

# CURSO RESPUESTA AL CAMBIO CLIMÁTICO PARA LA SALUD EN LATINOAMÉRICA

Recolección de datos y vigilancia de enfermedades sensibles al clima  
12 de mayo, 2022

Rachel Lowe

ICREA Research Professor and Royal Society Dorothy Hodgkin Fellow  
Barcelona Supercomputing Center and London School of Hygiene & Tropical Medicine



# Agradecimientos

Global Health Resilience Team, Barcelona Supercomputing Center

- Martin Lotto Batista (BSC/HZI)
- Dr Raquel Lana (BSC)

Planetary Health and Infectious Diseases Lab, London School of Hygiene & Tropical Medicine

- Sophie Lee (LSHTM)
- Dr Rory Gibb (LSHTM)
- Dr Felipe González-Colón (Wellcome Trust/LSHTM)
- Dr Isabel Fletcher (Wellcome Trust/LSHTM)

# Objetivos de aprendizaje

- Discutir el riesgo de las enfermedades infecciosas sensibles al clima en el contexto de eventos extremos y el cambio climático
- Describir el flujo de datos (climáticos y epidemiológicos) y los métodos generalmente utilizados para:
  - Monitorear las condiciones climáticas adecuadas para la transmisión de enfermedades sensibles al clima.
  - Transformar información climática para su uso local en sistemas de alerta temprana.
  - Identificar indicadores hidrometeorológicos útiles para predecir el riesgo de epidemias de enfermedades sensibles al clima.



Viajes internacionales



Comercio internacional



Cambio climático



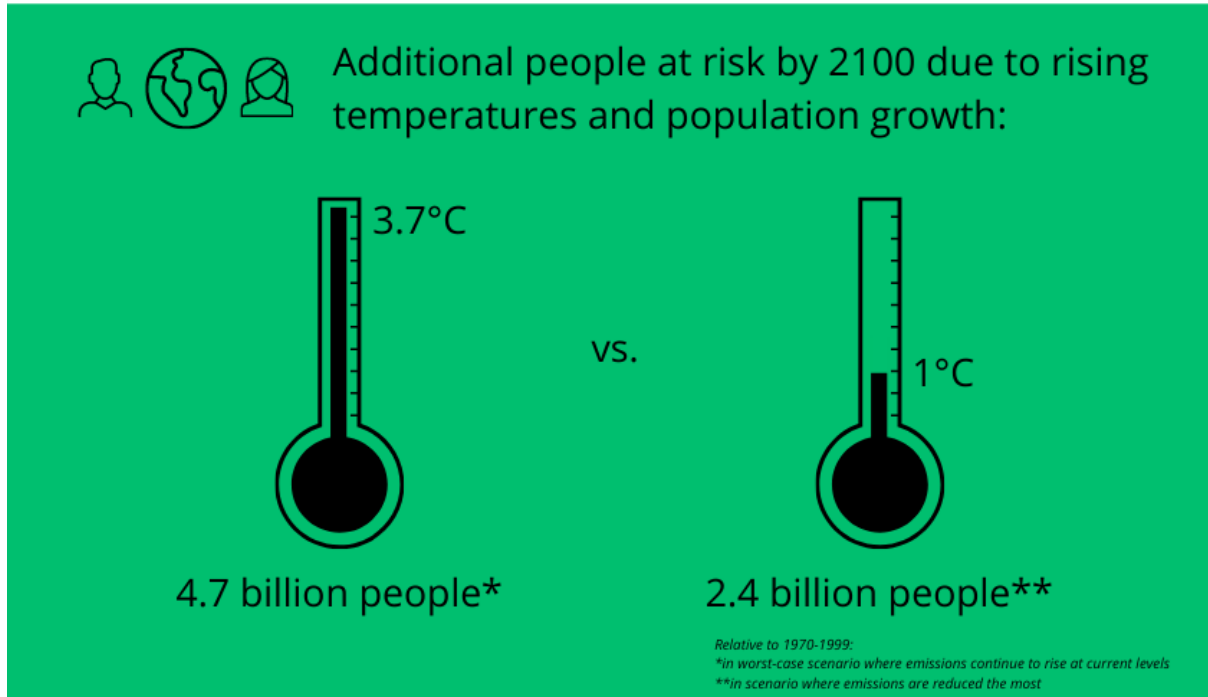
Eventos extremos





La mitad de la población mundial está en riesgo de enfermedades transmitidas por mosquitos

# Riesgo de dengue y malaria en un mundo más cálido



# Votación en Zoom

¿Cuál cree que es la enfermedad más estudiada en relación con eventos climáticos extremos?

- a) Malaria
- b) Cólera
- c) Enfermedades diarreicas
- d) Dengue



# Brotos de enfermedades infecciosas después de eventos climáticos extremos

Tilly Alcayna *et al.*, One Earth 2022

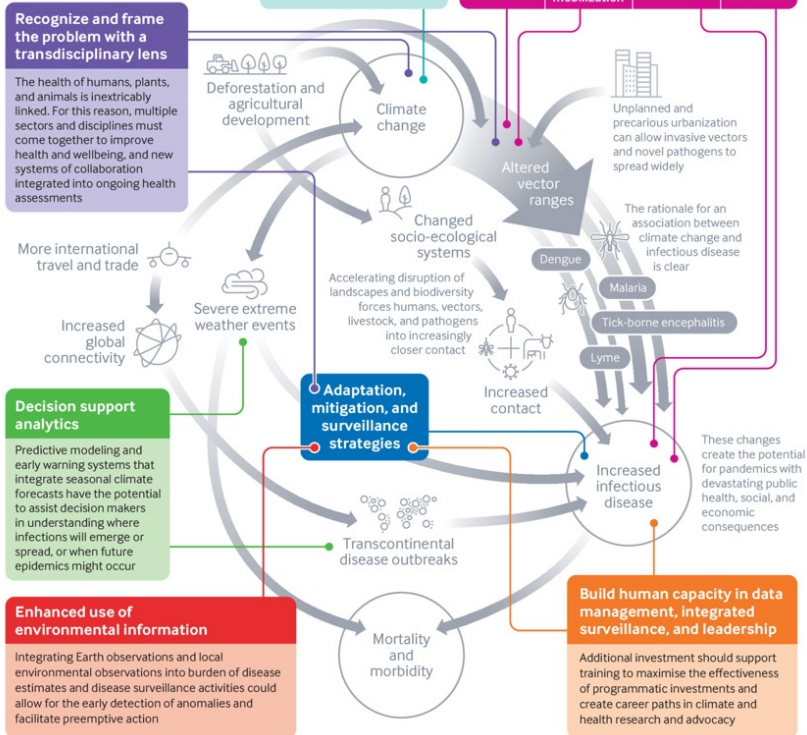
Disease	Heavy Rainfall	Tropical Cyclones	Drought	Flooding	Heatwaves	Multiple Events	Total
Cholera	Low evidence (N=1) Outbreak <sup>53</sup>	High agreement, high evidence (N=7) Outbreak <sup>51, 54-59</sup>	High agreement, low evidence (N=2) Outbreak <sup>48,52</sup>	Medium agreement, medium evidence (N=4) Outbreak <sup>41,60</sup> <sup>60</sup> noted the floods did not seed the outbreak; outbreaks began during only one out of every 14 floods <sup>46</sup>	Low evidence (N=1) Outbreak <sup>30</sup>	High agreement, medium evidence (N=3) Including drought followed by heavy rains <sup>48</sup> and two systematic reviews investigating water-related disasters <sup>68, 61</sup>	N=18
Diarrheal Diseases (Non-cholera)	High agreement, high evidence (N=5) Outbreak: <sup>32,34,35</sup> But dynamics of dry period followed by rainfall vs wet period followed by rainfall are important <sup>63</sup> and on type of rainfall event <sup>62</sup>	High agreement, high evidence (N=10) Outbreak: <sup>44,63,69,71,73-75,82,84,85</sup>	High agreement, low evidence (N=2) Outbreak <sup>63,64</sup>	High agreement, high evidence (N=20) Outbreak <sup>36-39, 62, 65, 70, 71, 76-79, 81-83, 86, 87, 94, 104, 105</sup> <sup>82</sup> found that the relationship between flooding and diarrhea risk appeared to vary by pathogen	Low evidence (N=1) Increasing heatwaves days were linked with increased emergency department visits for childhood diarrhea <sup>79</sup>	High agreement, high evidence (N=5) <sup>104</sup> looked at EM-DAT data in general for a 'disaster' period <sup>47,67,72,85</sup> were all reviews which covered multiple hazards	N= 43
Malaria	Low evidence (N=1) Outbreak <sup>91</sup>	Low evidence (N=1) No outbreak <sup>90</sup>	Low agreement, low evidence (N=1) <sup>64</sup> found that evidence of associations was mixed	Medium agreement, medium evidence (N=8) Outbreaks <sup>34,92, 93, 95</sup> A scoping review reports overall positive linkages between floods and outbreaks <sup>94</sup> No outbreak <sup>78,89</sup>	No papers retrieved	No papers retrieved	N = 11
Dengue	High agreement, medium evidence (N=3) Increased outbreak risk <sup>71,62,63</sup>	Low agreement, high evidence (N=5) Outbreak <sup>95,73, 103</sup> No outbreak <sup>90,102</sup>	High agreement, medium evidence (N=4) Increased outbreak risk <sup>42,43,64,99</sup>	Medium agreement, low evidence (N=2) Unclear impacts of flooding on outbreaks Mixed findings, including decreases and increases <sup>95</sup> Decreased risk (possibly due to vector control activities) <sup>78</sup>	Medium agreement, medium evidence (N=3) Outbreak <sup>31,97</sup> No outbreak <sup>29</sup>	Low evidence (N= 1) <sup>86</sup> investigate heavy rainfall, but defined 'flood' periods caveating that this did not necessarily correspond with actual flood waters	N = 18
Total	N=10	N=23	N= 9	N= 34	N=5	N= 9	90



Funding for training, research, and practice related to climate change and infectious disease has been limited, and the global response has largely been characterized by skepticism and watchful inaction. This graphic introduces six strategies for intervening in the complex network of connections around climate change and infectious disease

**Health sector emissions mitigation**  
The health sector is responsible for over 4% of global emissions, more than aviation or shipping. Reducing emissions should be a fundamental priority

