

HEALTHY BIRTH, GROWTH & DEVELOPMENT

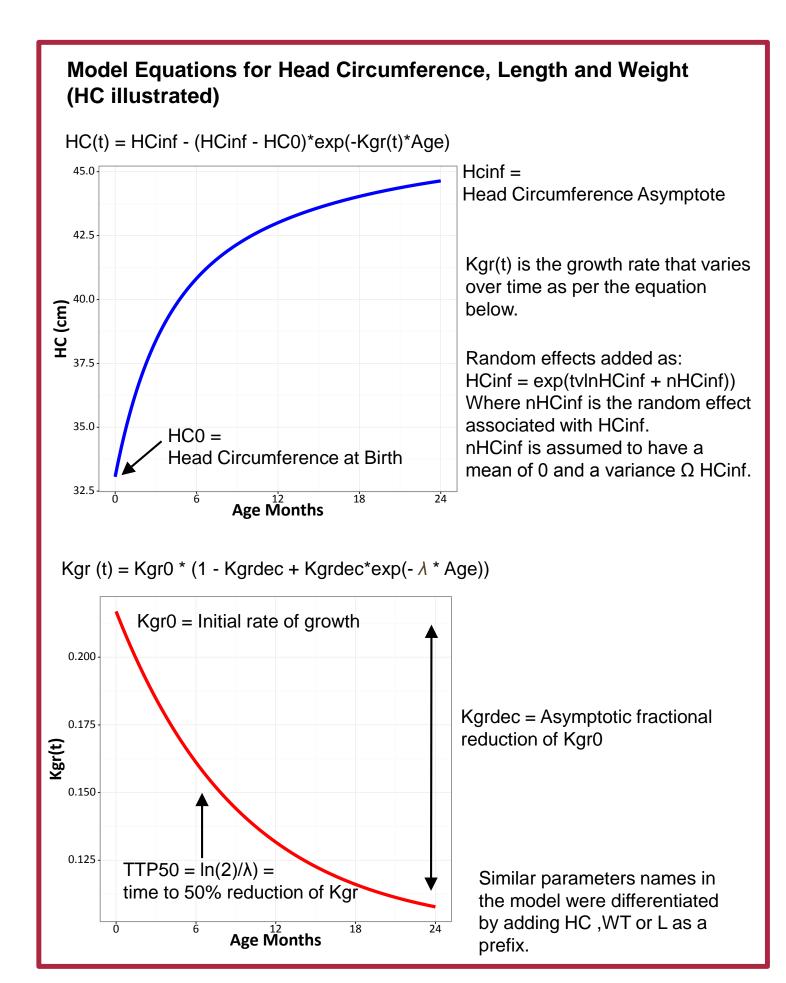
CERTARA Strategic Consulting

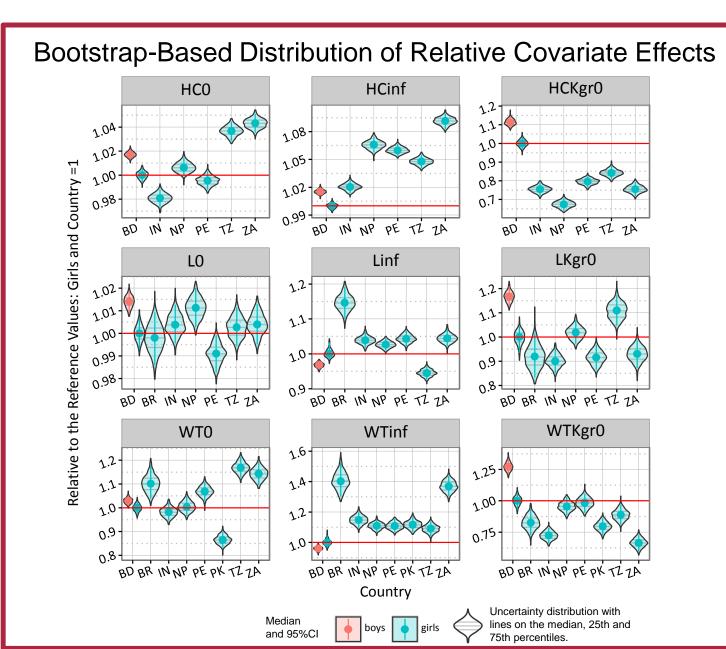
Primary Microcephaly: Do All Roads Lead to Rome?

