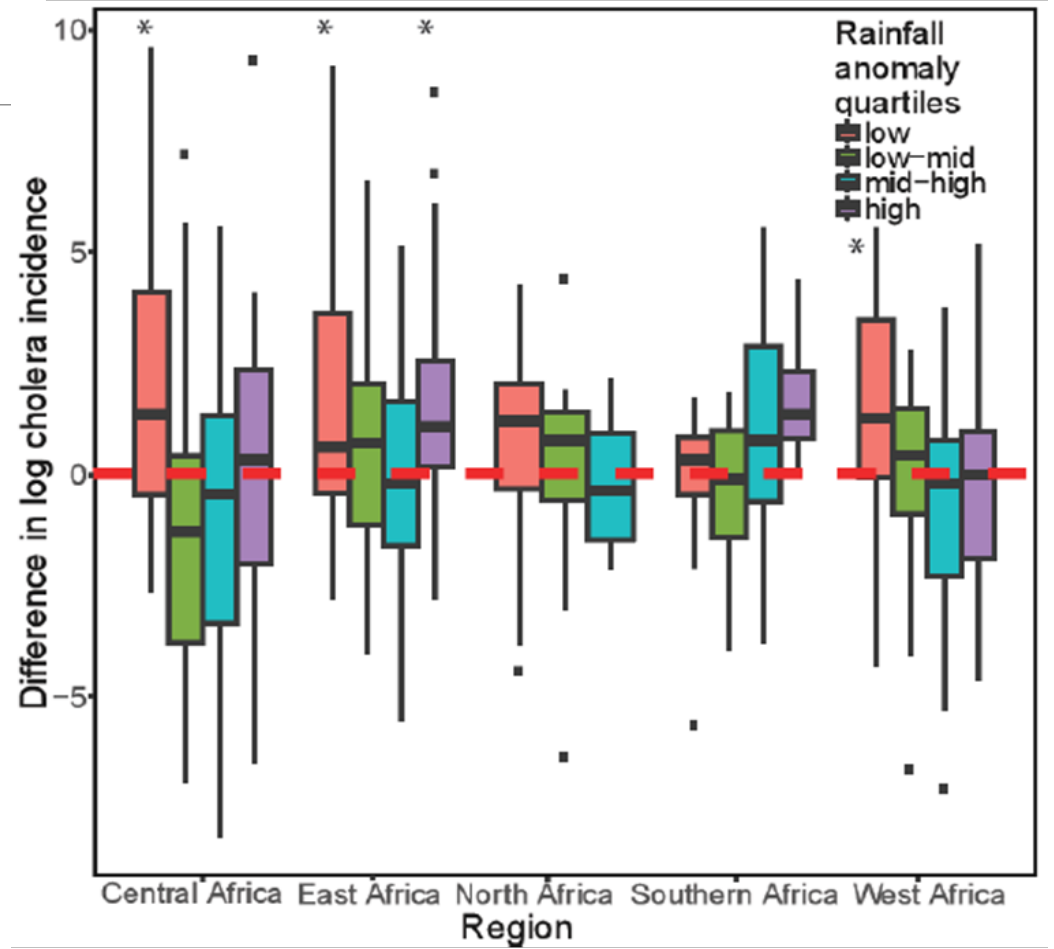
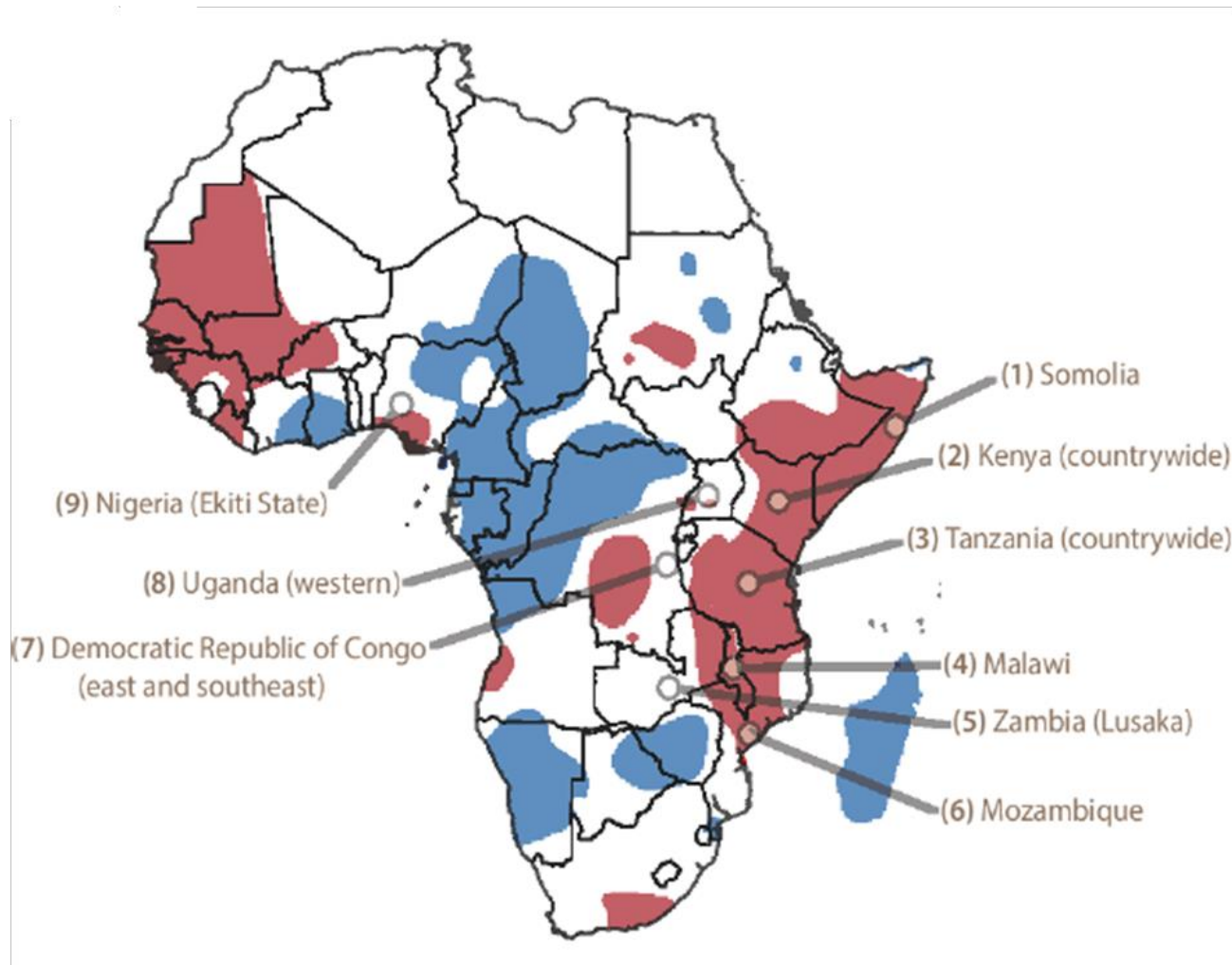




The African Cholera Risk Early Warning System (ACREWS)