**Increased funding for climate and health**  
Nations must invest in appropriate strategies to further elucidate linkages and address climate related health risks



KNOWLEDGE GAPS	1. Location, location	2. Annual trends	3. Extreme events
	Some areas that have experienced significant shifts in the climate, including parts of Africa and the Middle East, are underrepresented in the evidence base, which limits conclusions about climatic influences in certain regions	There is limited research on the role of interannual climate variability, which is important for many infectious diseases with a marked seasonal component	Insufficient attention has been paid to the impacts of increasingly frequent and severe extreme weather events, which can influence the timing and intensity of disease outbreaks and hinder response efforts

Fortaleciendo la respuesta global al cambio climático y a la amenaza de las enfermedades infecciosas

Hess J, Boodram LG, Paz S, Stewart-Ibarra AM, Wasserheit JN, Lowe R, BMJ 2020

# De observaciones globales a intervenciones locales

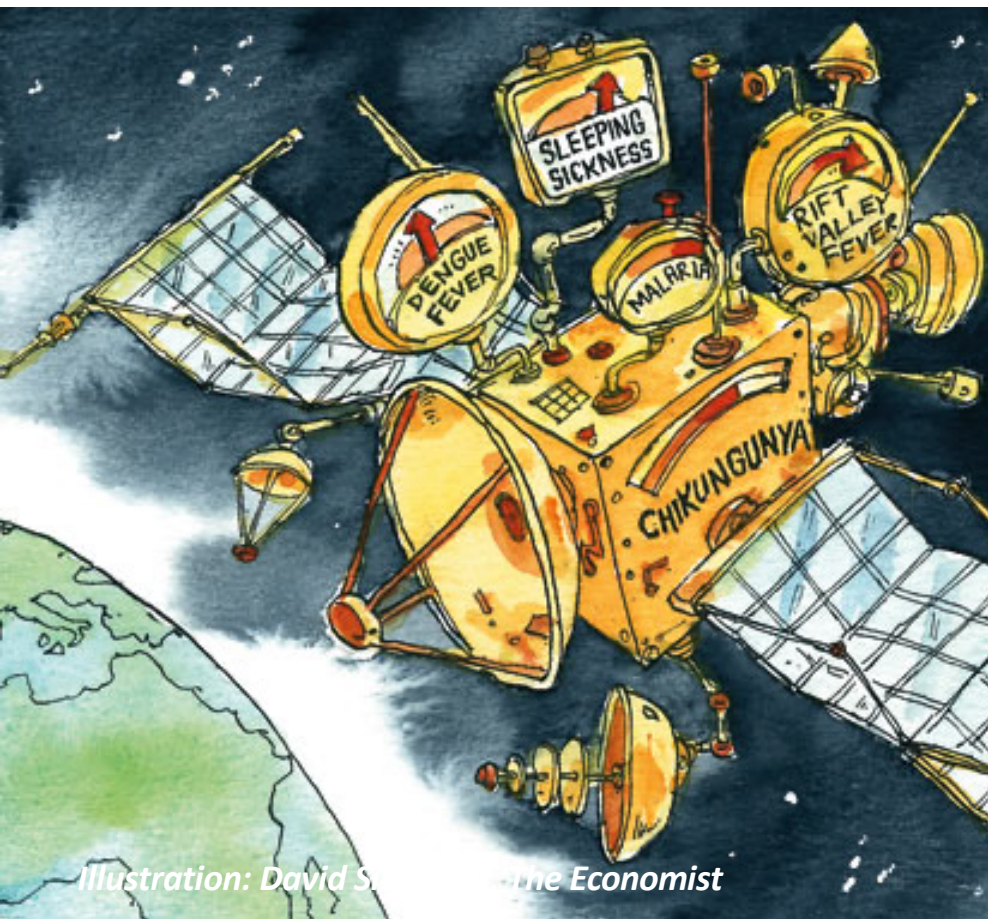
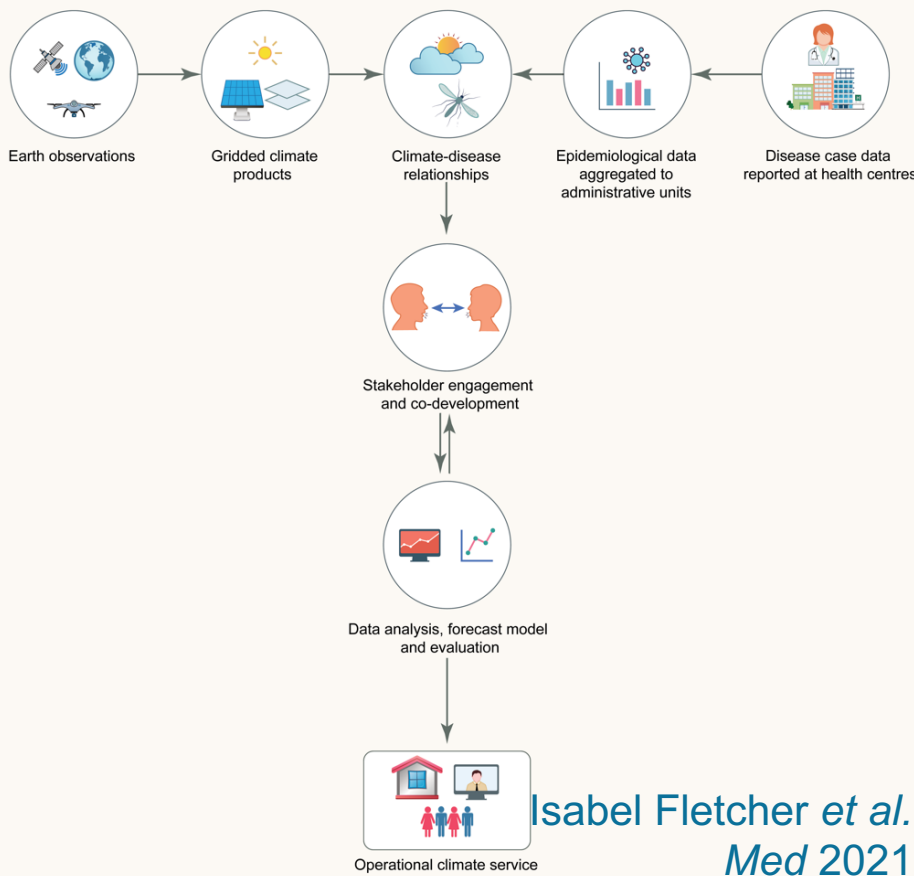


Illustration: David S. Reardon, *The Economist*

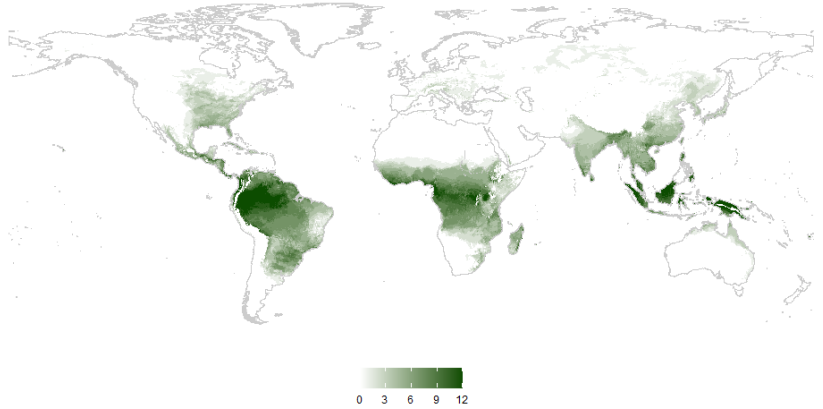
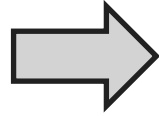
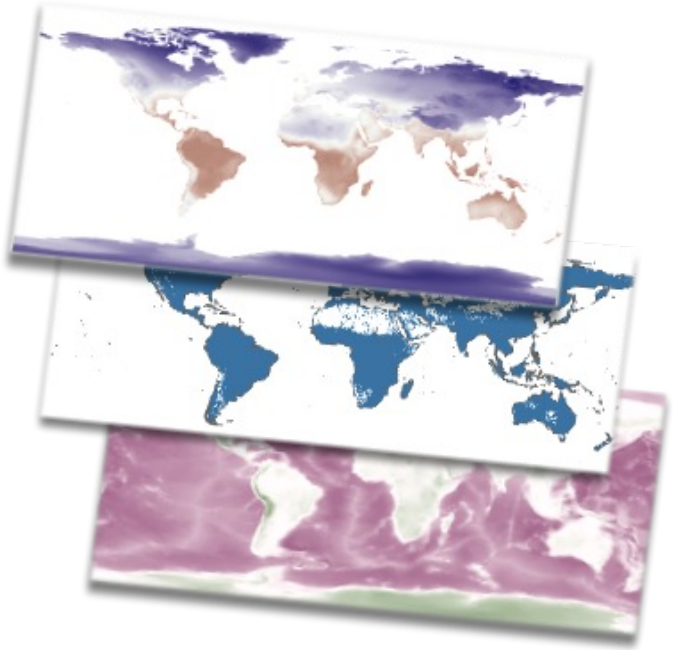


Isabel Fletcher *et al.*  
*Med* 2021

# Monitoreo de las condiciones climáticas adecuadas para la transmisión de enfermedades sensibles al clima



# Combinación de capas para determinar condiciones favorables



*Número de meses favorables para la transmisión de malaria  
(enero, 2019)*





# Datos climáticos: ERA5-Land

- Datos globales que contienen variables climáticas (p.ej., temperatura, precipitación y viento)
- Escala espacial:  $0,1^{\circ} \times 0,1^{\circ}$  ( $\sim 9$  km)
- Disponible por hora o mensual desde 1950 hasta el presente
- Acceso a través de Copernicus (el acceso es gratuito pero requiere registro)

## ERA5-Land monthly averaged data from 1950 to present

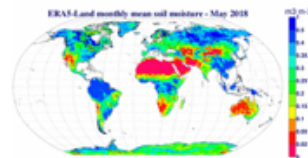
[Overview](#) [Download data](#) [Quality assessment](#) [Documentation](#)

ERA5-Land is a reanalysis dataset providing a consistent view of the evolution of land variables over several decades at an enhanced resolution compared to ERA5. ERA5-Land has been produced by replaying the land component of the ECMWF ERA5 climate reanalysis. Reanalysis combines model data with observations from across the world into a globally complete and consistent dataset using the laws of physics. Reanalysis produces data that goes several decades back in time, providing an accurate description of the climate of the past.

