



# Simulation Finds Antenatal Intravenous Iron Reduces Anemia Burden Related to Pregnancy and Impacts Under 5 Mortality

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The Vivarium Framework

May 2023

Sylvia Lutze

## Gender inclusive language

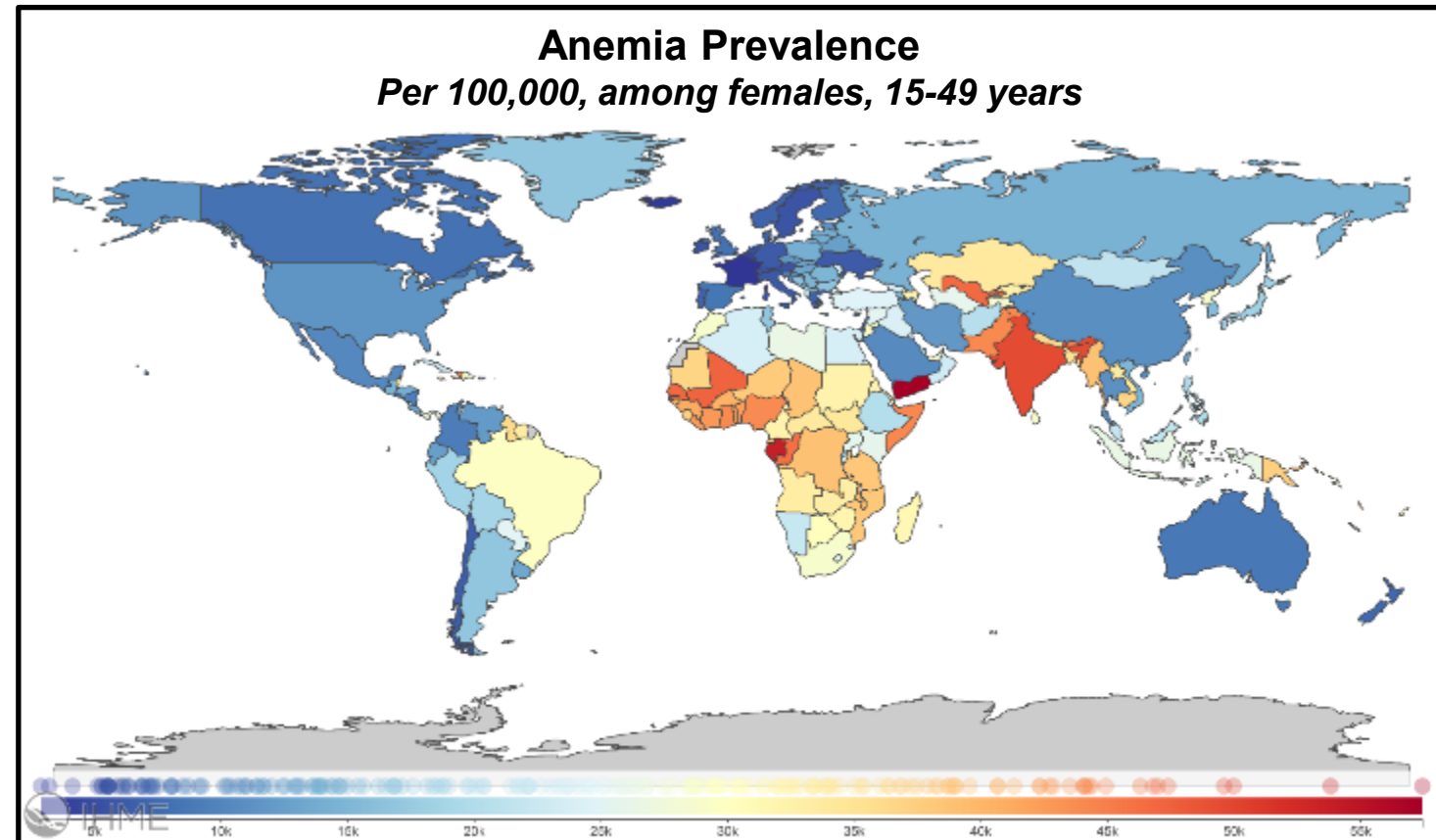
- For this presentation, we would like to start by acknowledging that not all people who can get pregnant and give birth are cis-gendered women, and our team would like to be more inclusive to all sexes and genders in our language
- The majority of the input data used includes an undifferentiated sex/gender category, which is created from a composite of studies that define sex and/or gender in a multitude of ways
- We acknowledge that creating a model based on this data leads to limitations in our analysis; however, for this talk, we will choose to use gender inclusive terms throughout the presentation
- A dictionary:
  - Maternal health → pregnancy related health
  - Maternal disorders → pregnancy related disorders
  - Maternal mortality → pregnancy related mortality
  - Women of reproductive age → women and birthing people of reproductive age
  - Pregnant and lactating women → pregnant and lactating people

# Outline

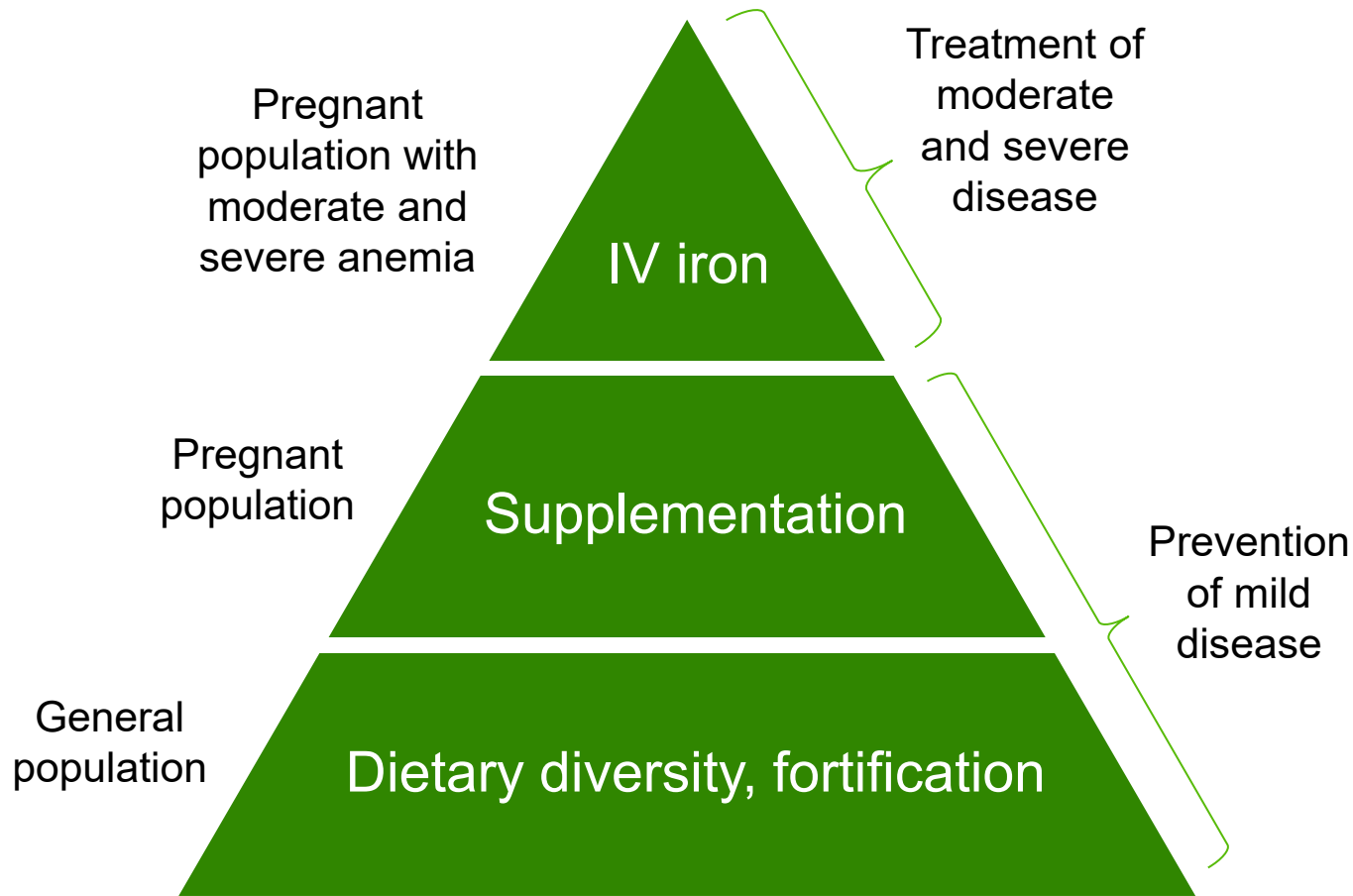
- **Introduction**
- **Overview of Simulation**
  - Vivarium Framework
  - GBD Data
  - Uncertainty Measurements
  - Parent/Child Dyads
- **Results**
  - Pregnancy Related Outcomes
  - Child Outcomes
  - Costs
- **Questions**

## Introduction

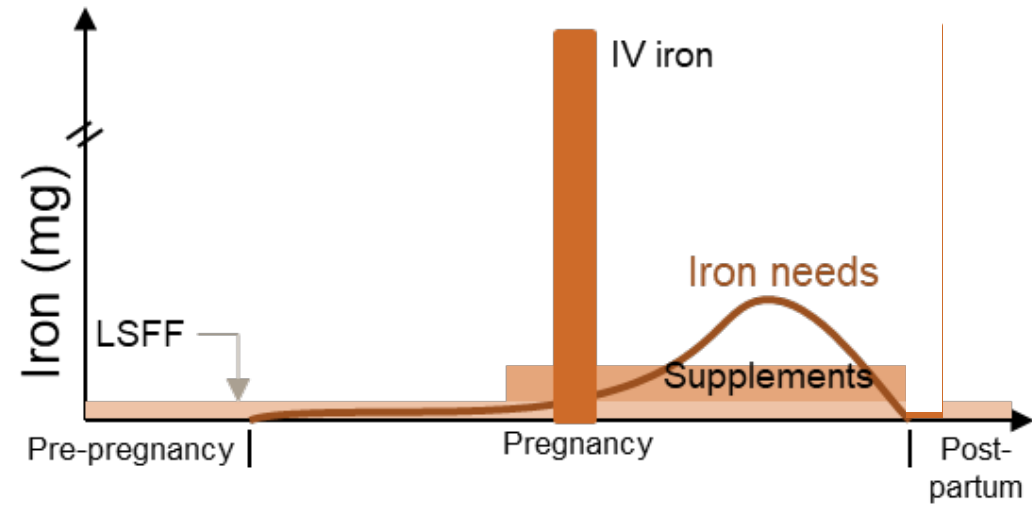
- Pregnancy related and neonatal disorders were a leading cause of DALYs, representing 15% of total population DALYs, in Sub-Saharan Africa according to GBD 2019
- Because of this, there is a lot of effort and attention on addressing unmet needs and finding effective interventions
- Trials remain costly, and results can be highly localized in nature
- Simulation studies are useful to evaluate the possible impact of interventions across regions
- Today, we will look at the impact of IV Iron on pregnancy, and neonatal health in Sub-Saharan Africa and South Asia



# Addressing anemia throughout pregnancy



## The IV iron opportunity

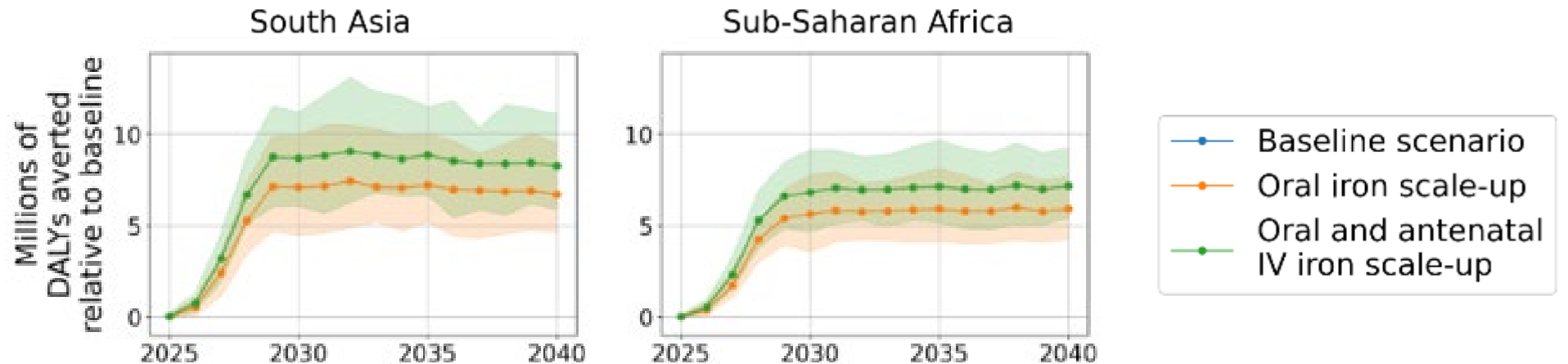


# High Level Results

## Simulated three scenarios

- Baseline
- Oral iron scale-up
- Oral iron and antenatal IV iron scale-up

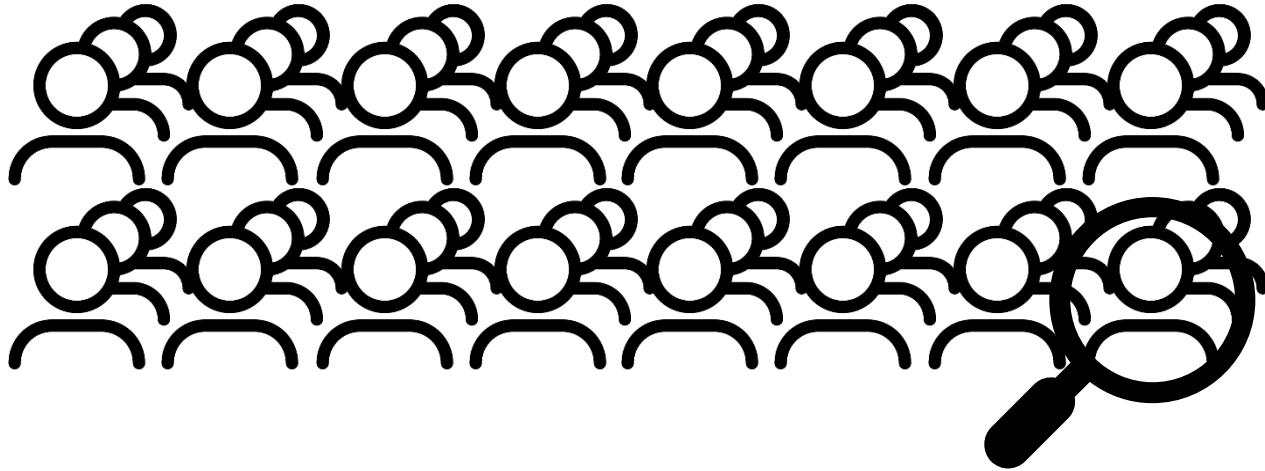
Disability adjusted life years (DALYs)  
among women and people of reproductive age and children under five



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## Microsimulation overview



At the population level, data is calibrated to match estimates from IHME's Global Burden of Disease databases or other sources

Microsimulation allows us to assign heterogeneous attributes to individual simulants, allowing more flexibility compared to a compartmental model

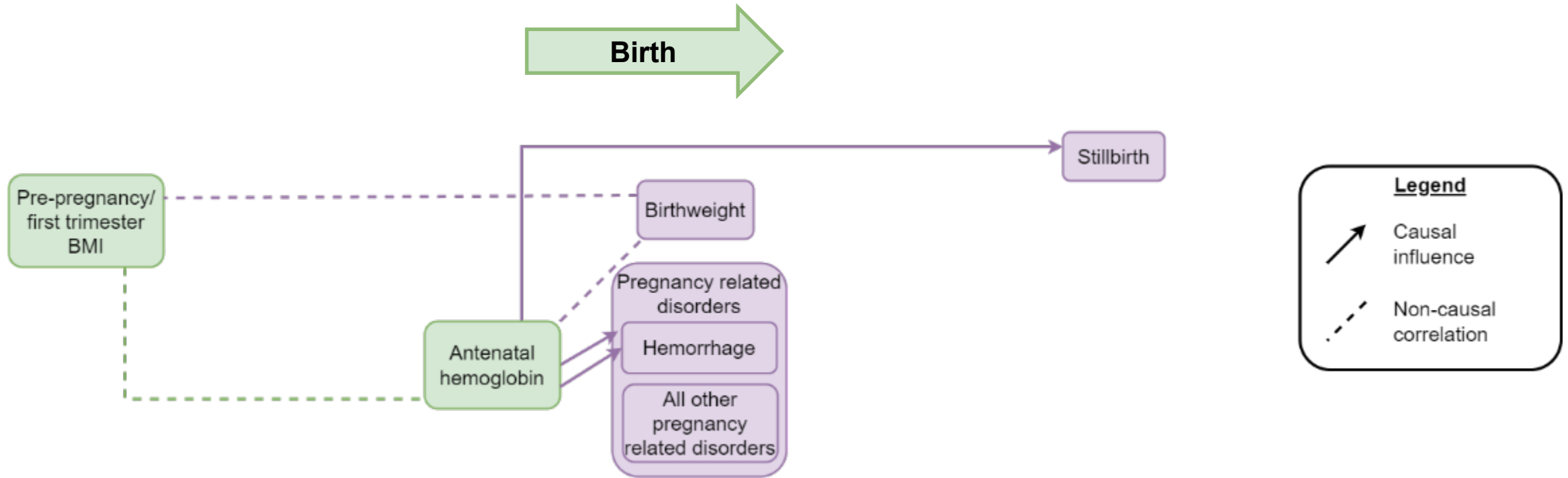
Simulants experience disease, treatment, morbidity and mortality and rates correlated with their attributes