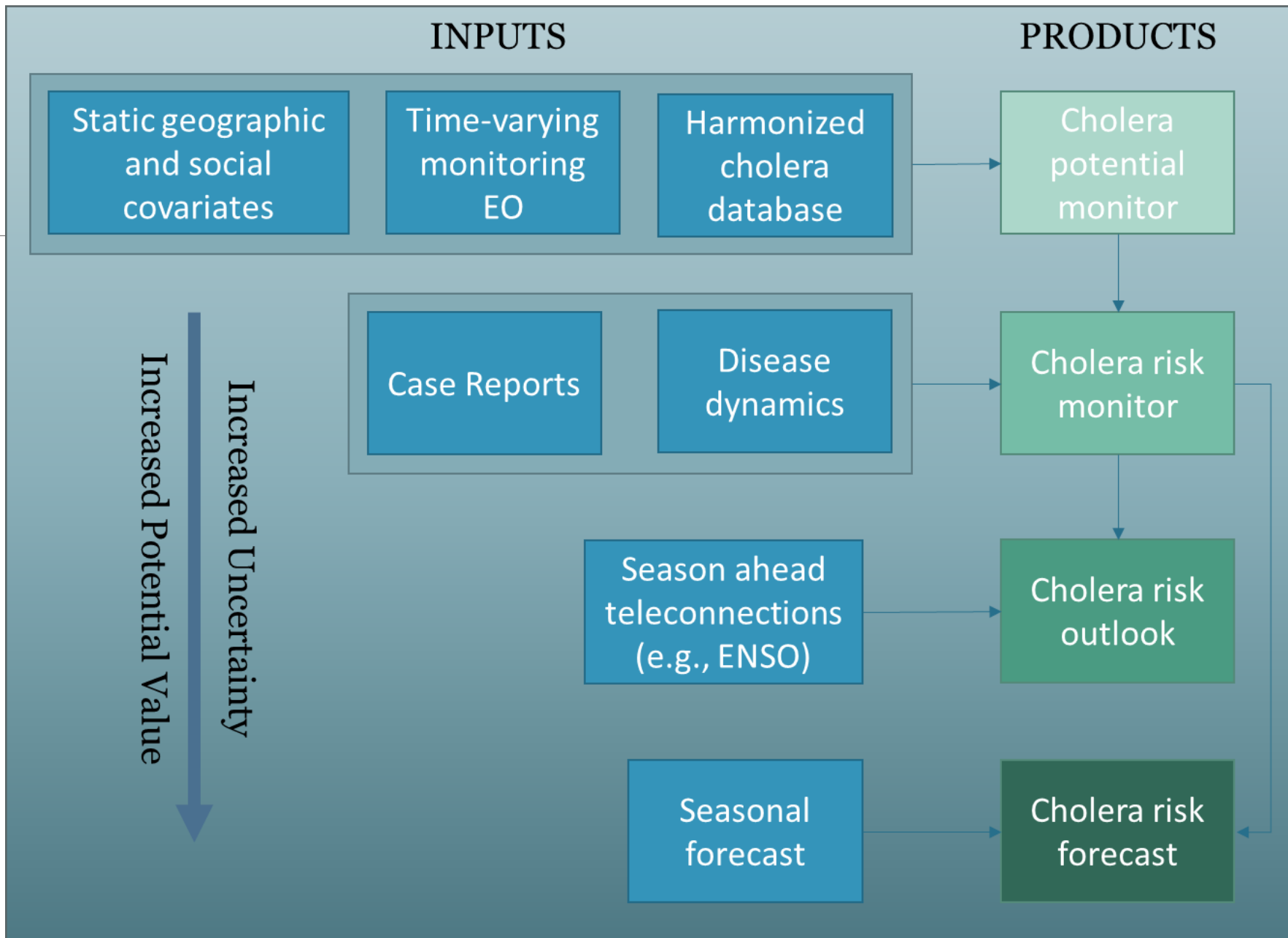
PI: BENJAMIN ZAITCHIK, JOHNS HOPKINS UNIVERSITY
CO-I: JUSTIN LESSLER, JOHNS HOPKINS UNIVERSITY
CO-I: ANDREW AZMAN, JOHNS HOPKINS UNIVERSITY
CO-I: SEAN MOORE, NOTRE DAME UNIVERSITY
COLLABORATOR: EMMA DIGGLE, SAVE THE CHILDREN

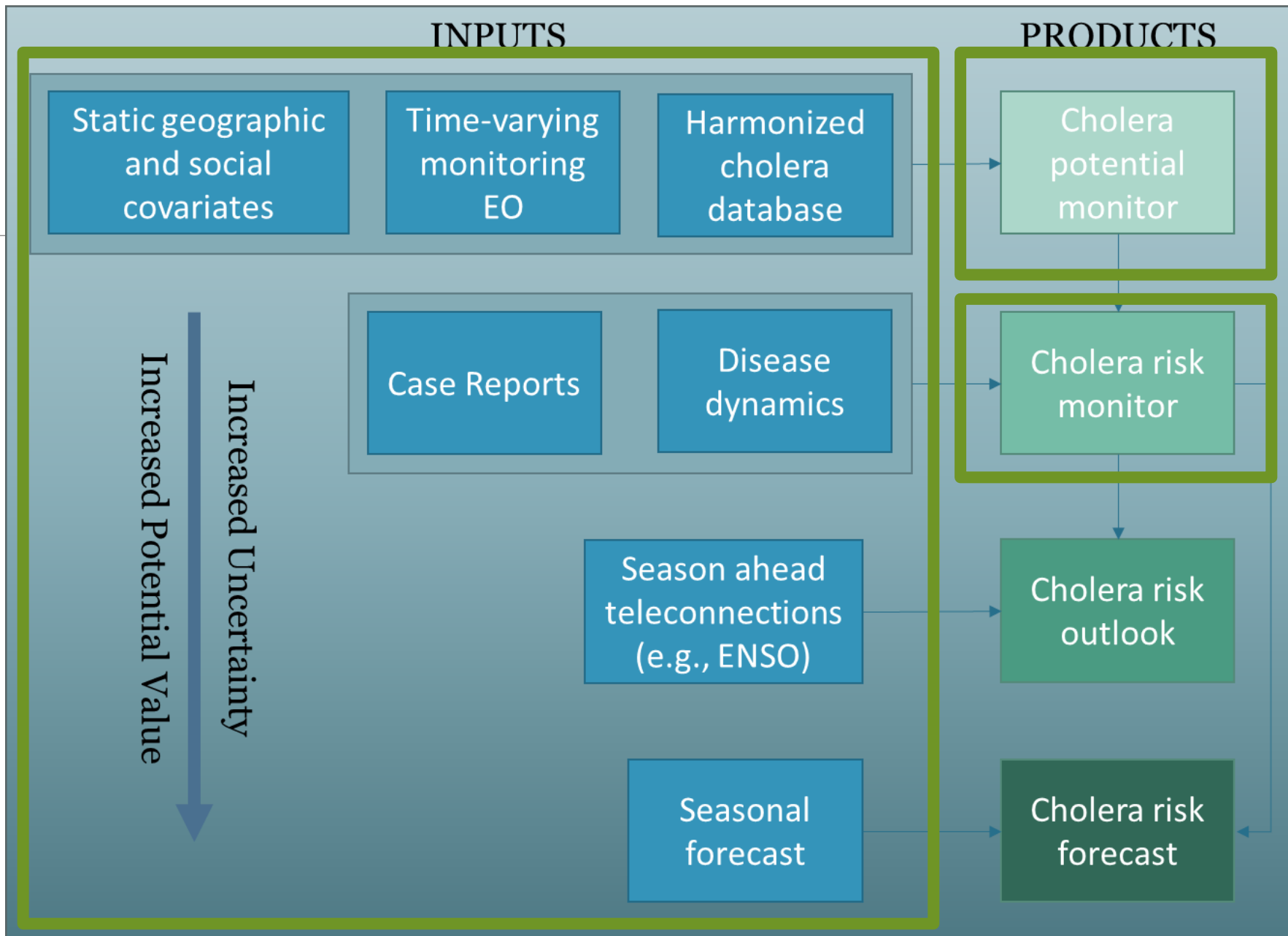


Project Goal

Develop and operationalize an **Earth Observation-informed African Cholera Risk Early Warning System (ACREWS)** to support rapid response interventions

End users: UN Taskforce on Cholera Control, Save the Children, MSF





Objectives

1. Deliver a database of spatial and temporal variability in cholera burden across the continent.
2. Align our cholera database with a matching EO database of potential cholera predictors.
3. Collaboratively design a baseline system that generates weekly maps of environmental cholera potential based on historical correlations between ENSO, rainfall, and local cholera response.
4. Enhance the system to monitor actual cholera risk using EO-informed predictive models that account for the roles of population susceptibility, spatial correlation, and introduction probability
5. Apply two seasonal prediction techniques to extend the ACREWS time horizon: an ENSO analog-based cholera risk outlook and a dynamically-based cholera risk forecast.
6. Operationalize the system for decision support through partnership with the GTFCC.