ERA5-Land provides a consistent view of the water and energy cycles at surface level during several decades. It contains a detailed record from 1950 onwards, with a temporal resolution of 1 hour. The native spatial resolution of the ERA5-Land reanalysis dataset is 9km on a reduced Gaussian grid (TCO1279). The data in the CDS has been regridded to a regular lat-lon grid of  $0.1 \times 0.1$  degrees.

The data presented here is a post-processed subset of the full ERA5-Land dataset. Monthly-mean averages have been pre-calculated to facilitate many applications requiring easy and fast access to the data, when sub-monthly fields are not required.

Hourly fields can be found in the [ERA5-Land hourly fields CDS page](#). Documentation can be found in the [online ERA5-Land documentation](#).



Earth Syst. Sci. Data, 13, 4349–4383, 2021  
<https://doi.org/10.5194/essd-13-4349-2021>  
© Author(s) 2021. This work is distributed under the Creative Commons Attribution 4.0 License.



Open Access  
Earth System  
Science  
Data

## ERA5-Land: a state-of-the-art global reanalysis dataset for land applications

Joaquín Muñoz-Sabater<sup>1</sup>, Emanuel Dutra<sup>2,3</sup>, Anna Agustí-Panareda<sup>1</sup>, Clément Albergel<sup>4,5</sup>, Gabriele Arduini<sup>1</sup>, Gianpaolo Balsamo<sup>1</sup>, Souhail Boussetta<sup>1</sup>, Margarita Choulga<sup>1</sup>, Shaun Harrigan<sup>1</sup>, Hans Hersbach<sup>1</sup>, Brecht Martens<sup>6</sup>, Diego G. Miralles<sup>6</sup>, María Piles<sup>7</sup>, Nemesio J. Rodríguez-Fernández<sup>8</sup>, Ervin Zsoter<sup>1</sup>, Carlo Buontempo<sup>1</sup>, and Jean-Noël Thépaut<sup>1</sup>

# Datos climáticos: ERA5-Land

Overview **Download data** Quality assessment Documentation

ERA5-Land is a reanalysis dataset providing a consistent view of the evolution of land variables produced by replaying the land component of the ECMWF ERA5 climate reanalysis complete and consistent dataset using the laws of physics. Reanalysis produces data throughout the past.

ERA5-Land provides a consistent view of the water and energy cycles at surface level with a resolution of 1 hour. The native spatial resolution of the ERA5-Land reanalysis dataset is regular lat/lon grid of 0.1x0.1 degrees.

The data presented here is a post-processed subset of the full ERA5-Land dataset. Monthly and fast access to the data, when sub-monthly fields are not required.

Hourly fields can be found in the ERA5-Land hourly fields CDS page. Documentation can

<https://cds.climate.copernicus.eu/>



Overview **Download data** Quality assessment Documentation

Product type

Monthly averaged reanalysis

Variable

Temperature

2m dewpoint temperature  
 Skin temperature  
 Soil temperature level 2  
 Soil temperature level 4



Format

GRIB  NetCDF (experimental) Clear all

Terms of use

Licence to use Copernicus Products View terms

Show API request Show Toolbox request **Submit Form**

# Datos climáticos: ERA5-Land

Data processing

Temperatura en enero 2019



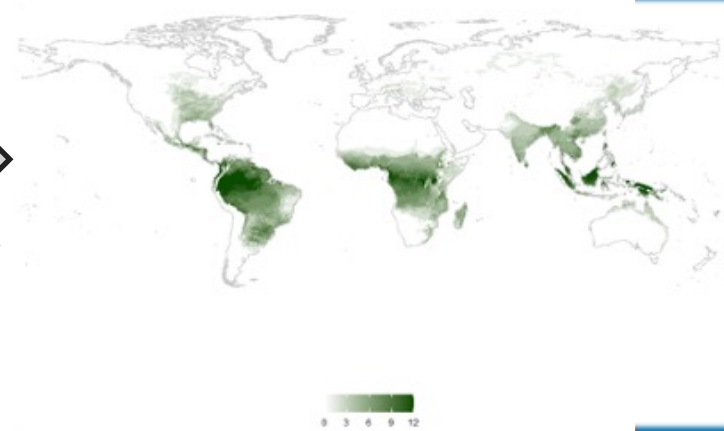
Precipitación total en enero 2019



Temperatura de rocío en enero 2019



- CDO**
- *Transformar unidades,*
  - *Calcular condiciones climáticas*
  - *Calcular de media anual*



*Número de meses con condiciones climáticas apropiadas para transmisión de malaria (enero 2019)*

# Datos del medio ambiente: Copernicus Global Land Service

Data request

Copernicus Global Land Service  
Providing geospatial products of global land surface

Home Products Use cases Product Access Viewing Library Get Support

Burnt Area NDVI  
Dry Matter Prod. Soil Water Index  
FAPAR Surf. Soil Moisture  
FCOVER VCI  
Leaf Area Index VPI  
Land Cover

LCC characteristics

Access Algorithm Quality Application Technical Documents

Product version	Access	Sensor	Temporal coverage	Spatial information	Timeliness
3.0	<a href="#">Global Land Cover viewer for maps and area statistics</a> <a href="#">Google Earth Engine™ for analysis</a> <a href="#">Geo-WIKI for inter-comparison and validation</a> <a href="#">Zenodo Open Science data</a>	PROBA-V	Annual, between 2015 and 2019	100m resolution, global	Updated annually



## Copernicus Global Land Service: Land Cover 100m: collection 3: epoch 2019: Globe

● Marcel Buchhorn ● Bruno Smets ● Luc Bertels ● Bert De Roo ● Myroslava Lesiv ● Nandin-Erdene Tsendbazar ● Martin Herold ● Steffen Fritz

Near real time epoch 2019 from the Collection 3 of annual, global 100m land cover maps.

Other available epochs: 2015 2016 2017 2018

Produced by the global component of the Copernicus Land Service, derived from PROBA-V satellite observations and ancillary datasets.



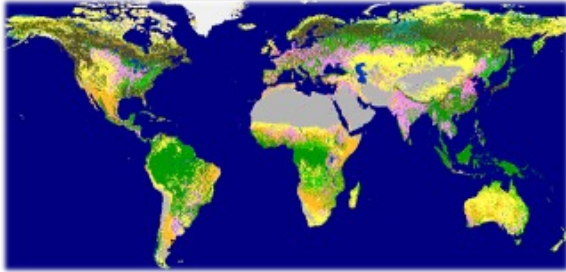
PROBAV\_LC100\_global\_v3.0.1\_2019-nt\_Discrete-Classification-proba\_EPSG-43 7.7 GB Preview Download

nd5-d49f8c21c87d6b51e1f03c-4e3306a4f



# Datos del medio ambiente: Copernicus Global Land Service

Data processing



*Copernicus Global Land Service (2019)*

*Reclasificación*



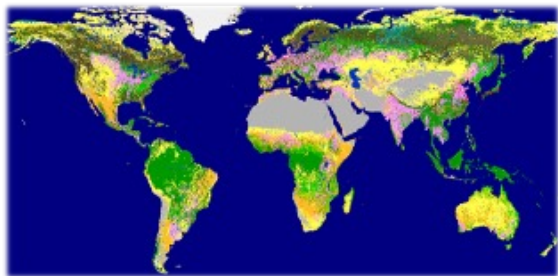
# Lancet Countdown: seguimiento de las condiciones climáticas favorables para las transmisión de malaria

Martin Lotto Batista & Lowe (in prep)

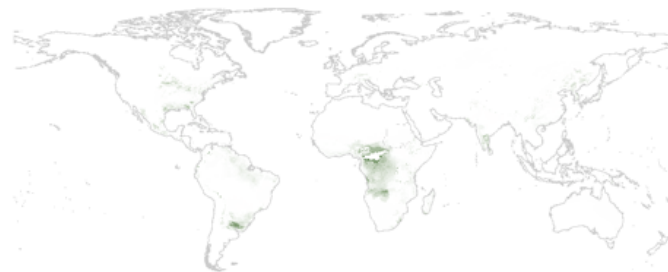
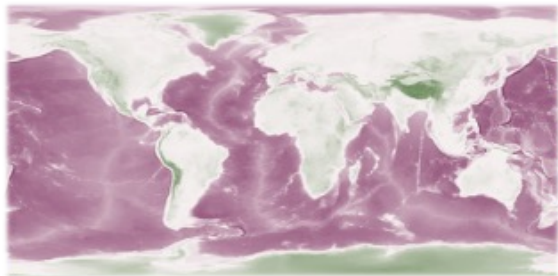
ERA5-Land  
(Temperatura en enero 2019)



Copernicus Global Land Service  
(2019)

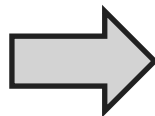


Elevación JISAO

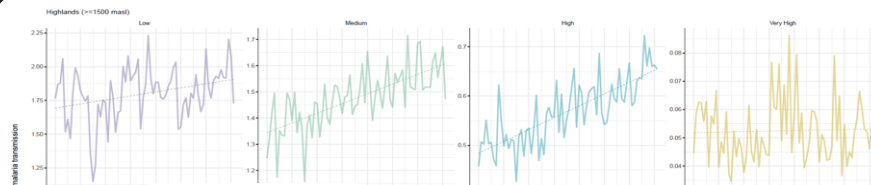


00 25 50 75 100

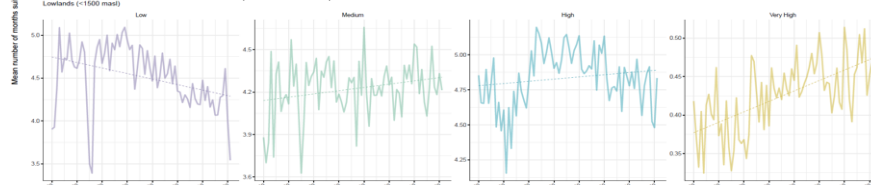
Percentage change between 1950 and 2019



Highlands ( $\geq 1500$  masl)



