WEBINAR

Preparing for the 2025 dengue season: insights from predictive models

October 31st, 2024

1 p.m. (London) SIMULTANEOUS TRANSLATION English | Portuguese | Spanish







Chair: Rachel Lowe - Research Professor, Catalan Institution for Research and Advanced Studies (ICREA) and Global Health Resilience Group Leader, Barcelona Supercomputing Centre (BSC), Spain

Claudia Codeço - Senior Researcher in Public Health, Oswaldo Cruz Foundation (Fiocruz, Rio de Janeiro), Brazil

Mauricio S. Vegas - Professor, Universidad de los Andes, Bogotá, Colombia

THE GLOBAI

Flavio Coelho - Associate professor, School of Applied Mathematics, Getulio Vargas Foundation (FGV, Rio de Janeiro), Brazil and Principal Investigator of the Mosqlimate Project

Marcela Lopes Santos - Technical consultant, General Coordination of Arbovirus Surveillance, Ministry of Health, Brazil

Registered in today's webinar

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The recording, materials and presentations will be shared on the TGHN LAC:



https://bit.ly/webinfodengue









The event

Tools

Results 00000000

Forecasting Arbovirus Diseases Dengue forecasting initiative

Flávio Codeço Coelho

Infodengue and Mosqlimate Projects

August 16, 2024



Flávio Codeço

August 16, 2024

Forecasting Arbovirus Diseases

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Dengue Dynamics

----- Casos Estimados 💼 Alerta Vermelho de 📁 Alerta Laranja — Alerta Amarelo 💳 Alerta Verde — Casos Notificados



¹Source: Infodengue project

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Epidemic Forecastir	ng		

What it is...

- Use our best knowledge to anticipate future events
- Understanding the Uncertainty in epidemics

Why Forecast?

- Dengue epidemics are increasing in intensity and geographic range.
- Largest epidemic ever in 2024, with 6.4 million cases. and 5080 confirmed deaths
- Predicting where the next epidemic will hit is important for resource allocation to reduce burden.

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Goal: Bring together experienced forecasters, to tackle dengue forecasting for 2025.

Organization:







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Participants			

- The Infodengue project ^a works closely with the Brazilian MOH to help manage arbovirus diseases, through its early warning system.
- The Mosqlimate^b project's mission: Facilitate modeling the impact of climate on the dynamics of Arboviruses
- The invited teams are collaborators of the Infodengue team with experience with dengue modelling.

Teams:

D-fense: Américo cunha (UERJ) Dobby Data: Eduardo Araújo (FGV) GeoHealth: Paula Moraga (KAUST) Global Health Resilience: Rachel Lowe (BSC) PET: Leo Bastos (PROCC-Fiocruz) Ki-Dengu Peppa: Luiz Max Carvalho (FGV) DS OKSTATE: Lucas Stolerman (OSU)

^ainfo.dengue.mat.br ^bmosqlimate.org

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The Sprint			

Main goal: provide forecasts for 2025, at state level, by:

- Organizing a community of modellers with unified goal and methods
- Or Together generate a set of independent models tested using data from previous seasons
- 3 Train ensemble model with all submissions
- Produce forecasts for 2025 using the best models, either single or combined.
- **5** Technical Report with the results
- **6** Update and monitor the performance of the models until 2025
- Organize a larger Sprint initiative in 2025.

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Mosqlimate's Forec	ast Comparison PI	atform	

The Mosqlimate platform offers data and visualization tools for tracking arbovirus forecasting experiments:

- Open datasets (climatic, demographic and case data): https://api.mosqlimate.org/datastore/
- Model Registry: https://api.mosqlimate.org/models/
- Visualization tools: https://api.mosqlimate.org/vis/dashboard
- Forecast scoring tools: https://mosqlimate.org/mosqlimate-client/

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Model Comparisons	S		

- Continuous Ranked Probability Score (CRPS)
- Log Score
- Interval Score
- Errors around regions of interest of the prediction window: epidemic onset and peak
- Scores are computed using the code available on the Mosqlient library.



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Ranking Models

Full curve challenge												
SCOPE	ALL S	TATES	A	м	C	E	G	0	P	R	м	G
TEST YEAR	2023	2024	2023	2024	2023	2024	2023	2024	2023	2024	2023	2024
GOLD	BBM	GHR	BBM	OK	DD	BBM	BBM	GHR	BBM	GHR	BBM	GH
SILVER	DD	GH	GHR	GH	BBM	GHR	KDP1	GH	KDP1	GH	DD	DD
BRONZE	KDP1	BBM	DD	GHR	GHR	GH	GHR	KDP2	DD	KDP2	KDP1	GHR
Half curve challe	enge											
SCOPE	ALL S	TATES	A	м	C	E	G	0	P	R	M	G
TEST YEAR	2023	2024	2023	2024	2023	2024	2023	2024	2023	2024	2023	2024
GOLD	BBM	GH	BBM	OK	DD	GH	BBM	GHR	BBM	GHR	BBM	GH
SILVER	DD	GHR	DD	GH	BBM	BBM	DD	GH	DD	GH	GHR	KDP2
BRONZE	GHR	ОК	GHR	KDP1	GHR	GHR	GHR	DD	KDP1	KDP2	DD	GHR
Peak size				Hono	rable I	Mentic	ns					
SCOPE	ALL S	TATES										
TEST YEAR	2023	2024		DD	predic	ted pe	ak incr	ease in	most	states		
COLD	-	CUD		CHD 4	KDD		at a luc ma	odistas	d the in			

in 2024 in MG

DOI 10.5281/zenodo.13367301

Sprint Report

KDP1 GH

BBM KDP2

SILVER

BRONZE



Forecasting Arbovirus Diseases

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Ensemble Model			

The ensemble forecast model, combining the best, models submitted, was built as a Stacking Regression model²

- Trained on 2 Scenarios:
 - 2023-like: medium to high transmission
 - 2024-like: high to very high transmission



https://github.com/rasbt/mlxtend

 2 https://statistics.berkeley.edu/sites/default/files/tech-reports/367.pdf $\equiv \circ \circ$

Flávio Codeço

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For the full results:



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Predicted Median Incidence per 100 thousand

Predicted median dengue **incidence** per 100 thousand inhabitants in 2025 (from EW 41 of 2024 to EW 40 of 2025). Both scenarios.

State	Ensemble 2023	Ensemble 2024	Acum. Incidence in 2	0
AL	681.25	500.97	484.0	
BA	463.08	707.4	1688.66	
CE	186.05	186.05	152.78	
MA	88.08	149.14	157.48	
PB	357.6	379.62	343.07	
PE	455.28	484.6	361.47	
PI	214.34	389.71	454.97	
SE	158.98	241.5	154.8	
RN	487.92	719.22	550.82	
SP	1645.58	5421.43	4725.89	
MG	1519.4	6478.22	8551.89	
RJ	552.66	3314.83	1940.8	
ES	2175.62	3294.17	1707.82	
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State	Ensemble 2023	Ensemble 2024	Acum. Incidence in 20
AM	173.01	250.79	268.87
AP	177.98	191.54	1155.15
ТО	865.1	579.08	416.82
RR	247.08	293.4	87.8
RO	408.03	466.29	348.34
AC	886.19	1234.07	1249.49
PA	139.18	187.98	239.7
DF	876.8	892.38	10400.08
GO	1867.66	2560.25	4895.45
MT	643.9	1055.63	1185.25
MS	1701.6	1050.31	724.73
RS	981.52	981.52	1803.75
SC	2054.05	2054.05	5128.36
PR	5110.72	17374.19	5871.73

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