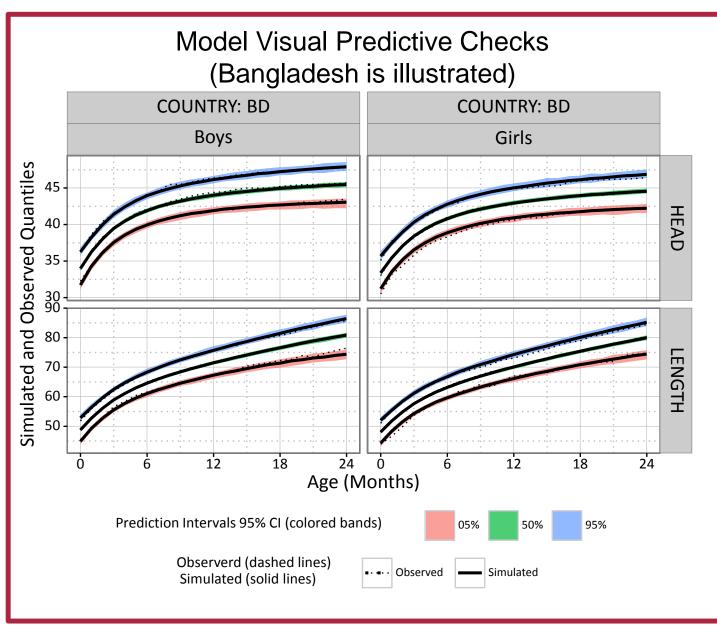
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Objectives

- Symmetric intrauterine growth restriction has a growth pattern where all biometric measurements are affected to the same degree.
- Similarly growth after birth is expected to be symmetrical.
- The objectives of this study were:
- (1) To determine the joint probability distributions of growth parameters describing Weight/Length and Head Circumference (WT/LEN/HC) from age 0 to 24 mo, and
- (2) To study symmetry across the 3 growth measures to provide useful quantitative guidance to Zika clinicians and researchers on measurements of individuals with a normal/mild-to-moderate/small head relative to other anthropometric measures.



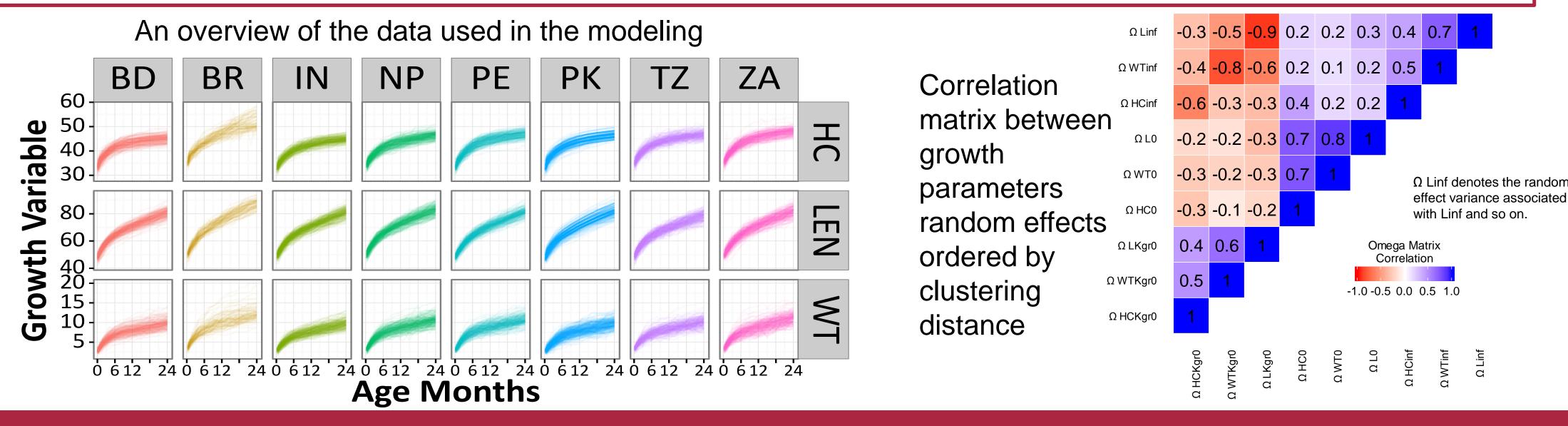




References

- Preliminary guidelines for the surveillance of microcephaly in newborns in settings with risk of Zika virus circulation. Pan American Health Organization Web site. http://iris.paho.org/xmlui/handle/123456789/18601. Accessed May 19, 2016.
- 2. Soares de Araújo JS, et al. Microcephaly in northeast Brazil: a review of 16 208 births between 2012 and 2015. *Bull World Health Organ.* E-pub: 4 Feb 2016.
- doi:http://dx.doi.org/10.2471/BLT.16.170639
 Geraedts EJ et al. Association between head circumference and body size. Horm Res Paediatr. 2011;75(3):213-219.
 Sponsored by the Healthy Birth, Growth, and Development (HBGD) initiative representing Discovery & Translational Sciences, Integrated Development, Integrated Delivery, Nutrition, Agriculture, Water, Sanitation & Hygiene, Maternal, Newborn & Child Health, Enteric & Diarrheal Diseases, and Pneumonia Program Strategy Teams. HBGDki was conceived of and is directed by shasha.jumbe@gatesfoundation.org.