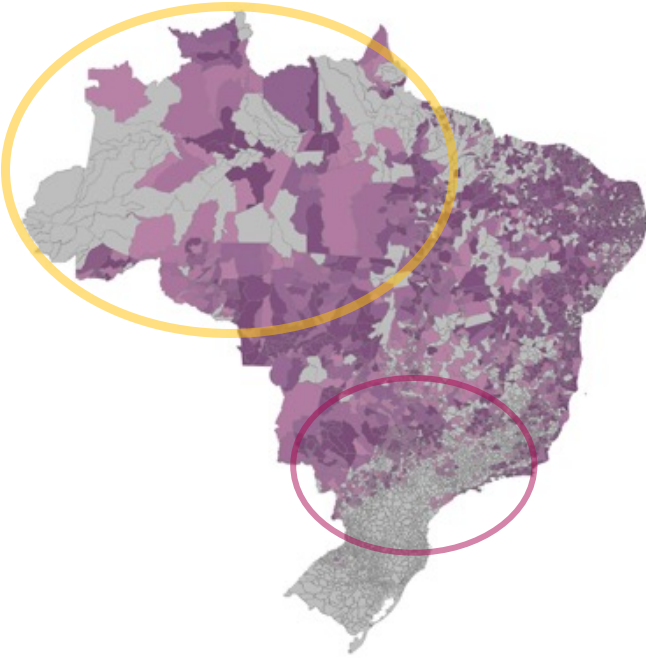
Lowlands ( $< 1500$  masl)



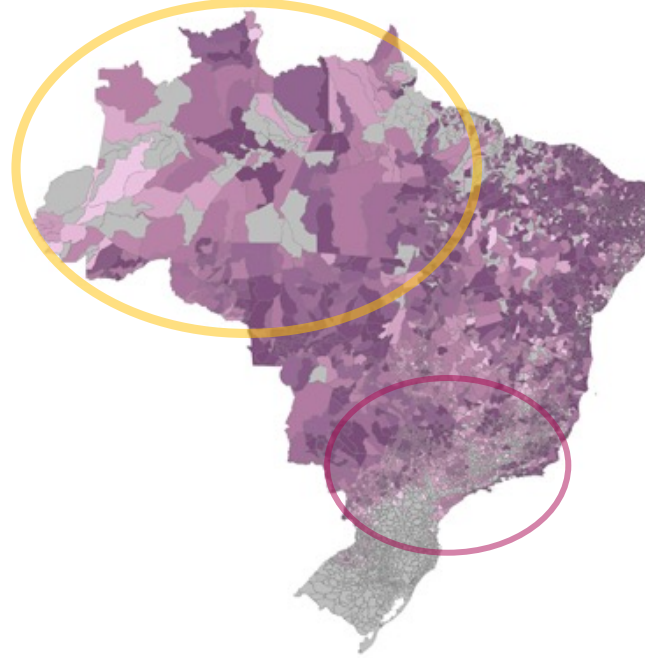
Trend by Human Development Index (HDI)

# Expansión del dengue en el Brasil del siglo XXI

2001 - 2010



2001 - 2020



Year of first outbreak

2005

2010

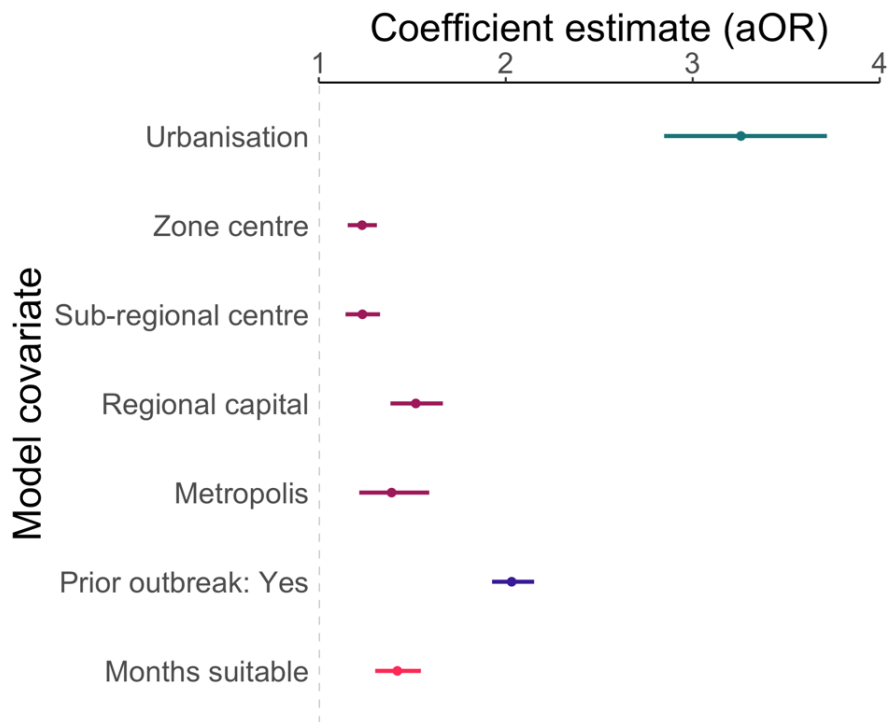
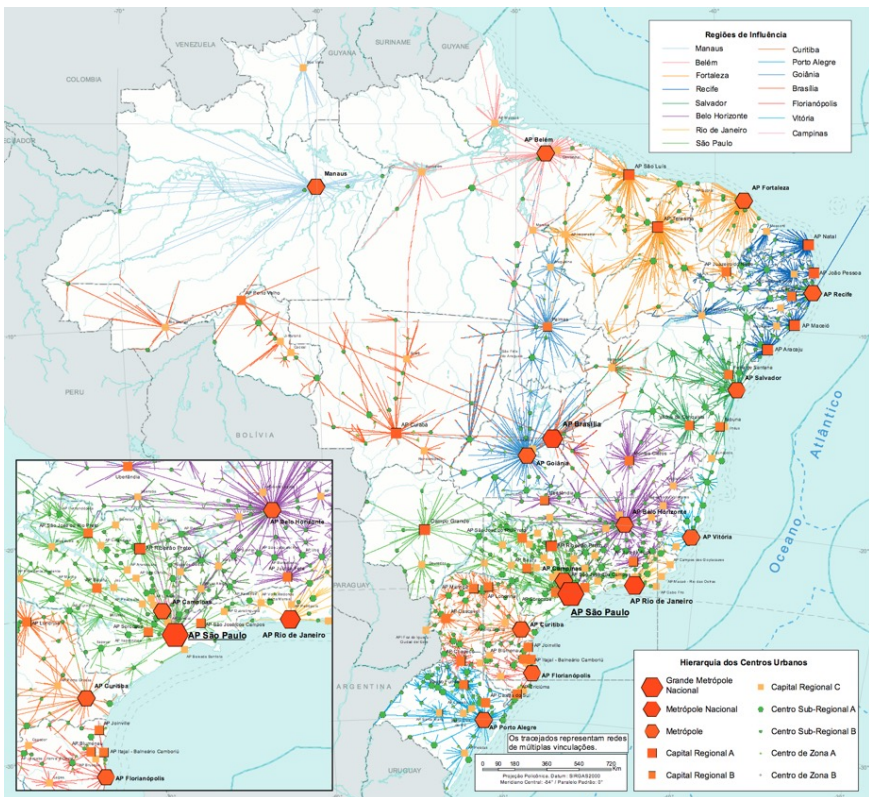
2015

2020

No outbreaks



# Clima, urbanización y conectividad



# ¿Qué datos necesitamos para comprender el impacto del clima en las enfermedades infecciosas?

gov.br

CORONAVÍRUS (COVID-19) ACESSO À INFORMAÇÃO PARTICIPAR

MINISTÉRIO DA SAÚDE

## DATASUS

Sistemas Notícias Segurança da informação Acesso à informação Metodologias Perguntas frequentes  
Processos Seletivos Fale conosco

datasus.saude.gov.br/informacoes-de-saude-tabnet/

Importado Importado do... BSC Spain R e dados Sifilis Scientific\_texts Textos\_midia Invest Corrida email Fiocruz Lin

- Indicadores de Saúde e Pactuações
- Assistência à Saúde
- Doenças e Agravos de Notificação - 2007 em diante (SINAN)**
  - Morbidade Hospitalar do SUS (SIH/SUS)
  - Casos de Aids - Desde 1980 (SINAN)
  - Casos de Hanseníase - Desde 2001 (SINAN)
  - Casos de Tuberculose - Desde 2001 (SINAN)
  - Doenças e Agravos de Notificação - 2007 em diante (SINAN)
  - Doenças e Agravos de Notificação - 2001 a 2006 (SINAN)
  - Notificações de casos suspeitos de SCZ - desde 2015
  - Programa de Controle da Esquistossomose (PCE)
  - Estado Nutricional (SISVAN)
  - Hipertensão e Diabetes (HIPERDIA)
  - Câncer de colo de útero e de mama (SISCOLO/SISMAMA)
  - Sistema de Informação do Câncer - SISCAN (colo do útero e mama)
  - Tempo até o início do tratamento oncológico - PAINEL - oncologia
- Rede Assistencial
- Estatísticas Vitais

## Doenças e Agravos de Notificação - 2007 em diante (SINAN)

Opção selecionada: Doenças e Agravos de Notificação - 2007 em diante (SINAN)

- Acidente por Animais Peçonhentos
- Botulismo
- Cólera
- Coqueluche
- Dengue até 2013
- Dengue de 2014 em diante
- Difteria
- Doença de Chagas Aguda
- Doenças Exantemáticas
- Esquistossomose
- Febre Amarela
- Febre de Chikungunya
- Febre Maculosa
- Febre Tifóide
- Hantavirose
- Hepatite
- Influenza Pandêmica



## Doenças e Agravos de Notificação - 2007 em diante (SINAN)

Opção selecionada: Doenças e Agravos de Notificação - 2007 em diante (SINAN)

- Acidente por Animais Peçonhentos
- Botulismo
- Cólera
- Coqueluche
- Dengue até 2013
- Dengue de 2014 em diante
- Difteria
- Doença de Chagas Aguda
- Doenças Exantemáticas
- Esquistossomose
- Febre Amarela
- Febre de Chikungunya
- Febre Maculosa
- Febre Tifoide
- Hantavirose
- Hepatite
- Influenza Pandêmica

