

Ministério da Saúde

FIOCRUZ

Fundação Oswaldo Cruz



Syndromic surveillance of arboviruses and respiratory infections

Marcelo F C Gomes

MAVE: Grupo de Métodos Analíticos em Vigilância Epidemiológica
(PROCC/Fiocruz e EMap/FGV)

Fiocruz, PROCC



Geral

Chega a 100 o número de mortes confirmadas no Rio Grande do Sul

Chuvas deixam mais de 163 mil desabrigados e 63,7 mil desalojados





<https://www.vakinha.com.br/vaquinha/a-maior-campanha-solidaria-do-rs>



O que está procurando?



Explorar



Criar Vaquinha

TRAGÉDIAS / DESASTRES / ACIDENTES

A Maior Campanha Solidária do RS

ID: 4712837



Arrecadado

R\$ 59.801.779,00

Meta

R\$ 80.000.000,00

Apoiadores

1109752

Você e a vaquinha concorrem a R\$ 15 MIL

Doe e concorra



Porto Alegre / RS
Ativo(a) no Vakinha desde março/2023

COMPARTILHE ESTA VAQUINHA

<https://www.vakinha.com.br/4712837>

Copiar



S.O.S CHUVAS RIO GRANDE DO SUL

**A CUFA BRASIL E A FRENTE NACIONAL ANTIRRACISTA
JUNTO COM A TICKET ESTÃO UNINDO ESFORÇOS
PARA AJUDAR QUEM MAIS PRECISA.**



DOE PELO PIX:

DOACOES@CUFA.ORG.BR



PIX

SOS RIO GRANDE DO SUL



Leia o QR Code

Ajude doando qualquer valor

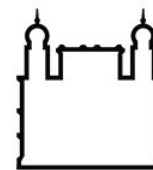
Chave pix (CNPJ) : 92.958.800/0001-38

Instituição: Banrisul



UNIDOS PELO RIO GRANDE DO SUL

Poder público, sociedade e empresas em apoio às vítimas das chuvas



FIOCRUZ

fiocruz.colabore.org/unidosporRioGrandedoSul

Message from a friend and colleague from the
Lab for public health surveillance in Rio Grande do
Sul:

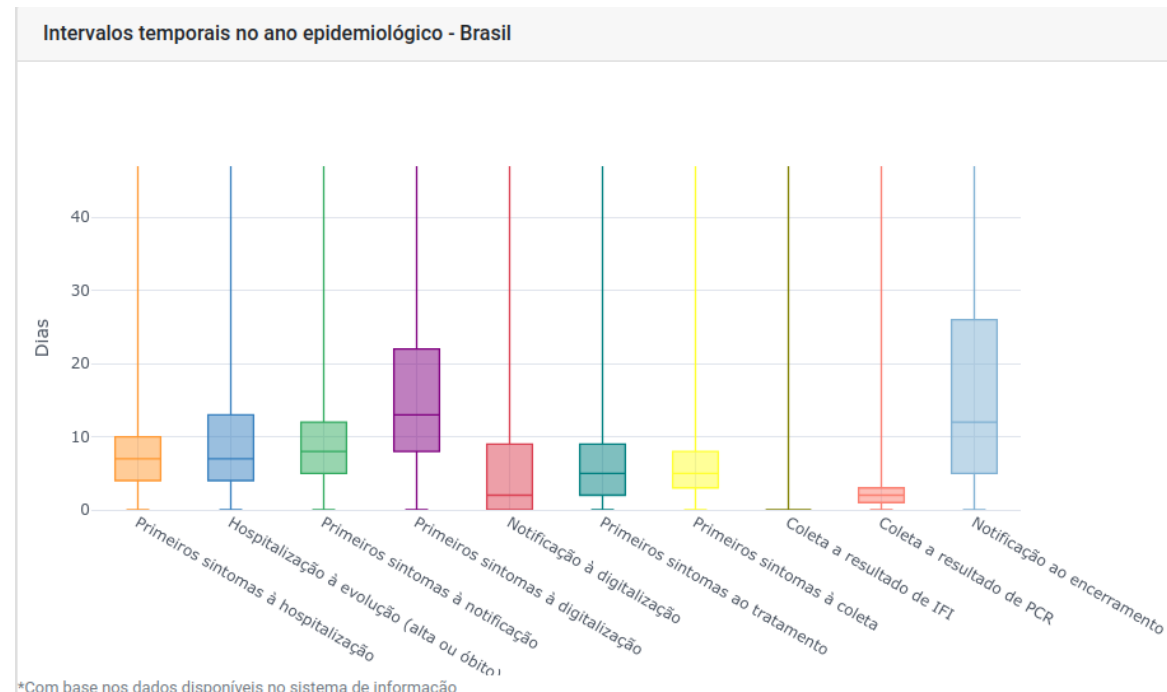
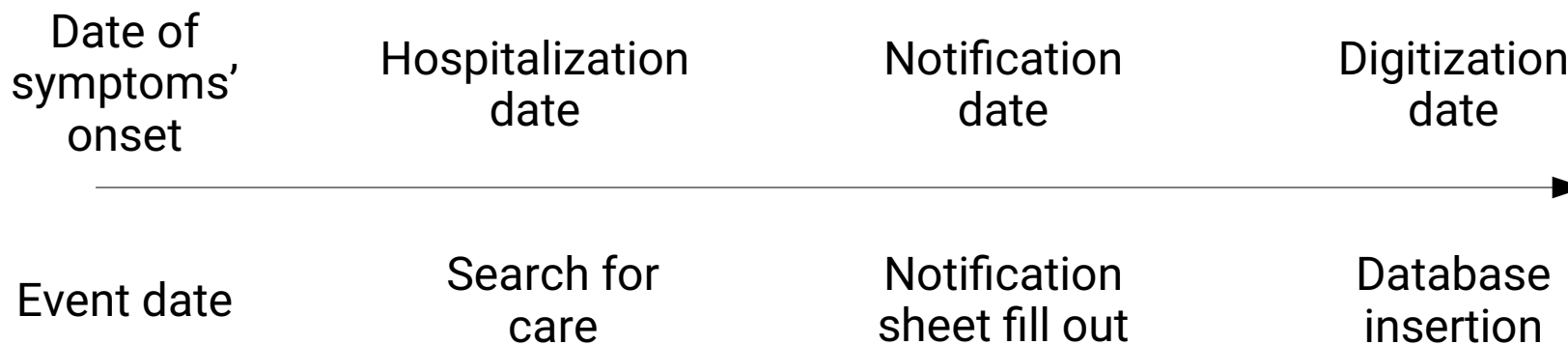
Desculpa trazer um problema pessoal aqui, mas
não estou vendo outra alternativa no momento e
eu e minha família não conseguimos ajudar mais.
Tenho 3 primos que perderam as casas. Uma tem
um bebê, e um deles foi pra um abrigo com a
esposa.

Estou fazendo uma vaquinha para ajudar
financeiramente. Se vcs souberem de alguém que
queira ajudar, deixo meu pix aqui.

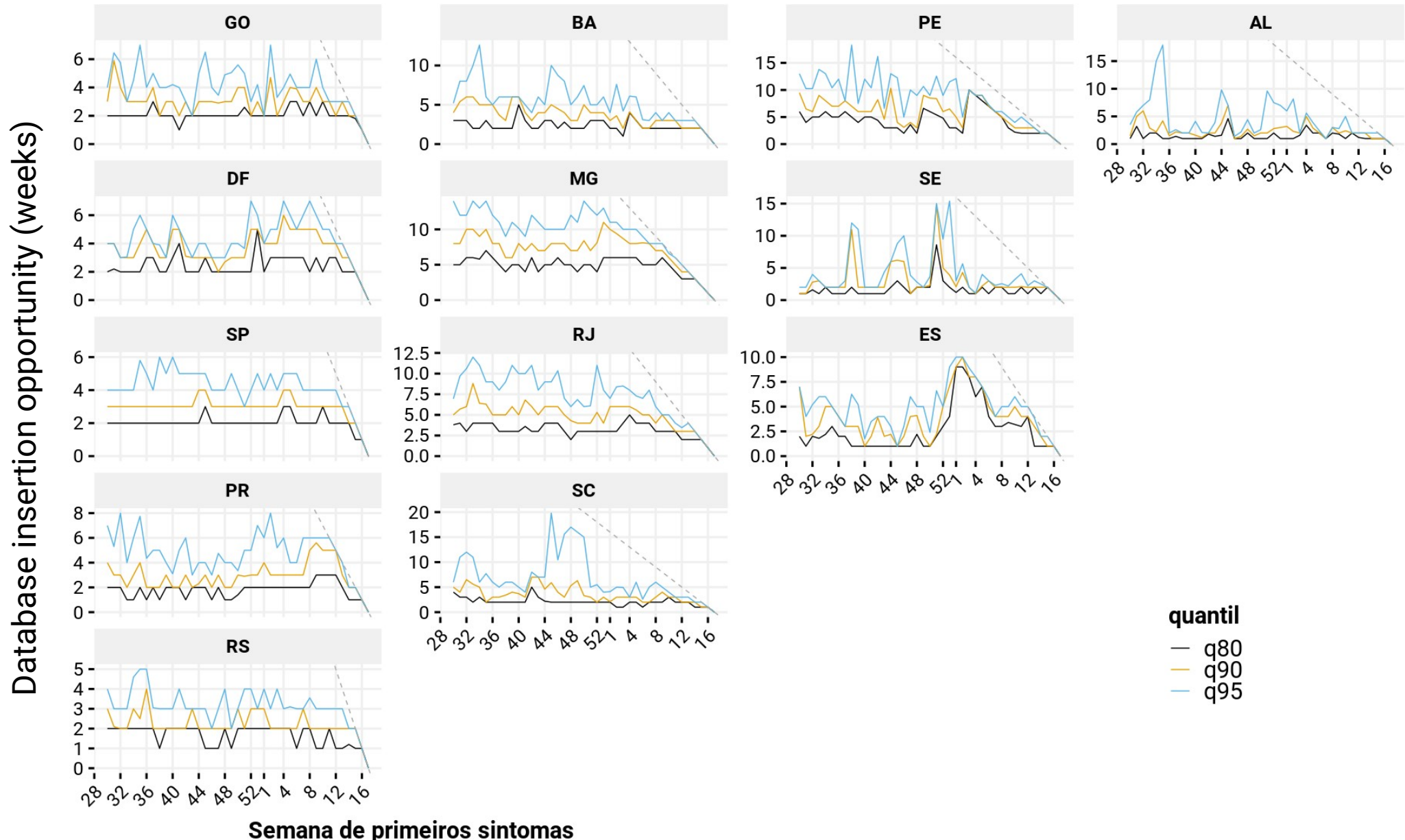
CPF 49150081004 Tatiana Gregianini

Epi surveillance and the need of nowcasting models

Challenge: time to database insertion (backfill)