Objectives

1. Deliver a database of spatial and temporal variability in cholera burden across the continent.
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GTFCC Web Portal

The screenshot displays the 'Ethiopia Country Profile' page on the GTFCC Web Portal. The page features a navigation bar with links to Home, Glossary, Resources, Observation Collections, Countries, and Sign in. The main content area is divided into several sections:

- Data Explorer:** Includes a map of Ethiopia with various regions and cities labeled. The map is interactive, with a 'Sync Map Movement' checkbox.
- Summary Statistics:**
 - Most recent suspected case:** AFR::ETH::Sidama::Sidama::Aroresa, 2020-12-14 - 2020-12-20, OC #21136
 - Most recent confirmed case:** AFR::ETH::SNNP::Bench Maji::Debub Bench, 2020-11-30 - 2020-12-06, OC #21136
- Unified Data Sets:** A table showing WHO Annual Data for Ethiopia, with columns for Time Period, Suspected Cases, and Deaths. A 'Download Dataset' button is present.
- Observation Collections:** A table listing observation collections with columns for UID, Public?, # of observations, Tags, Earliest observation, Latest observation, Observation Frequency, and Date Created.

The 'Observation Collections' table contains the following data:

UID	Public?	# of observations	Tags	Earliest observation	Latest observation	Observation Frequency	Date Created
21136		1255	SitReps	2010-04-22	2020-12-20	Other (107)	2020-11-02

GTFCC Web Portal

Compare Figures and Maps

Sync maps

Maps

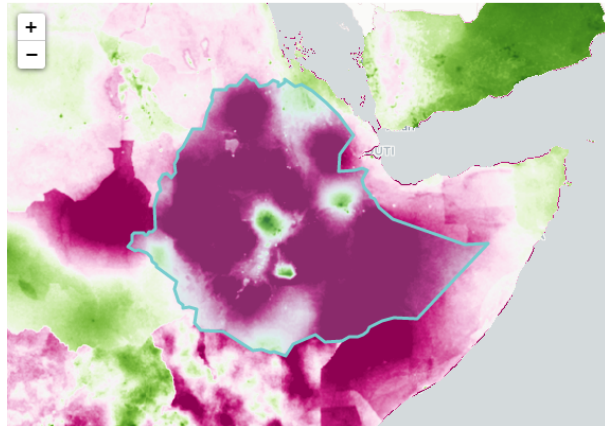
Sanitation access

Water access

Cases

Rates

Clear overlays



Modeled estimate of the percent of the population with access to improved water in 2017 (5 km x 5 km grid)
Source: Institute for Health Metrics and Evaluation, [https://doi.org/10.1016/S2214-109X\(20\)30278-3](https://doi.org/10.1016/S2214-109X(20)30278-3)

Figures

Maps

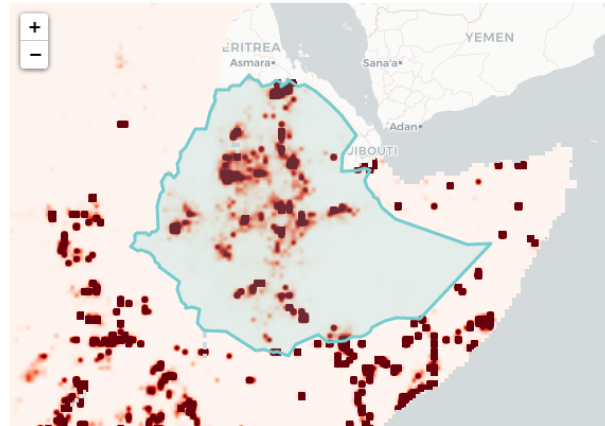
Sanitation access

Water access

Cases

Rates

Clear overlays



Modeled estimate of mean annual suspect cholera cases from 2010-2016 (20 km x 20 km grid)
Source: Johns Hopkins Infectious Disease Dynamics Group, [https://doi.org/10.1016/S0140-6736\(17\)33050-7](https://doi.org/10.1016/S0140-6736(17)33050-7)

Figures

GTFCC Web Portal

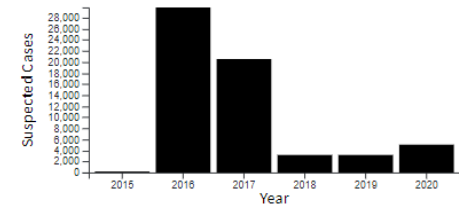
Compare Figures and Maps

Maps

- Sanitation access
- Water access
- Cases
- Rates
- Clear overlays

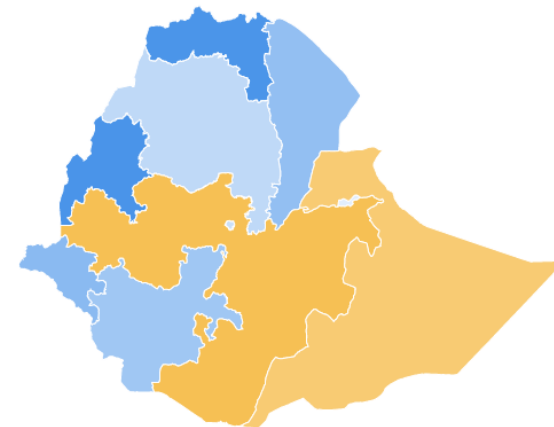
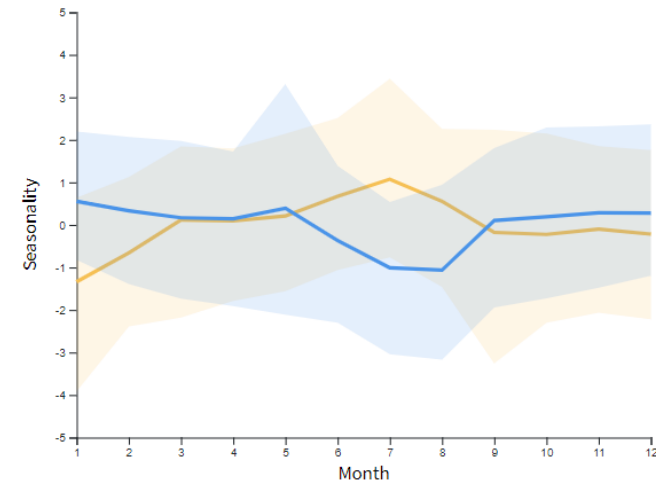
Modeled estimate of the percent of the population with water access in 2017 (5 km x 5 km grid)
Source: Institute for Health Metrics and Evaluation, PLoS ONE 109X(20)30278-3

Cases



Annual suspect cholera cases reported nationally
Source: Ethiopian Public Health Institute

Seasonality



Modeled estimate of monthly seasonality in suspect cholera occurrence from 2015-2019. Colors represent geographic groupings (map) with similar monthly seasonal patterns (line chart).
Source: Johns Hopkins Infectious Disease Dynamics Group