- Dengue até 2013
- Dengue de 2014 em diante
- Difteria
- Doença de Chagas Aguda
- Doenças Exantemáticas
- Esquistossomose
- Febre Amarela
- Febre de Chikungunya
- Febre Maculosa
- Febre Tifoide
- Hantavirose
- Hepatite
- Influenza Pandêmica
- Intoxicação Exógena
- Leishmaniose Visceral
- Leishmaniose Tegumentar Americana

Selecione a opção ou clique no mapa ▾

Brasil por Região, UF e Município

- Acre
- Alagoas
- Amazonas
- Amapá
- Bahia
- Ceará
- Distrito Federal
- Espírito Santo
- Goiás
- Maranhão
- Mato Grosso
- Mato Grosso do Sul
- Minas Gerais
- Pará
- Paraíba
- Paraná
- Pernambuco
- Piauí

Selecione a opção ou clique no mapa ▾

DENGUE - NOTIFICAÇÕES REGISTRADAS NO SISTEMA DE AGRAVOS DE NOTIFICAÇÃO - BRASIL

Linha	Coluna	Conteúdo
Ano 1º Sintoma(s)	Capital de notificação	Casos Prováveis
Mês 1º Sintoma(s)	Região de residência	
Semana epidem. 1º Sintomas(s)	UF de residência	
Ano notificação	Capital de residência	

### PERÍODOS DISPONÍVEIS

- 2021
- 2020
- 2019
- 2018
- 2017
- 2016

### SELEÇÕES DISPONÍVEIS

- Ano 1º Sintoma(s)
- Mês 1º Sintoma(s)
- Semana epidem. 1º Sintomas(s)
- Ano notificação
- Mês notificação
- Semana epidem. notificação
- Ano epidem. notificação
- Ano epidem. 1º Sintomas(s)
- Região de notificação

- Caso notificado assint. resid
- Faixa Etária
- Raça
- Sexo
- Class. Final
- Critério conf.
- Evolução
- Exame sorológico (IgM) Dengue
- Exame sorológico Elna
- Exame isolamento viral
- Exame de RT-PCR
- Sorotipo
- Exame de Histopatologia
- Exame de Imunohistoquímica
- Ocorrência hospitalização

Ordenar pelos valores da coluna  Exibir linhas zeradas

Formato  Tabela com bordas  Texto pré-formatado  Colunas separadas por \*\*

Mostra

Limpa

Fonte: Ministério da Saúde/SVS - Sistema de Informação de Agravos de Notificação - Sinan Net

Notas:



# Datos del censo: población e indicadores socioeconómicos



Instituto Brasileiro de Geografia e Estatística

Estadísticas > Downloads

## Downloads

Aqui você pode baixar conteúdos das nossas pesquisas estruturais, censos, entre outras, na área de estatísticas.

- ▶ Acesso\_a\_internet\_e\_posse\_celular
- ▶ acesso\_ao\_cadastro\_unico\_2014
- ▶ Artigos\_e\_Apresentacoes
- ▶ Aspectos\_das\_relacoes\_de\_trabalho\_e\_sindicacao
- ▶ Aspectos\_e\_cuidados\_das\_crianças
- ▶ Assistencia\_Social\_Privada\_Sem\_Fins\_Lucrativos
- ▶ Atualizacao\_Aplicativos
- ▶ Audiencia\_Publica
- ▶ Caracteristicas\_etnico\_raciais\_populacao
- ▶ Censo\_Agropecuario
- ▶ Censos
  - ▶ Censo\_Demografico\_1991
  - ▶ Censo\_Demografico\_2000
  - ▶ Censo\_Demografico\_2010
  - ▶ lela\_me.txt
- ▶ Comercio\_e\_Servicos

Instituto Brasileiro de Geografia e Estatística

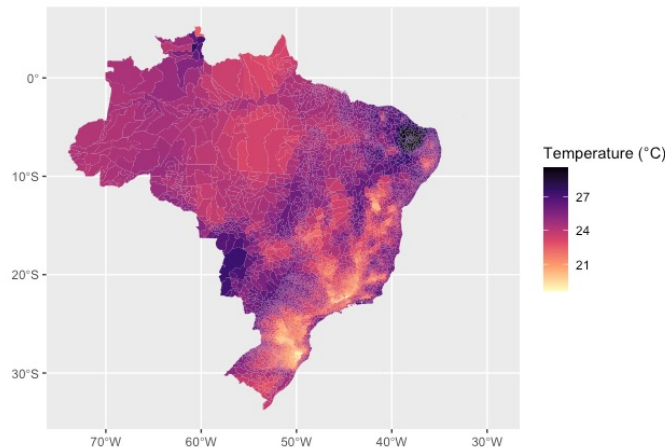
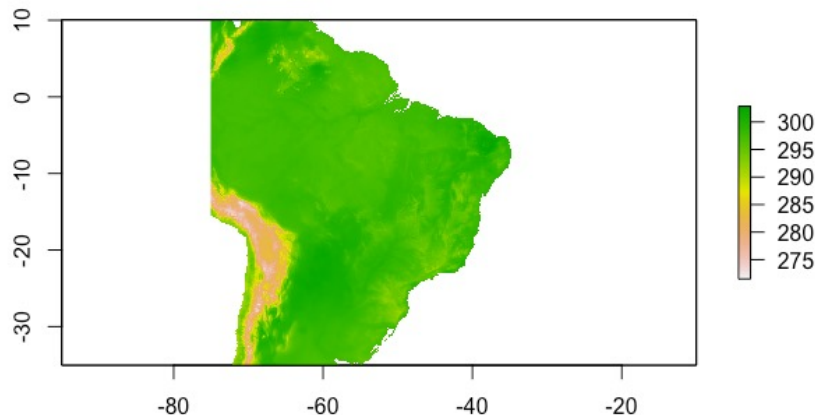
Estadísticas\_Vitais

Estimativas\_de\_Populacao

- ▶ Estimativas\_1989
- ▶ Estimativas\_1992
- ▶ Estimativas\_1993
- ▶ Estimativas\_1994
- ▶ Estimativas\_1995
- ▶ Estimativas\_1997
- ▶ Estimativas\_1998
- ▶ Estimativas\_1999
- ▶ Estimativas\_2000
- ▶ Estimativas\_2001
- ▶ Estimativas\_2002
- ▶ Estimativas\_2003
- ▶ Estimativas\_2004
- ▶ Estimativas\_2005
- ▶ Estimativas\_2006
- ▶ Estimativas\_2008
- ▶ Estimativas\_2009
- ▶ Estimativas\_2011
- ▶ Estimativas\_2012

# Postprocesamiento de datos climáticos

- Los archivos en formato NetCDF pueden ser manipulados en R como archivos raster (en grillas) y con el paquete `raster`
- Antes del análisis, el raster debe ser convertido en un mapa de polígonos (áreas) usando un mapa de referencia importado con `sf`
- Para reducir los valores de las celdas a uno por polígono, usamos el paquete `exactextractr` para extraer distintas medidas de resumen
- Por ejemplo, este mapa fue convertido de Kelvin a  $^{\circ}$ Celsius y luego se extrajo la media de temperatura por polígono usando el código `exact_extract(raster_temp, sf_brazil, 'mean')`

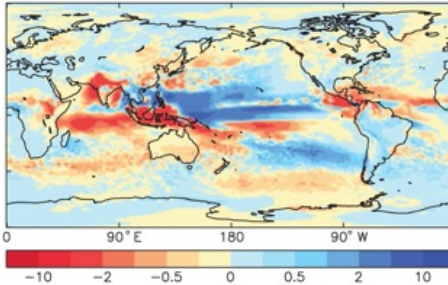
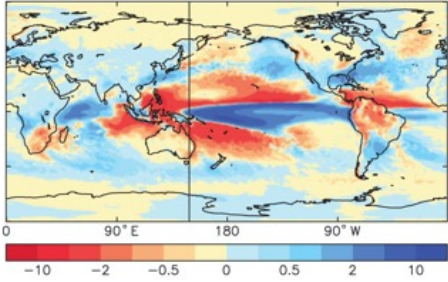


# Transformación de la información climática para el uso en sistemas de alerta temprana



# Sistemas de alerta para el dengue

## Pronóstico estacional del clima



Met Office GloSea5  
(MacLachlan *et al.* 2014)

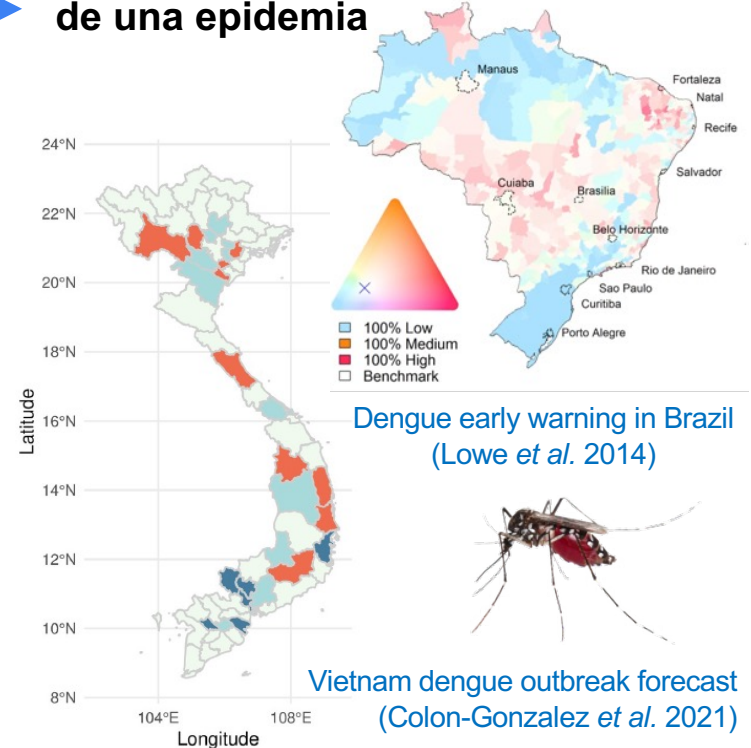


## Modelo estadístico

usa asociaciones aprendidas de datos climático históricos para predecir el riesgo de una epidemia