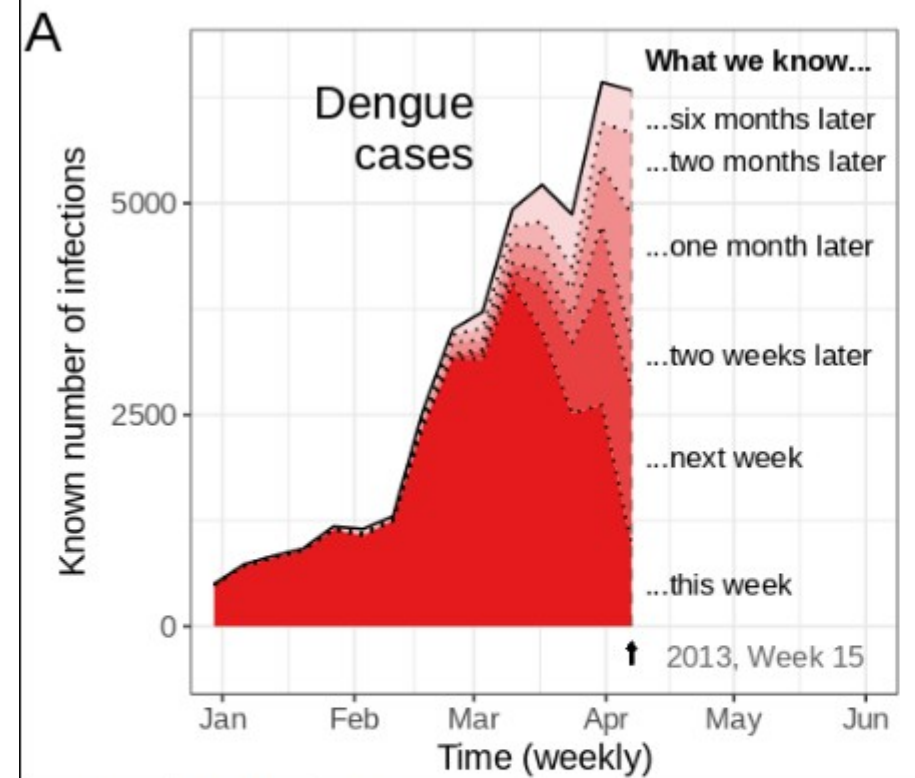
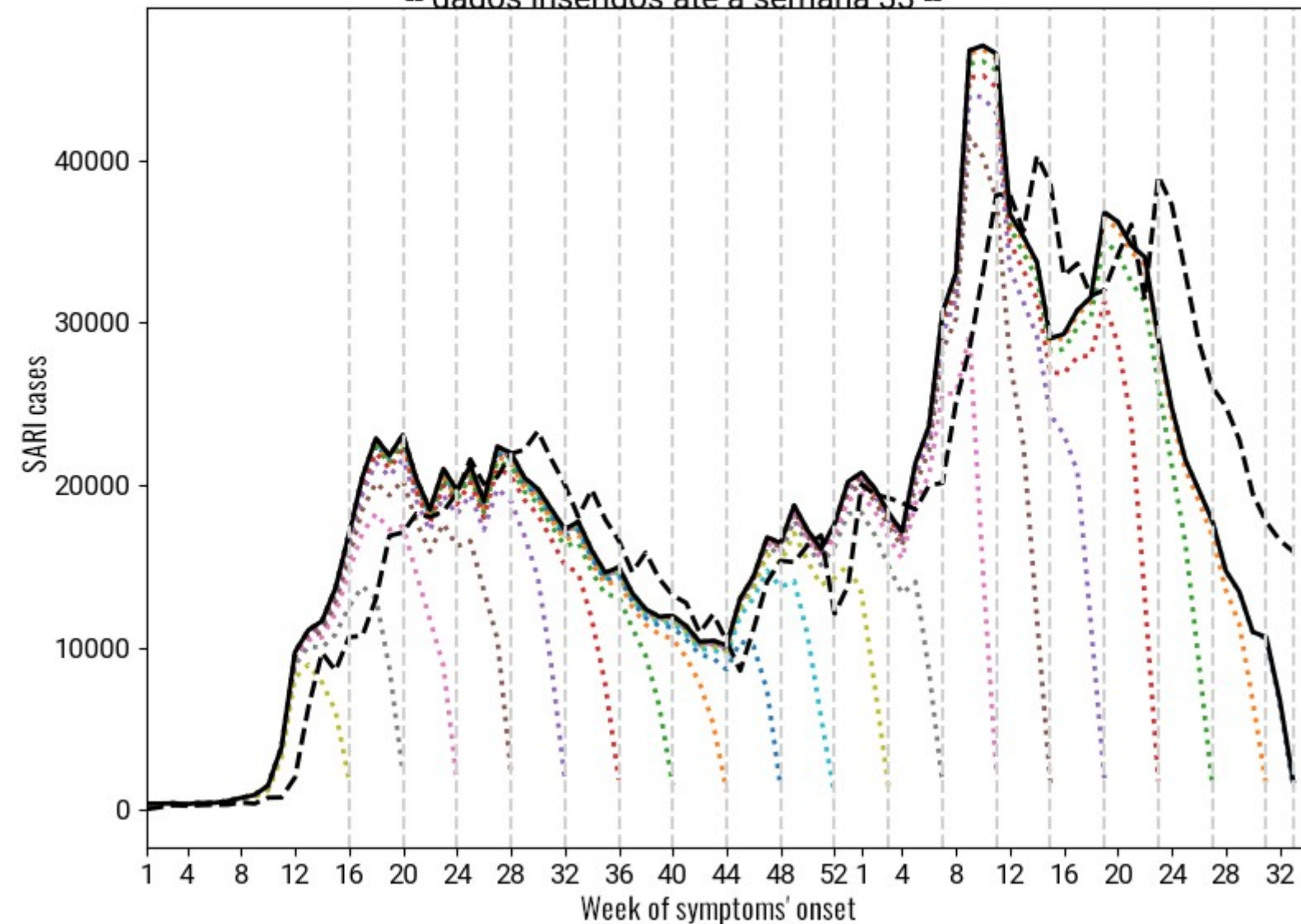


Challenge: time to database insertion (backfill)



Challenge: from time of event to database entry

SRAG no Brasil
-- dados inseridos até a semana 33 --



Challenge: from time of event to database entry

Time	0	1	2	...	D-2	D-1	D	N	
1	$n_{1,0}$	$n_{1,1}$	$n_{1,2}$...	$n_{1,D-2}$	$n_{1,D-1}$	$n_{1,D}$	N_1	Observations
2	$n_{2,0}$	$n_{2,1}$	$n_{2,2}$...	$n_{2,D-2}$	$n_{2,D-1}$	$n_{2,D}$	N_2	
3	$n_{3,0}$	$n_{3,1}$	$n_{3,2}$...	$n_{3,D-2}$	$n_{3,D-1}$	$n_{3,D}$	N_3	
⋮	⋮	⋮	⋮	⋮	⋮	⋮	⋮	⋮	
T-D	$n_{T-D,0}$	$n_{T-D,1}$	$n_{T-D,2}$...	$n_{T-D,D-2}$	$n_{T-D,D-1}$	$n_{T-D,D}$	N_{T-D}	Nowcasting
T-D+1	$n_{T-D+1,0}$	$n_{T-D+1,1}$	$n_{T-D+1,2}$...	$n_{T-D+1,D-2}$	$n_{T-D+1,D-1}$	$n_{T-D+1,D}$	N_{T-D+1}	
T-D+2	$n_{T-D+2,0}$	$n_{T-D+2,1}$	$n_{T-D+2,2}$...	$n_{T-D+2,D-2}$	$n_{T-D+2,D-1}$	$n_{T-D+2,D}$	N_{T-D+2}	
T-2	$n_{T-2,0}$	$n_{T-2,1}$	$n_{T-2,2}$...	$n_{T-2,D-2}$	$n_{T-2,D-1}$	$n_{T-2,D}$	N_{T-2}	Forecasting
T-1	$n_{T-1,0}$	$n_{T-1,1}$	$n_{T-1,2}$...	$n_{T-1,D-2}$	$n_{T-1,D-1}$	$n_{T-1,D}$	N_{T-1}	
T	$n_{T,0}$	$n_{T,1}$	$n_{T,2}$...	$n_{T,D-2}$	$n_{T,D-1}$	$n_{T,D}$	N_T	
T+1	$n_{T+1,0}$	$n_{T+1,1}$	$n_{T+1,2}$...	$n_{T+1,D-2}$	$n_{T+1,D-1}$	$n_{T+1,D}$	N_{T+1}	Forecasting
T+2	$n_{T+2,0}$	$n_{T+2,1}$	$n_{T+2,2}$...	$n_{T+2,D-2}$	$n_{T+2,D-1}$	$n_{T+2,D}$	N_{T+2}	
⋮	⋮	⋮	⋮	⋮	⋮	⋮	⋮	⋮	
T+K	$n_{T+K,0}$	$n_{T+K,1}$	$n_{T+K,2}$...	$n_{T+K,D-2}$	$n_{T+K,D-1}$	$n_{T+K,D}$	N_{T+K}	

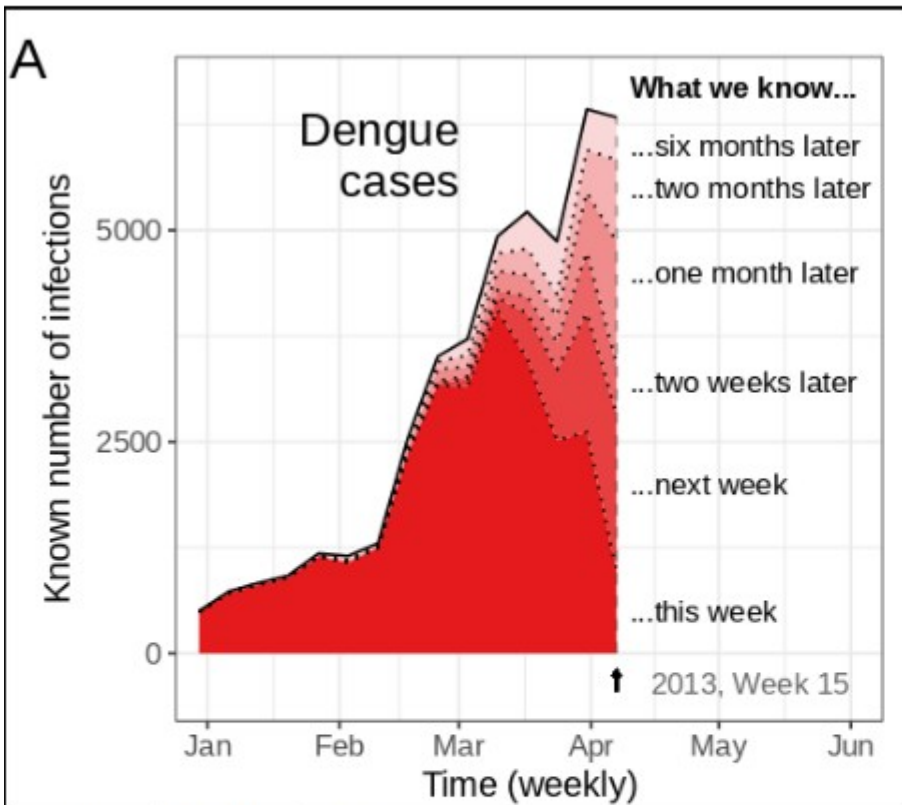
$$n_{t,d} \sim \text{NegBin}(\lambda_{t,d}, \phi), \lambda_{t,d} > 0, \phi > 0$$

$$\log(\lambda_{t,d}) = \mu + \alpha_t + \beta_d$$

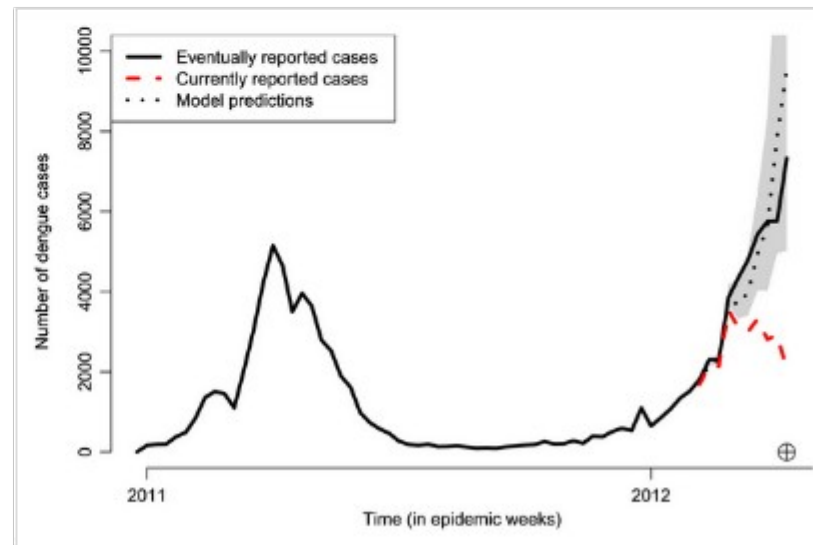
Bastos, LS, Economou, T, Gomes, MFC, et al.

A modelling approach for correcting reporting delays in disease surveillance data. *Statistics in Medicine*. 2019; 38: 4363– 4377.

