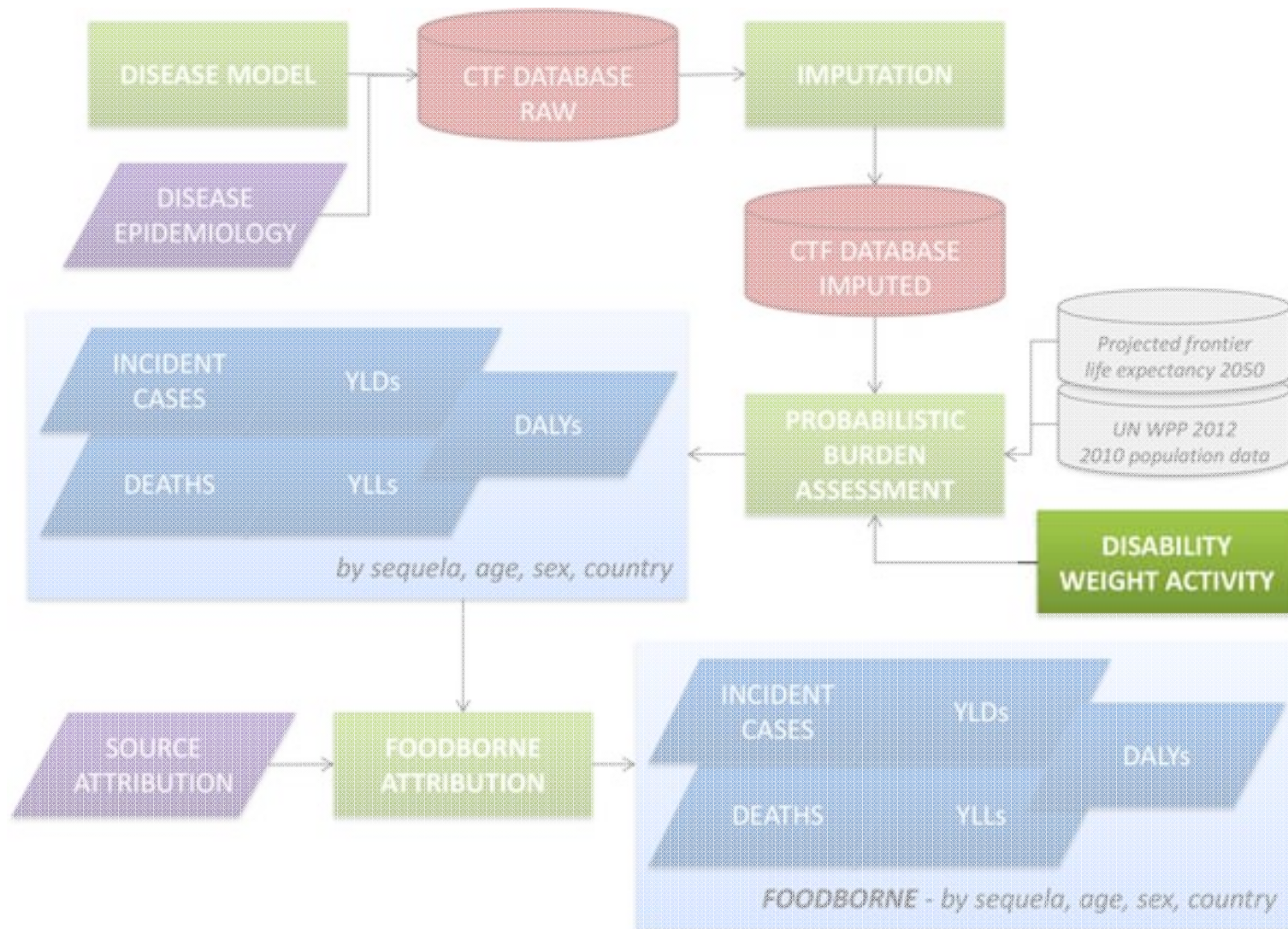


# Imputation model

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- ▶ Provide reasonable value + uncertainty range
- ▶ Bayesian random effects log-Normal regression model
- ▶ **Only when data from different subregions available**
  - ▶ If not: no imputation, no global estimates
  - ▶ *Bacillus cereus*, *Clostridium perfringens*, *Clostridium botulinum*, *Staphylococcus aureus*, and peanut allergens

