

Eike Luedeling^{1,2}, Jan De Leeuw¹, Christine Lamanna¹, Todd S. Rosenstock¹, Cory W. Whitney^{3,4}, Keith D. Shepherd¹

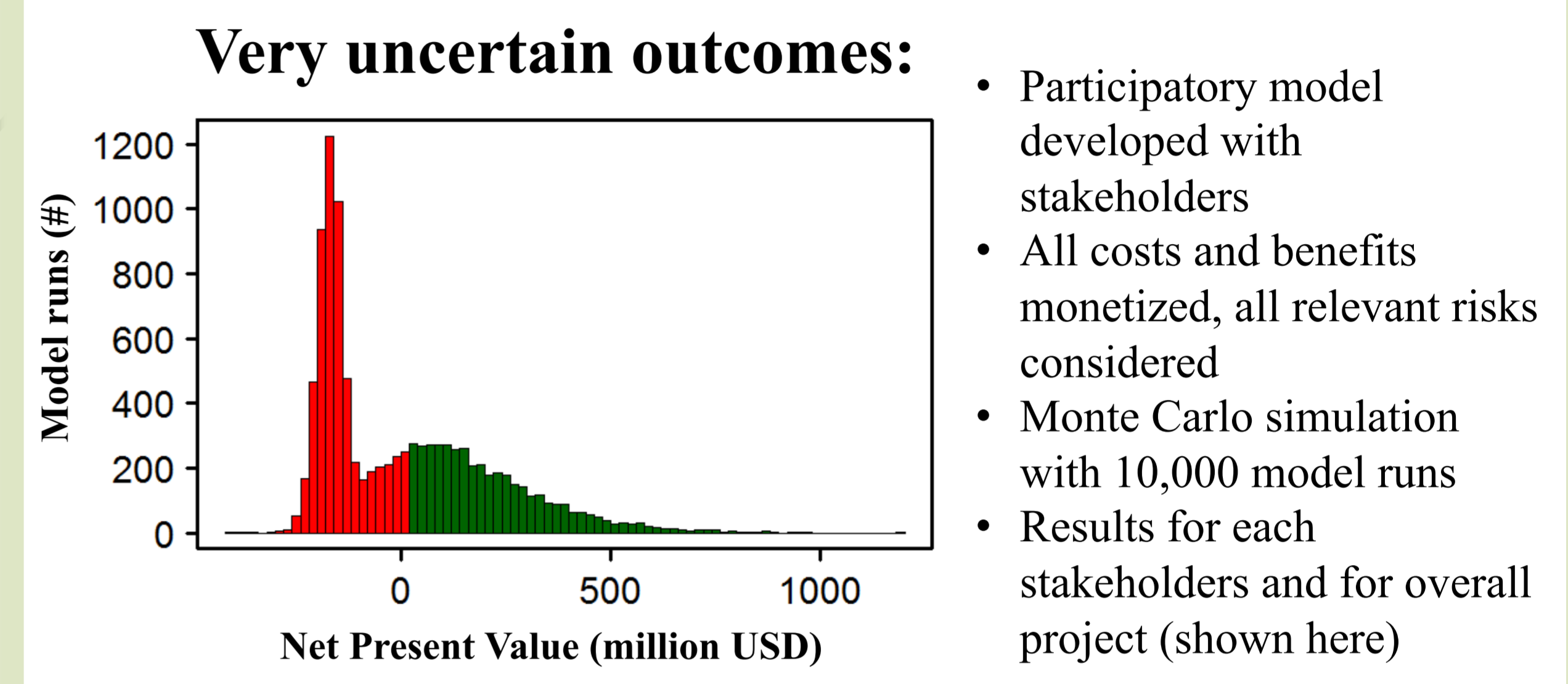
¹ World Agroforestry Centre (ICRAF), Nairobi, Kenya; ² Center for Development Research, University of Bonn, Germany; ³ Rhine-Waal University of Applied Sciences, Kleve, Germany; ⁴ University of Kassel, Germany

Uncertainty in agricultural development

Agricultural systems in the tropics are complex, depending on many interrelated drivers that are often poorly understood and not well-described by data. Nevertheless, decision-makers need scientific support for decisions on such systems. Research approaches are needed that can deal with the complexity and imperfect information that is a reality in agricultural development. Decision analysis methods have promise for bridging this gap.