<https://doi.org/10.1002/sim.8303>



Time	0	1	2	...	D-2	D-1	D	N	
1	$n_{1,0}$	$n_{1,1}$	$n_{1,2}$...	$n_{1,D-2}$	$n_{1,D-1}$	$n_{1,D}$	N_1	Observations
2	$n_{2,0}$	$n_{2,1}$	$n_{2,2}$...	$n_{2,D-2}$	$n_{2,D-1}$	$n_{2,D}$	N_2	
3	$n_{3,0}$	$n_{3,1}$	$n_{3,2}$...	$n_{3,D-2}$	$n_{3,D-1}$	$n_{3,D}$	N_3	
...									
T-D	$n_{T-D,0}$	$n_{T-D,1}$	$n_{T-D,2}$...	$n_{T-D,D-2}$	$n_{T-D,D-1}$	$n_{T-D,D}$	N_{T-D}	Nowcasting
T-D+1	$n_{T-D+1,0}$	$n_{T-D+1,1}$	$n_{T-D+1,2}$...	$n_{T-D+1,D-2}$	$n_{T-D+1,D-1}$	$n_{T-D+1,D}$	N_{T-D+1}	
T-D+2	$n_{T-D+2,0}$	$n_{T-D+2,1}$	$n_{T-D+2,2}$...	$n_{T-D+2,D-2}$	$n_{T-D+2,D-1}$	$n_{T-D+2,D}$	N_{T-D+2}	
T-2	$n_{T-2,0}$	$n_{T-2,1}$	$n_{T-2,2}$...	$n_{T-2,D-2}$	$n_{T-2,D-1}$	$n_{T-2,D}$	N_{T-2}	Forecasting
T-1	$n_{T-1,0}$	$n_{T-1,1}$	$n_{T-1,2}$...	$n_{T-1,D-2}$	$n_{T-1,D-1}$	$n_{T-1,D}$	N_{T-1}	
T	$n_{T,0}$	$n_{T,1}$	$n_{T,2}$...	$n_{T,D-2}$	$n_{T,D-1}$	$n_{T,D}$	N_T	
T+1	$n_{T+1,0}$	$n_{T+1,1}$	$n_{T+1,2}$...	$n_{T+1,D-2}$	$n_{T+1,D-1}$	$n_{T+1,D}$	N_{T+1}	Forecasting
T+2	$n_{T+2,0}$	$n_{T+2,1}$	$n_{T+2,2}$...	$n_{T+2,D-2}$	$n_{T+2,D-1}$	$n_{T+2,D}$	N_{T+2}	
...									
T+K	$n_{T+K,0}$	$n_{T+K,1}$	$n_{T+K,2}$...	$n_{T+K,D-2}$	$n_{T+K,D-1}$	$n_{T+K,D}$	N_{T+K}	



Received: 15 May 2018 | Revised: 13 May 2019 | Accepted: 3 June 2019
 DOI: 10.1002/sim.8303

RESEARCH ARTICLE

WILEY *Statistics in Medicine*

A modelling approach for correcting reporting delays in disease surveillance data

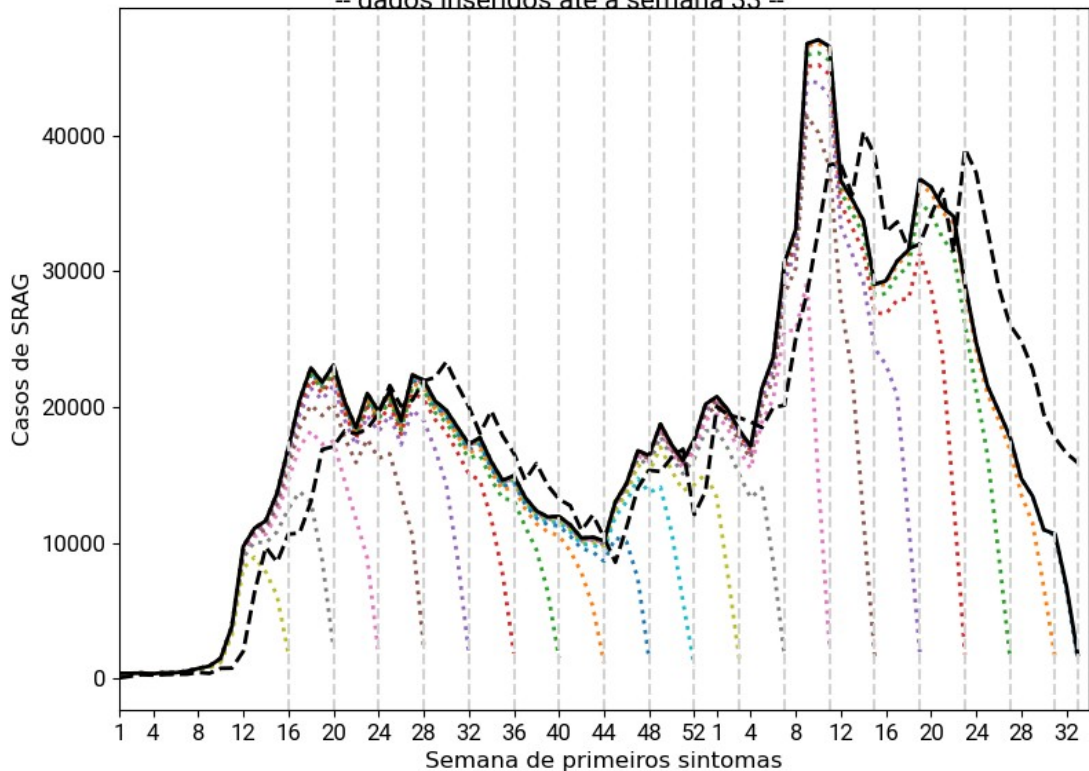
Leonardo S Bastos¹ | Theodoros Economou² | Marcelo F C Gomes¹ | Daniel A M Villela¹ | Flavio C Coelho³ | Oswaldo G Cruz¹ | Oliver Stoner² | Trevor Bailey² | Claudia T Codeço¹

Bastos, LS, Economou, T, Gomes, MFC, et al.

A modelling approach for correcting reporting delays in disease surveillance data. *Statistics in Medicine*. 2019; 38: 4363– 4377. <https://doi.org/10.1002/sim.8303>

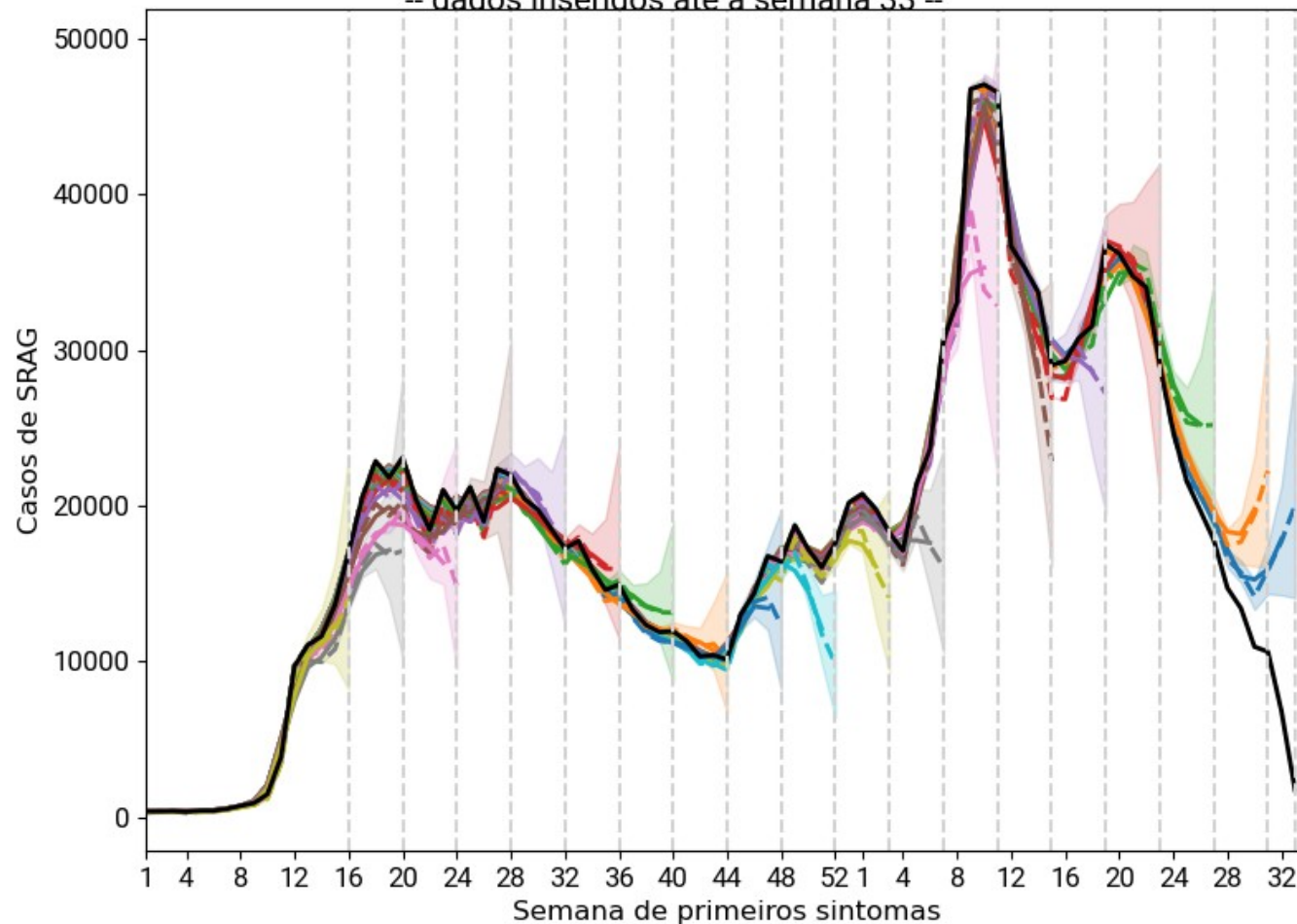
SRAG no Brasil

-- dados inseridos até a semana 33 --



SRAG no Brasil

-- dados inseridos até a semana 33 --



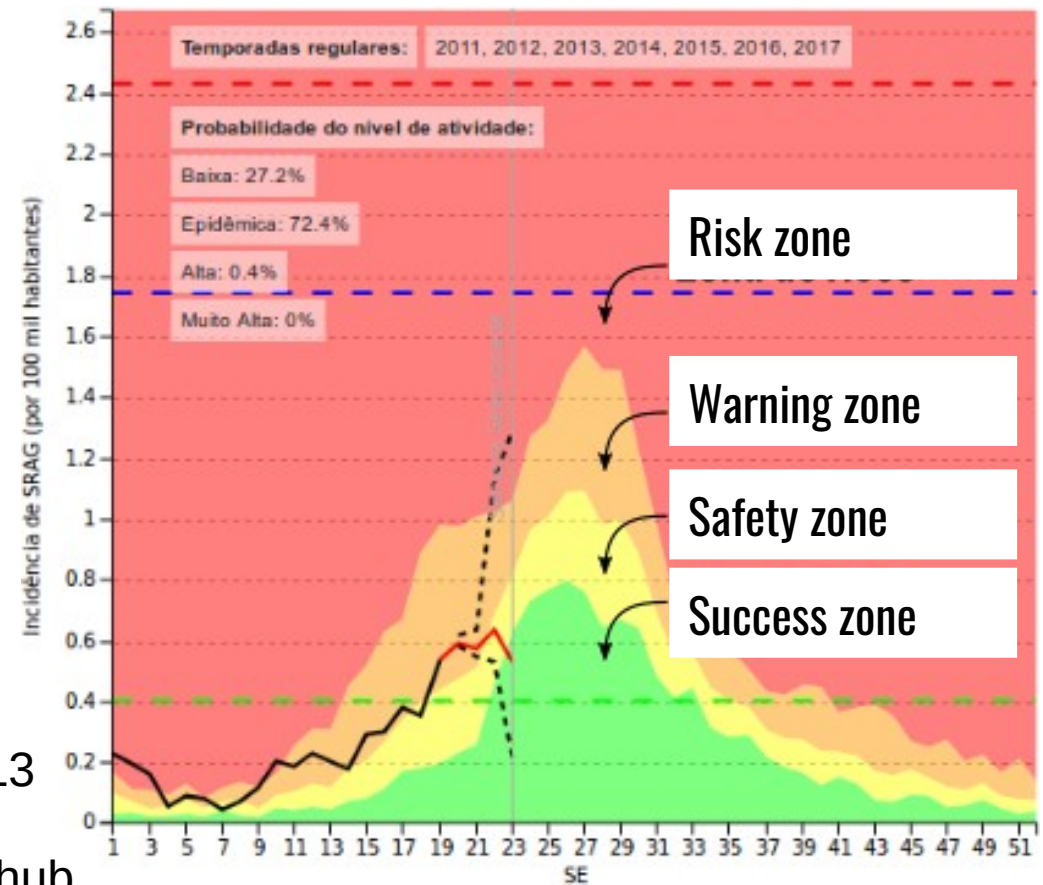
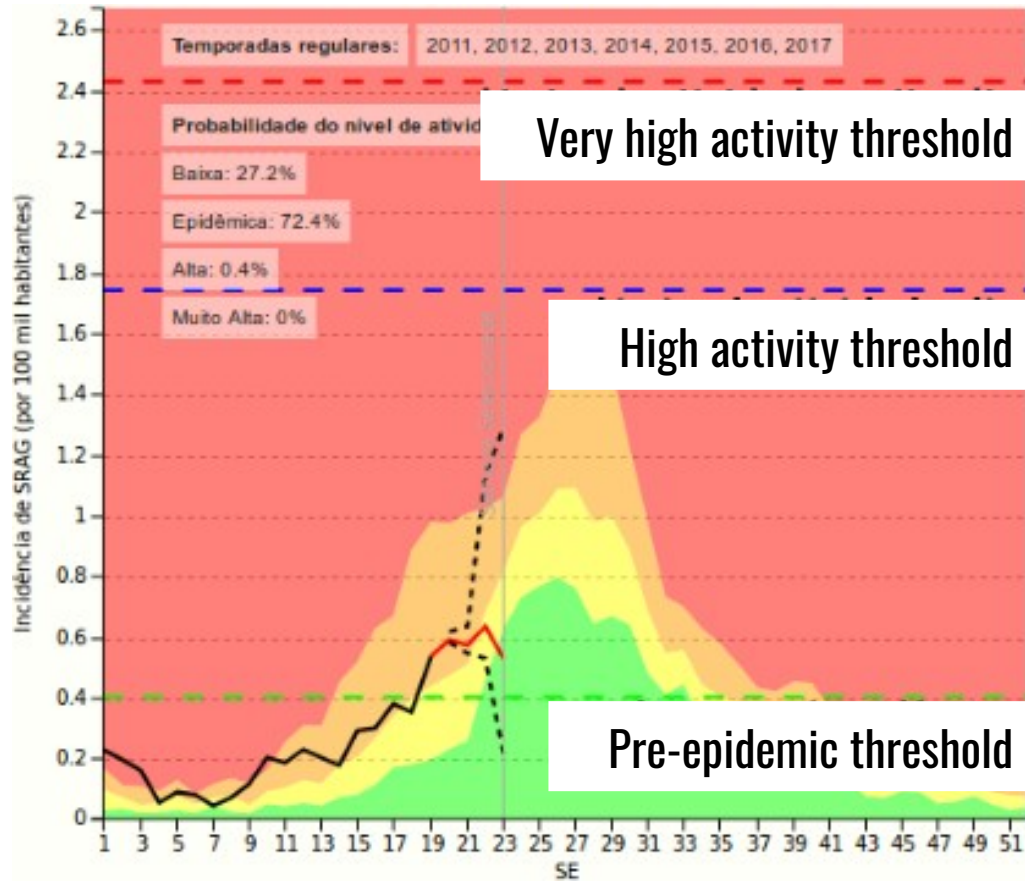
Bastos, LS, Economou, T, Gomes, MFC, et al.