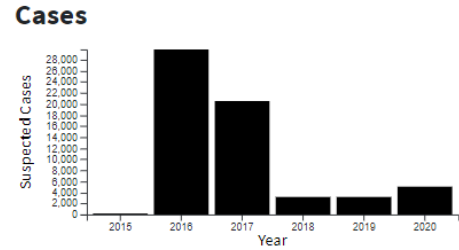
GTFCC Web Portal

Compare Figures and Maps

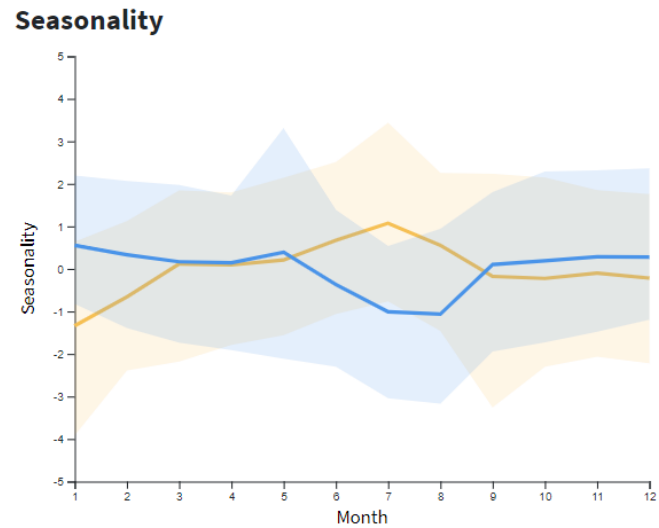
Maps

- Sanitation access
- Water access
- Cases
- Rates
- Clear overlays

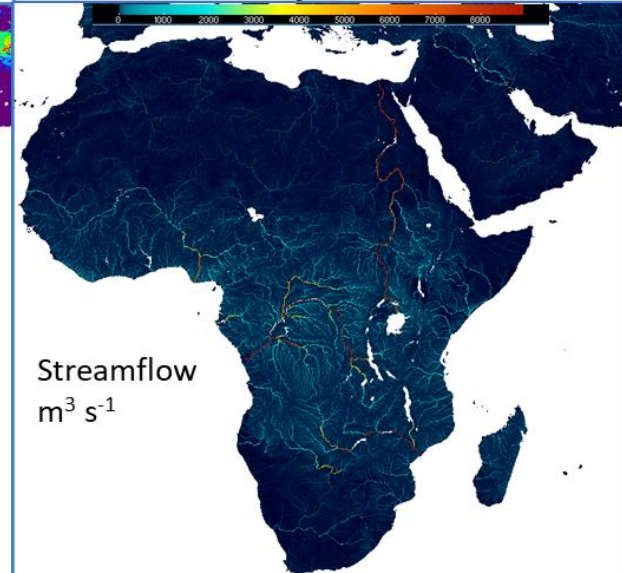
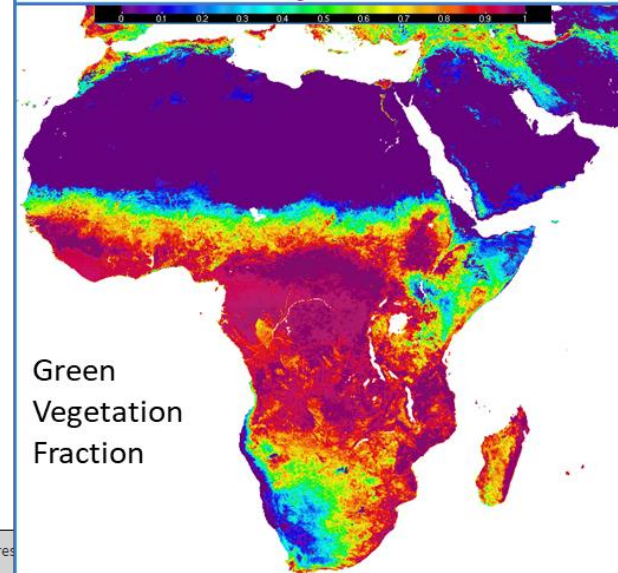
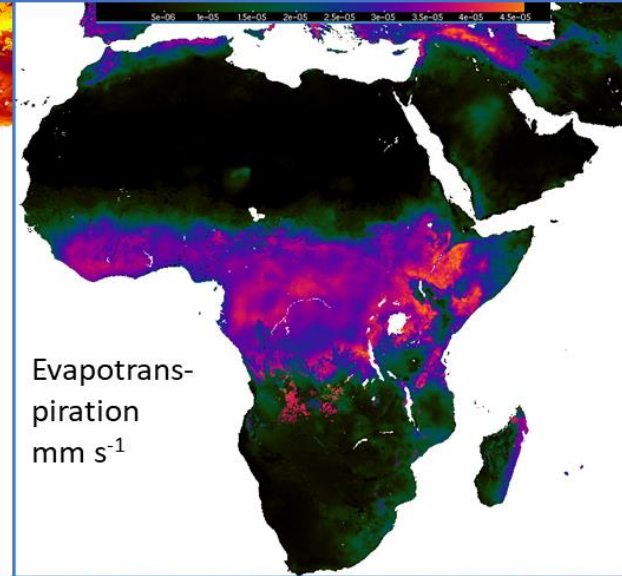
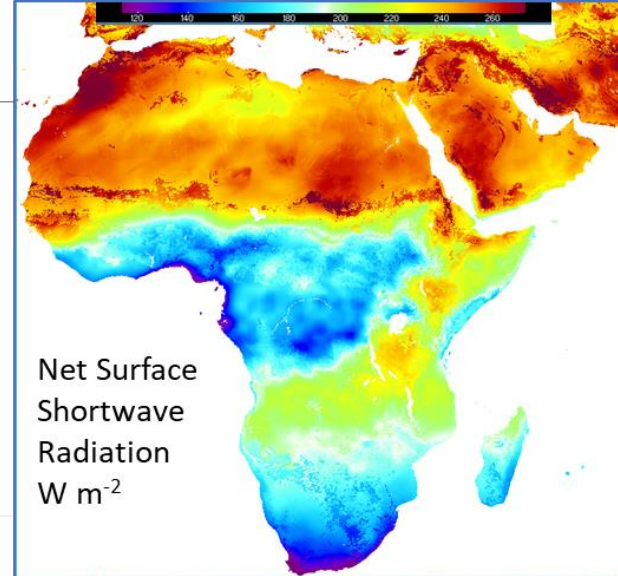
Modeled estimate of the percent of the population with sanitation and water access in 2017 (5 km x 5 km grid)
 Source: Institute for Health Metrics and Evaluation, PLoS ONE 109X(20)30278-3



Annual suspect cholera cases reported nationally
 Source: Ethiopian Public Health Institute



Modeled estimate of monthly seasonality in suspect cholera occurrence from 2015-2019. Colors represent different months.
 Source: Johns Hopkins Infectious Disease Dynamics Group