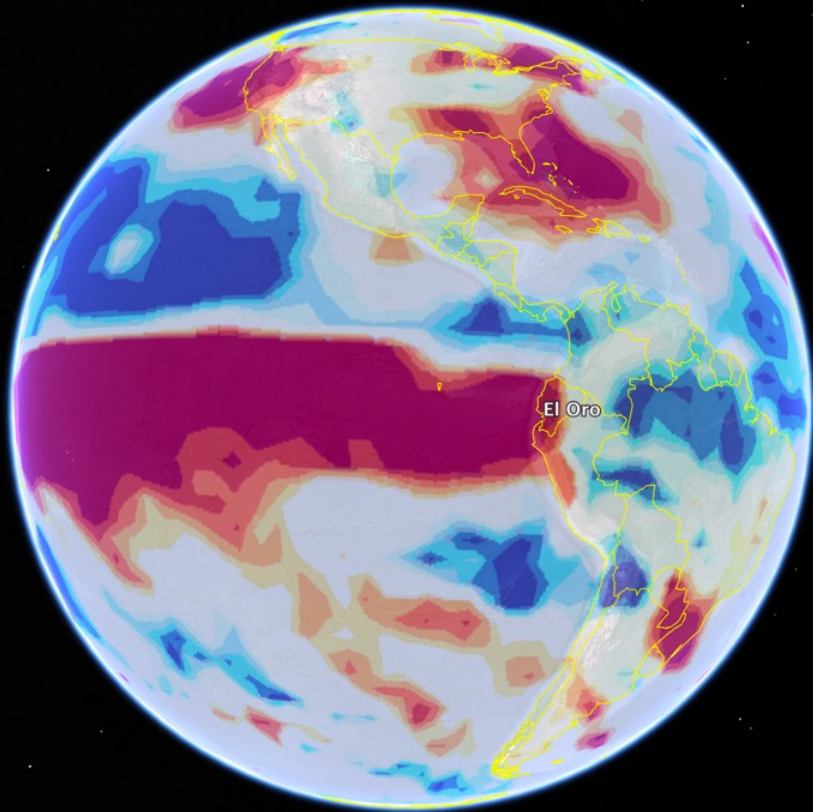
## Pronóstico de la probabilidad de una epidemia



Dengue early warning in Brazil  
(Lowe *et al.* 2014)

Vietnam dengue outbreak forecast  
(Colon-Gonzalez *et al.* 2021)





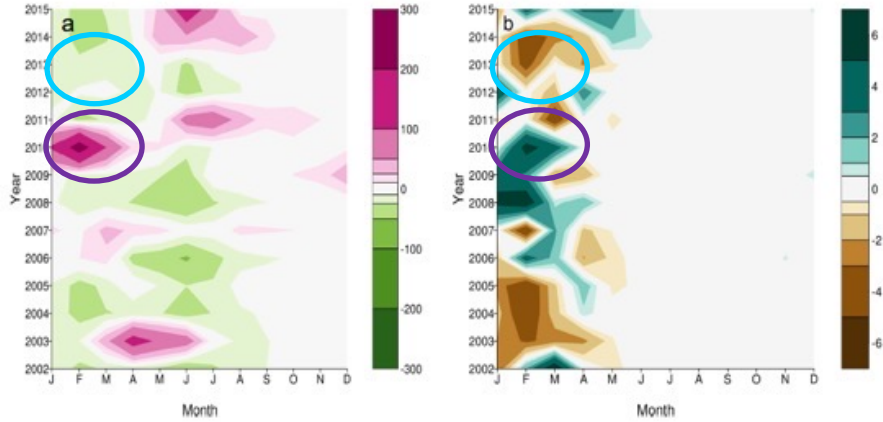




En 2016, la peor inundación desde 1998 ocurrió en Machala, Ecuador

Photo: Danny Krom

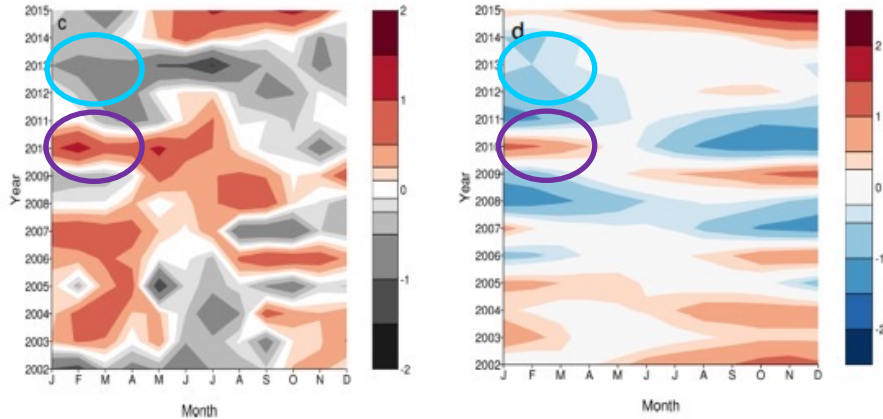
# Dengue y clima: datos y modelos



○ más frío/seco que lo usual → menos dengue  
○ más cálido/húmedo que lo usual → más dengue

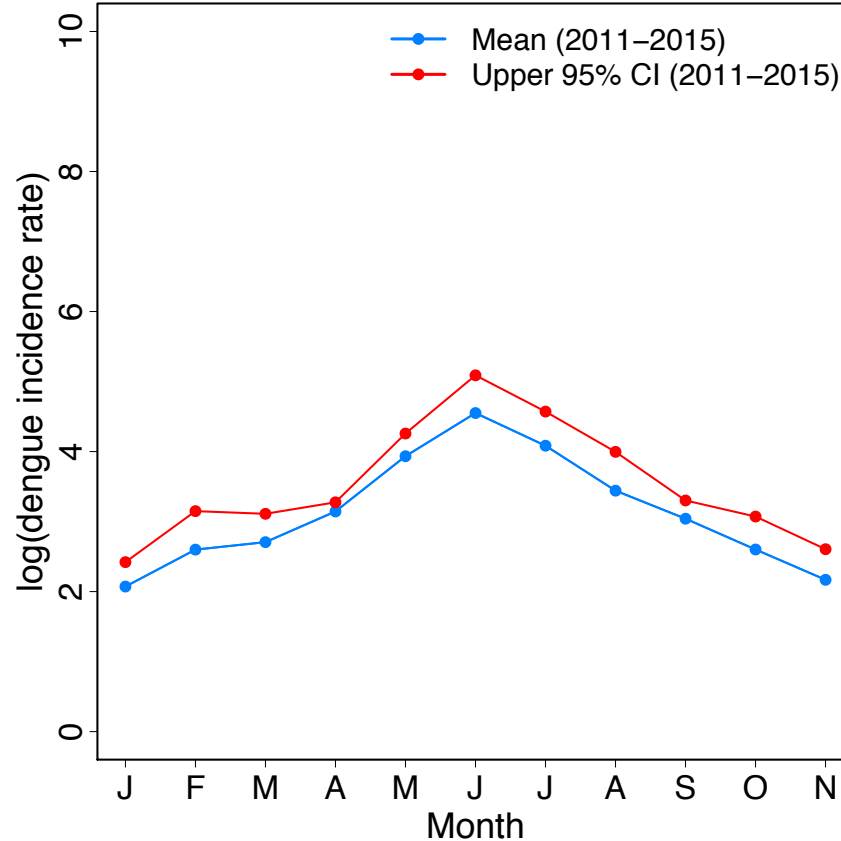
$$y_t \sim \text{NegBin}(\mu_t, \kappa)$$

$$\log(\mu_t) = \log(p) + \log(r_t)$$

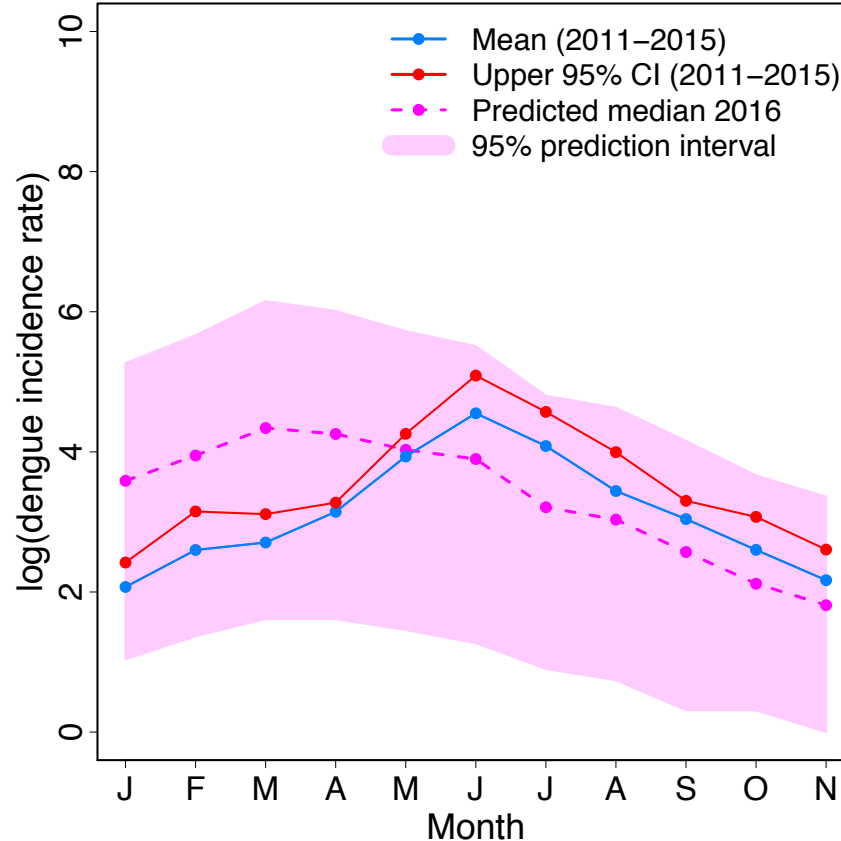


$$\log(r_t) = \underbrace{\alpha}_{\text{Dengue incidence rate}} + \underbrace{f(\beta_{t(t)})}_{\text{Annual cycle}} + \underbrace{\sum_j \gamma_j x_{jt}}_{\text{Climate variables}} + \underbrace{\delta_{T(t)}}_{\text{Inter-annual variation}}$$