A modelling approach for correcting reporting delays in disease surveillance data.

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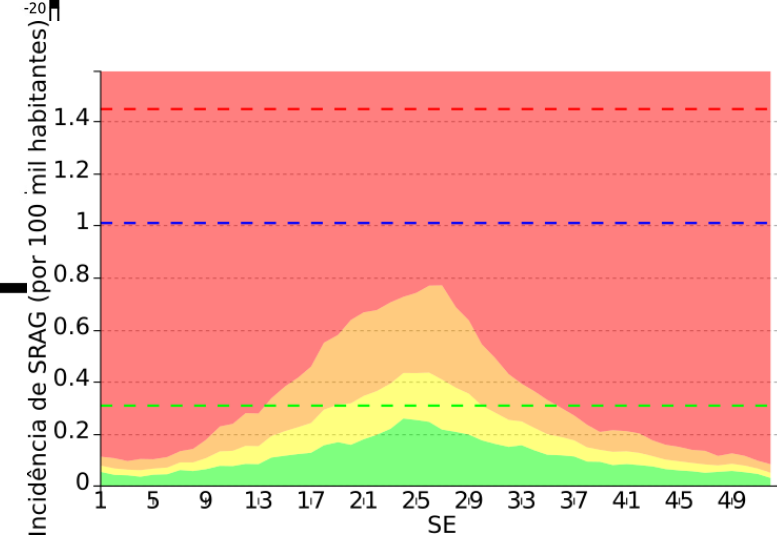
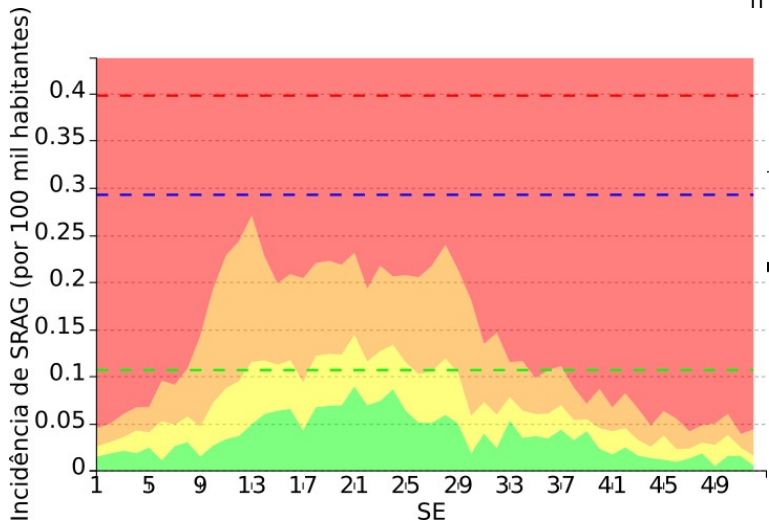
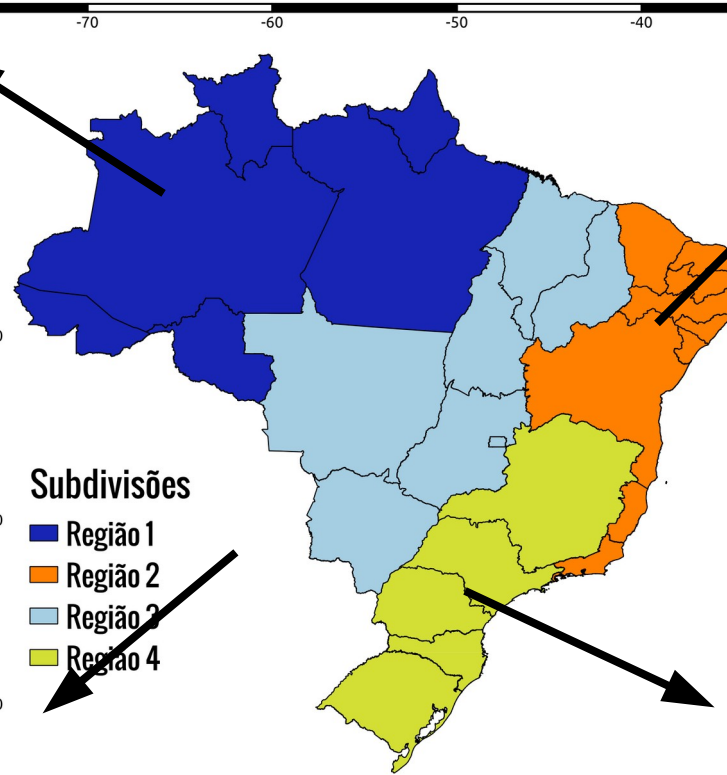
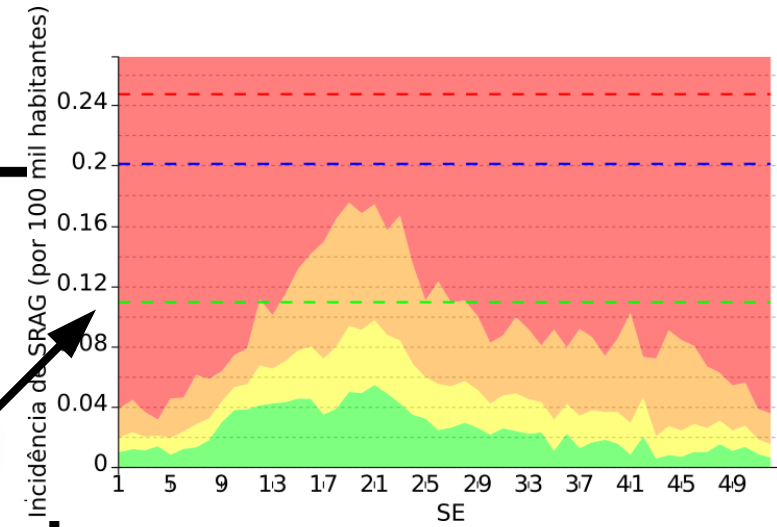
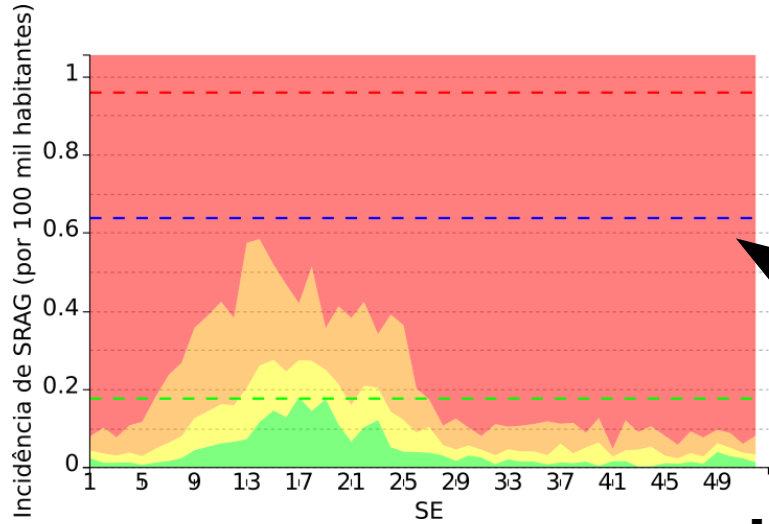
Respiratory infections

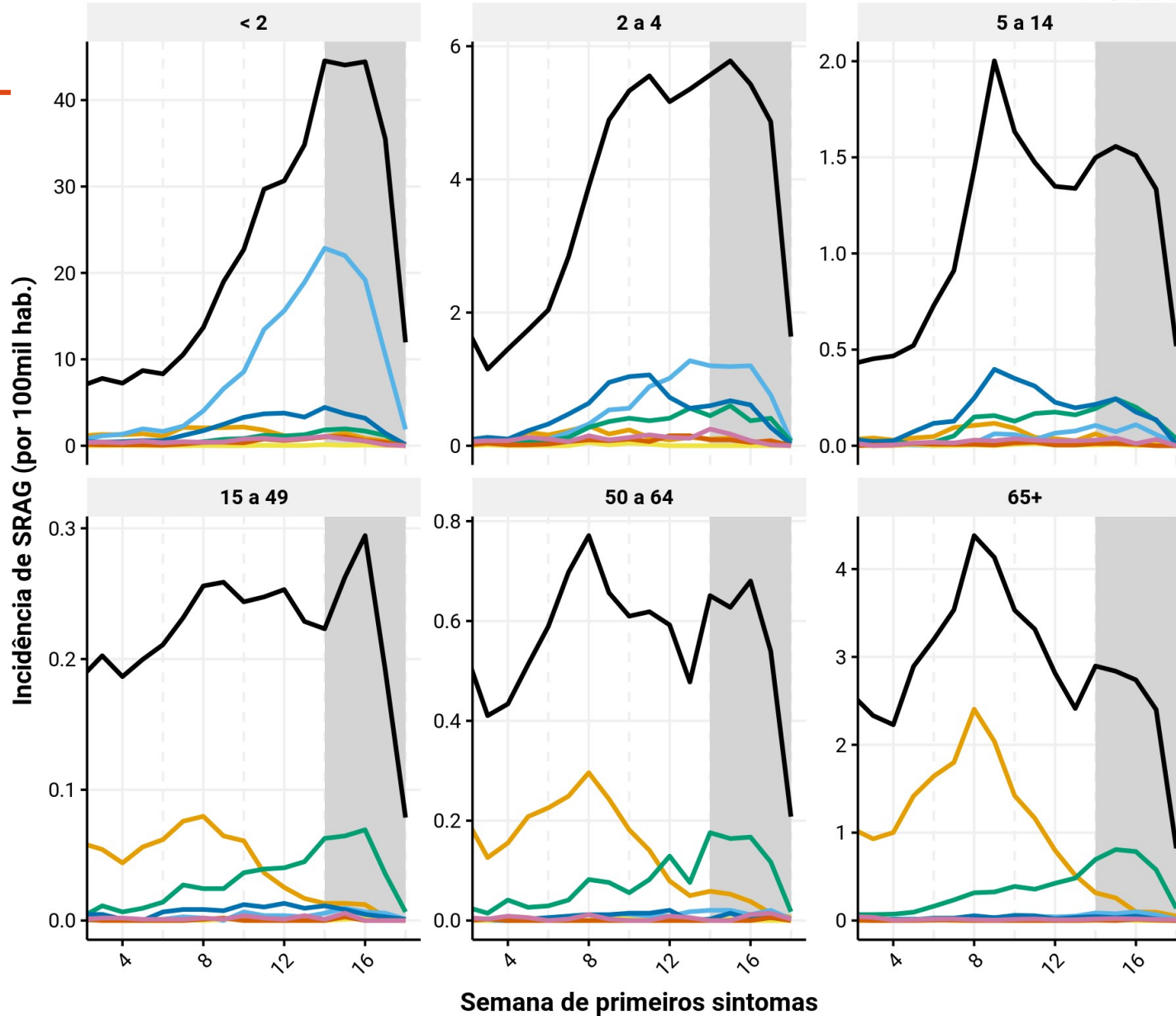
Seasonal profiles and activity thresholds