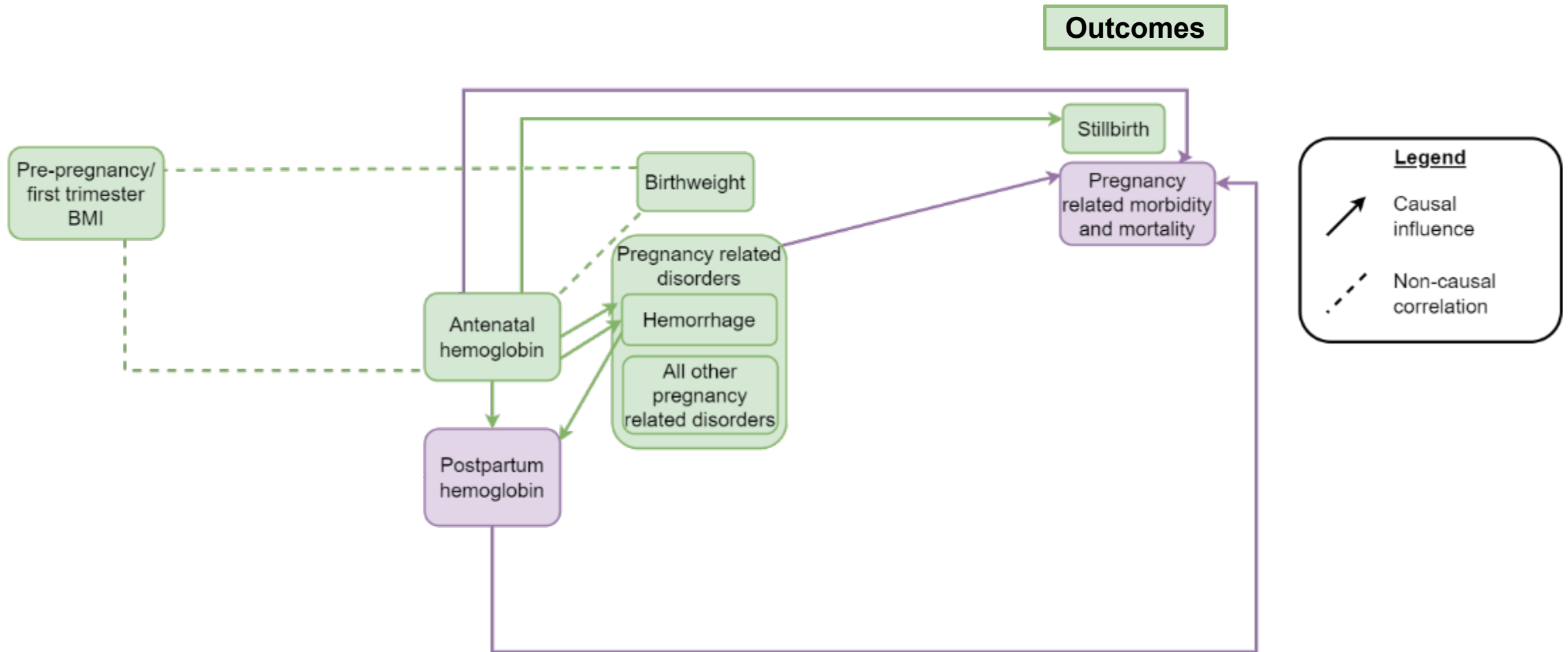
## IV iron simulation concept model diagram



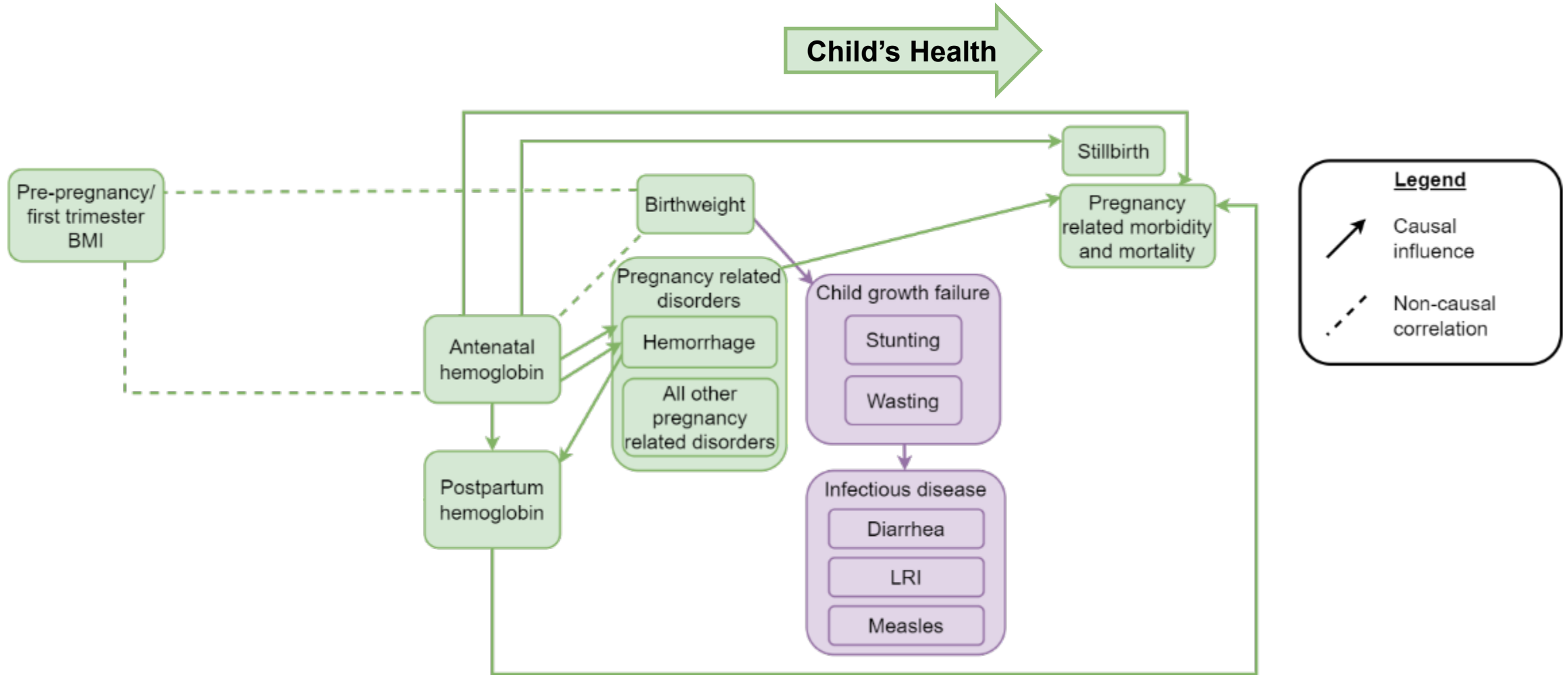
# IV iron simulation concept model diagram



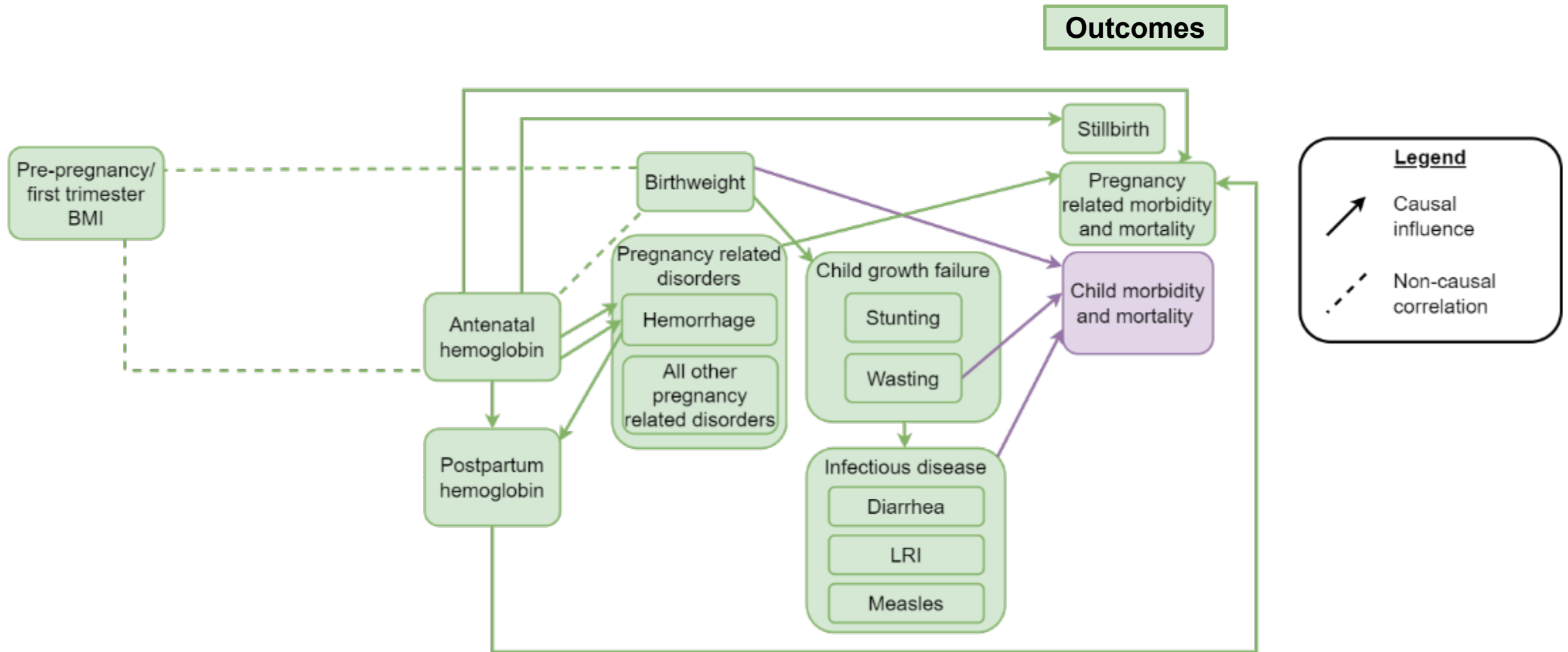
# IV iron simulation concept model diagram



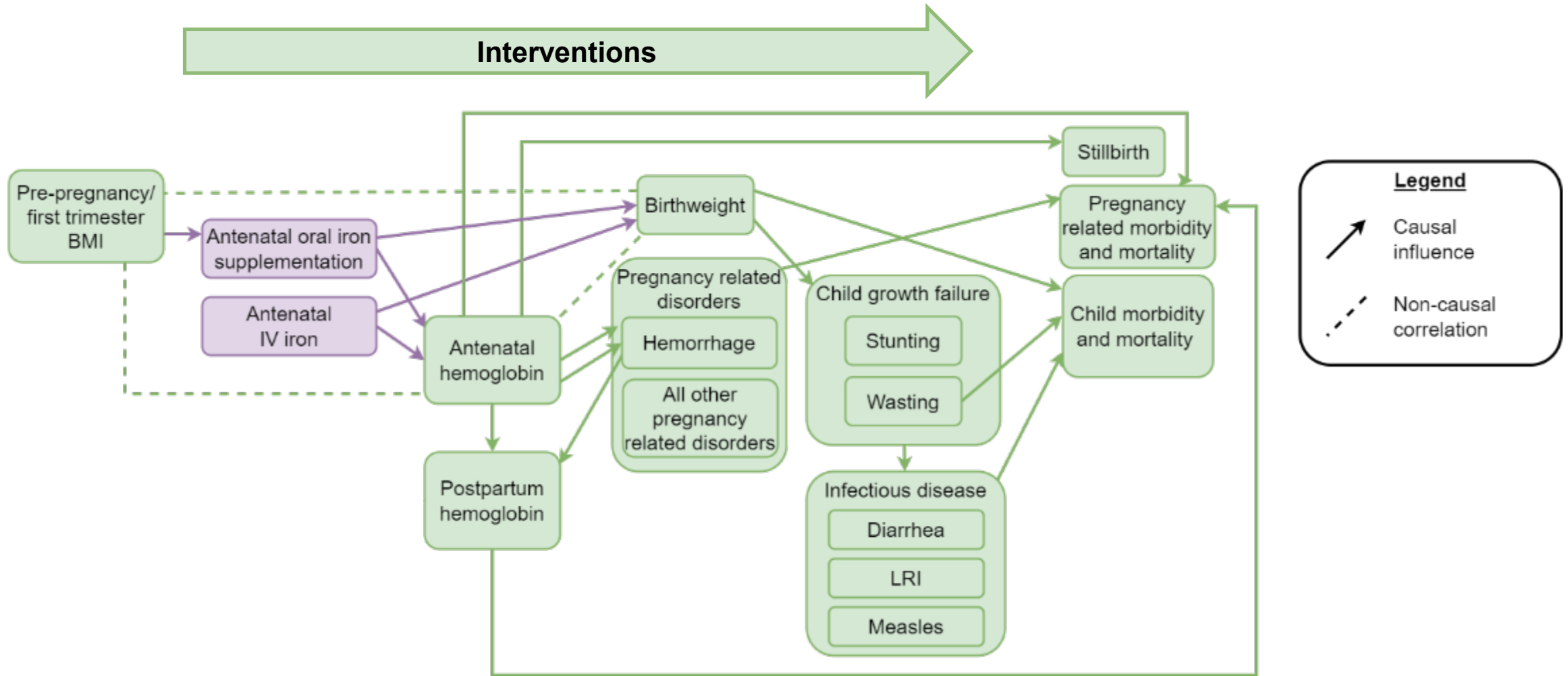
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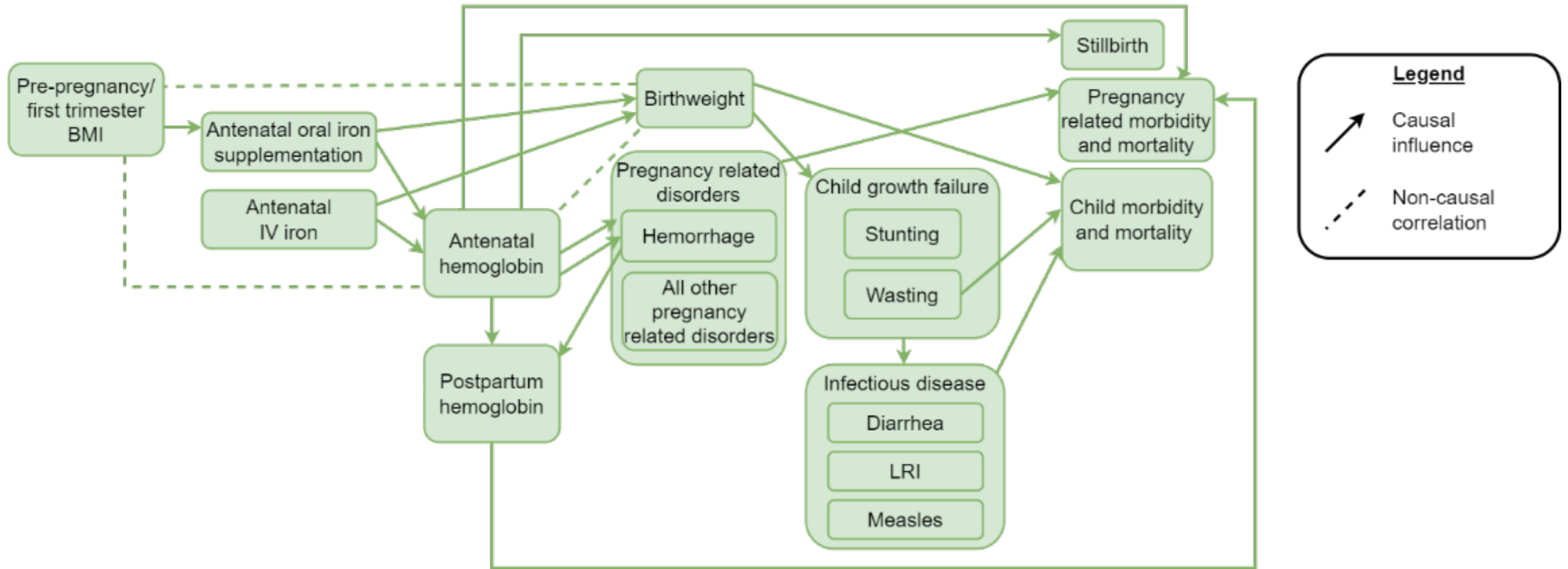
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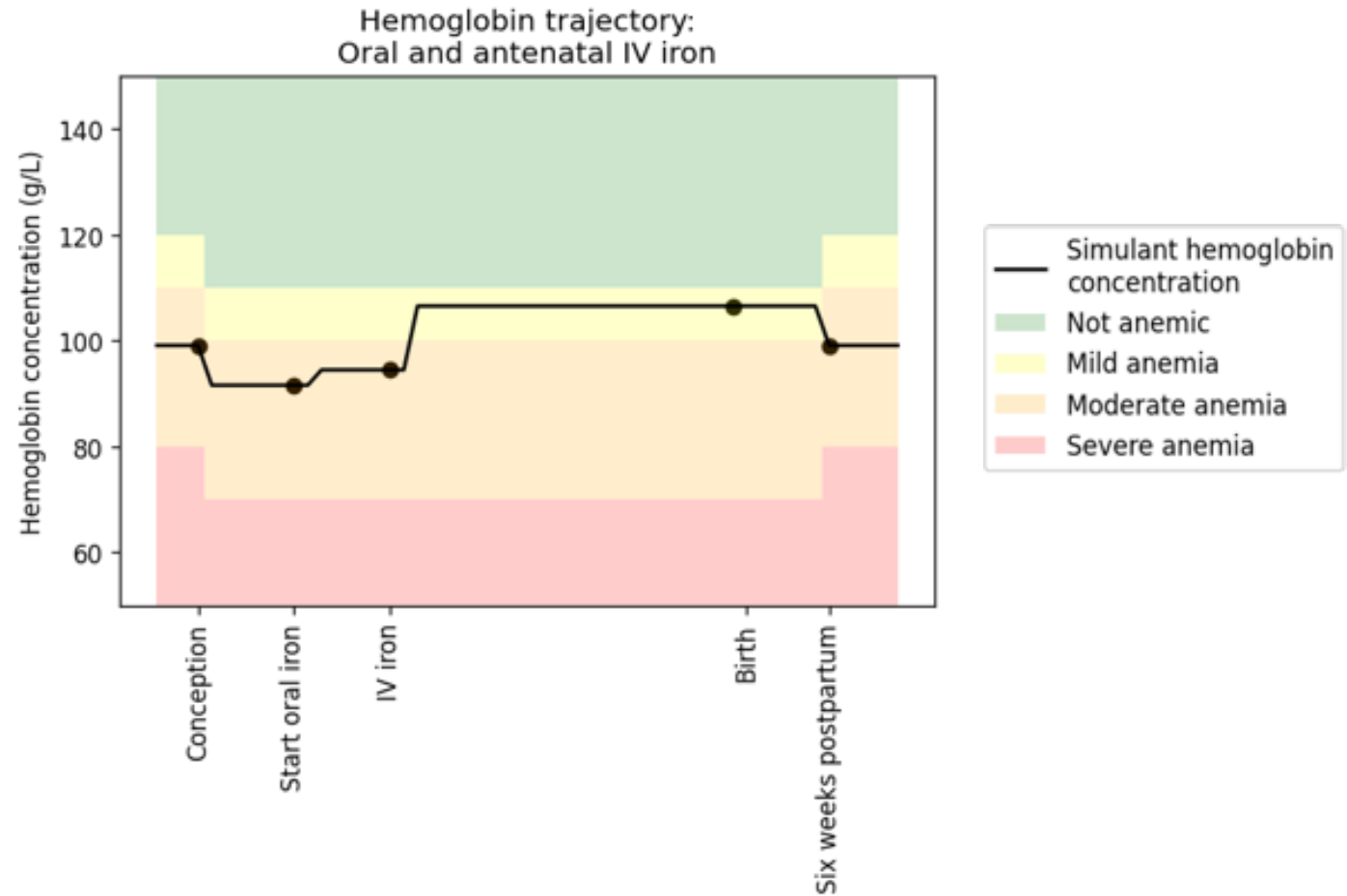
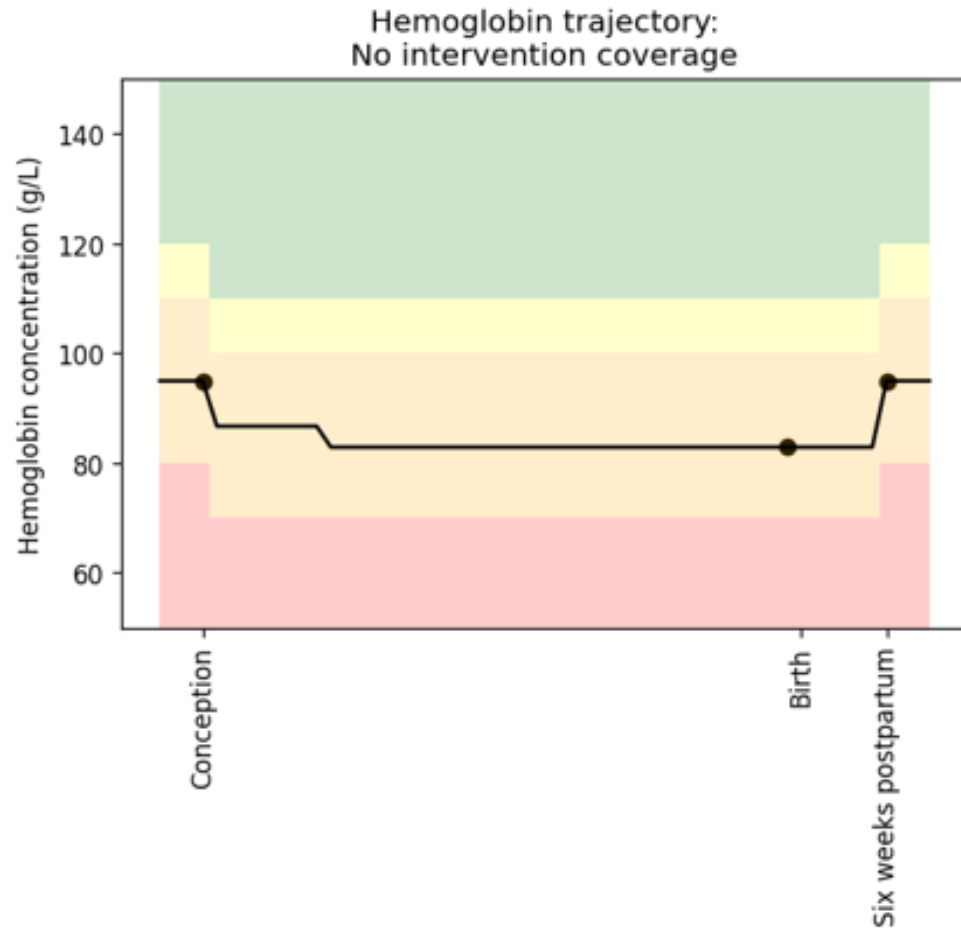
# IV iron simulation concept model diagram