# Práctica habitual de vigilancia: canal endémico

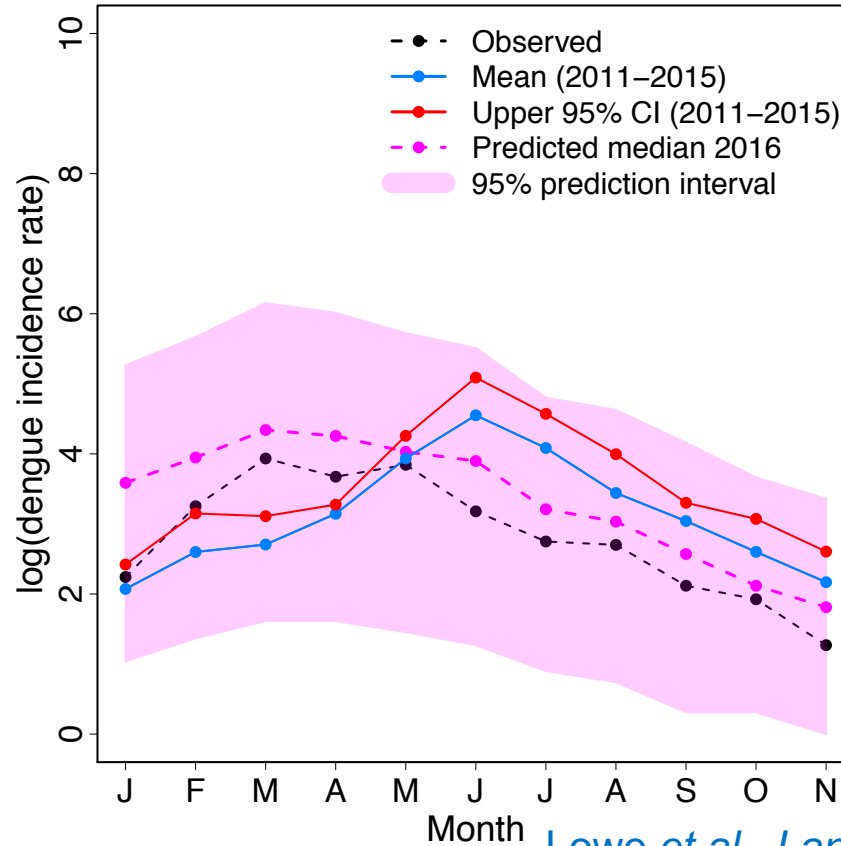


# Predicción del dengue usando pronósticos climáticos





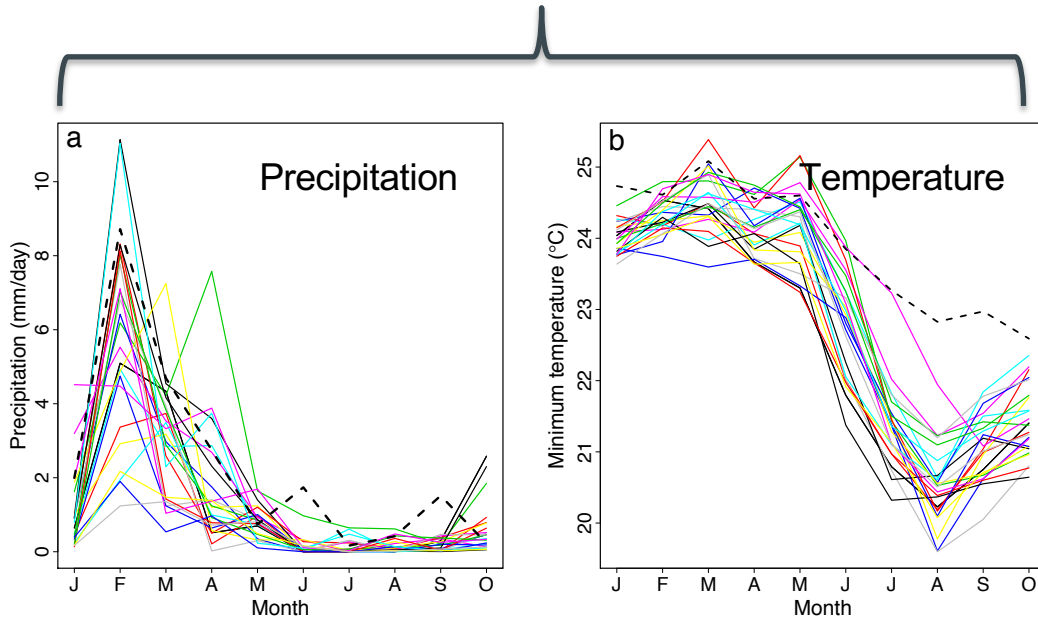
# Pico temprano detectado usando pronóstico del clima





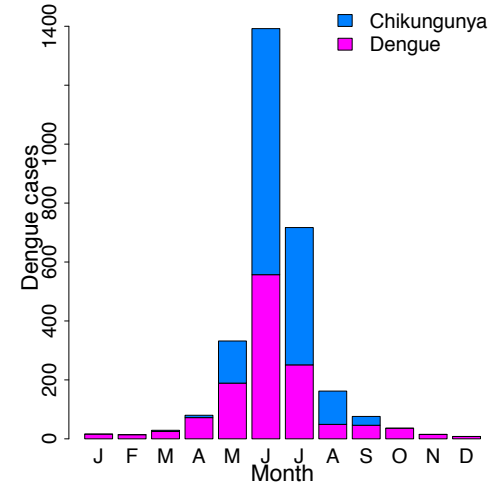
# Fuentes de previsibilidad

## Sincronización



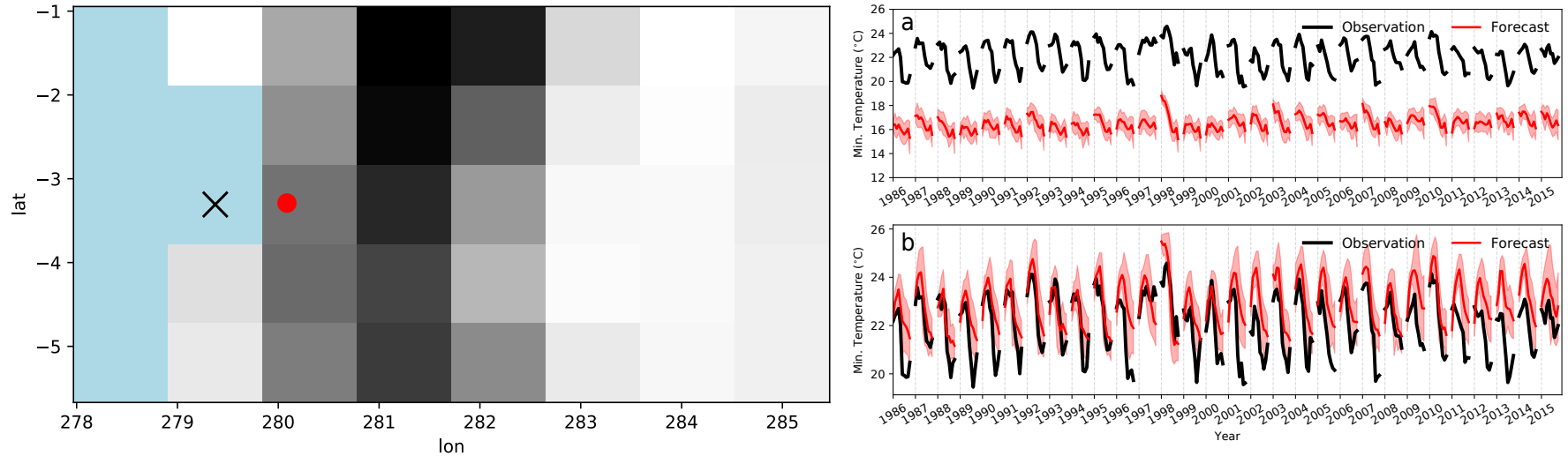
Pronóstico climático estacional

## Magnitud



Vigilancia activa

# Alineación de la estación meteorológica y los datos cuadriculados

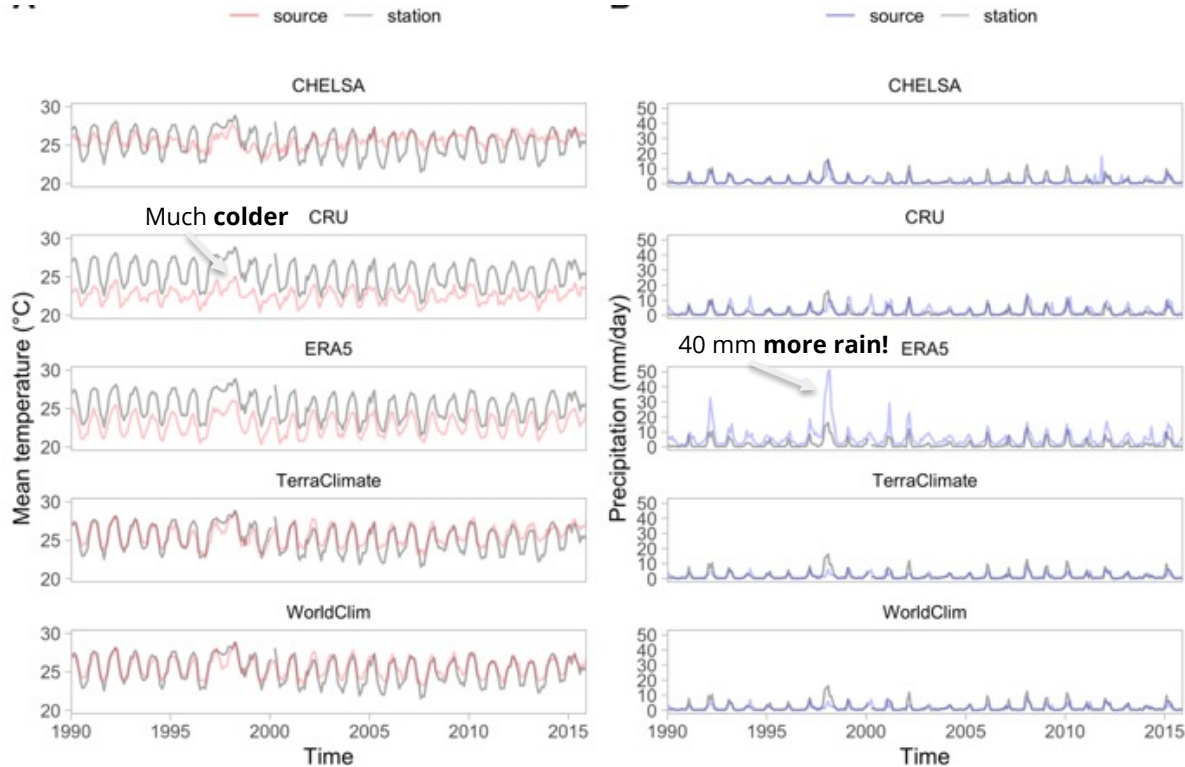


**Figure S5:** Topography in the Ecuador area as seen by the Climate Forecast System version 2 (CFSv2) model with 1 degree resolution (111 km at the Equator). Points marked as sea by the model land-sea mask are shaded in blue. The weather station is Machala is indicated with a red dot. The grid point chosen as being representative of the climate in Machala is marked with a black cross.