Moving epidemics method (MEM)
Tomás Vega et al. *Influenza and Other Respiratory Viruses* 2013
doi: 10.1111/j.1750-2659.2012.00422.x.
<https://github.com/marfcg/mem> adapted from lozalojo/mem github

SARI surveillance in Brazil: InfoGripe





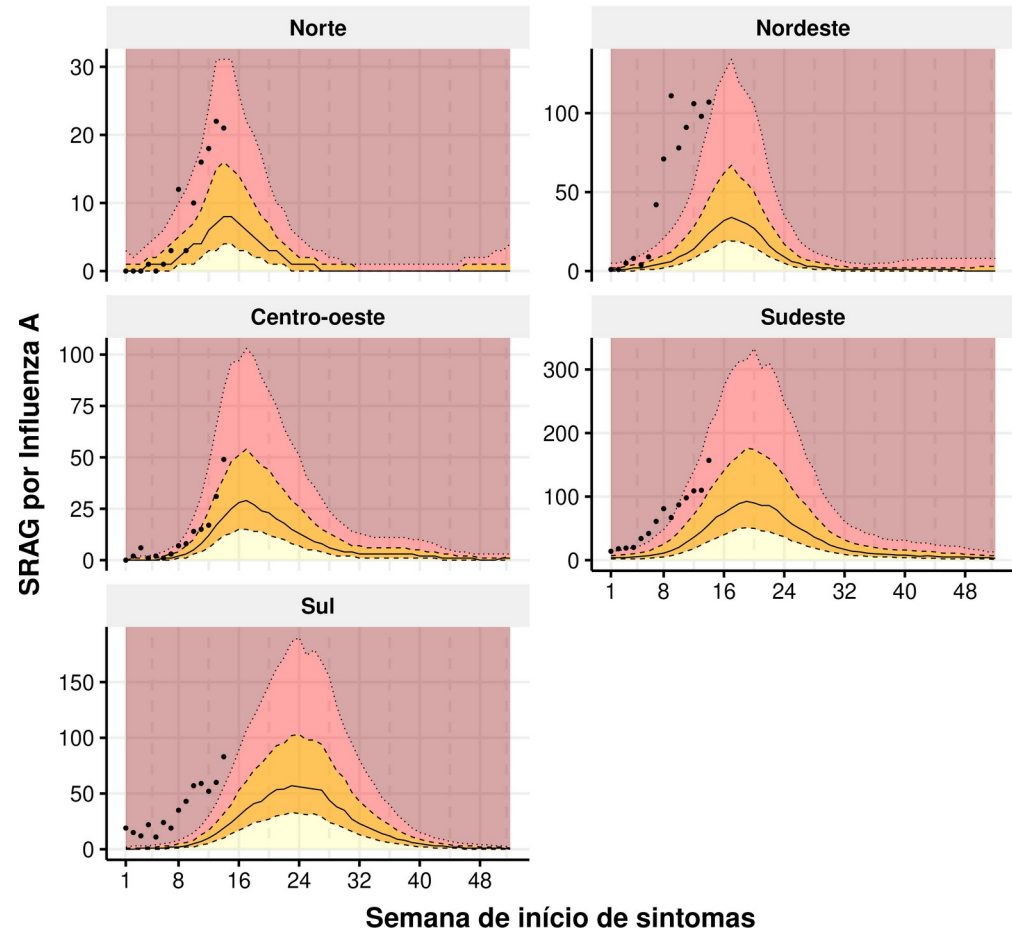
— SRAG em geral — VSR — FLU B — ADENO
 — SARS-CoV-2 — FLU A — RINO — OUTROS

Model-based projections

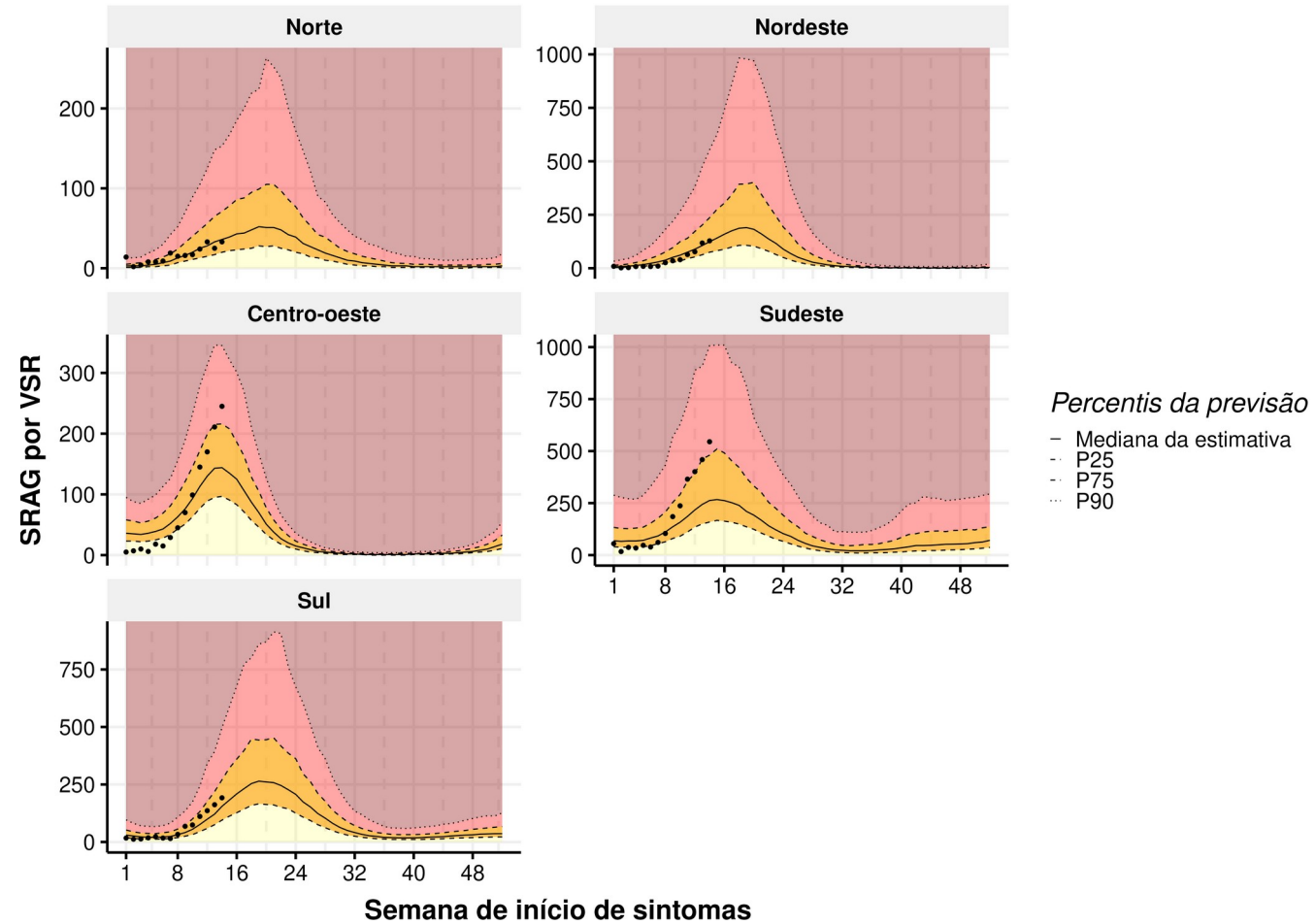
$$N_t \sim \text{NegBin}(\lambda_t, \phi), \quad \phi > 0, \lambda_t > 0, t = 1, 2, 3, \dots, T$$

$$\log(\lambda_t) = \alpha + \beta_{Y[t]} + \gamma_w[t]$$

Anos de referência: 2014-2019.

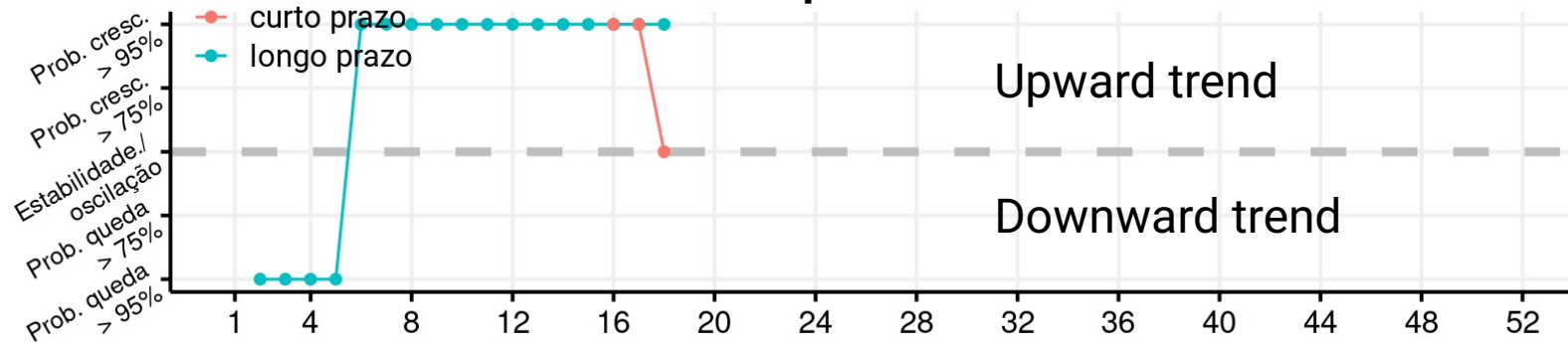
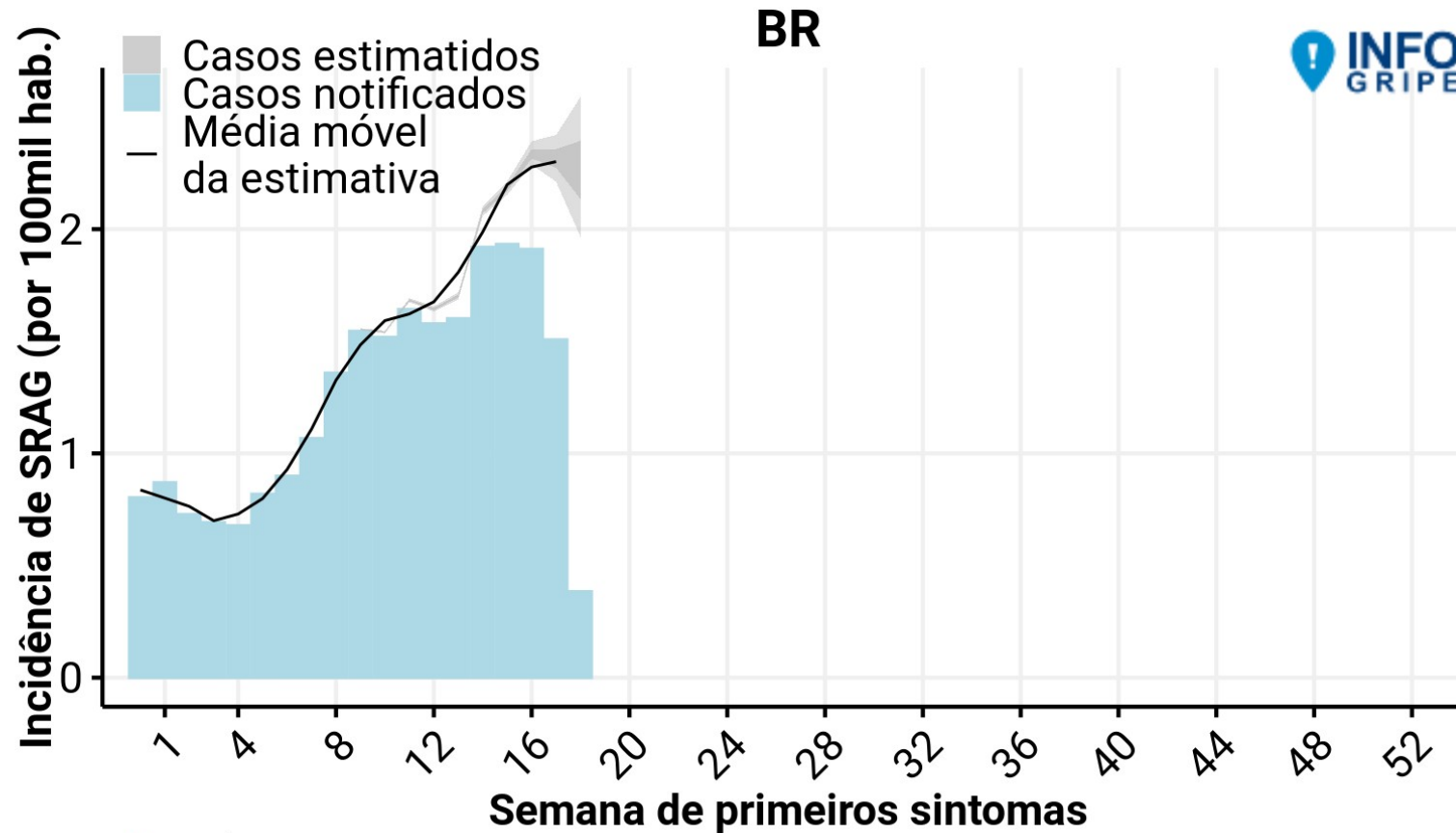