# IV iron simulation concept model diagram



# Hemoglobin trajectory plot

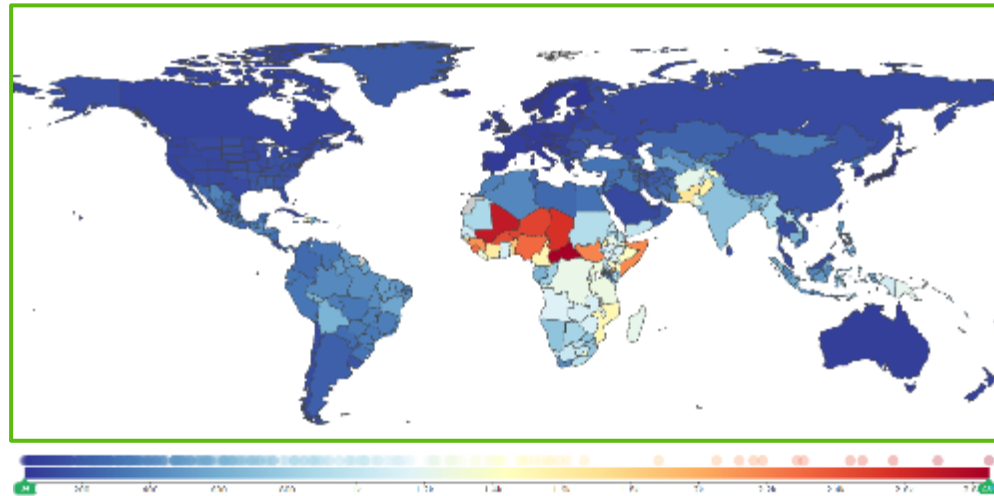




## Framing: IHME and the Global Burden of Disease Study (GBD)

- The Institute for Health Metrics and Evaluation (IHME) runs the Global Burden of Disease (GBD) collaboration, which houses the world's most comprehensive collection of data on disease risks, incidence, prevalence, morbidity, and mortality
  - Age-, sex-, year-, and location-specific estimates for 900+ locations globally

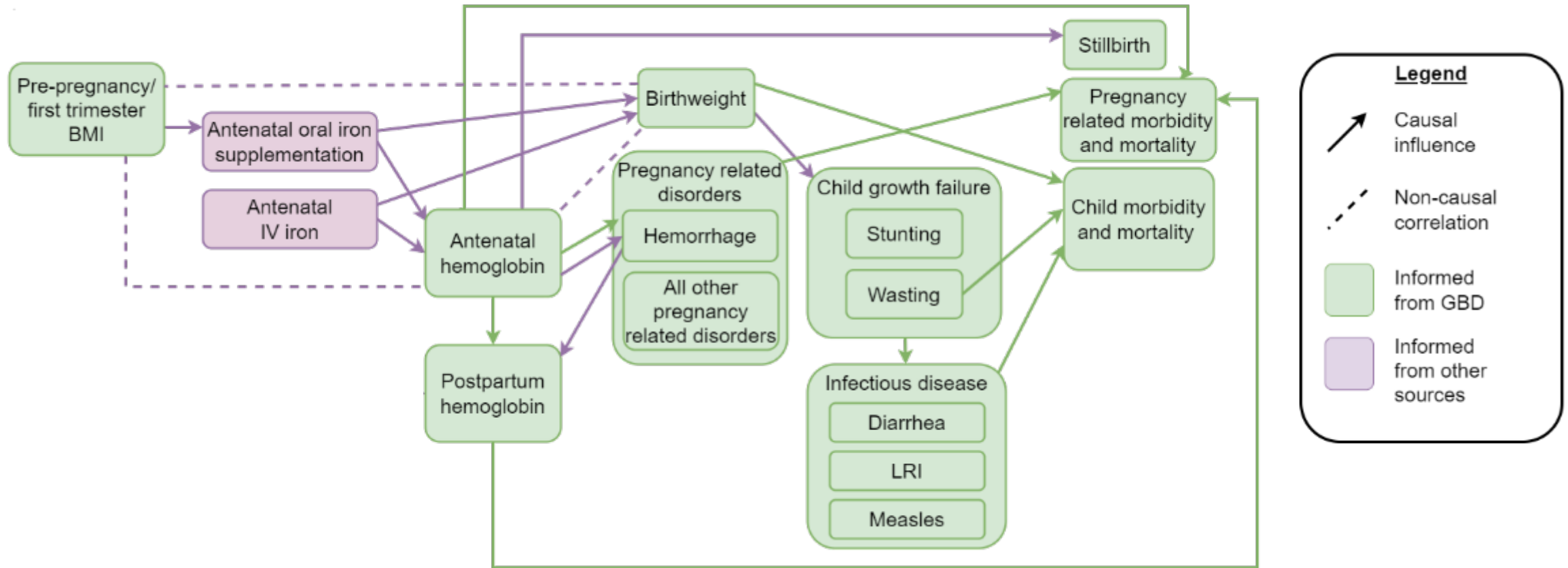
Data sourced from over 120,000 datasets covering 195 countries



Under-5 deaths per 100,000 person-years

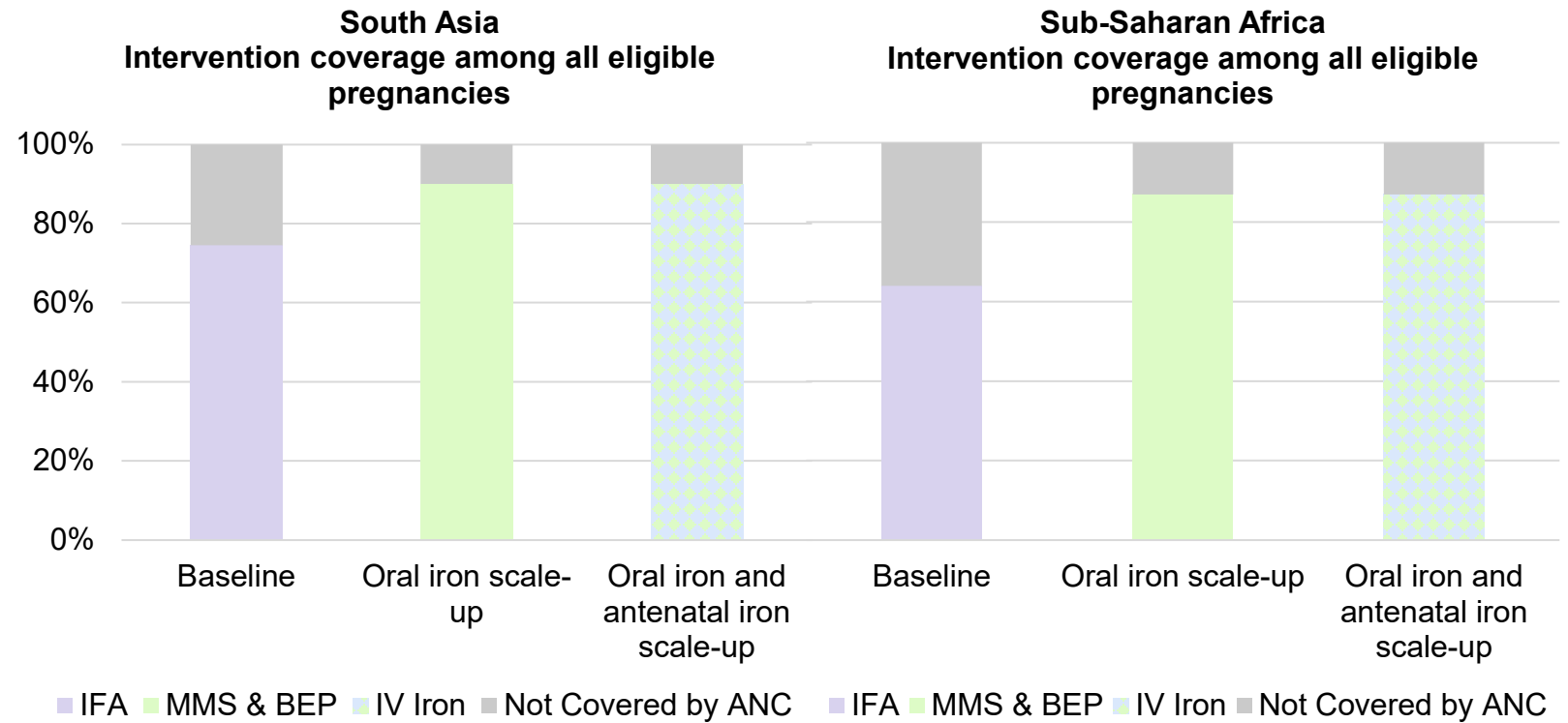


## IV iron simulation concept model diagram: Data sources



# Simulated scenarios

Scenario	Intervention	Target population
Baseline	Iron folic acid supplementation (IFA)	All pregnancies
Oral Iron Scale-Up	Multi-micronutrient supplementation (MMS)	Pre-pregnancy BMI > 18.5
	Balanced energy protein supplementation (BEP)	Pre-pregnancy BMI ≤ 18.5
Oral Iron Scale-Up and Antenatal IV Iron	Antenatal IV iron	Hemoglobin ≤ 10 g/dL in 2 <sup>nd</sup> /3 <sup>rd</sup> trimester

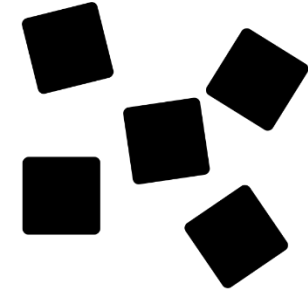
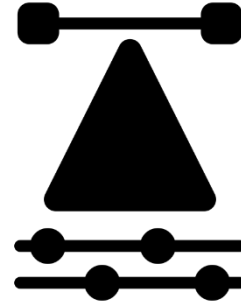


## Intervention effects

Intervention	Relative to	Birthweight mean difference in grams (95% CI)	Antenatal hemoglobin mean difference in g/L (95% CI)
IFA	No iron in pregnancy	+57.73 (7.66 to 107.79) (Peña-Rosas et al., 2015) <sup>2</sup>	+7.8 (4.08, 11.52)
MMS	IFA	+45.16 (32.31 to 58.02) Meta-analysis of 13 studies from Keats et al., 2019, <sup>3</sup> published in Young et al., 2020 <sup>1</sup>	+0
BEP	MMS	+66.96 (13.13, 120.78) (Ota et al., 2015) <sup>4</sup>	+0
Antenatal IV iron	No antenatal IV iron	+50	+23 (SD: 14), normal distribution rectified at zero

- Assume that the effect on hemoglobin occurs two weeks after administration and persist until six weeks postpartum
- Data from BMGF trials/optimistic target profiles unless otherwise stated

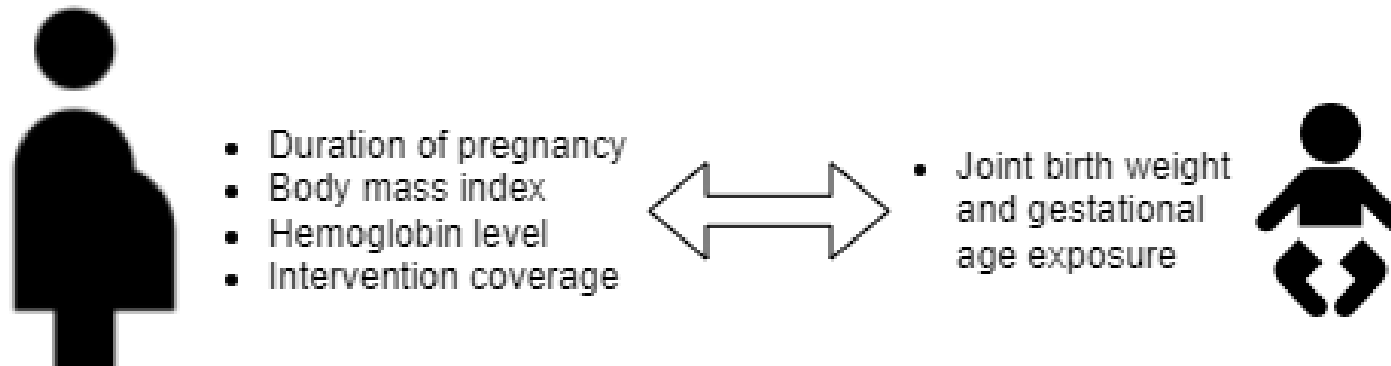
## Uncertainty Measures



	Heterogeneity	Parameter Uncertainty	Stochastic Uncertainty
Definition	Individual level heterogeneity in risk factors and outcomes, stratified by age and sex. Data is not assumed to be normally distributed but matches the distribution found in the population	Parameter values are rarely precisely known. Therefore, we include 50 draws, provided by GBD data that account for parameter uncertainty	Individual-level events provide stochastic uncertainty in the model, showing what is due to random chance and what is due to changing inputs
Model Context	Hemoglobin and BMI levels match the population but vary between simulants	The “true” anemia prevalence is unknown, so 50 different possible values were used, and results calculated with each input	If two identical simulants give birth, one might have a maternal disorder and the other might not due to random chance

## Simulated parent-child dyads

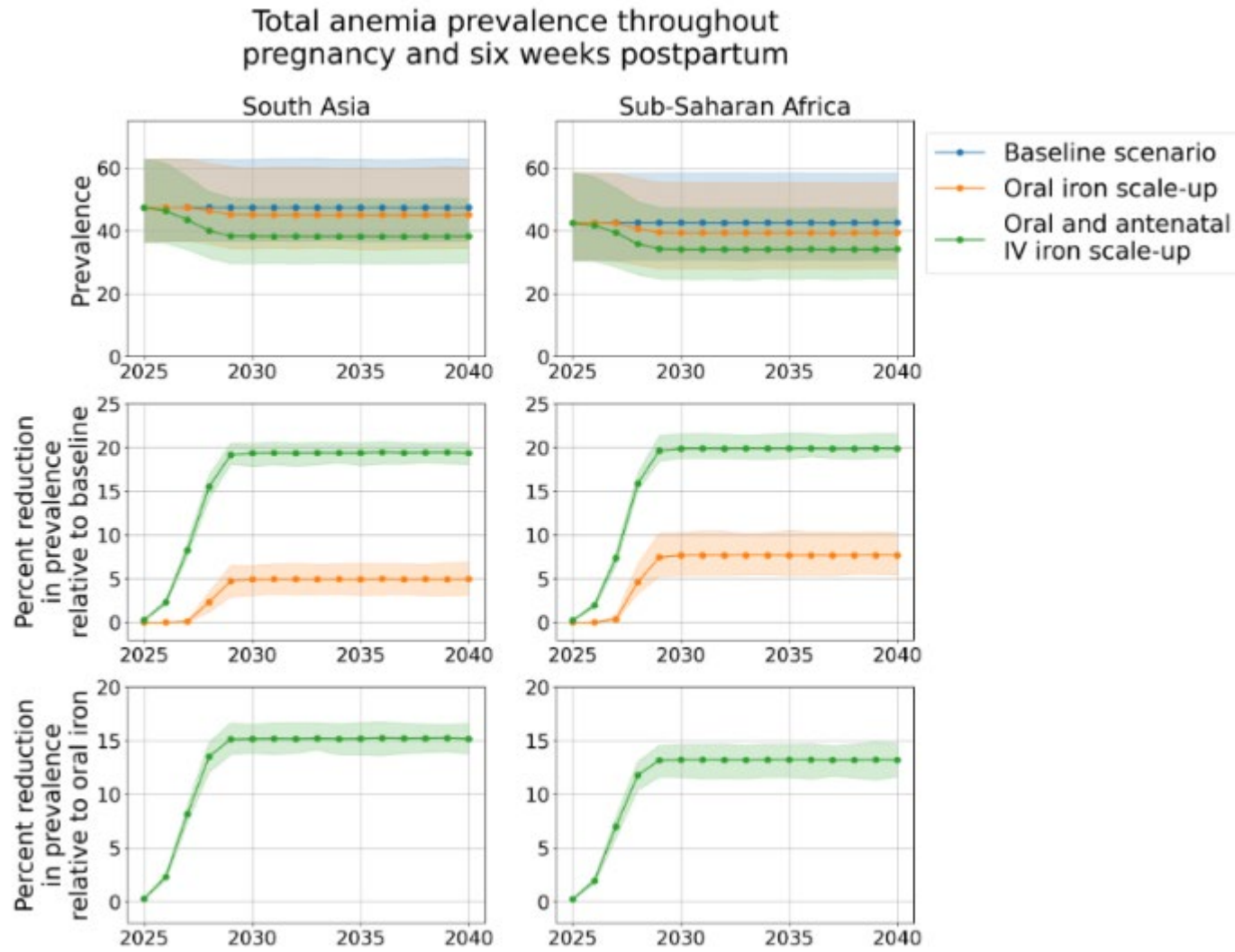
- Pregnancy model among women and people of reproductive age
  - Utilizes GBD estimates of ectopic pregnancies, abortion/miscarriage, stillbirths, and live births
  - Current model utilizes crude age-specific pregnancy rates
    - Assumes new pregnancy cannot occur within six weeks of birth
- Live births among WPRA comprise child population
  - Pregnancy duration consistent with infant gestational age (and corresponding birthweight) from the joint low birthweight and short gestation (LBWSG) risk exposure from GBD
  - Pregnancy characteristics inform infant risk exposure