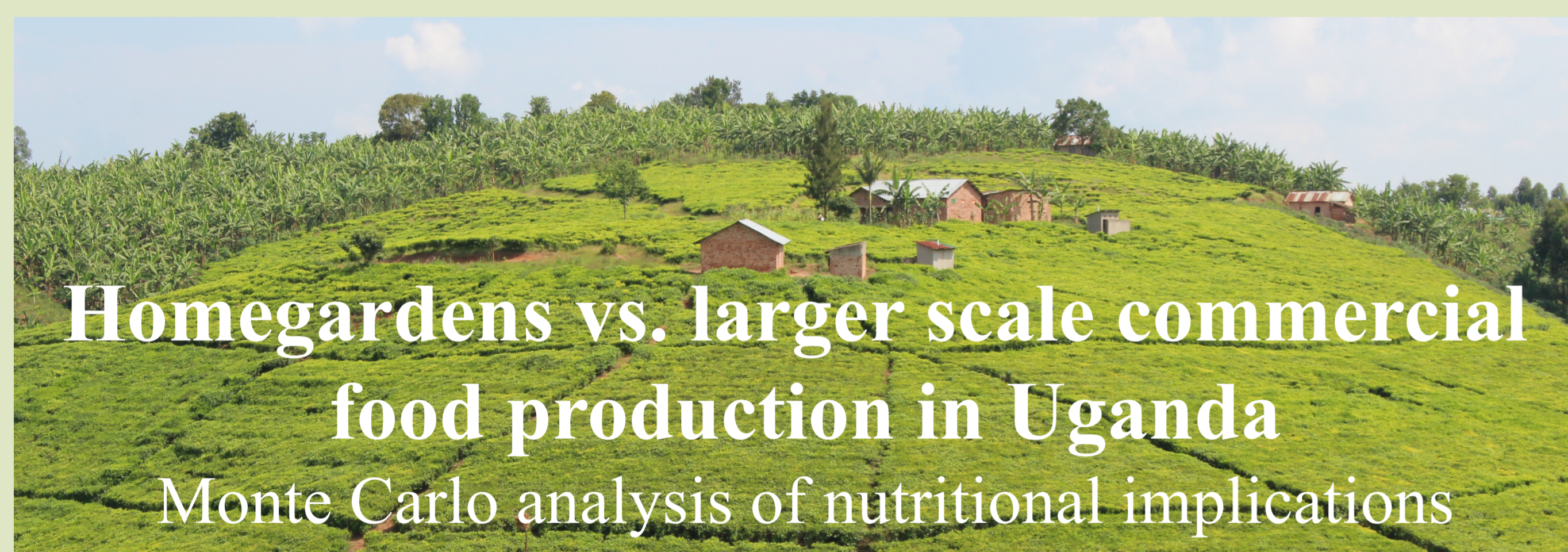
Decision analysis principles

- Work directly with decision-makers and stakeholders on pending decisions
- Consider both social and environmental factors, regardless of state of knowledge
- Model uncertainty and risk
- Make existing knowledge and expected causal relationships explicit in models
- Use all knowledge sources, incl. experts
- Use probabilistic methods, e.g. Monte Carlo simulation or Bayesian Networks