Anos de referência: 2019, 2022 e 2023.

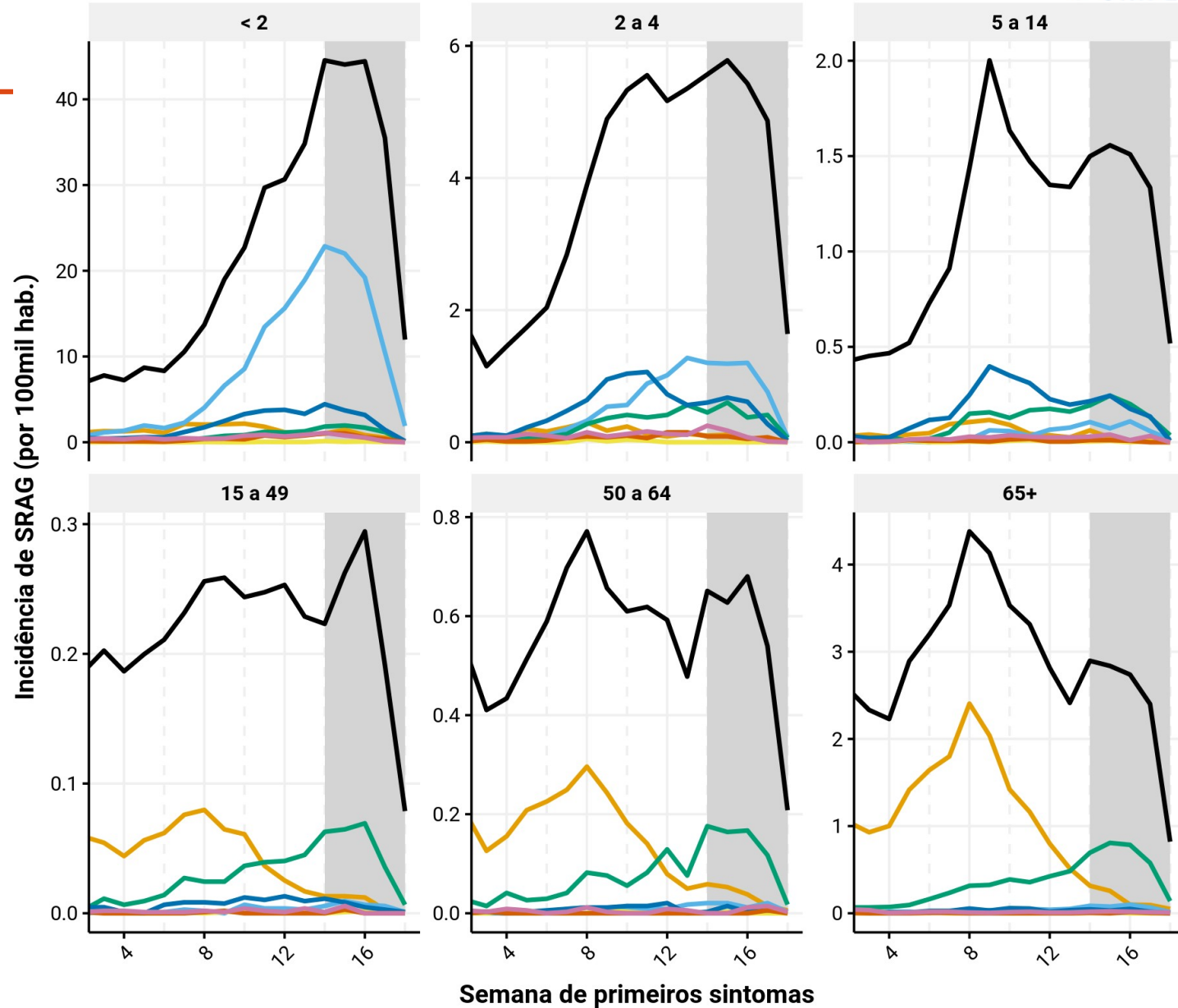


SARI by Influenza A and RSV in 2024

InfoGripe: nowcasting and trend



Bastos, Carvalho & Gomes, 2021.
Modelling misreported data,
in: Building a Platform for
Data-Driven Pandemic
Prediction
<http://info.gripe.fiocruz.br>
<http://bit.ly/mave-repo-fiocruz>



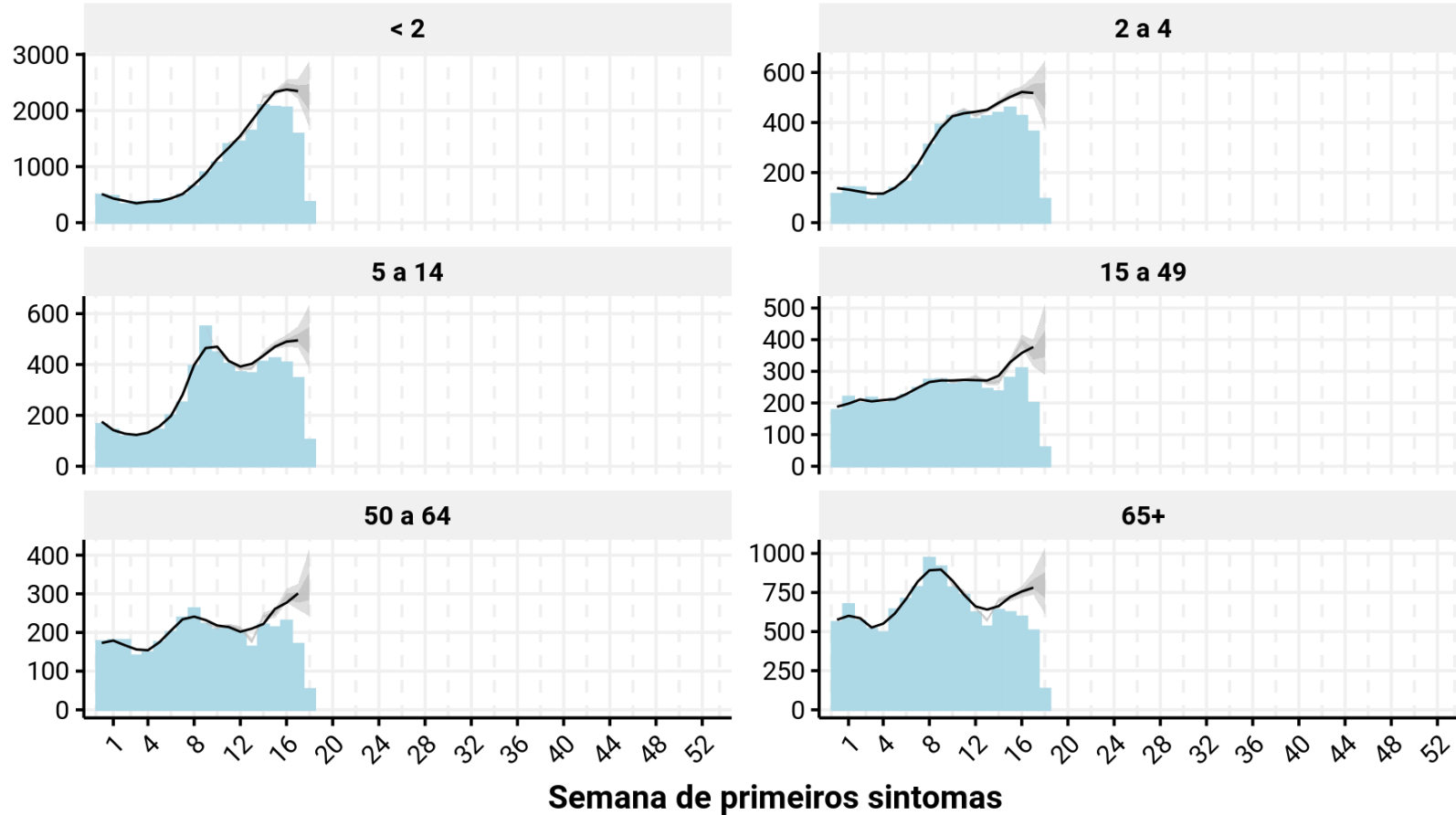
— SRAG em geral
 — VSR
 — FLU B
 — ADENO
— SARS-CoV-2
 — FLU A
 — RINO
 — OUTROS

BR



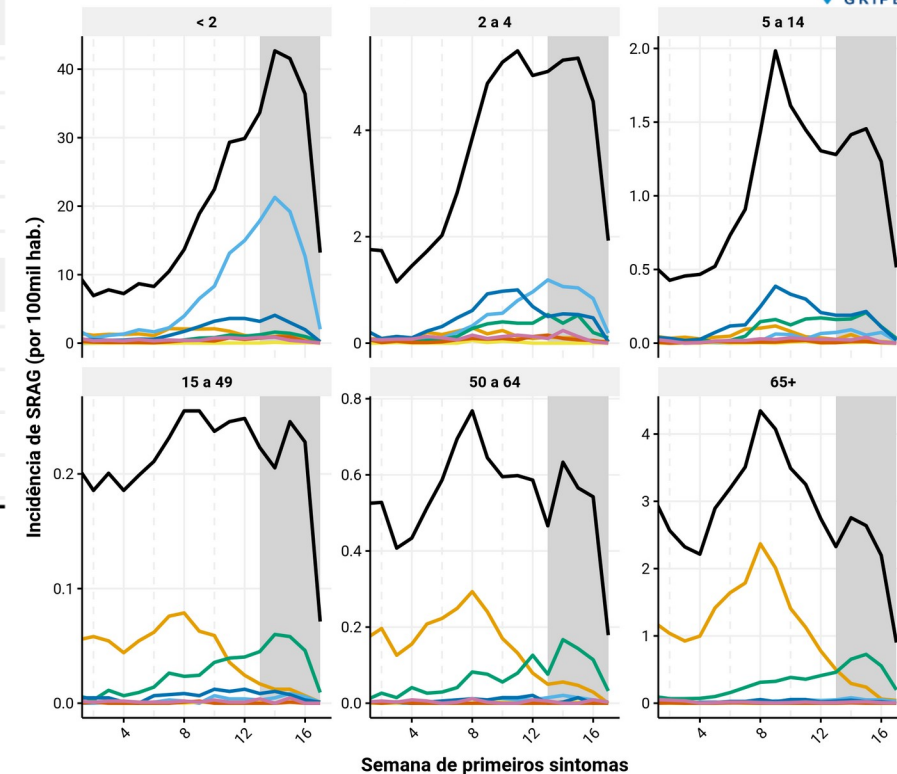
Novos casos semanais por faixa etária. Dados até a semana 18 2024

Casos de SRAG



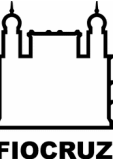
— Média móvel da estimativa ■ Casos estimados ■ Casos notificados

Novos casos de SRAG semanais por faixa etária. Dados até a semana 17 2024. Para semanas recentes os dados são parciais (área cinza).