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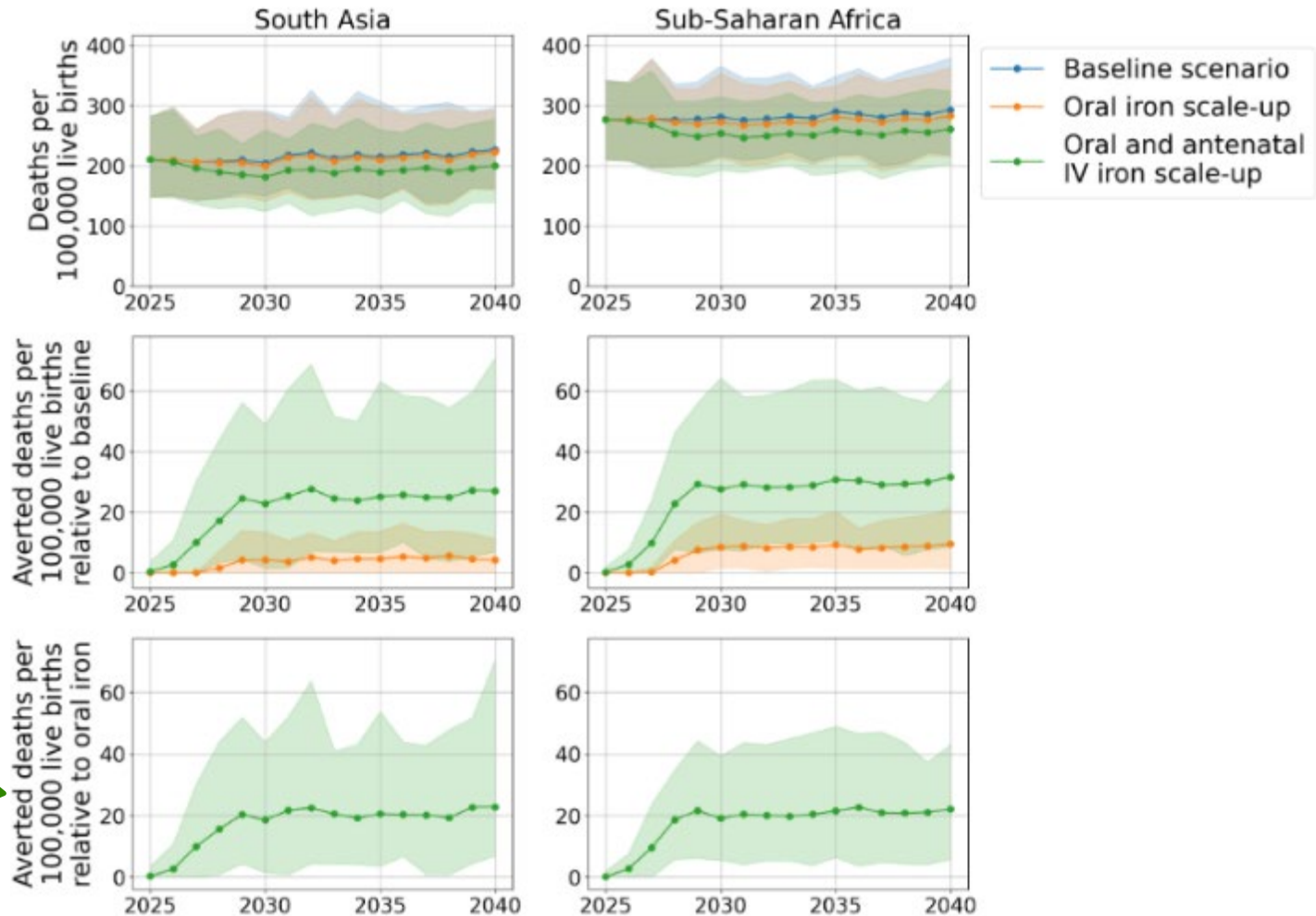
# Antenatal IV iron interventions may reduce total anemia prevalence throughout pregnancy and six weeks postpartum by approximately 13 to 15 percent of what it would be with a scale-up of oral iron interventions





# Antenatal IV iron scale-up in addition to a scale-up of oral iron may avert approximately 20 additional pregnancy related deaths per 100,000 live births

Pregnancy related mortality rate  
(pregnancy-related deaths per 100,000 live births)

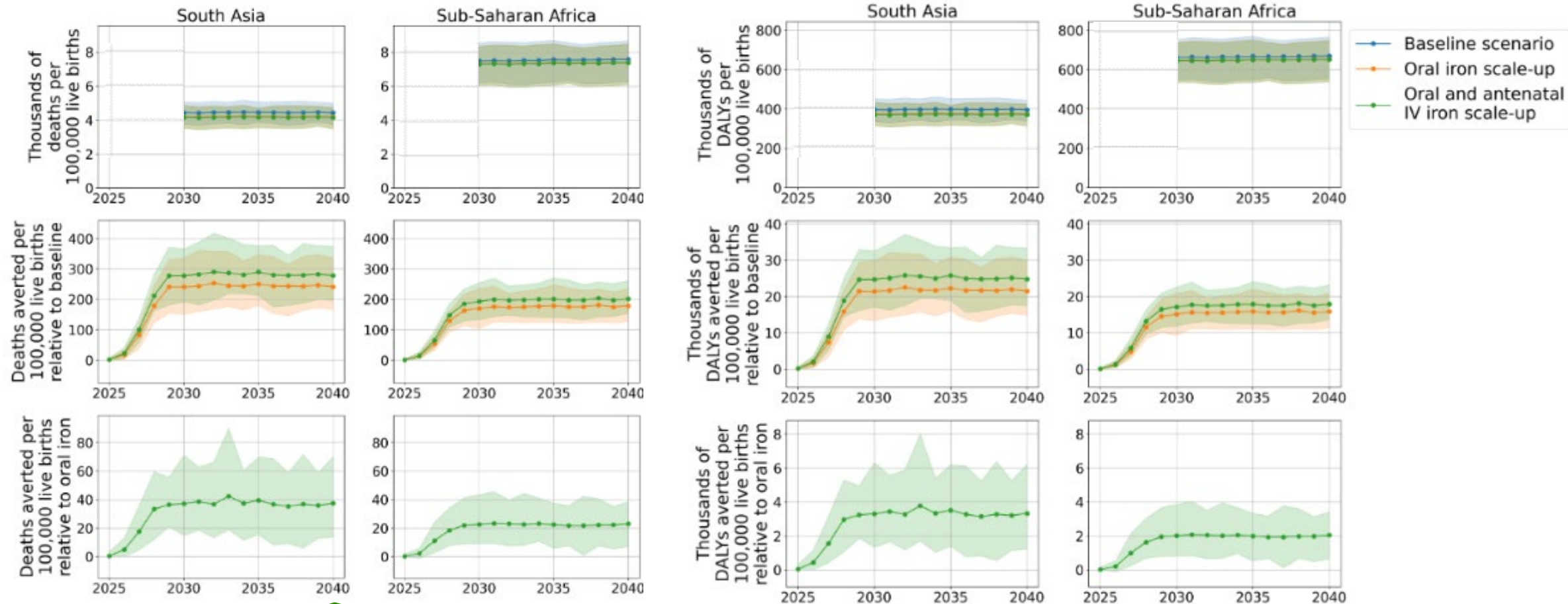


This is approximately 8.3k total deaths averted in South Asia and 11.3k in Sub-Sharan Africa

# Intervention impacts on morbidity and mortality among children under five (neonates)

Under five mortality per 100,000 live births

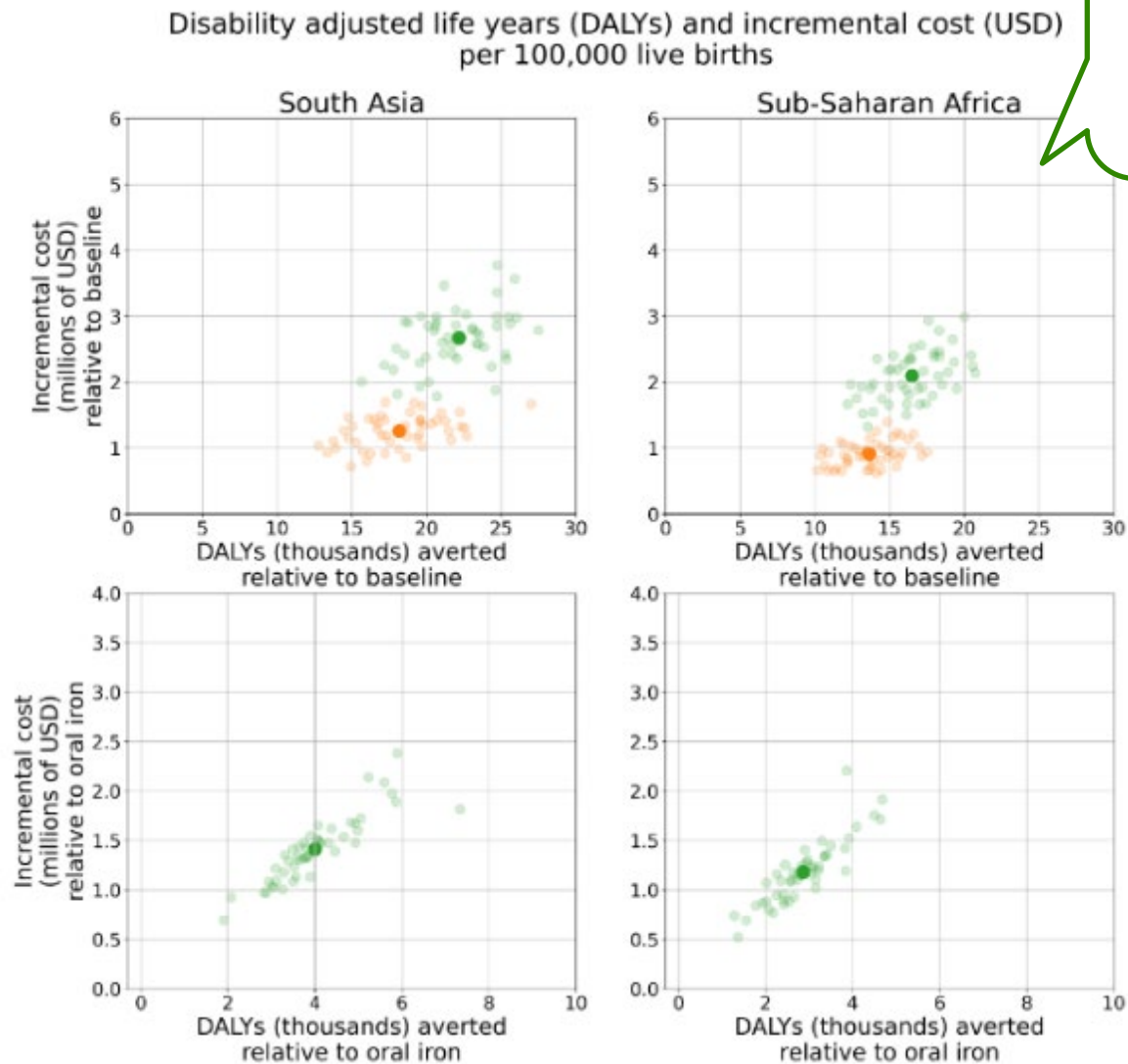
Disability adjusted life years (DALYs) among children under five per 100,000 live births



This is approximately 85k total deaths averted in South Asia and 71k in Sub-Sharan Africa

## Estimates of incremental costs were calculated based on product cost estimates

Scenario Added	Intervention	Product Cost
Baseline Only	IFA	\$0.91
Oral Iron Scale-Up	MMS	\$2.98
	BEP	\$60
Oral Iron Scale-Up and Antenatal IV Iron	Antenatal IV iron	\$87.90



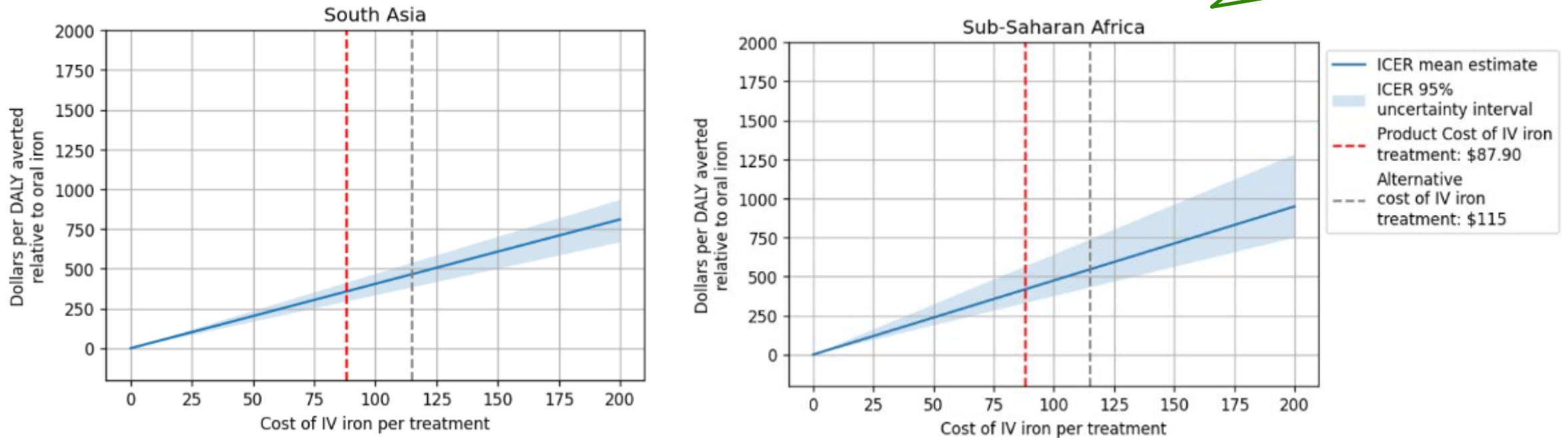
The incremental cost is \$120 relative to baseline and \$353 relative to oral iron in South Asia and \$129 and \$408 in Sub-Saharan Africa

- Oral iron scale-up
- Oral and antenatal IV iron scale-up

## Sensitivity analysis: Antenatal IV iron incremental cost effectiveness ratio relative to oral iron is sensitive to the cost of IV iron treatment

The GDP per capita in 2021 was \$1,626 in Sub-Saharan Africa and \$2,150 in South Asia

Incremental cost effectiveness ratio of antenatal IV iron scale-up relative to oral iron by cost of IV iron treatment



Sensitivity analysis cost estimate of 117.90 USD from:

- \$87.90 product cost from Jose et al. (2019) FCM trial in India
- \$30 IV administration cost from Mosegui et al. (2019) CEA of oral versus IV dehydration treatment in Brazil

## Future directions for results

- Our model is also able to include postpartum intravenous iron, which when tested showed limited impact over antenatal only
- In addition to modeled effects on child outcomes, we hope to include the impact of orphanhood and breastfeeding/chest feeding, further allowing pregnancy related outcomes to impact children
- We would like to further improve our costing model to include additional detail such as: supply chain costs, administration costs and transition or changeover costs



## Acknowledgements

We would like to thank everyone who made this work possible:

- Past and present members of the Simulation Science Team including Abraham Flaxman, Ali Bowman, Alix Pletcher, Rajan Mudambi, Matt Kappel, Jim Albright, Hussain Jafari, James Collins, Nathaniel Blair-Stahn, Paulina Lindstedt, Caroline Kinuthia, Nicole Young, and Kjell Swedin
- All GBD modelers at IHME for their work on the GBD study that makes our work possible with the use of their data. Most especially the neonatal and child health and maternal health teams.
- Our partners at the Bill and Melinda Gates Foundation for their support including Laura Lamberti, Kate Fay, and Sun-Eun Lee