# Computational Task Force Workflow



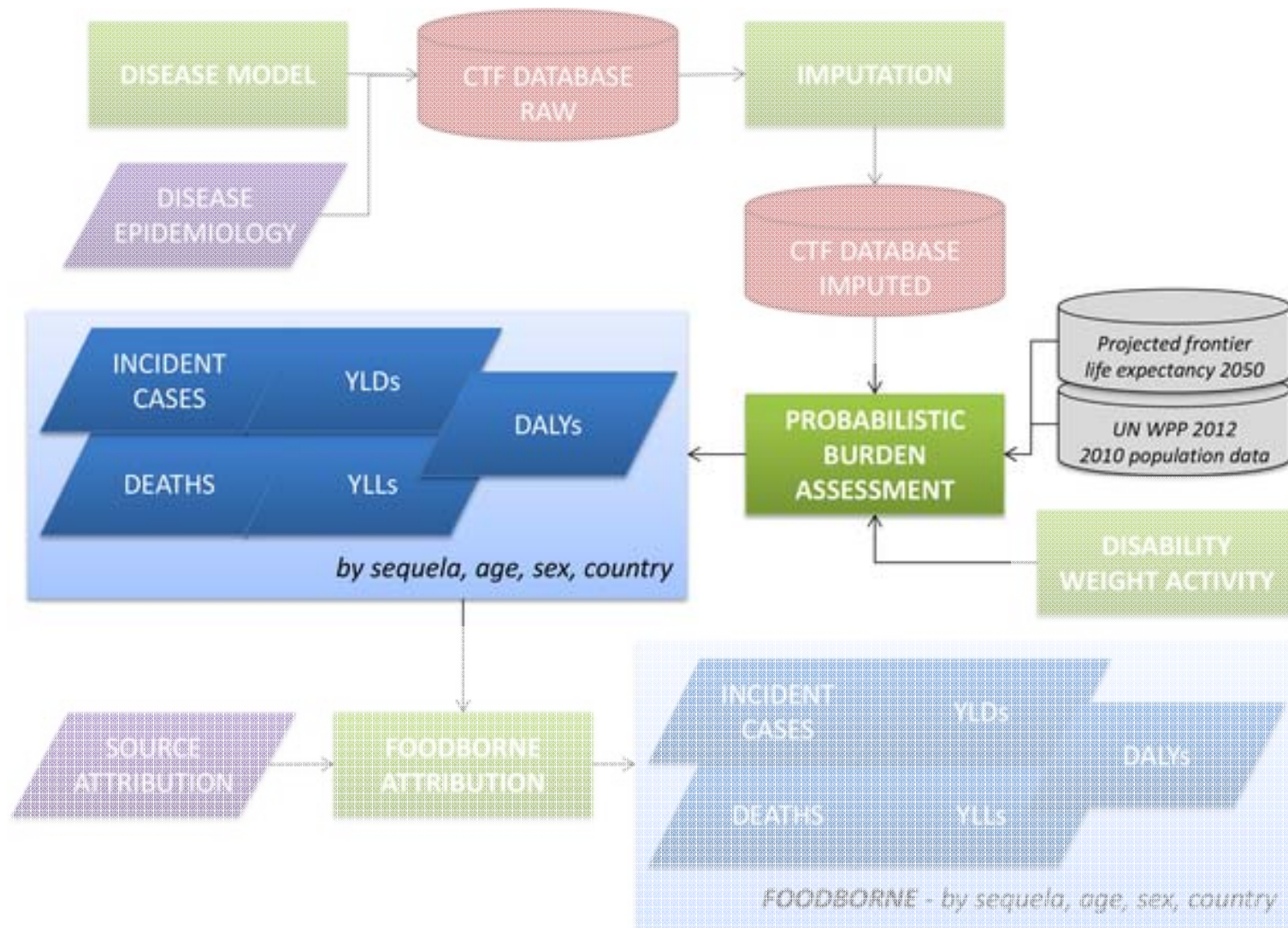


# Disability weights

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- ▶ **Severity of health states, relative reduction in health**
  - ▶ 0 = perfect health
  - ▶ 1 = death
- ▶ **Adopted from WHO Global Health Estimates**
  - ▶ Based on GBD 2010, except:
    - ▶ Primary infertility: alternative value
    - ▶ Hypothyroidy: GBD 2013
  - ▶ Direct mapping or proxy health state(s)
- ▶ **Severity levels (mild, moderate, severe)**
  - ▶ Included in disease model as distinct health states
  - ▶ Weighted average, based on epidemiological data