— SRAG em geral ■ SRS-CoV-2 ■ VSR ■ FLU A ■ FLU B ■ RINO ■ ADENO ■ OUTROS

InfoGripe



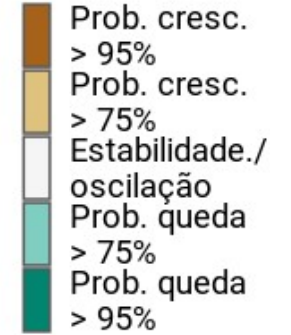
curto prazo
(últimas 3 semanas)

Semana 18 2024
(28/04 - 04/05):
Estados e DF

longo prazo
(últimas 6 semanas)



States

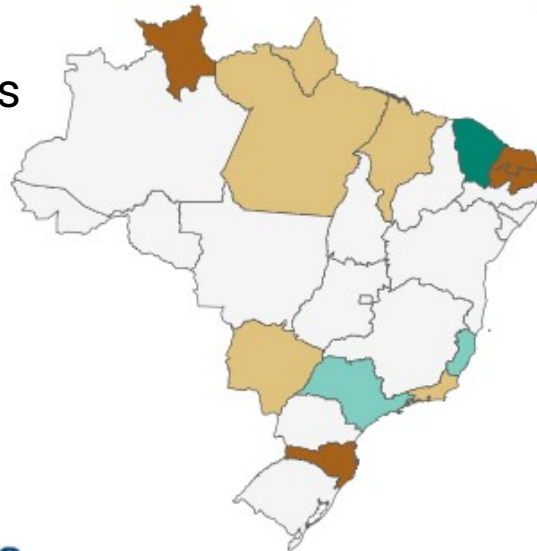


curto prazo
(últimas 3 semanas)

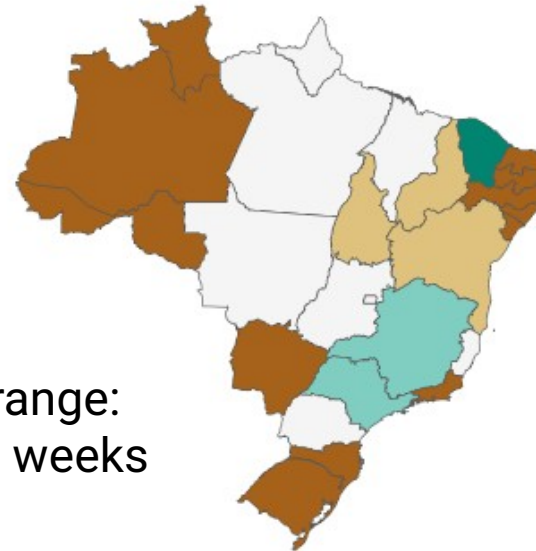
Capitais e região central
de saúde do DF

longo prazo
(últimas 6 semanas)

Short range:
Last 3 weeks



State
capitals

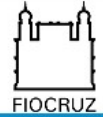


Long range:
Last 6 weeks



Arboviruses

Dengue, Zika, Chikungunya surv.: InfoDengue



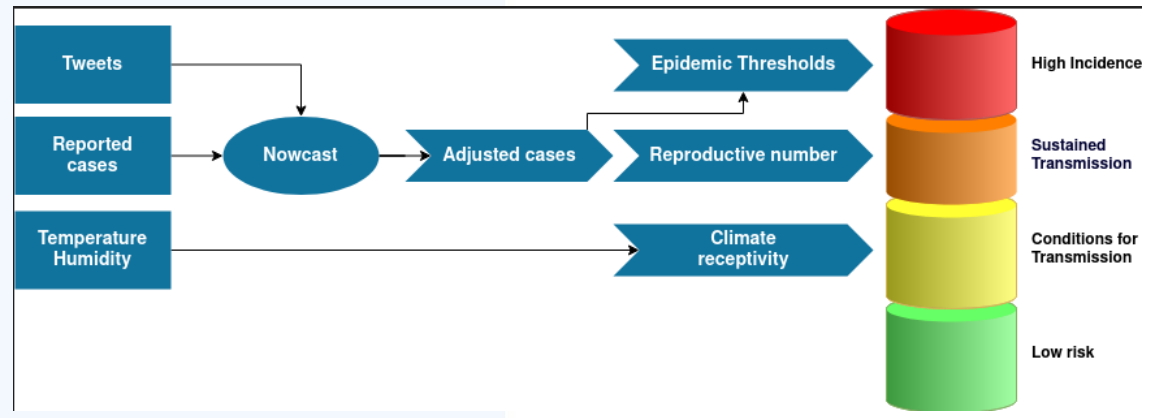
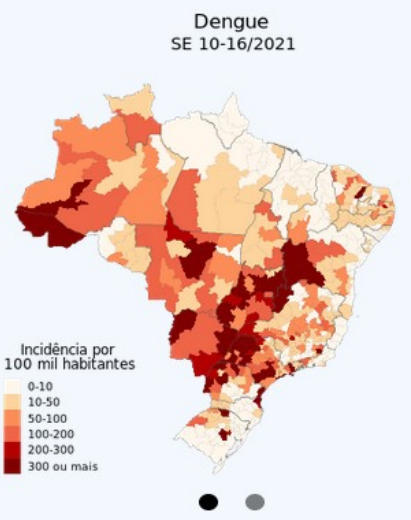
Início Sobre nós Equipe Participe Dados Relatórios Login

Situação de casos estimados

Análise integrada de dados epidemiológicos, climáticos e redes sociais.

Atualização semanal:

- Incidência estimada (nowcasting)
- Cidades com condições favoráveis para transmissão
- Cidades em níveis de atenção



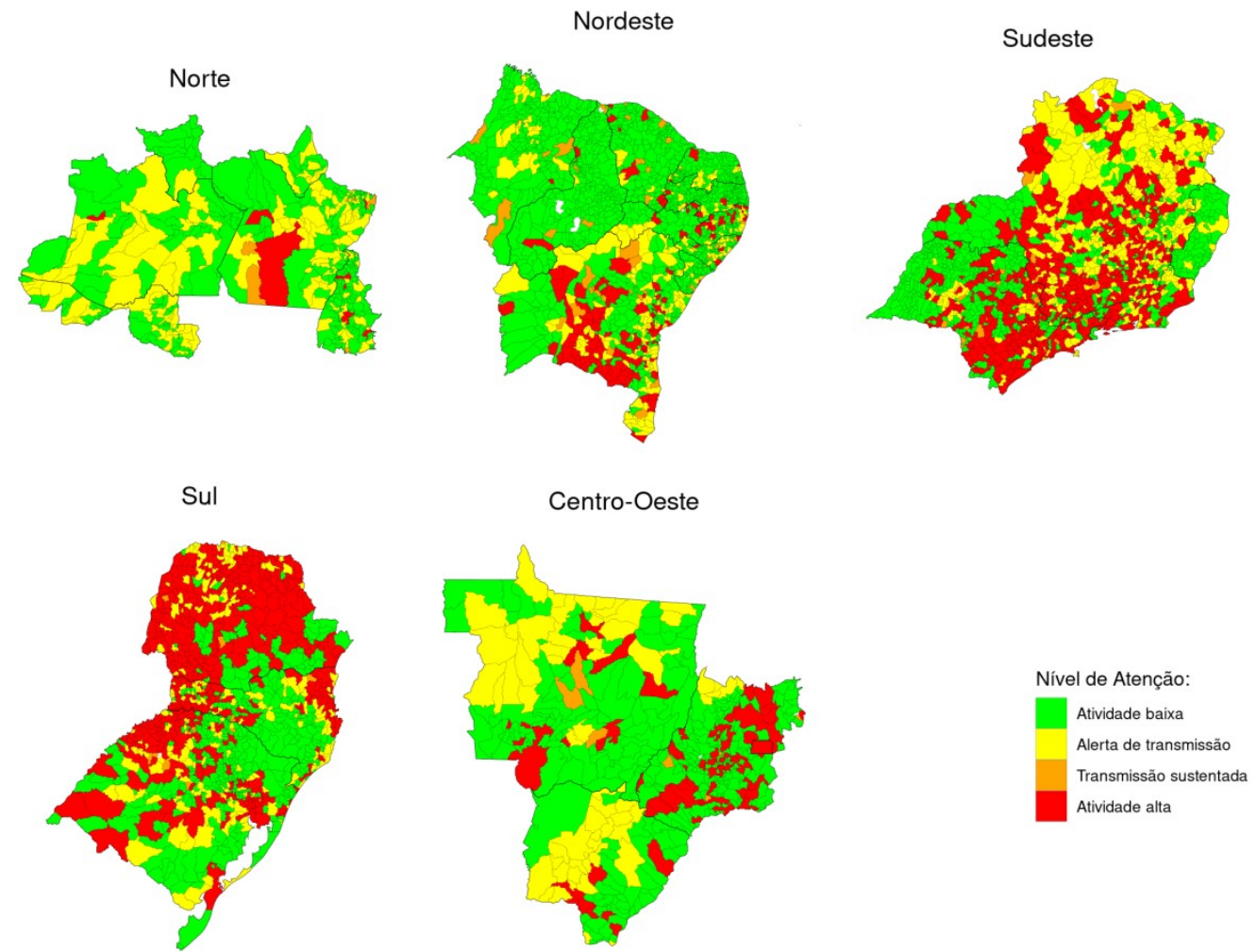
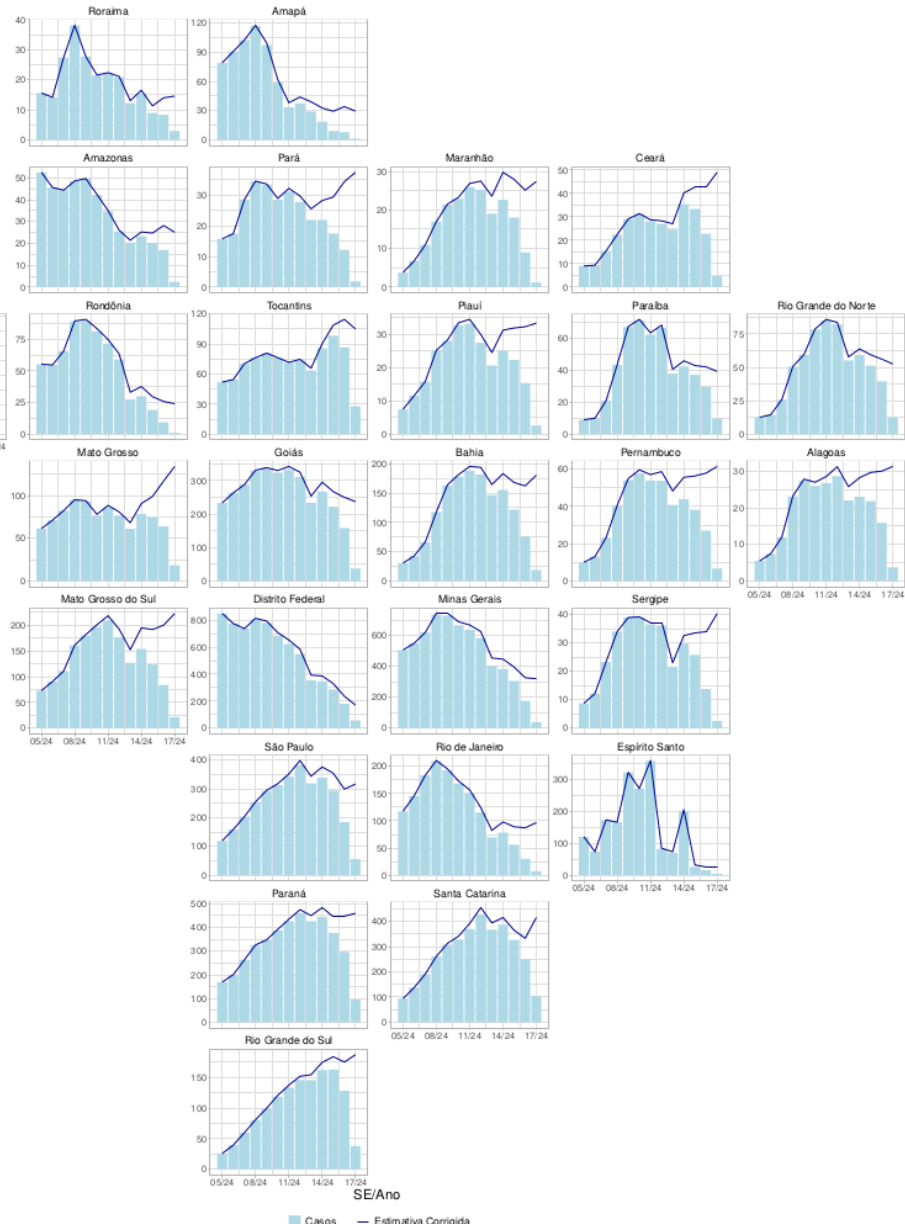
Situação Epidemiológica

Website: <http://info.dengue.mat.br/>

Dengue, Zika, Chikungunya surv.: InfoDengue



Incidência (dengue + chikungunya) por 100 mil hab.