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**Thank you!**

**Questions?**



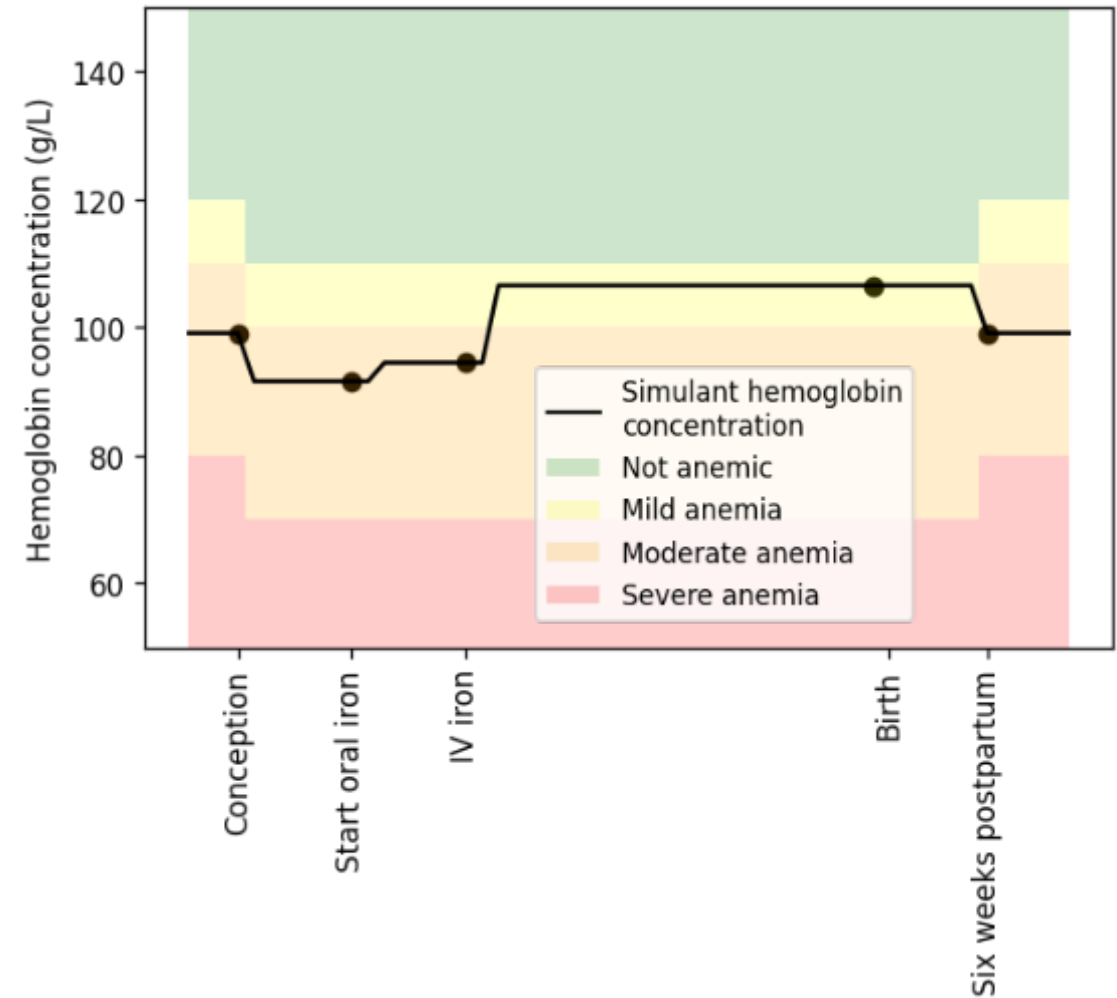


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- **Appendix**

## Simulant hemoglobin trajectories throughout pregnancy

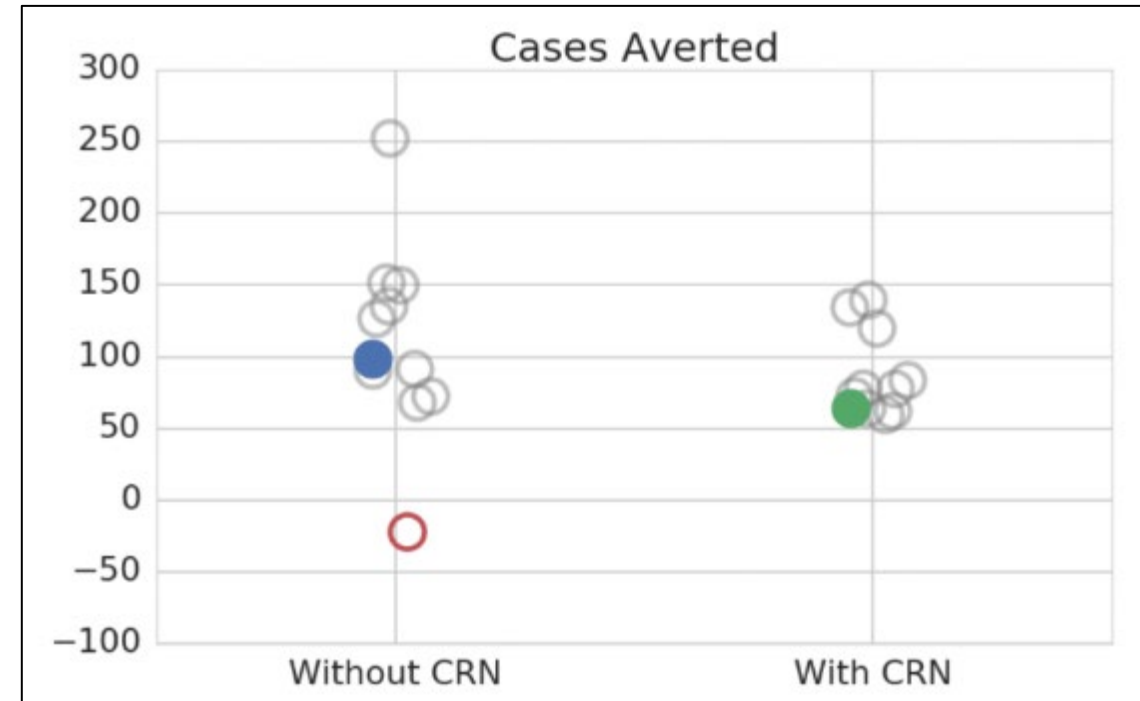
Population	Mild anemia hemoglobin threshold (g/L)	Moderate anemia hemoglobin threshold (g/L)	Severe anemia hemoglobin threshold (g/L)
Women 15 – 49, not pregnant	120 – 110	110 – 80	<80
Women 15 – 49, pregnant	110 – 100	100 - 70	<70



Anemia severity	Disability Weight
Mild	0.004
Moderate	0.052
Severe	0.149

## Common random numbers

- We utilize common random numbers to avoid over-estimating the impact of uncertainty
- This creates a population in each baseline and alternative scenario with the same:
  - Heterogeneous population
  - Starting parameter values
  - Random chance of experiencing events
- Uncertainty is still included in the simulation, but is not incorrectly increased by being included between scenarios



## Examples of previous projects

- Dynamic transition model of child wasting (in progress)
  - Used to investigate moderate and severe acute malnutrition case loads under various combinations of coverage scale-ups for:
    - Community management of acute malnutrition intervention for severe, moderate, or both
    - Small quantity lipid-based nutrient supplementation, targeted or universal
- Cost-effectiveness of antenatal multiple micronutrients (MMS) and balanced energy protein (BEP) supplementation compared to iron and folic acid (IFA) supplementation<sup>1</sup>
  - Assessed impact and costs of various scale-up strategies, including targeted and universal BEP supplementation, among children under two years of age
  - Found that MMS + BEP targeted to those with BMI < 18.5 is similarly cost effective to universal MMS

**PLOS MEDICINE**

RESEARCH ARTICLE

### Cost-effectiveness of antenatal multiple micronutrients and balanced energy protein supplementation compared to iron and folic acid supplementation in India, Pakistan, Mali, and Tanzania: A dynamic microsimulation study

Nicole Young<sup>1\*</sup>, Alison Bowman<sup>2</sup>, Kjell Swedin<sup>3</sup>, James Collins<sup>4</sup>, Nathaniel D. Bier-Bahng<sup>5</sup>, Paulina A. Lindsooth<sup>6</sup>, Christopher Troeger<sup>7</sup>, Abraham D. Flaxman<sup>8</sup>

<sup>1</sup>Institute for Health Metrics and Evaluation, Seattle, Washington, United States of America, <sup>2</sup>[n.young@puh.washington.edu](mailto:n.young@puh.washington.edu)



**Open Access**

**Abstract**

**Background**

Malnutrition among women of childbearing age is especially prevalent in Asia and sub-Saharan Africa and can be harmful to the fetus during pregnancy. In the most recently available Demographic and Health Survey (DHS), approximately 10% to 20% of pregnant women in India, Pakistan, Mali, and Tanzania were undernourished (body mass index [BMI] < 18.5 kg/m<sup>2</sup>), and according to the Global Burden of Disease (GBD) 2017 study, approximately 20% of babies were born with low birth weight (LBW) (< 2,500 g) in India, Pakistan, and Mali and 8% in Tanzania. Supplementing pregnant women with micro and macronutrients during the antenatal period can improve birth outcomes. Recently, the World Health Organization (WHO) recommended antenatal multiple micronutrient supplementation (MMS) that includes iron and folic acid (IFA) in the context of rigorous research. Additionally, WHO recommends balanced energy protein (BEP) for undernourished populations. However, few studies have compared the cost-effectiveness of IFA, BEP, or MMS supplementation regimens. We compared the cost-effectiveness of MMS and BEP with IFA to quantify their benefits in 4 countries with considerable prevalence of maternal undernutrition.

**Methods and findings**

Using nationally representative estimates from the 2017 GBD study, we conducted an individual-based dynamic microsimulation of population outcomes from birth to 2 years of age in India, Pakistan, Mali, and Tanzania. We modeled the effect of maternal nutritional supplementation on infant birth weight, stunting and wasting using effect sizes from Cochrane systematic reviews and published literature. We used a per-capita, per-pregnancy, combined cost of supplementation per pregnancy from the published literature. We compared direct, direct-

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Data Availability Statement: Cost and efficacy estimates for the dynamic microsimulation of population outcomes from birth to 2 years of age in India, Pakistan, Mali, and Tanzania are available from the [DOI:10.1371/journal.pmed.1005409.g001](https://doi.org/10.1371/journal.pmed.1005409.g001).

Funding: The Bill and Melinda Gates Foundation (BMGF) supported this work as a part of a research program to improve health and nutrition in low-income countries. The authors received no specific funding for this work.

PLOS ONE | <https://doi.org/10.1371/journal.pmed.1005409> February 22, 2022

## Intravenous Iron Microsimulation Research Question

### Simulation research question

Key outcomes:	Impact on disability adjusted life years (DALYs)
Intervention:	Scaled-up coverage of antenatal and postpartum IV iron interventions
Comparator:	Scaled-up coverage MMS and targeted BEP from baseline IFA
Population:	Women aged 15-49 and children under five years of age
Locations:	South Asia and Sub-Saharan Africa (India, Nigeria, and Ethiopia to come)
Timeframe:	2025 to 2040
Key assumptions:	<ul style="list-style-type: none"><li>• BMGF “optimistic target product profiles” for IV iron interventions</li><li>• Reach 100% coverage of eligible population at point of care by 2029</li></ul>

## Intervention impact on child growth failure

- Lack of literature evidence on intervention impact on child wasting and stunting
  - Lack of follow-up beyond birth outcomes
  - Small effects require large sample sizes
- Literature evidence on *causal* impact of birthweight improvement on child wasting and stunting exposure
  - McGovern 2018: study of twins and sibling pairs using DHS data
    - The marginal effect of a 200g increase in birthweight is associated with a 1.1-1.2 percentage point decrease in the probability of wasting and a 2.0 (SD: 0.6) to 2.3 (SD: 0.5) percentage point decrease in the probability of stunting among children under five
- Interventions impact on CGF entirely mediated through effect on birthweight

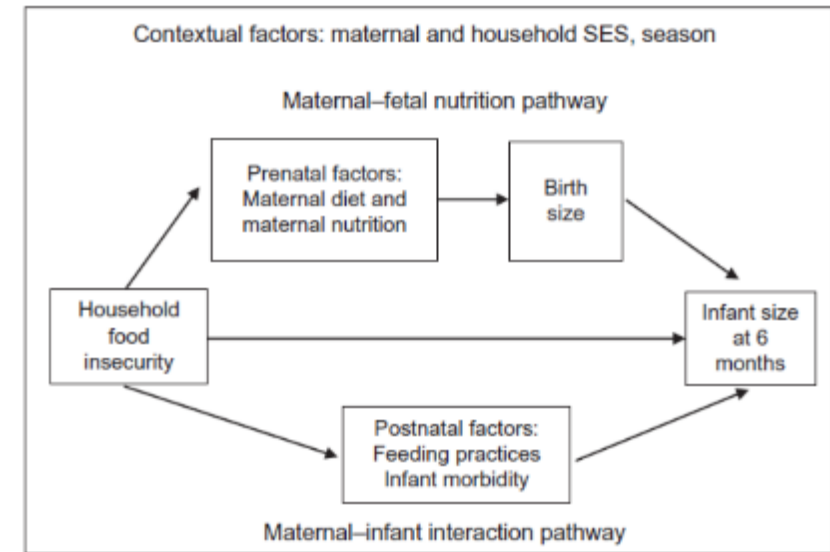


Figure from Na et al. 2020

McGovern M. E. (2019). How much does birth weight matter for child health in developing countries? Estimates from siblings and twins. *Health economics*, 28(1), 3–22.

Na, M., Shamim, A. A., Mehra, S., Labrique, A., Ali, H., Wu, L. S., Shaikh, S., Klemm, R., Christian, P., & West, K. P. (2020). Maternal nutritional status mediates the linkage between household food insecurity and mid-infancy size in rural Bangladesh. *The British journal of nutrition*, 123(12), 1415–1425.

## Impact of CGF pathway varies by location and age group

- Pathway through CGF represents a greater portion of DALYs averted in Sub-Saharan Africa than South Asia
  - Expected due to differences in regional epidemiology
    - On average, lower birthweight in South Asia than Sub-Saharan Africa
    - On average, greater CGF exposure and affected cause burden in Sub-Saharan Africa than South Asia
- Pathway through CGF has greater impact among post-neonates (1 month to 1 year) than children 1 to 4 years of age
  - Expected due to CGF-associated burden in the younger age group
  - Note that we did not model age-specific associations between birthweight and CGF exposures, which would be expected to exaggerate this finding further

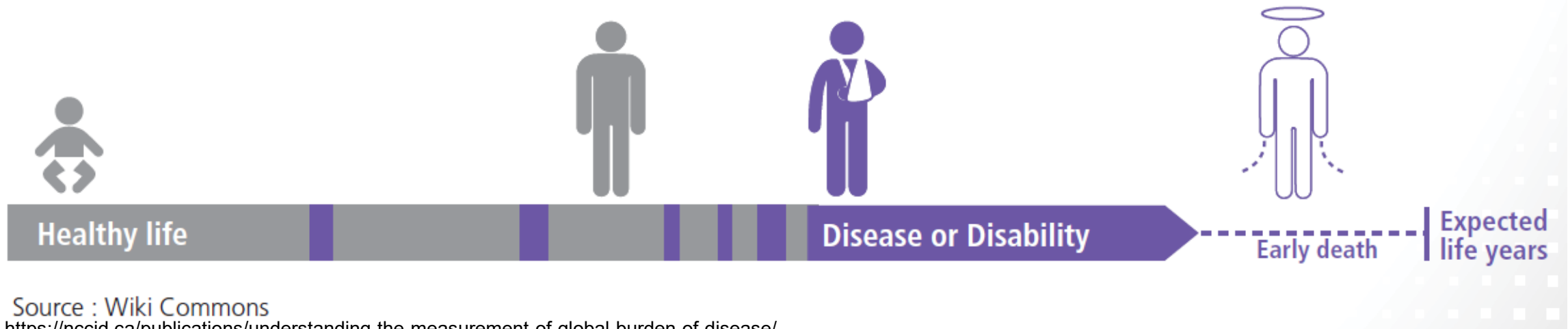
# Disability adjusted life years, reviewed

## DALY

Disability Adjusted Life Years measure the overall burden of disease, expressed as the cumulative number of years lost due to ill-health, disability or early death.

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

Years Lived with Disability + Years Life Lost

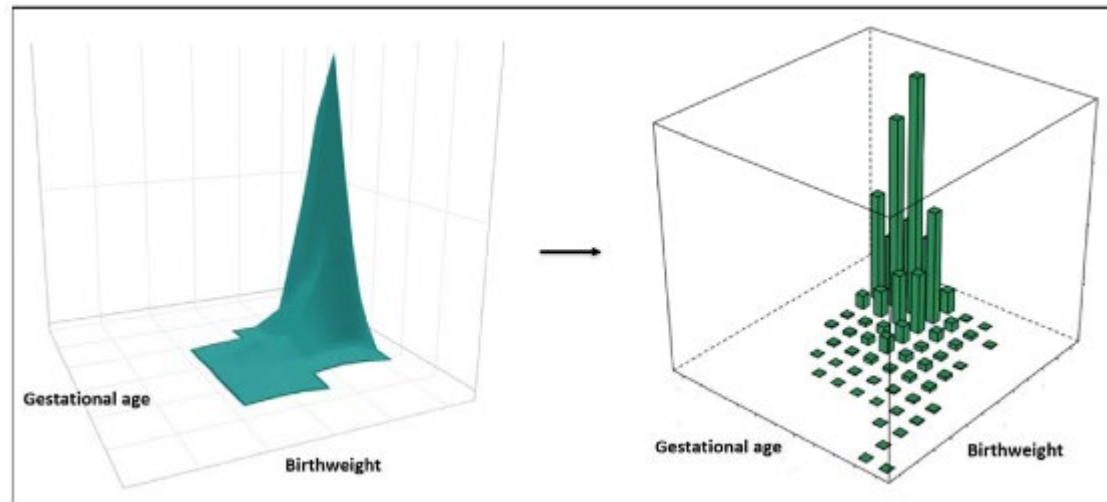


Source : Wiki Commons  
<https://nccid.ca/publications/understanding-the-measurement-of-global-burden-of-disease/>



## Infant birthweight and gestational age

- Each simulated live birth assigned point values for birthweight (grams) and gestational age at birth (weeks)
  - Informed from joint categorical distribution estimated in GBD
- Birthweight exposure may be additionally modified by maternal characteristics and intervention coverage
  - Assume no associated changes in gestational age at birth
- Applied an interpolated smoothed risk surface across categorical relative risk values from GBD so that birthweight increases within existing categories resulted in decreased risk as well as birthweight increases that result in crossing category boundaries



## Woman first trial for correlation

- Multi-country randomized controlled trial of comprehensive maternal nutrition supplementation initiated before conception, including sites in rural locations of the Democratic Republic of the Congo (DRC), Guatemala, India, and Pakistan
  - BMI exposure measurement preference was pre-pregnancy closest to conception or, if unavailable, first measurement in the first trimester
  - Hemoglobin exposure measurement preference was 2<sup>nd</sup> trimester, 1<sup>st</sup> trimester, 3<sup>rd</sup> trimester
- Unadjusted relative risk of BMI < 18.5 among those with hemoglobin < 10 g/dL relative to those with hemoglobin of 10 or more g/dL equal to 2.07 (95% CI: 1.79, 2.39)

Category	Birth weight mean difference relative to BMI ≥ 18.5 and hemoglobin ≥ 10 g/dL, in grams (95% CI)
BMI ≥ 18.5, hemoglobin < 10 g/dL	-94 (-142, -46)
BMI < 18.5, hemoglobin ≥ 10 g/dL	-182 (-239, -125)
BMI < 18.5, hemoglobin < 10 g/dL	-275 (-336, -213)