# Computational Task Force Workflow



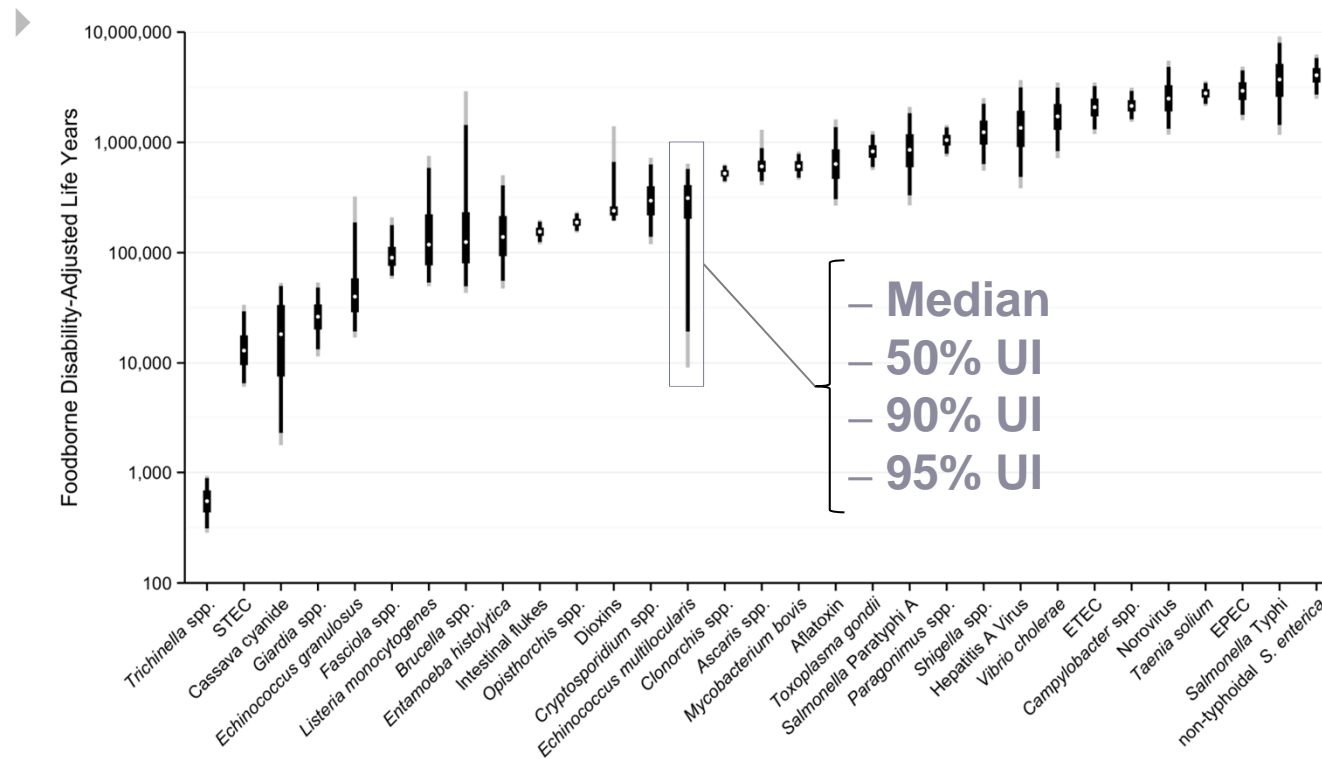
# Probabilistic burden assessment

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- ▶ Incidence, mortality, YLD, YLL, DALY rate
  - ▶ Per hazard, outcome, country, age, sex
- ▶ Absolute numbers: 2010 population sizes
- ▶ Standard life expectancy for YLLs
  - ▶ highest projected LE for 2050
  - ▶ LE at birth of 92, males and females
- ▶ No age weighting, no time discounting
- ▶ No correction for comorbidity, except
  - ▶ HIV infected invasive salmonellosis cases and deaths
  - ▶ HIV infected *M. bovis* deaths

# Probabilistic burden assessment

- ▶ **Probabilistic:** parameter + imputation uncertainty
  - ▶ 10,000 Monte Carlo simulations
  - ▶ Uncertainty distribution instead of single estimate
    - ▶ Median, 95% uncertainty interval