Nível de Atenção:
Atividade baixa
Alerta de transmissão
Transmissão sustentada
Atividade alta

Website: <http://info.dengue.mat.br/>

Model-based MEM-like expected season projections

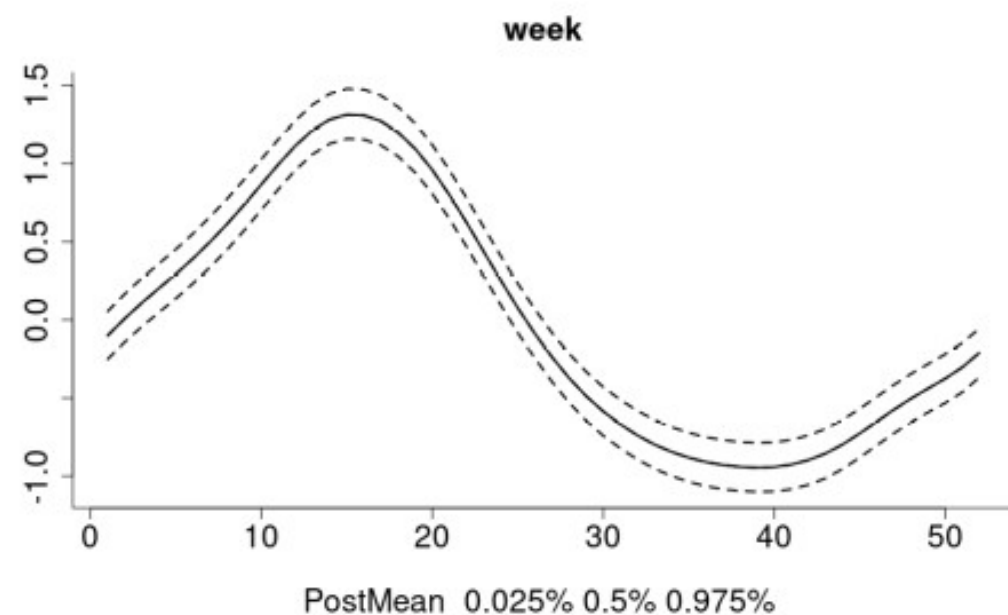
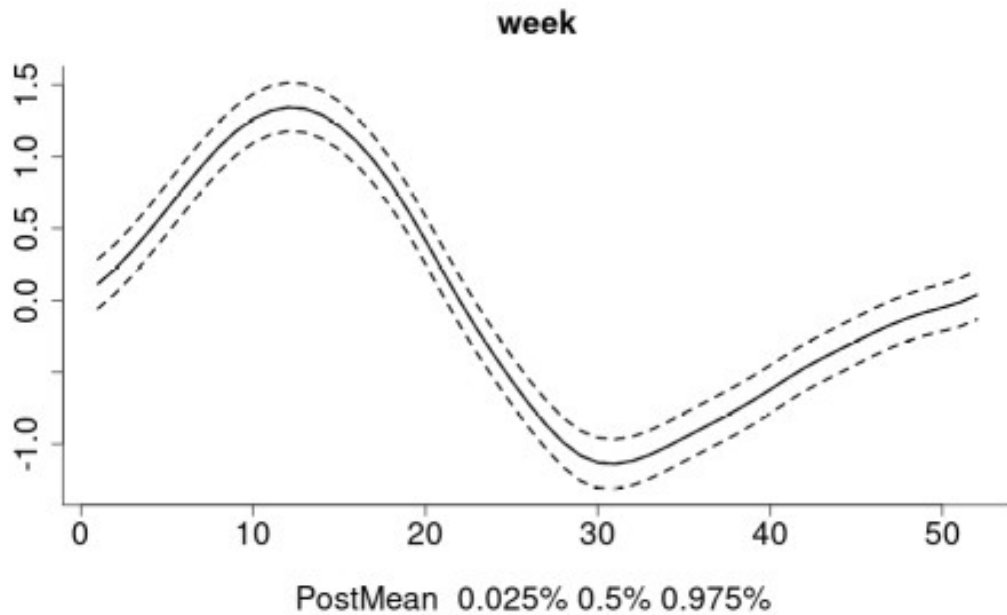
$$N_t \sim \text{NegBin}(\lambda_t, \phi), \quad \phi > 0, \lambda_t > 0, t = 1, 2, 3, \dots, T$$

$$\log(\lambda_t) = \alpha + \beta_{Y[t]} + \gamma_{w[t]}$$

$$Y = 2010, 2011, \dots, 2022; \quad w = 1, 2, \dots, 52$$

Foz

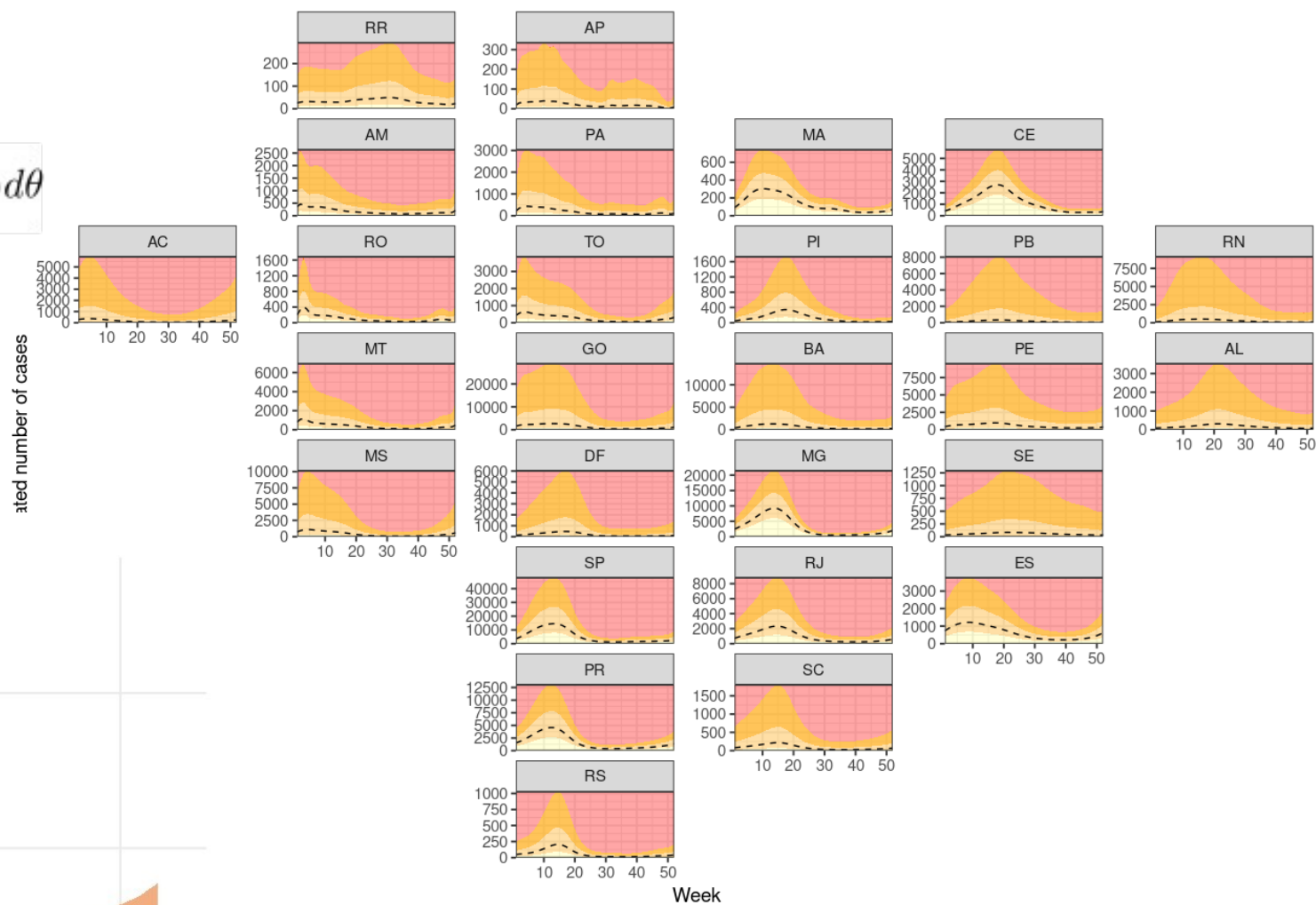
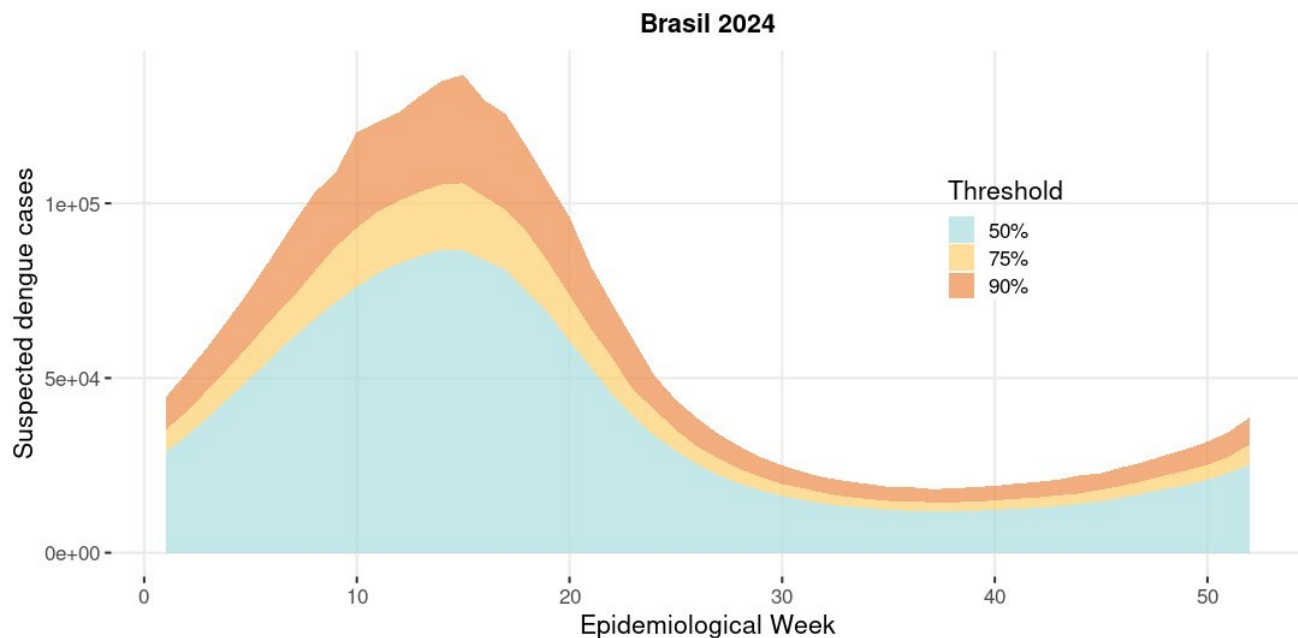
Rio



Model-based MEM-like expected season projections

Posterior predictive distribution

$$p(y_{r,1:52}^{2024} | y_{r,1:52}^{2015:2023}) = \int_{\theta} p(y_{r,1:52}^{2024} | \theta) p(\theta | y_{r,1:52}^{2015:2023}) d\theta$$



Thank you!



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- Claudia T Codeço

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Ministério da
Saúde