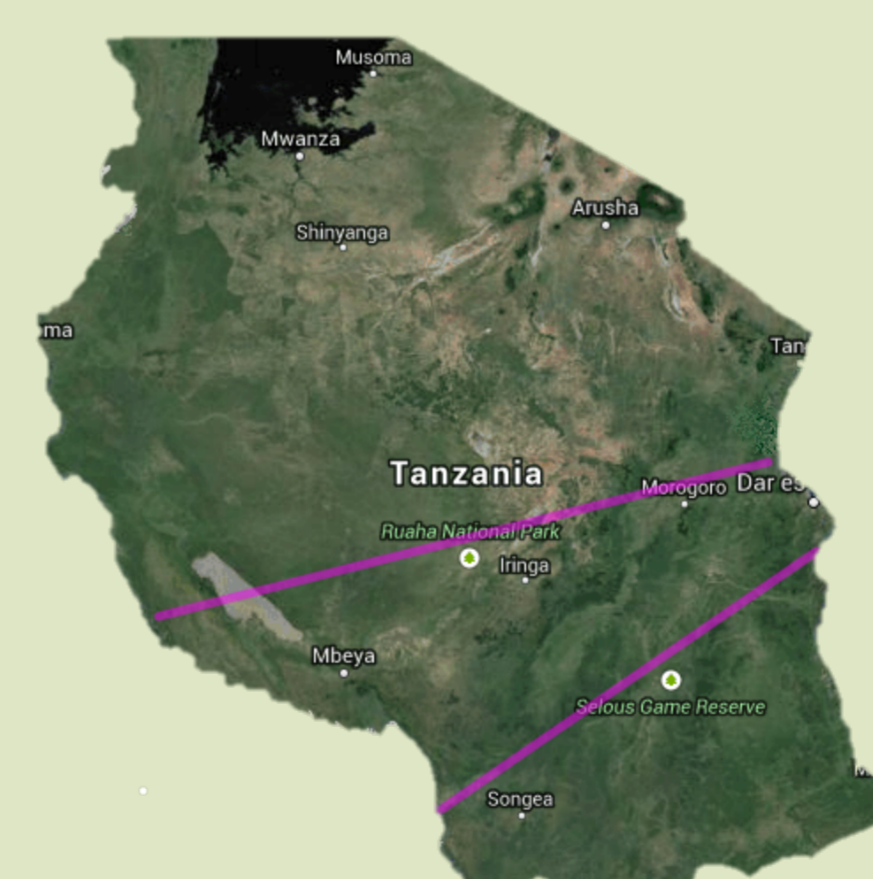
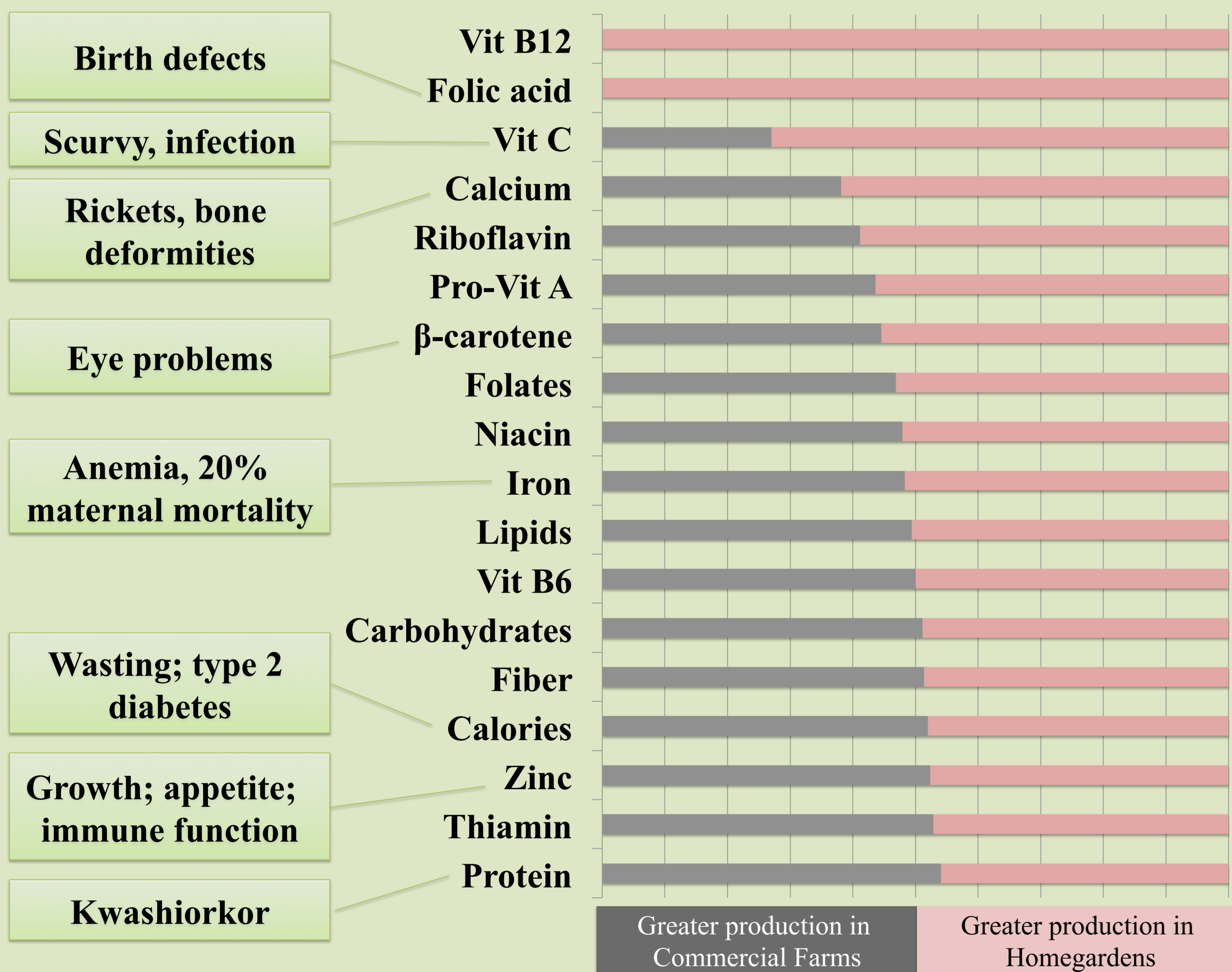


- Critical uncertainties:**
- Value of reduced infant mortality
 - Risk of political interference
 - Economic feasibility of water sales

Luedeling E, Oord A, Kiteme B, Ogalleh S, Malesu M, Shepherd K, De Leeuw J, 2015. *Frontiers in Environmental Science* 3, 16.