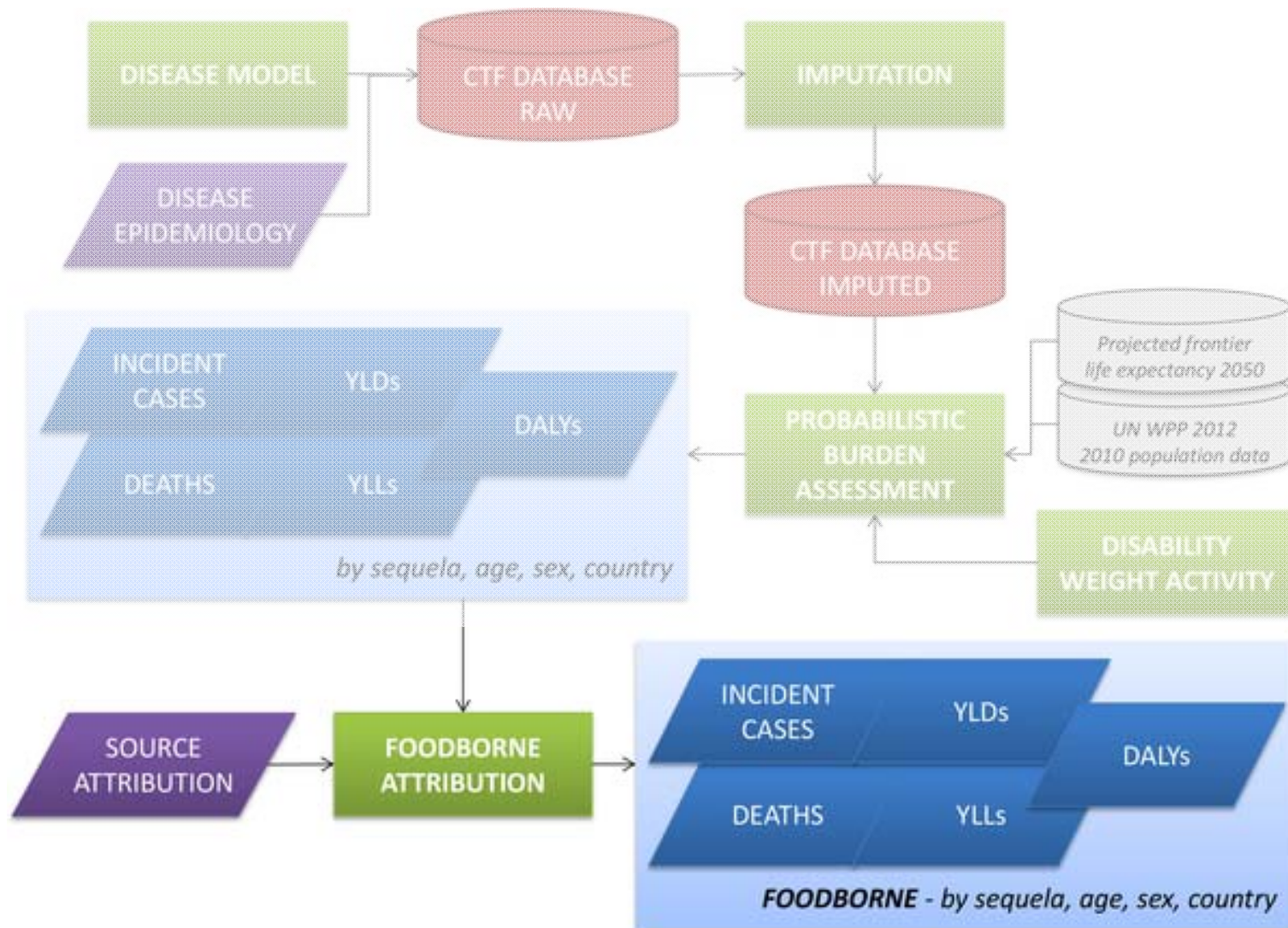


# Probabilistic burden assessment

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- ▶ *Probabilistic*: parameter uncertainty
  - ▶ 10,000 Monte Carlo simulations
  - ▶ Uncertainty distribution instead of single estimate
    - ▶ Median, 95% uncertainty interval
- ▶ **Implemented in R and JAGS**
  - ▶ All code available as 'FERG' package
  - ▶ <https://github.com/brechtdv/FERG>