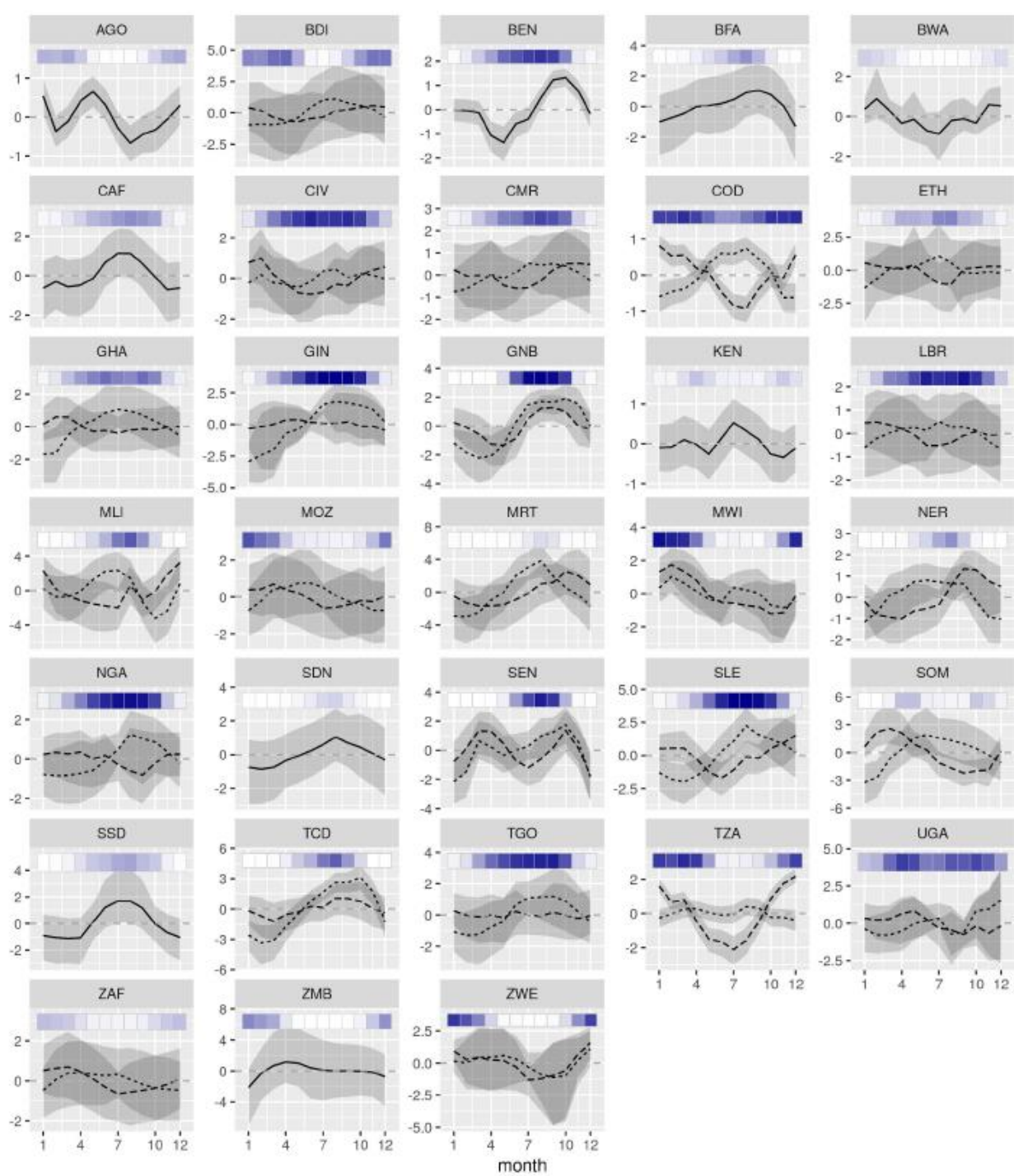


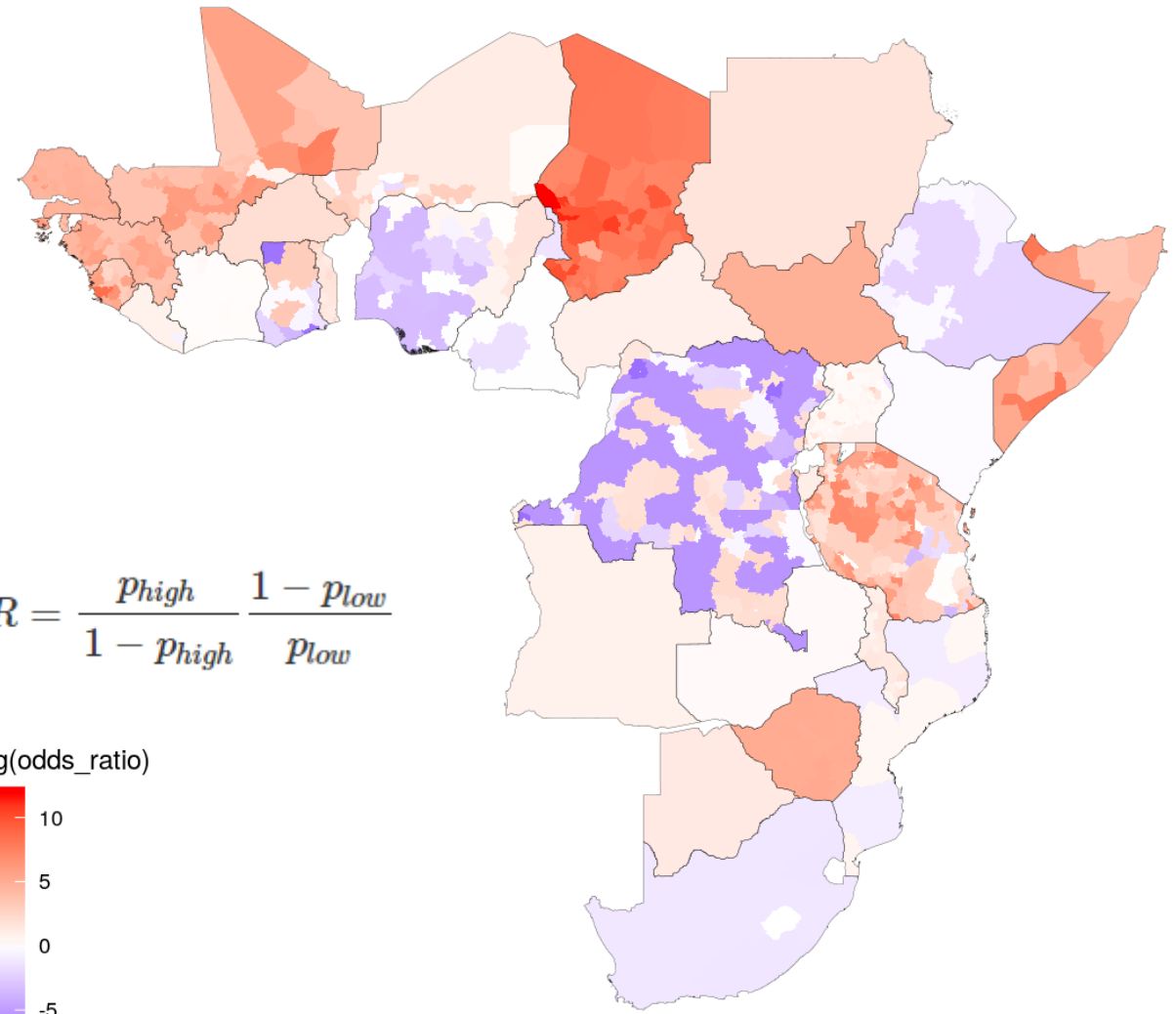
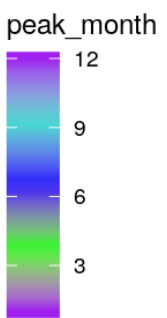
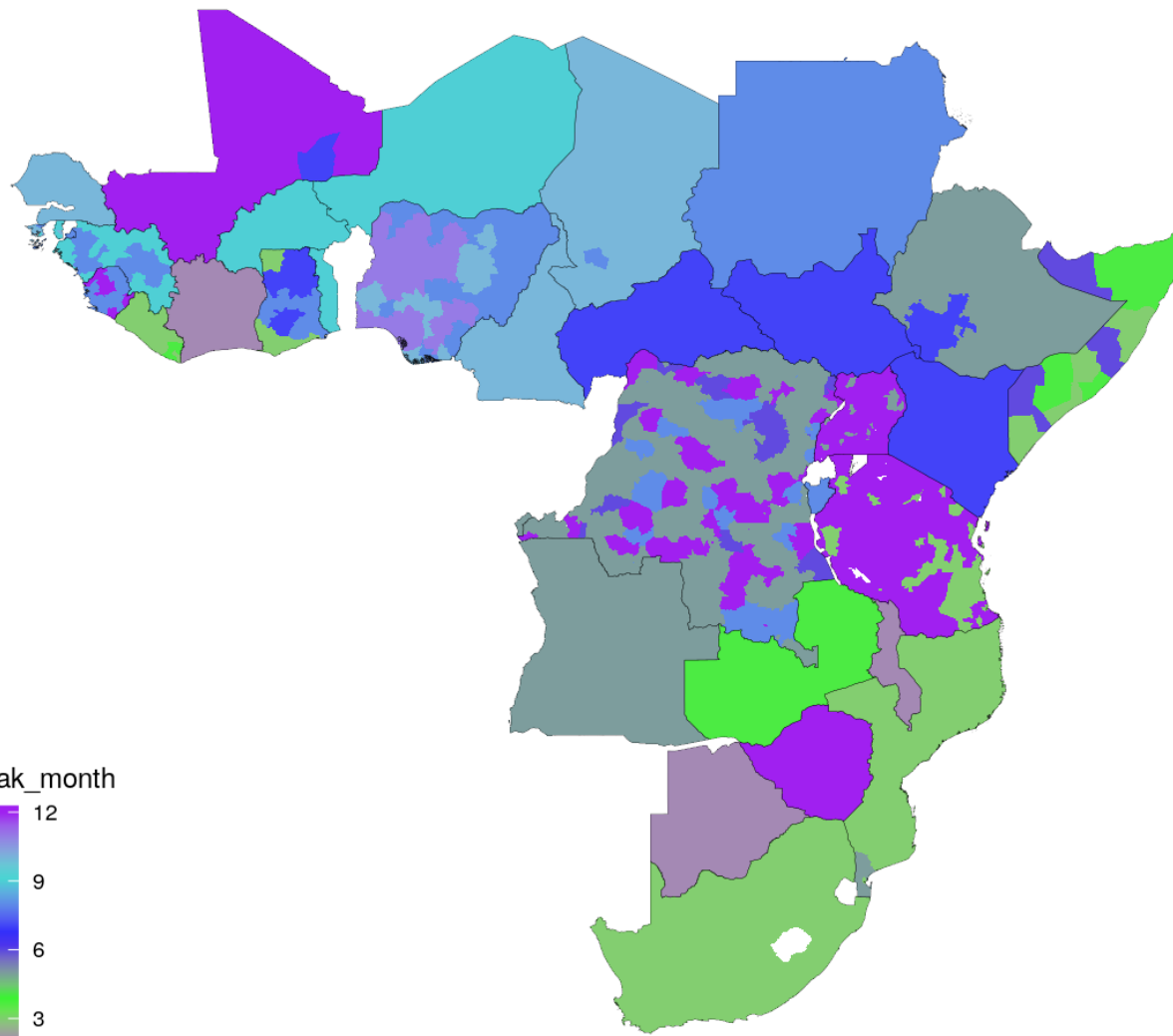
Risk modeling: seasonality