Focus on Head Circumference for age Z-score (HCAZ) data from birth to age 2 mo. **Western Asia:** BD BR IN NP TZ Turkey ariable Yemen **Southern Asia:** Northeri Cambodia Pakistan (PK) **Eastern Africa: Southeastern Asia:** Indonesia **Age Months** Myanmar **Western Africa:** Philippines Burkina Faso Proposed microcephaly detection criteria Viet Nam Americas: Côte d'Ivoire • PAHO preliminary guidelines1: HCAZ < -2, which corresponds to term Uganda birth HC < 31.9 cm for boys and < 31.5 cm for girls (red circles boys, red Zambia Middle Africa: triangles girls). **Southern Africa:** • Fenton curves, where microcephaly Cameroon South Africa (ZA) DR Congo equals HCAZ < -3 for age and gender² (Horizontal line ———) Countries: • High burden of stunting: dark green • Proportionality criteria, where Contributing to this analysis: red microcephaly equals a HC less than Recent outbreak of microcephaly: orange $((height/2) + 10) \pm 2.^{2,3}$ **Hypothesis: HCAZ: Head Circumference for Age Z-score** Difference between HCAZ and HAZ **HAZ: Length/Height for Age Z-score** determines disproportionate sub-population? Bivariate density 3D and contour of HAZ and HCAZ (India)



Methods

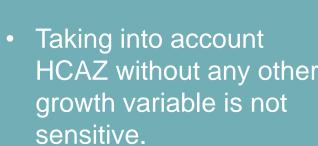
- Joint parametric nonlinear mixed effects (NLME) model built for WT/LEN/HC.
- Several parametric models tested such as exponential growth with and without decelerating growth rate.
- Key element: to determine the potential correlations between various growth outcomes WT/LEN/HC.
- Limited covariates testing performed including country site, sex, and socioeconomic factors.
- Model fitted using QRPEM fitting engine in Phoenix NLME parallelized on 20 cores.
- Model goodness-of-it assessed using graphical tools and visual predictive checks (VPC).
- Parameter uncertainty obtained from bootstrap resampling over Linux Torque Grid on Global Health Analytics Platform (ghap.io).

R packages and Shiny Apps used to streamline modeling:

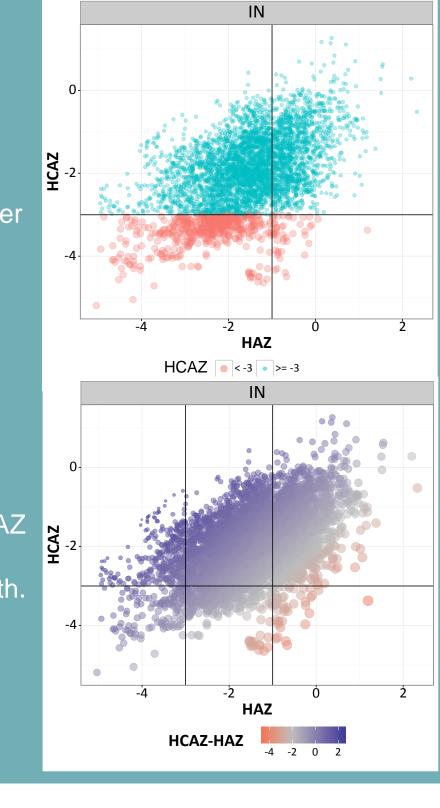
- Graphical quick exploration: https://pharmacometrics.shinyapps.io/ggplotwithyourdata/
- Hbgd https://github.com/hafen/hbgd to quickly compute zscores velocity statistics on growth curves
- scores, velocity, statistics on growth curves.Trelliscope http://tessera.io/docs-trelliscope/
- Trelliscope http://tessera.io/docs-trelliscope/
 data.table processing up to 100 M rows of simulation data
- Dplyr/ggplot/tidyr to process medium-sized data sets
 EACE to estimate high dimensional correlation matrices
- FACE to estimate high-dimensional correlation matrices
 Rworldmap to graph world map with custom projection
- Markdown and knitr to automate outputs and reports

Results

- Joint nonlinear deceleration model for WT/LEN/HC best fit the data (115 060 observations from 1568 subjects, 71 missing) with full random effects variance-covariance matrix.
- Between-subject variability: range,
 50% (weight rate of growth) to 10% (length at 0 mo).
- Country and sex kept in the model.
- Parameter uncertainty < 30%.
- Model accurately simulated correlated longitudinal data of WT/LEN/HC from 0-24 months from (1 to 97 percentiles).
- Model accurately predicted growth trajectories of HC conditional on WT and LEN.
- We propose to fit the current model on longitudinal data to determine conditional HCAZ/HAZ and then HCAZ-HAZ can be used as a potential predictor of disproportionate HC/LCM.



 Jointly taking into account HCAZ and HAZ helps in flagging disproportionate growth.



Conclusions

- Results address key aspect of characterizing WT/LEN/HC relations and predicting their evolution over time for a specific child, not just the population.
- Potential application of this model includes individualized bivariate or trivariate growth
- trajectories for early detection of serious conditions such as stunting and microcephaly.
- Identifying disproportionate subpopulation for further study and intervention should be validated against collected microcephaly data.