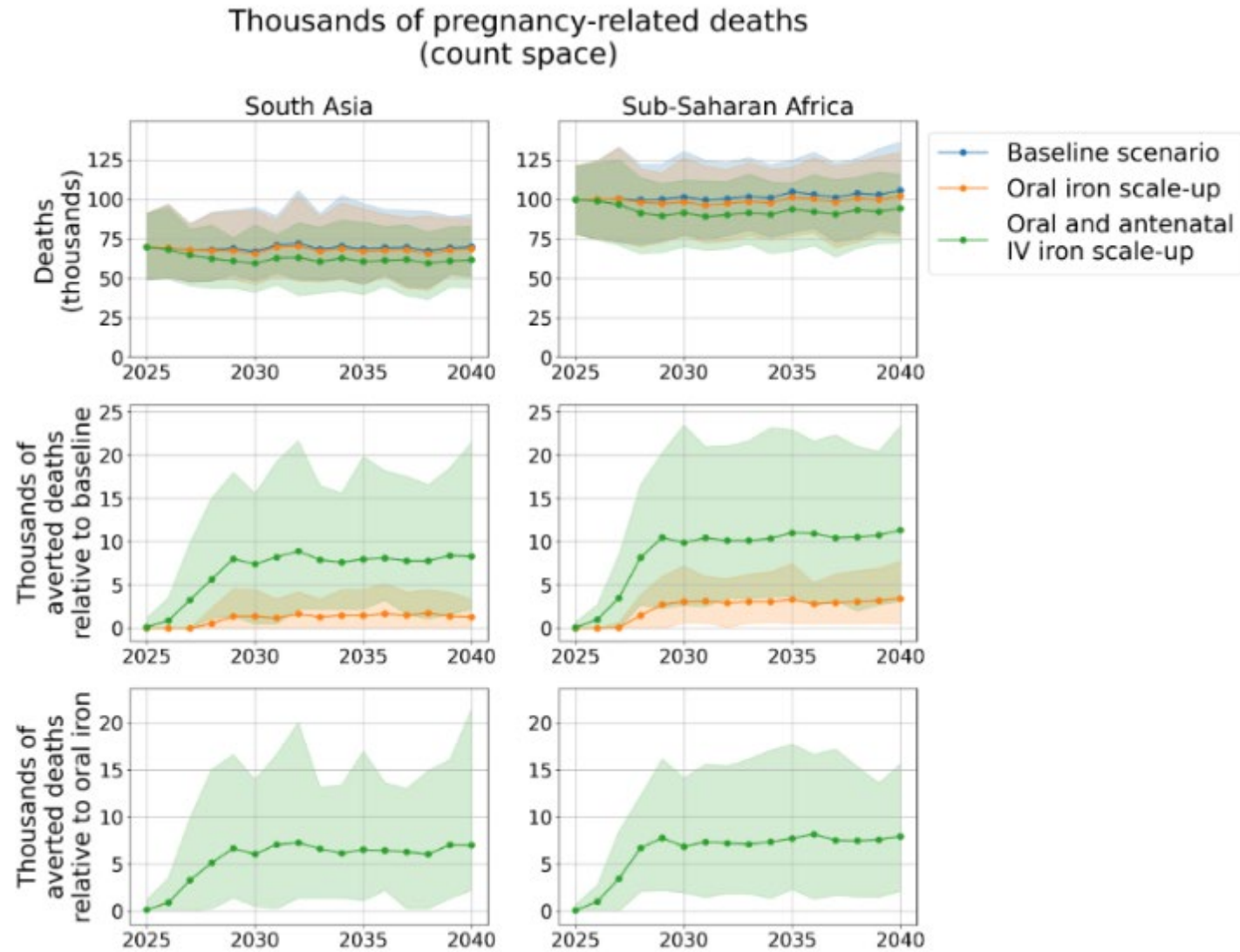
Hambidge KM, Westcott JE, Garcés A, Figueroa L, Goudar SS, Dhaded SM, Pasha O, Ali SA, Tshetu A, Lokangaka A, Derman RJ, Goldenberg RL, Bose CL, Bauserman M, Koso-Thomas M, Thorsten VR, Sridhar A, Stolka K, Das A, McClure EM, Krebs NF; Women First Preconception Trial Study Group. A multicountry randomized controlled trial of comprehensive maternal nutrition supplementation initiated before conception: the Women First trial. *Am J Clin Nutr*. 2019 Feb 1;109(2):457-469. doi: 10.1093/ajcn/nqy228. PMID: 30721941; PMCID: PMC6367966.

## Hemorrhage and hemoglobin

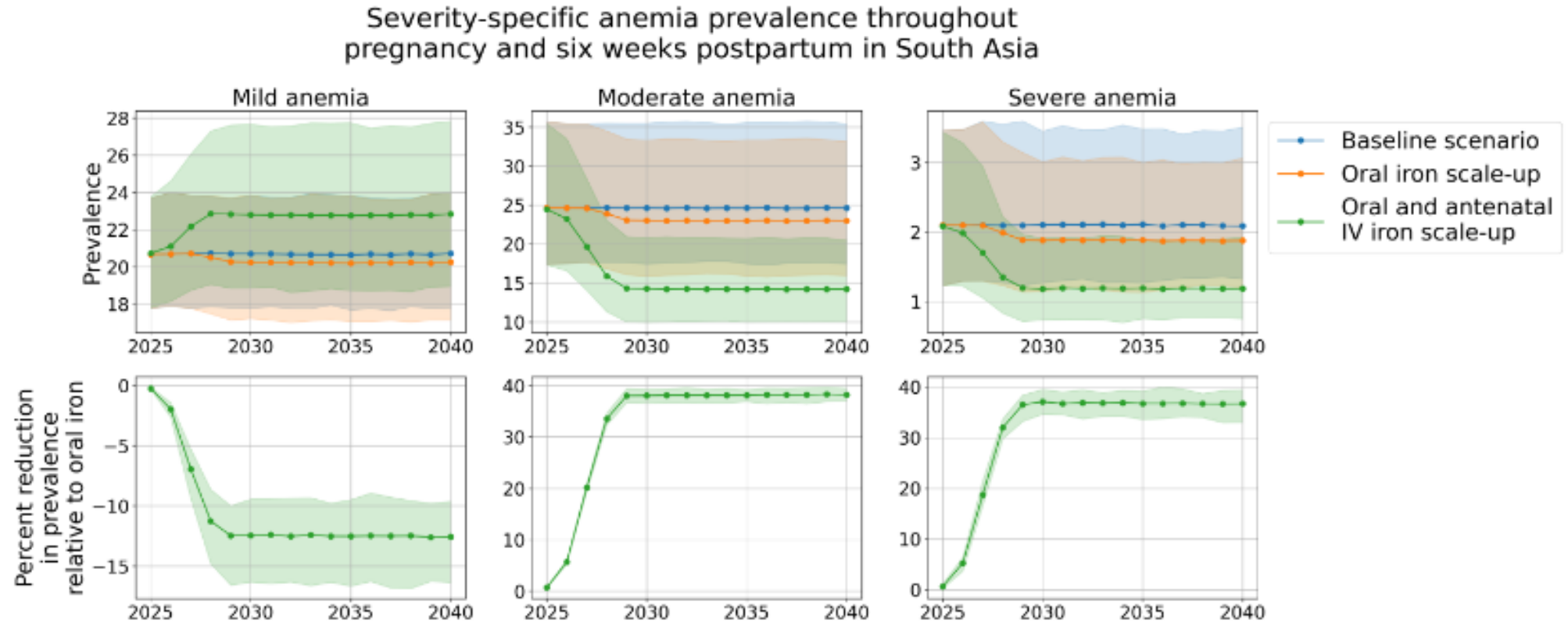
- Postpartum hemorrhage modeled as an incident cause at birth with no YLDs or YLLs
  - YLDs and YLLs included as a sub-cause in the maternal disorders parent cause component
  - Incidence informed from GBD sub-cause
- Allowed us to model:
  - Effect of hemoglobin at birth on postpartum hemorrhage incidence
    - Omotayo et al. (2021) systematic review: severe anemia OR: 3.54 (1.2, 10.4)
  - Effect of hemorrhage on hemoglobin
    - Hemorrhage severity fraction informed from GBD sequelae
    - Assumed 750 mL and 1,250 mL blood loss for moderate (500-1,000 mL) and severe (>1,000 mL) hemorrhage, respectively
    - Assumed blood volume at birth equal to 7.5 liters, under the assumptions of a 50% increase in plasma blood volume in the late third trimester<sup>6,7</sup>
    - Assumed proportional reduction in hemoglobin that persists for six weeks postpartum without intervention

Omotayo, M. O., Abioye, A. I., Kuyebi, M., & Eke, A. C. (2021). Prenatal anemia and postpartum hemorrhage risk: A systematic review and meta-analysis. *Journal of Obstetrics and Gynaecology Research*, 47(8), 2565–2576. <https://doi.org/10.1111/jog.14834>

# Pregnancy related deaths averted (*count space*)

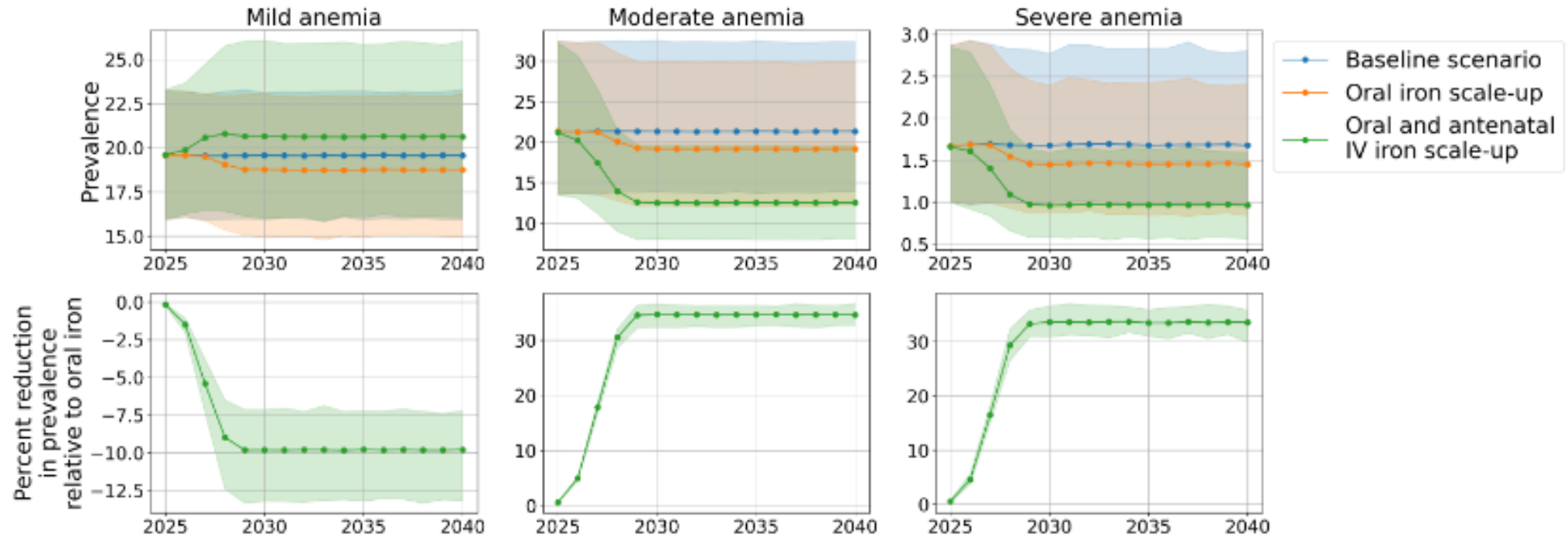


# Severity specific anemia prevalence in South Asia



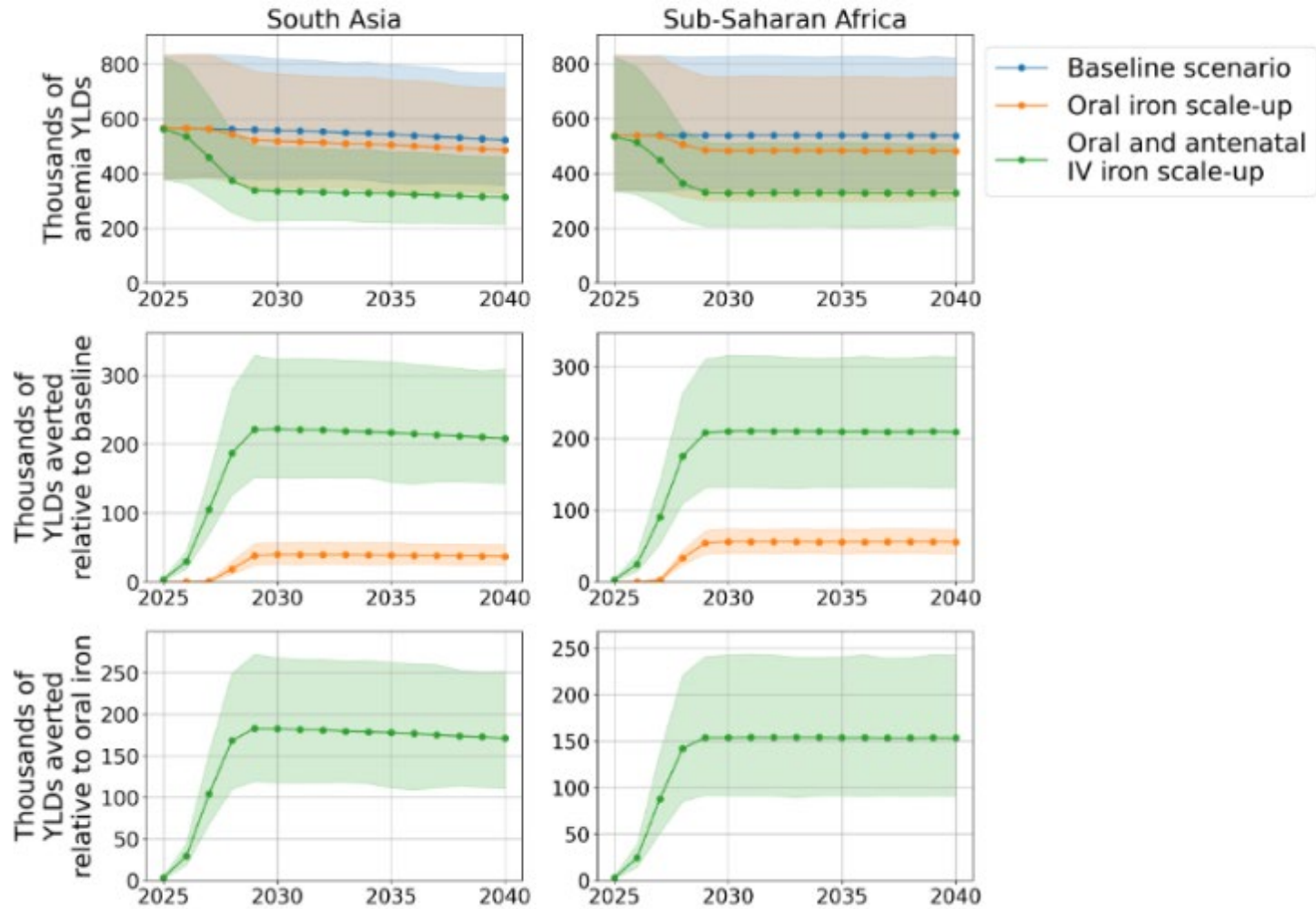
# Severity specific anemia prevalence in Sub-Saharan Africa

Severity-specific anemia prevalence throughout pregnancy and six weeks postpartum in Sub-Saharan Africa



# Anemia YLDs Averted (*count space*)

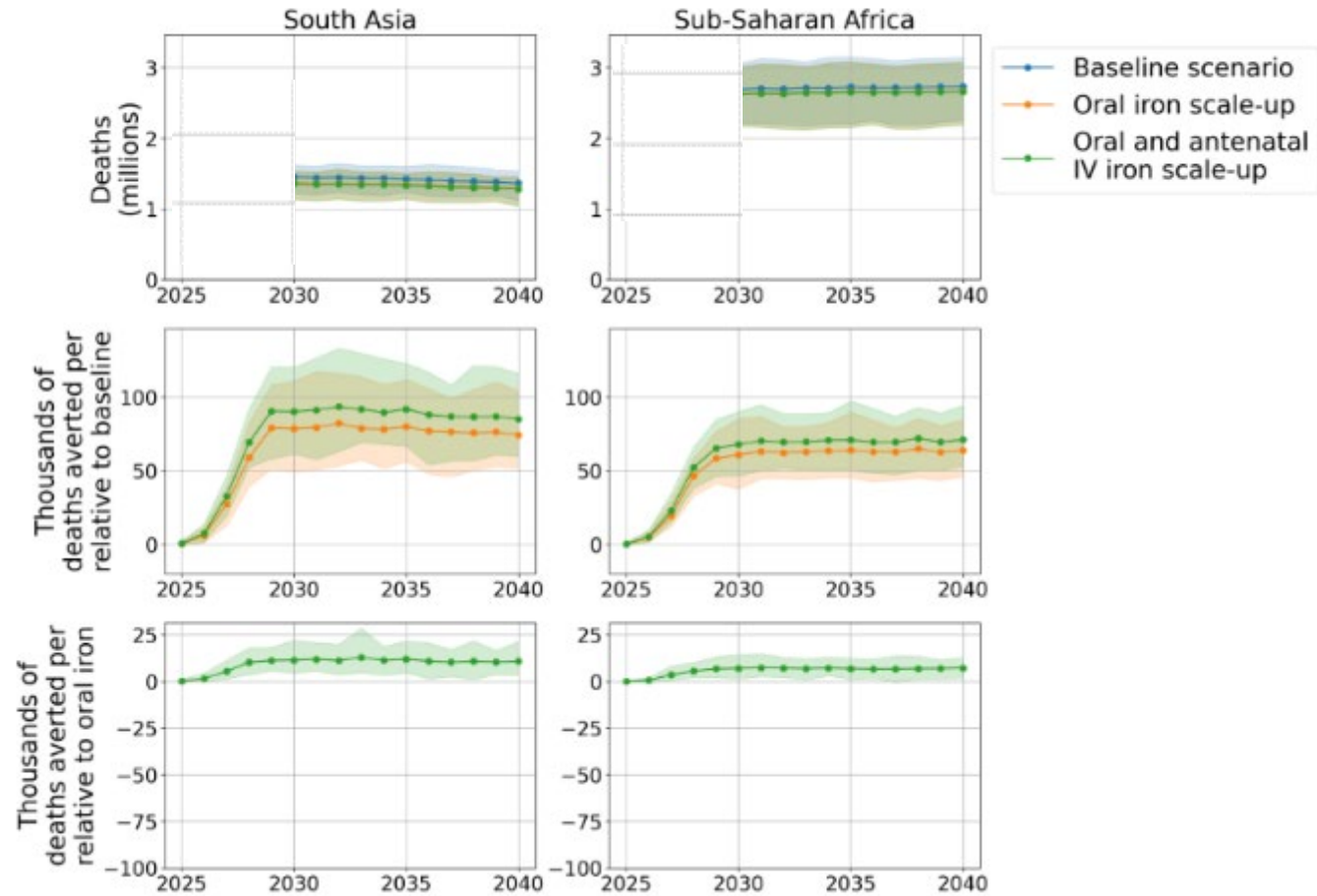
Years lived with disability (YLDs) due to anemia throughout pregnancy and six weeks postpartum