Need to account for probability of cholera and probability of detection

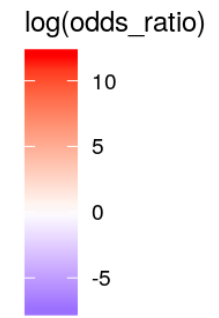
Attempt to leverage data at all administrative levels, with differing precision, data coverage, and record lengths.

Monthly random effect (logodds scale)

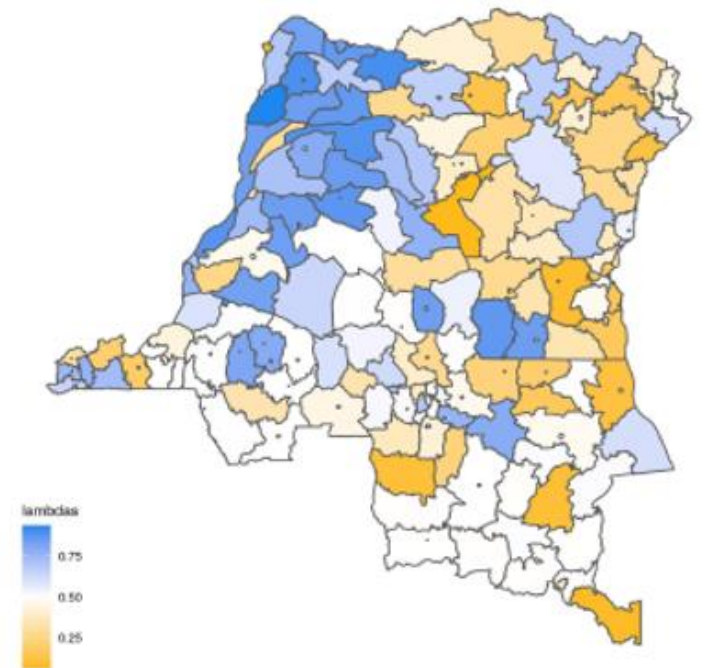
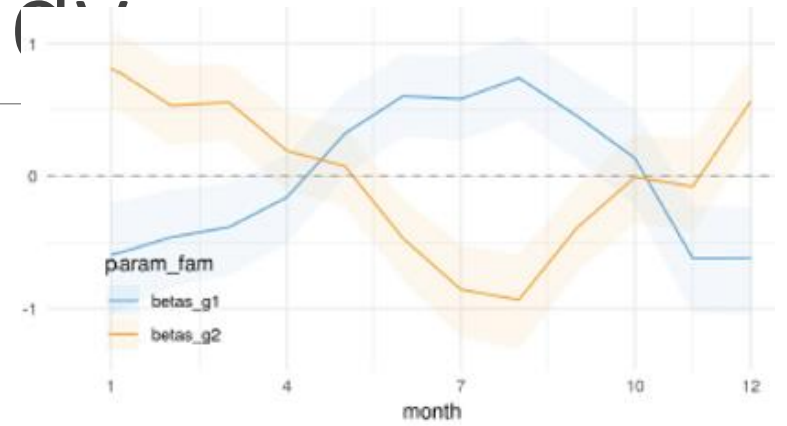
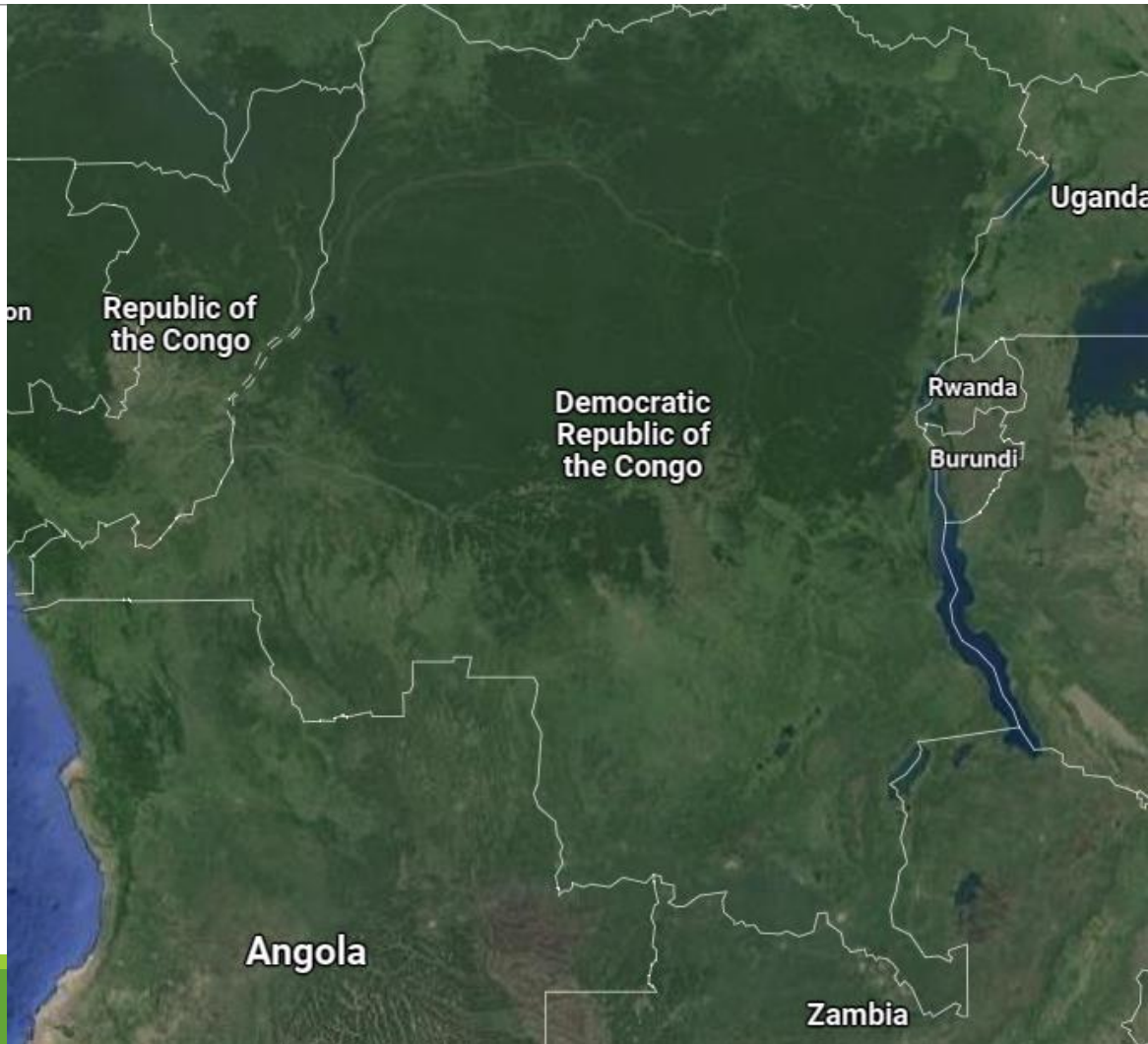