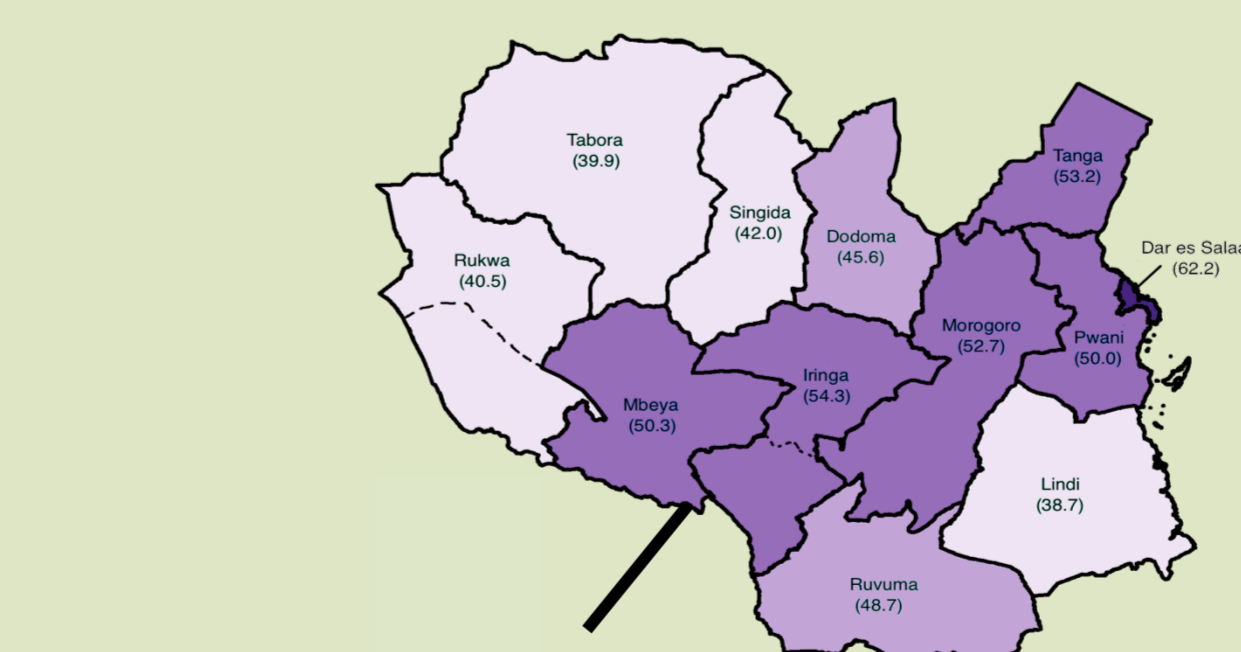
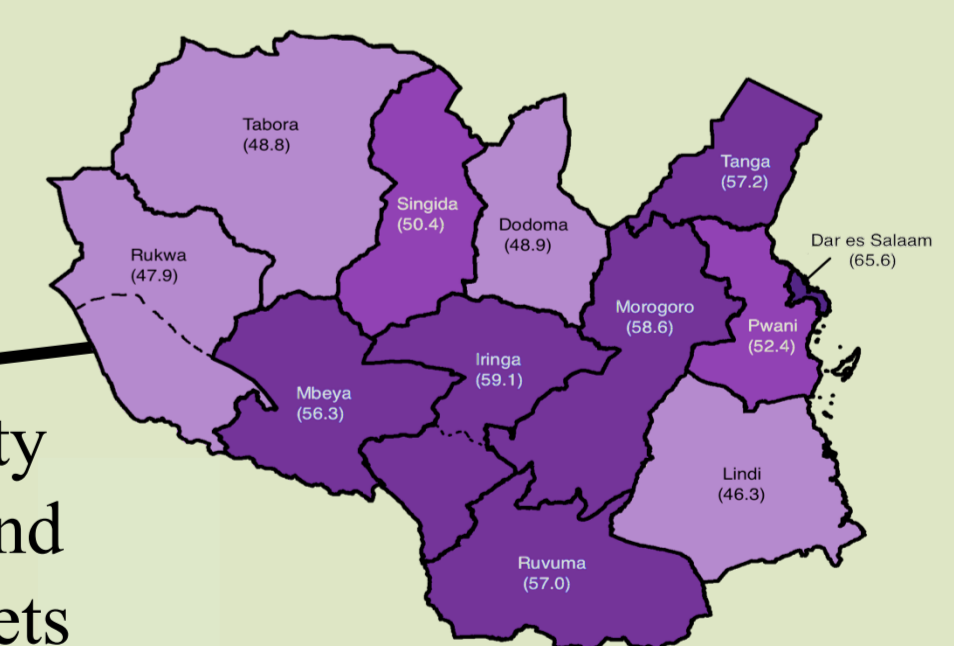