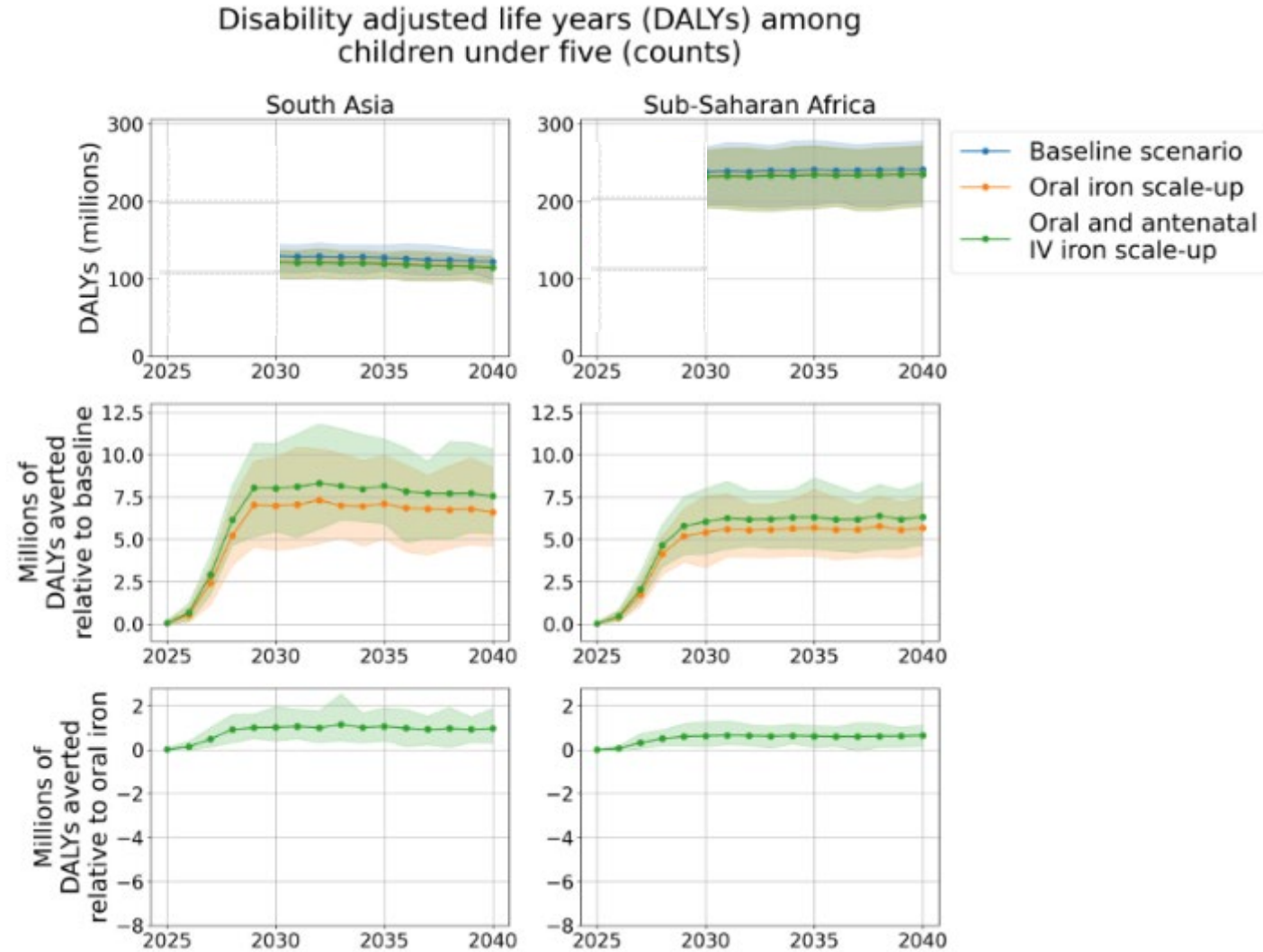
# Deaths among children averted (*count space*)

Under five mortality (counts)



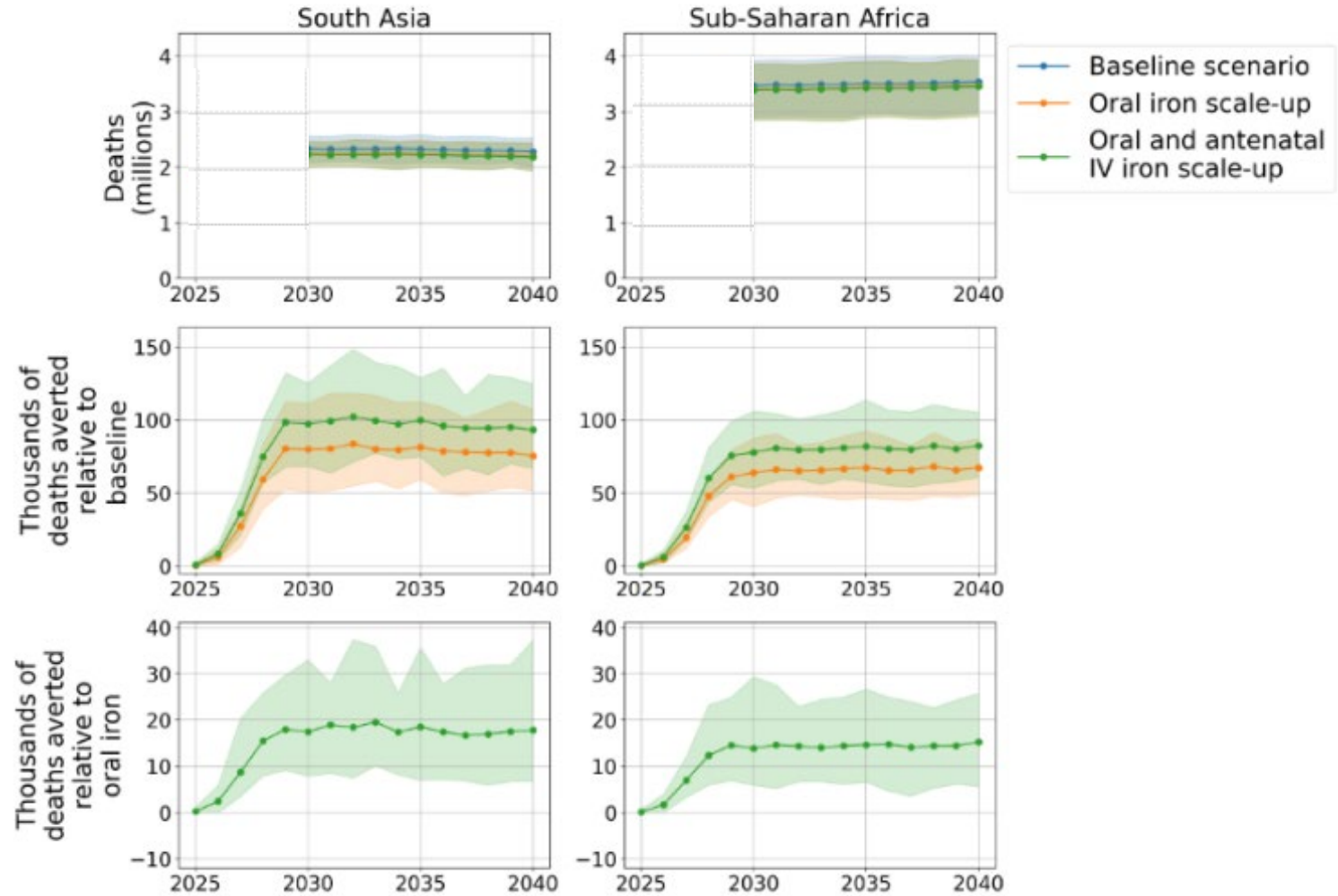


## DALYs among children averted (*count space*)



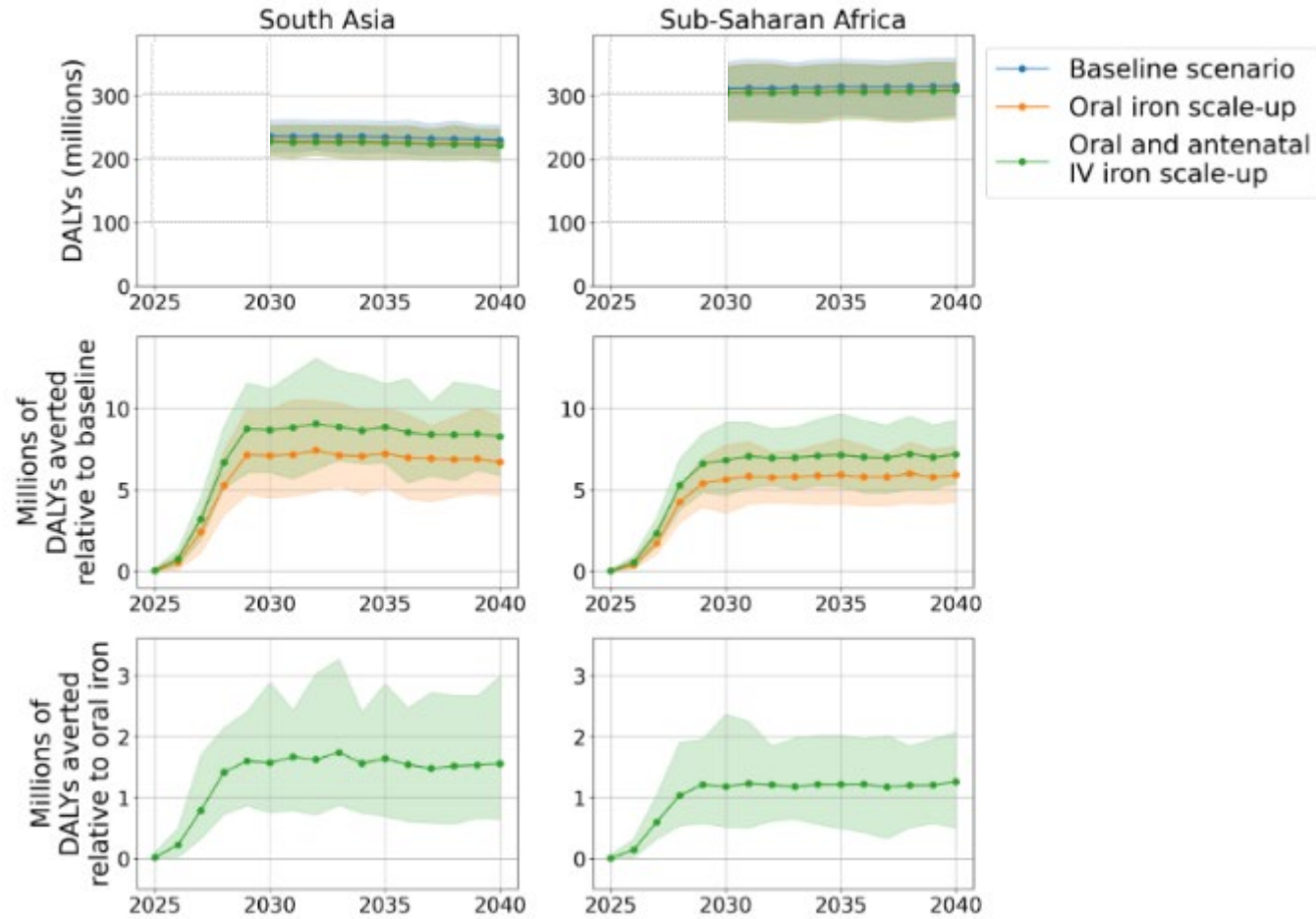
# Pregnancy related and child deaths averted (*count space*)

Deaths among women and people of reproductive age and children under five



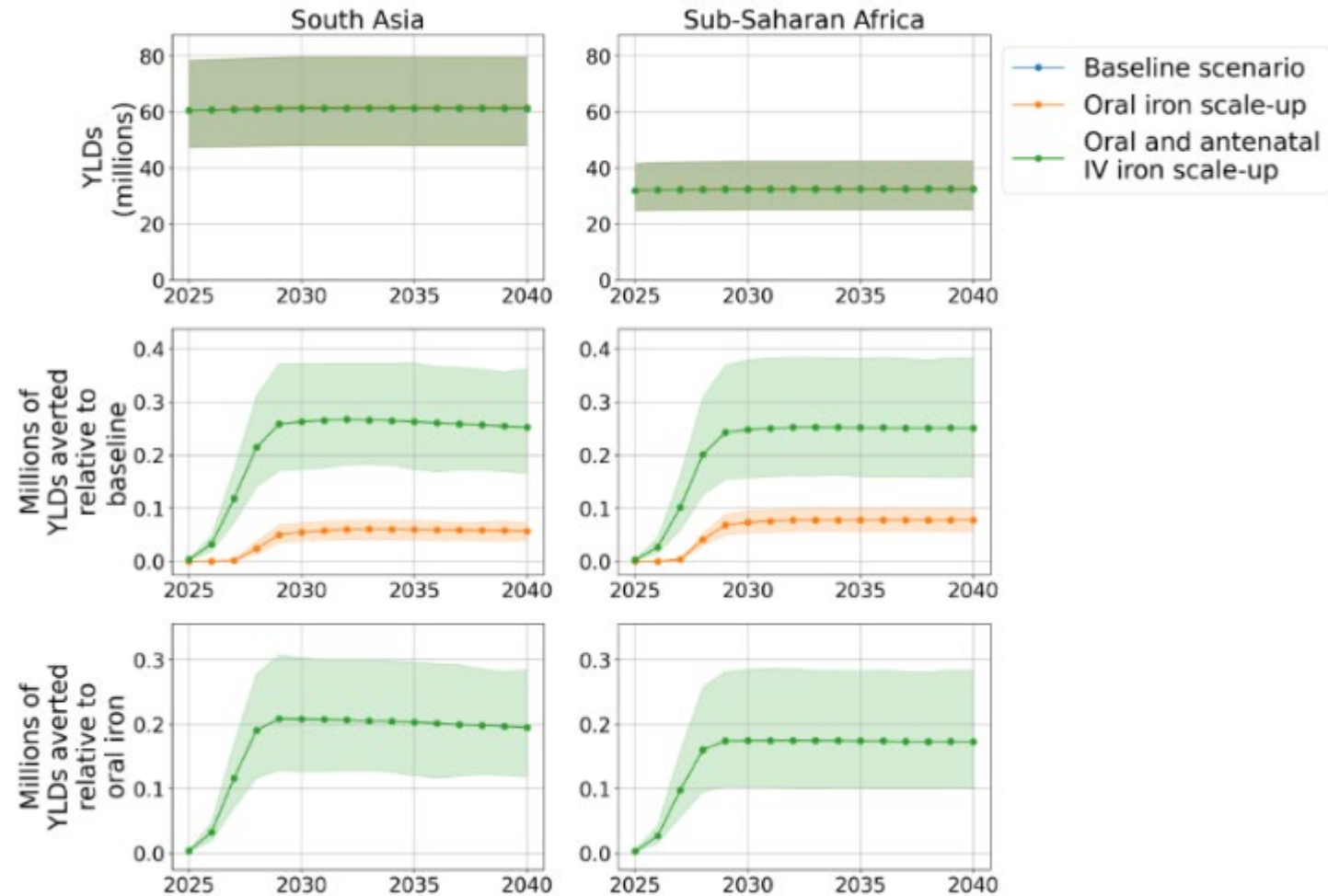
# DALYs averted for women or reproductive age and children under 5 (*count space*)

Disability adjusted life years (DALYs)  
among women and people of reproductive age and children under five



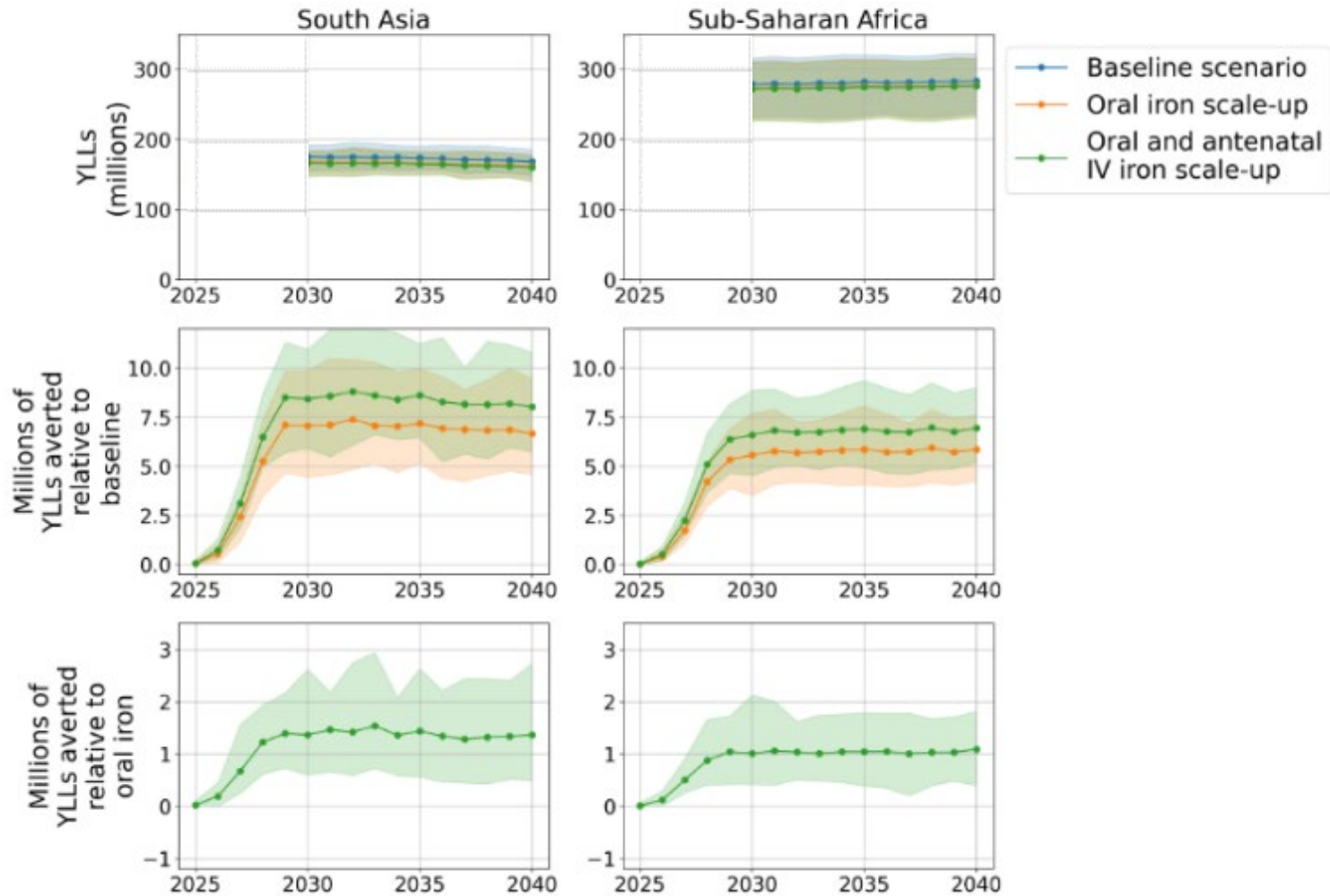
# YLDs averted for women or reproductive age and children under 5 (*count space*)