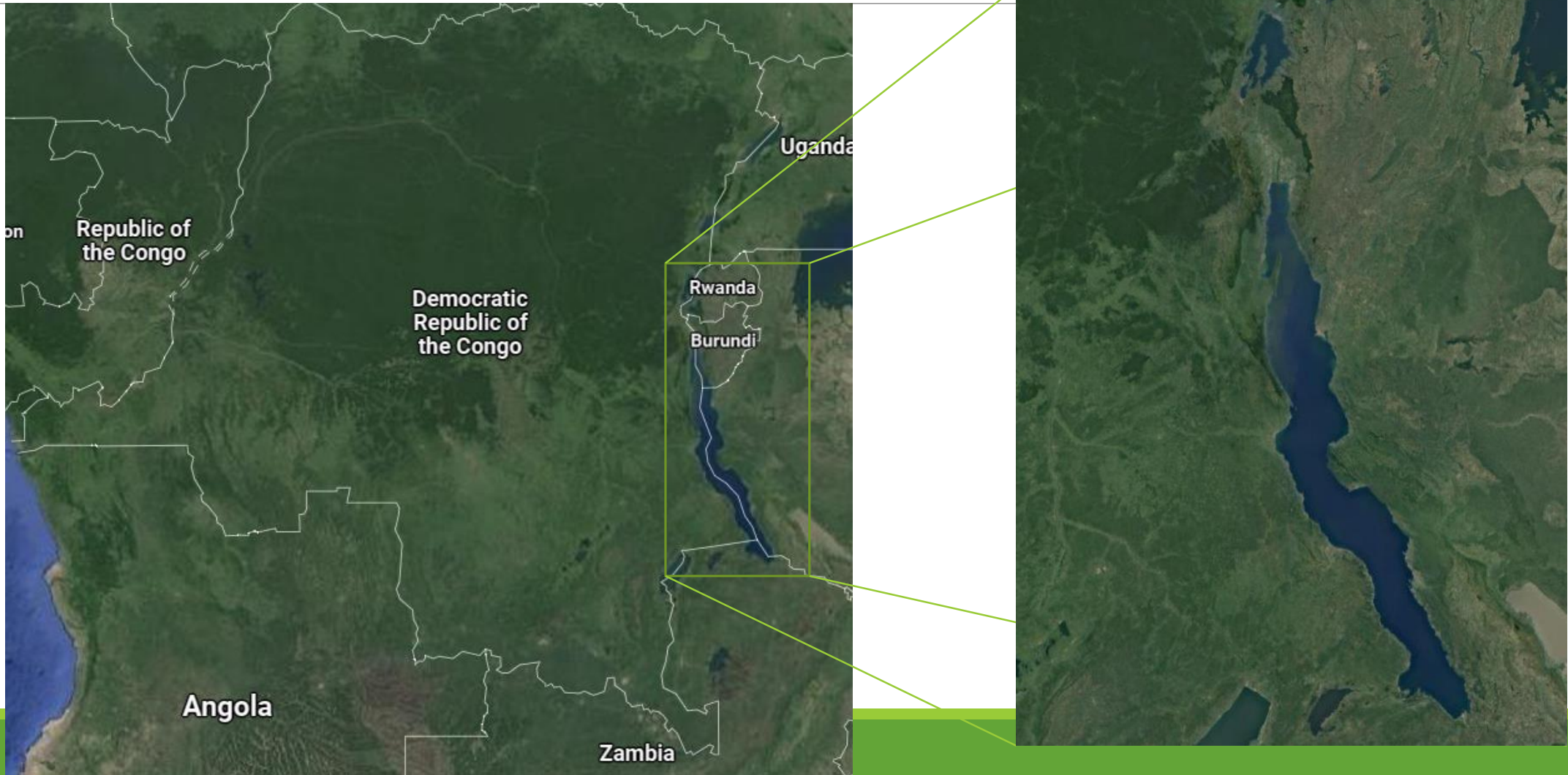
$$OR = \frac{p_{high}}{1 - p_{high}} \frac{1 - p_{low}}{p_{low}}$$



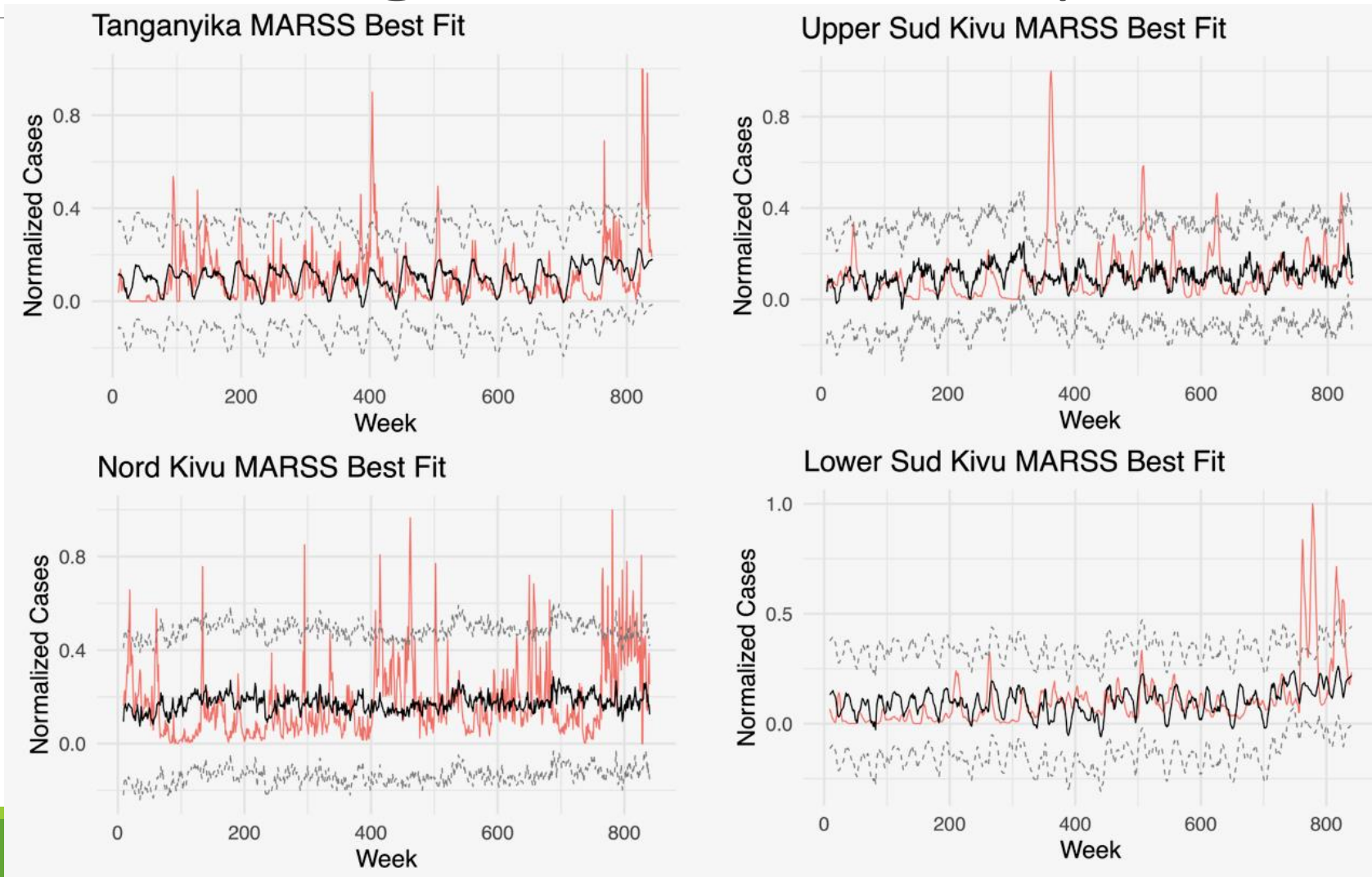
Risk modeling: DRC case study



Risk modeling: DRC case study



Risk modeling: DRC case study



Risk modeling: DRC case study

We're doing reasonably well on seasonality, but outbreaks are still a problem.