10,000 model runs, nutrient contribution from yields: homegardens & commercial farms

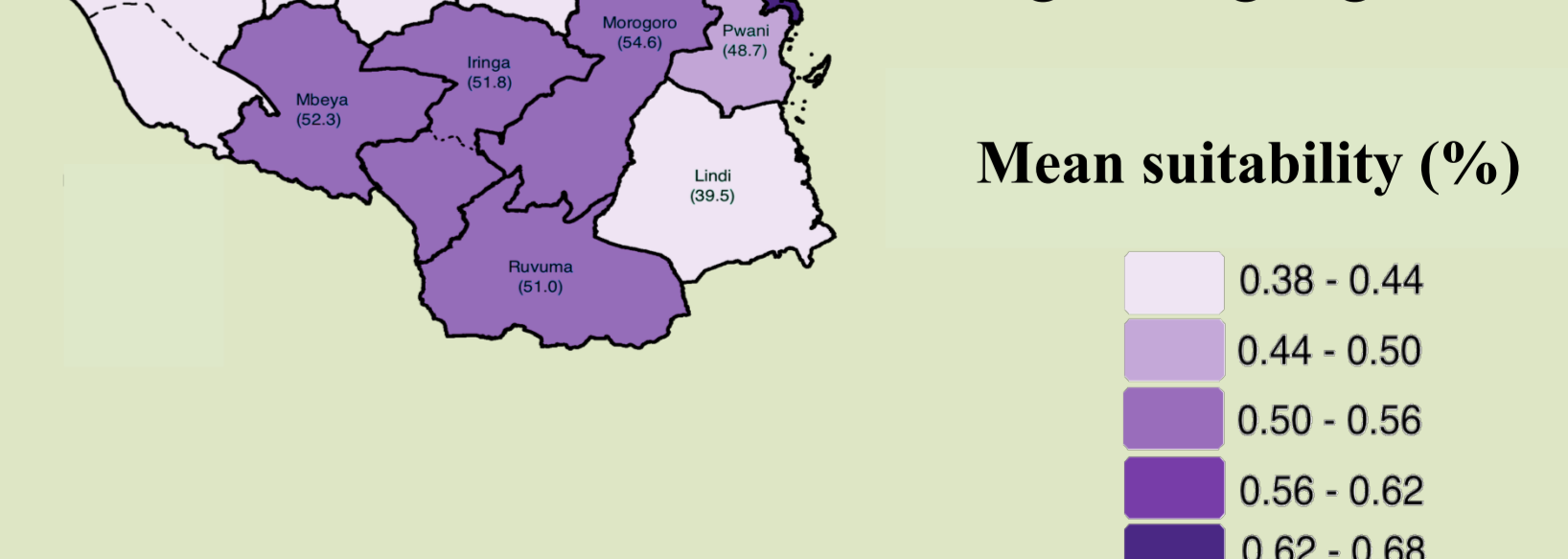


- Bayesian network of water use technology suitability
- Based on biophysical, social, and economic factors
- Conditional probabilities from experts and stakeholders
- Results used to implement TZ's Agriculture Climate Resilience Plan

Charco Dams
Universally high suitability due to low start up costs and low reliance on social assets



System of Rice Intensification
Highest suitability in rice growing regions



Conclusions

- Better guidance for decision-making is possible without expensive long-term data collection.
- Decision models allow probabilistic decision outcome forecasts, but this makes them hard to validate.
- The principles of business decision analysis offer one of the most promising approaches to meeting the challenges of system complexity and data scarcity that appear ubiquitous in agricultural development.