# Computational Task Force Workflow

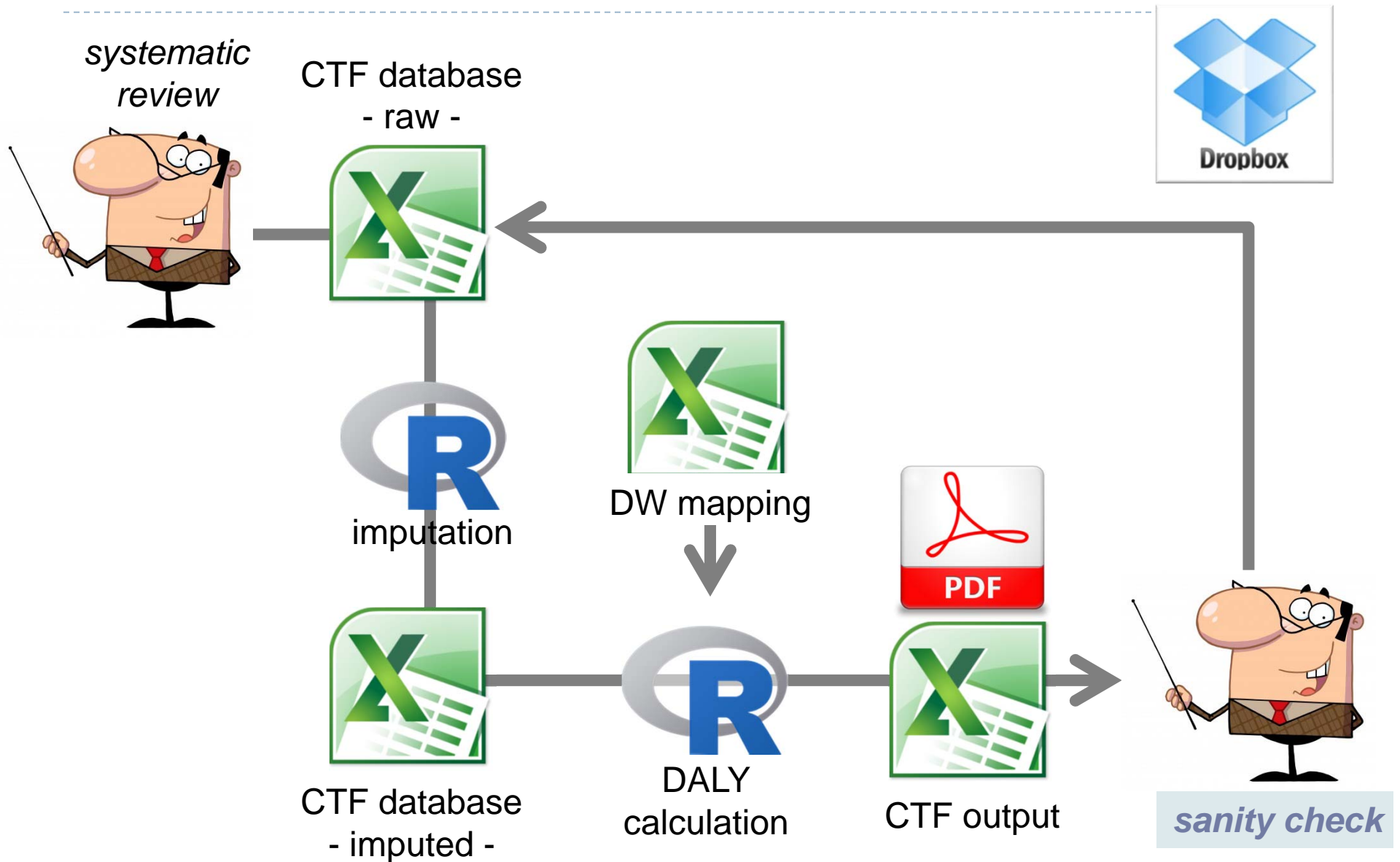


# Foodborne attribution

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- ▶ Some hazards considered 100% foodborne
  - ▶ *L. monocytogenes*, *M. bovis*, foodborne trematodes, *T. solium*, *Trichinella* spp., aflatoxin, cyanide in cassava, dioxin, peanut allergens
- ▶ Remaining hazards: structured expert elicitation
  - ▶ See next presentation
  - ▶ FB disease burden
    - = overall disease burden × proportion FB

# Traceability & transparency





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