Variables that are important for the best-performing models:

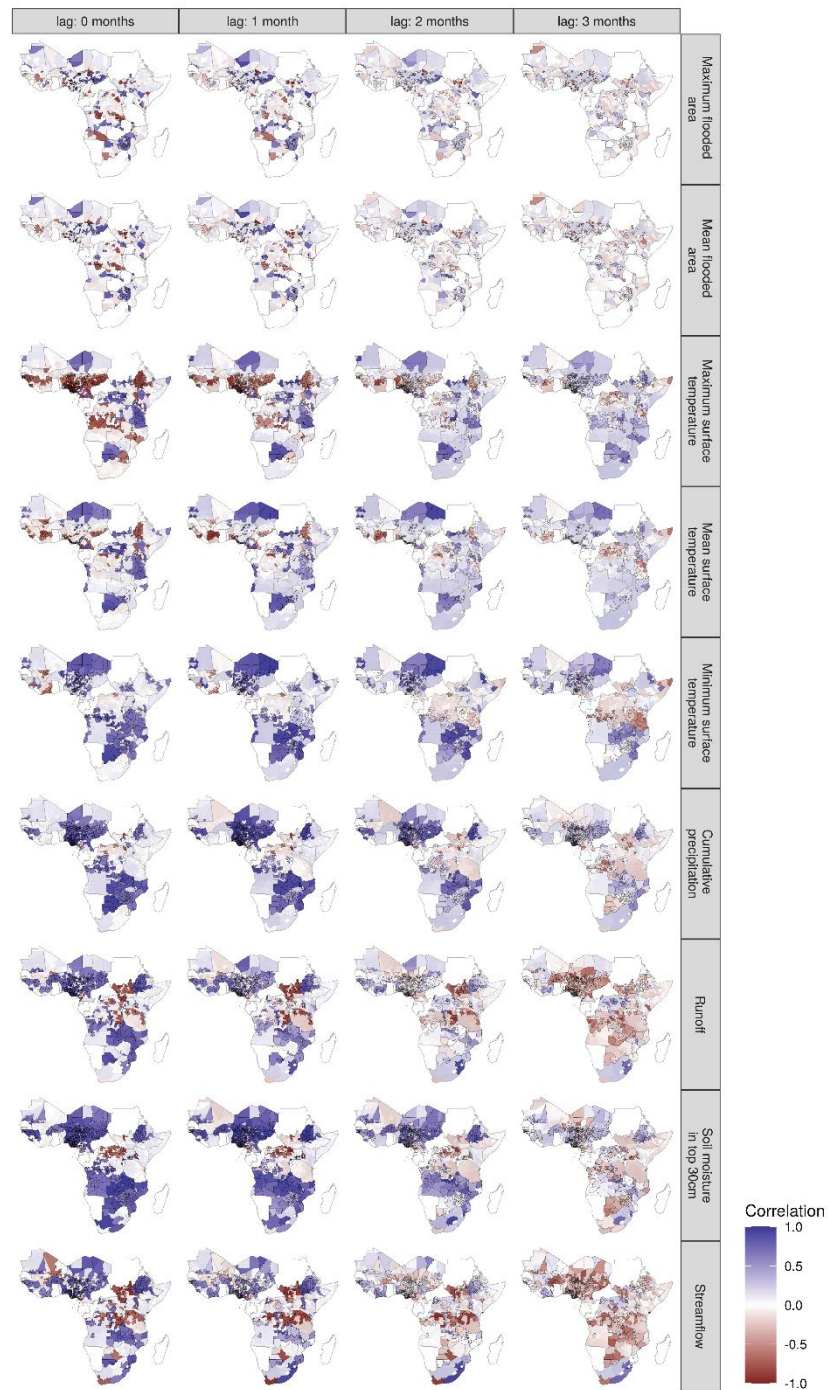
- GPM rainfall
- MERRA-2 air temperature
- Altimeter-derived lake height
- MODIS-derived Lake Surface Temperature
- FloodScan passive-microwave inundation
- Deaths from conflict in the region

Other variables that show up in reasonably good models:

- Land NDVI
- Lake chlorophyll

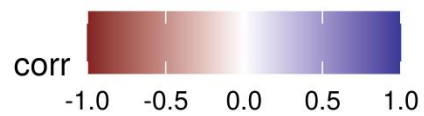
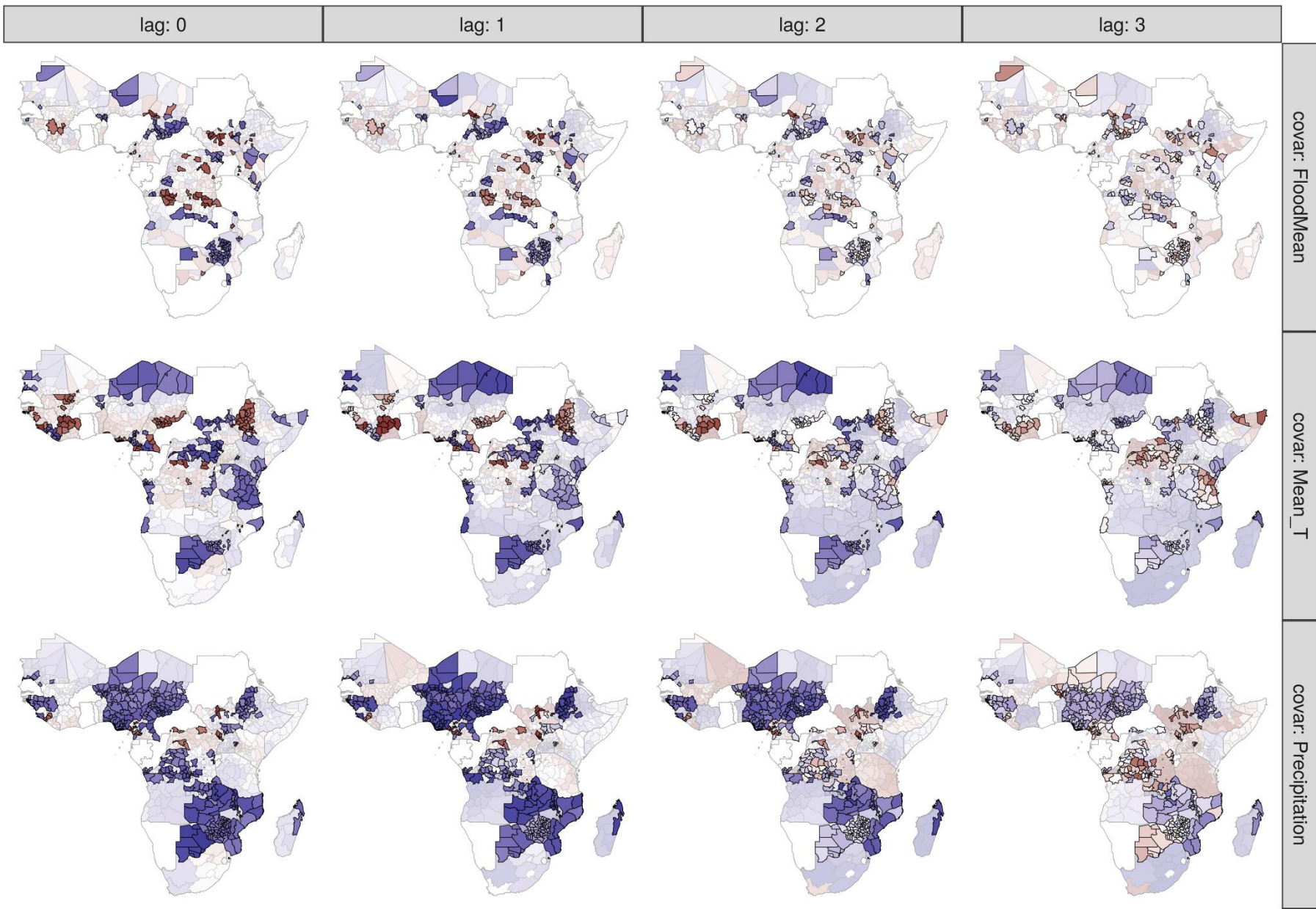
Risk modeling: continental scale

Risk modeling



21

Ris



Next steps

1. Predictive modeling using our Enteric Infectious Disease modeling framework (Bayesian GAM)
2. Introduction of season-ahead predictors
3. Continued interaction with the GTFCC to ensure that our enhancements of the information portal effectively support decision making

ARL

Current: ARL 5

Goal: ARL 8

Thank You