Years lived with disability (YLDs) among women and people of reproductive age and children under five



# YLLs averted for women or reproductive age and children under 5 (*count space*)

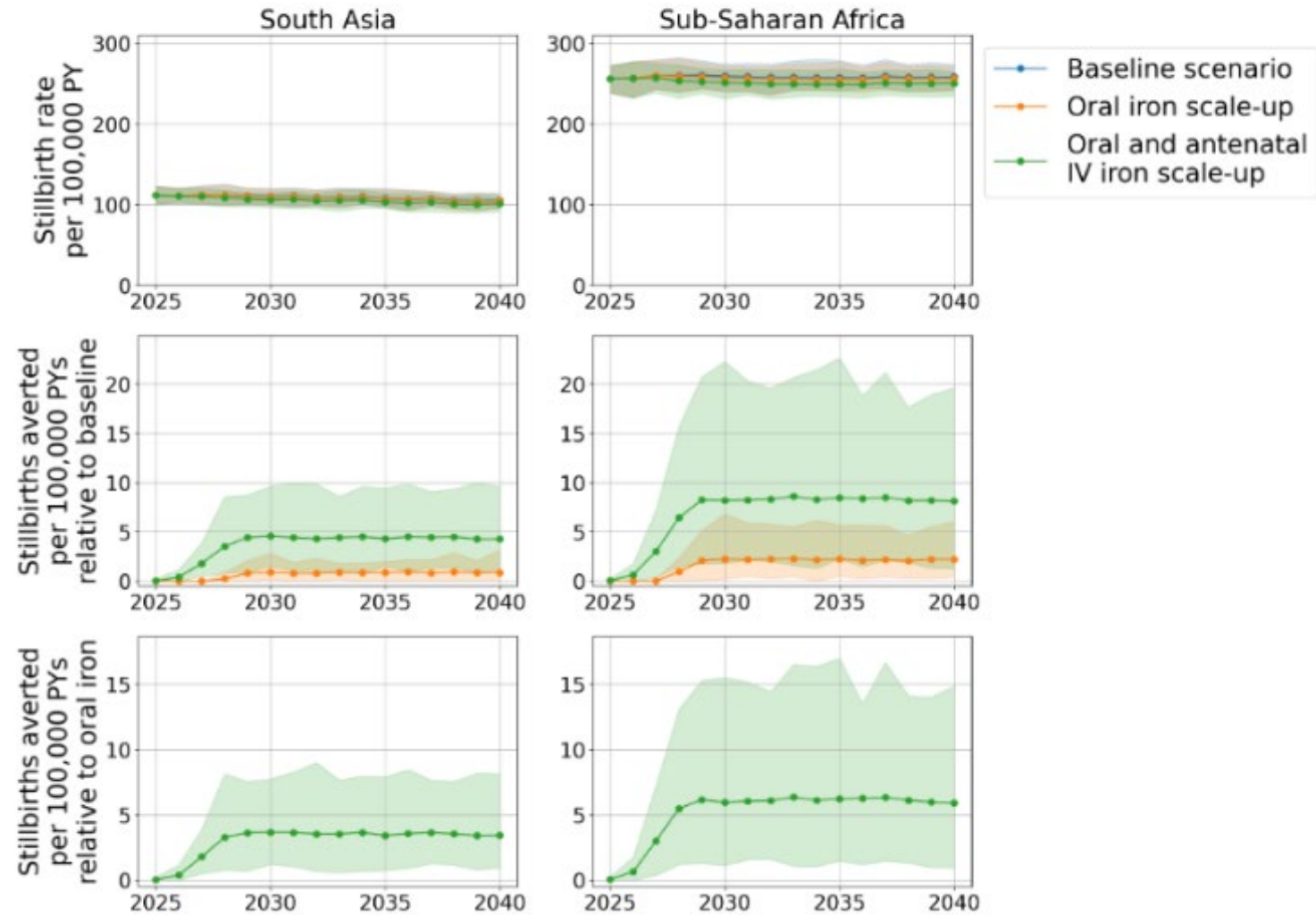
Years of life lost (YLLs) among women and people of reproductive age and children under five





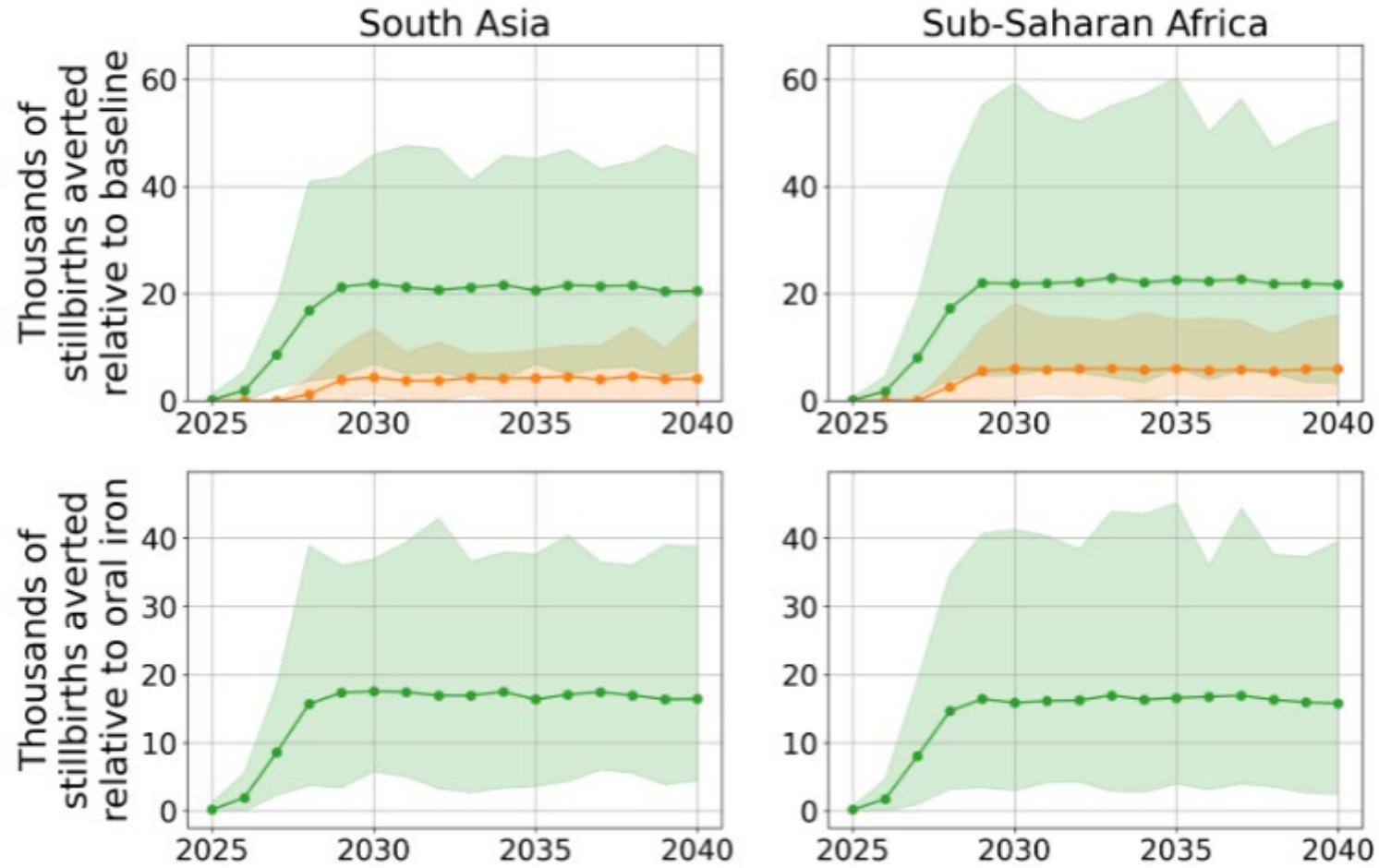
## Stillbirths averted (rate)

Stillbirths per 100,000 person-years  
among women and people of reproductive age



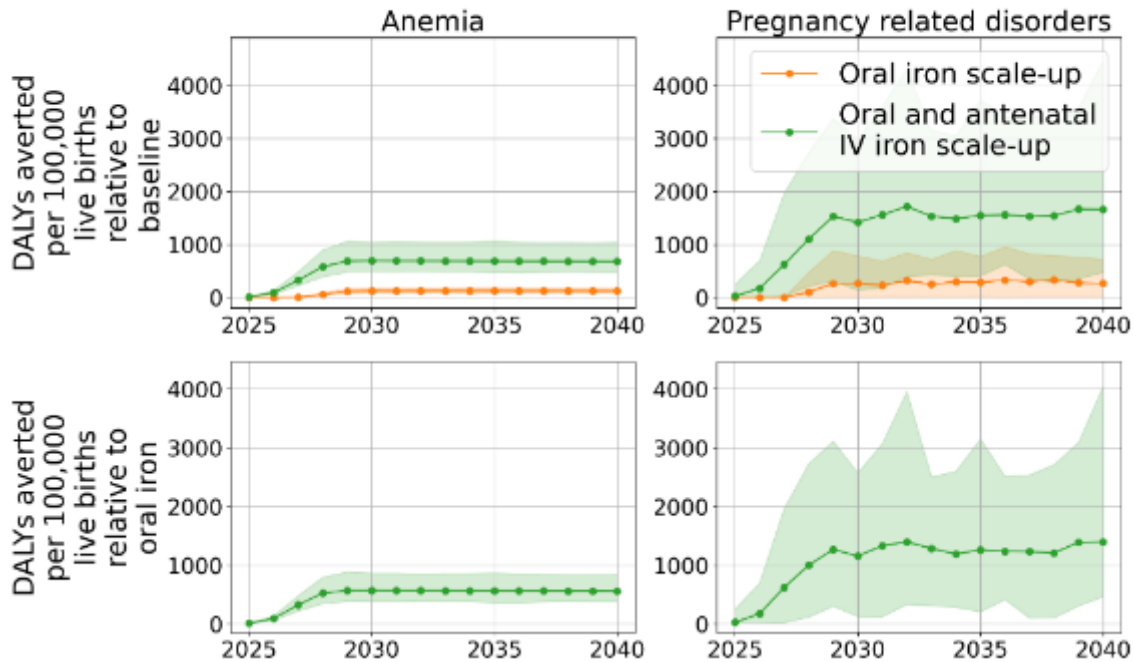
## Stillbirths averted (*count space*)

Stillbirths (counts, in thousands)

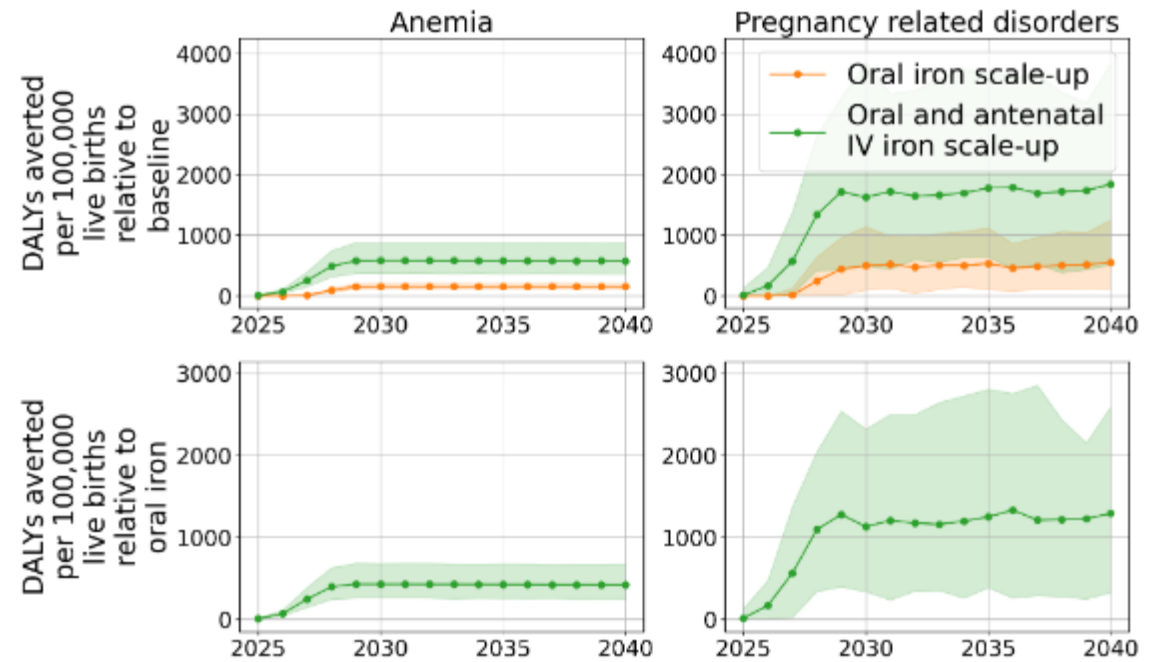


# Iron interventions during pregnancy have greater impact on pregnancy related disorders than anemia DALYs

DALYs averted per 100,000 live births among women and people of reproductive age in South Asia by cause



DALYs averted per 100,000 live births among women and people of reproductive age in Sub-Saharan Africa by cause

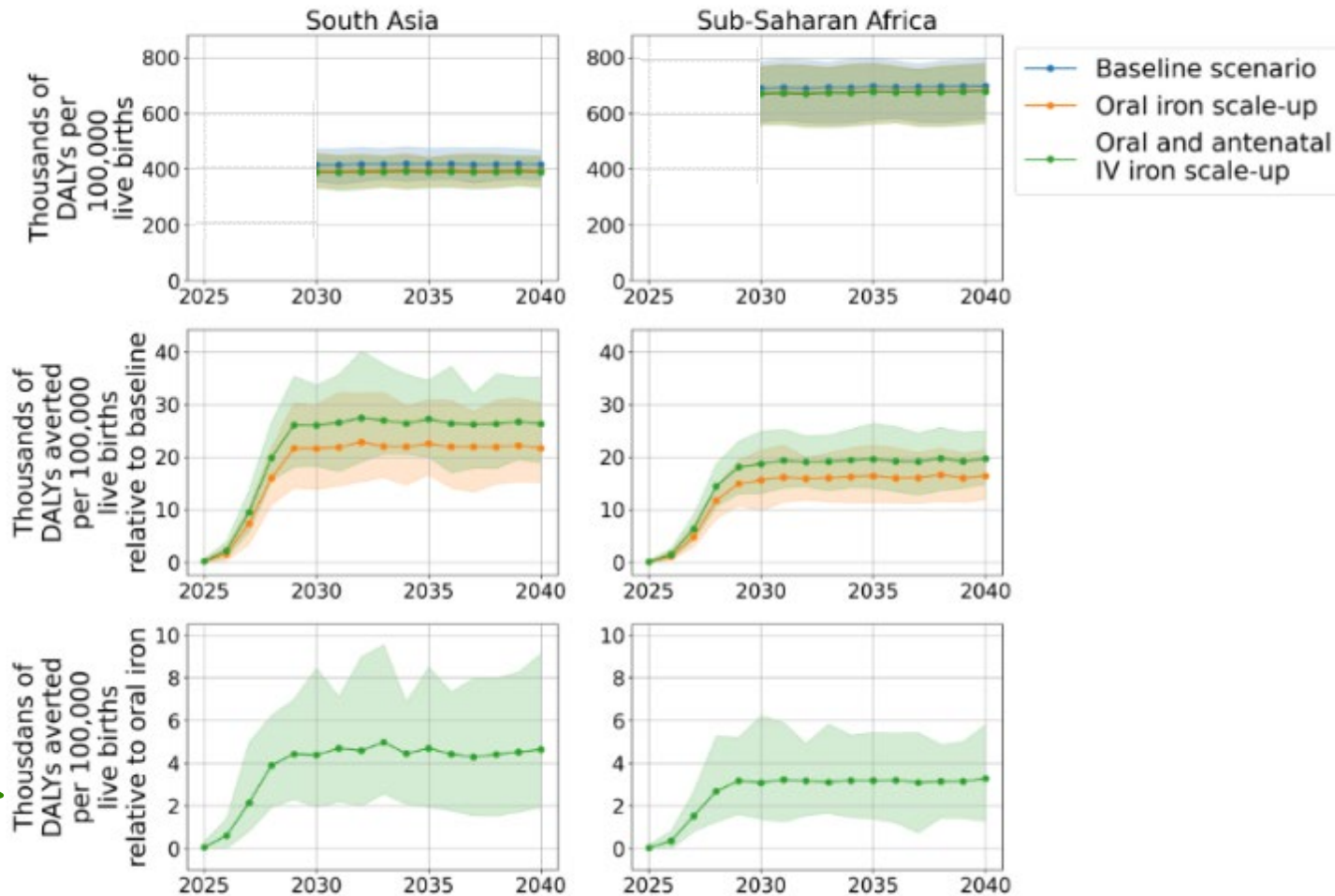


This is approximately 7.1m total DALYs averted in South Asia and 8.7m in Sub-Sharan Africa



Combining the prior results for pregnant and lactating people and children under five, we see a possible total reduction of 20-30 thousand DALYs averted per 100,000 births relative to baseline

Disability adjusted life years (DALYs) per 100,000 live births among PLW/P and children under five



This is approximately 8.3m DALYs averted in South Asia and 7.2m in Sub-Sharan Africa