# Varios productos de datos climáticos

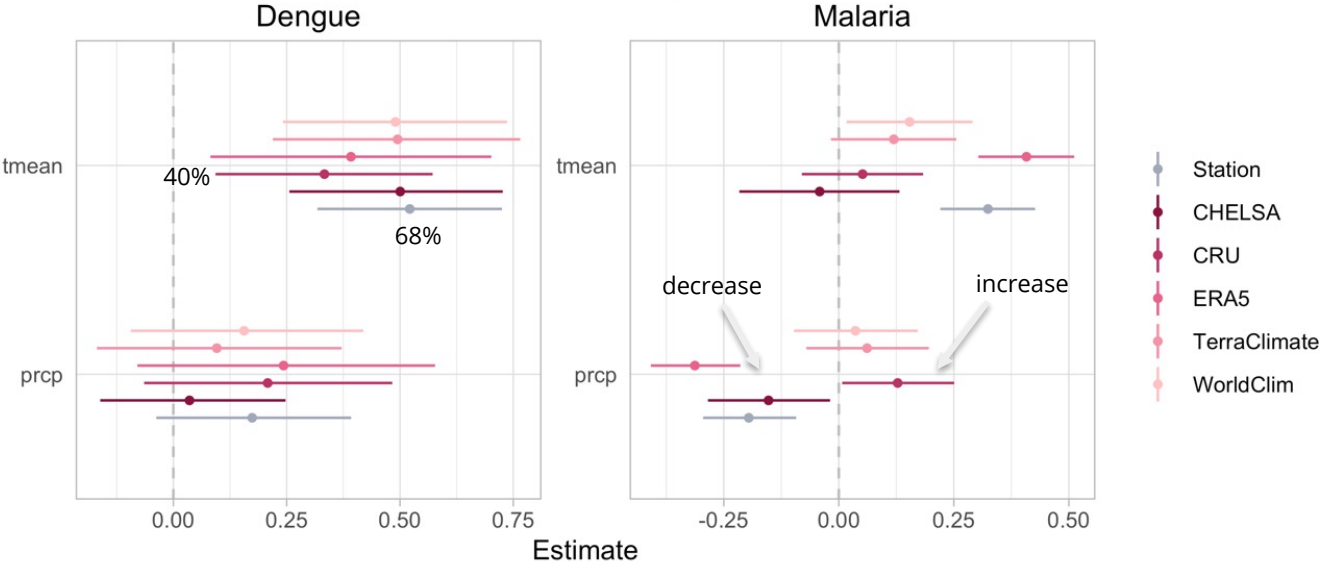
Source	Description	Temporal resolution	Spatial resolution	Historical coverage	File format
CHELSA	Based on mechanistical statistical downscaling of global reanalysis data (ERA-Interim) to a high resolution	Monthly	1 km/0.008°	1980-2019	GeoTiff
CRU TS	Estimates are produced using angular-distance weighting interpolation of climate anomalies from extensive global weather station observations	Monthly	55 km/0.5°	1901-2020	ASCII, NetCDF
ERA5-Land	A reanalysis dataset based on climate models of land surfaces	Up to hourly	9 km/0.08°	1950-present	GRIB, NetCDF
TerraClimate	Uses climatically aided interpolation and combines climatological normals from WorldClim with time-varying anomalies from CRU TS v.4.0 and Japanese 55-year Reanalysis (JRA55)	Monthly	4 km/0.04°	1958-2019	NetCDF
WorldClim	Historical estimates of climate variables downscaled from CRU TS v.4.03 and using WorldClim 2.1 for bias correction	Monthly	21 km/0.2°	1960-2018	GeoTiff

# Los datos climáticos para una misma ubicación varían según el producto



Monthly mean (A) temperature (°C) and (B) precipitation (mm/day) from the Granja Santa Ines meteorological station in Machala, Ecuador, and corresponding estimates from five global climate datasets

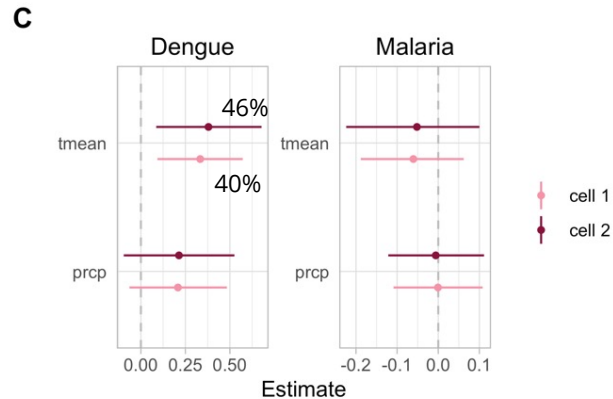
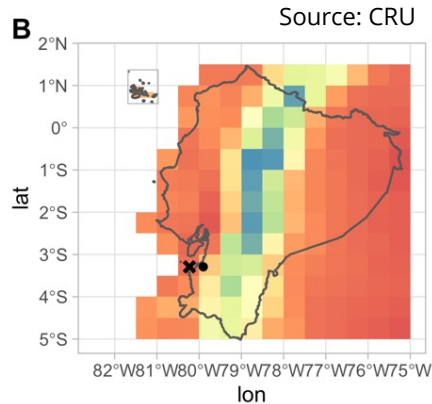
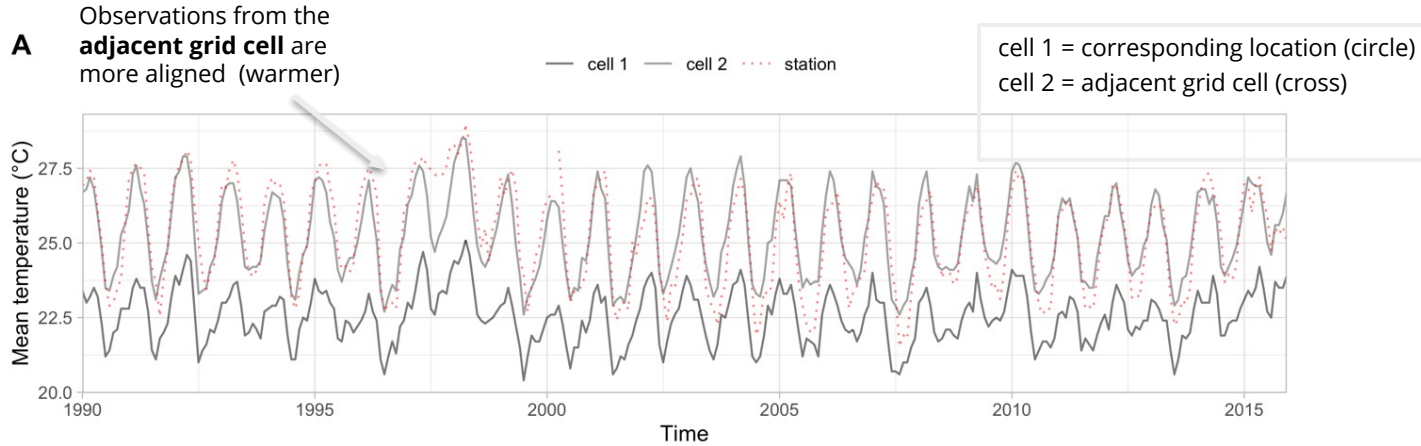
# La elección del producto afecta la relación clima-enfermedad



Posterior mean and 95% credible intervals of mean temperature (tmean) and precipitation (prcp) variables, in temporal models of monthly (C) dengue cases 2002–2014 and (D) malaria cases 1990–2015 in Machala.



# La elección de la celda adecuada es importante para capturar las condiciones reales del terreno



# Identificación de indicadores hidrometeorológicas para predecir el riesgo de brotes de enfermedades sensibles al clima



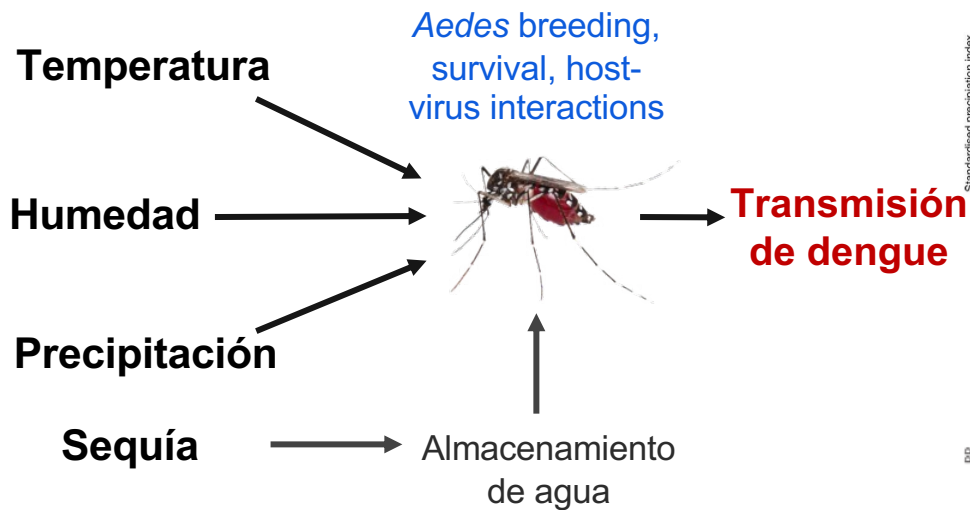
# Votación en Zoom

¿Cuál es el hábitat favorito de las larvas del mosquito *Aedes aegypti*?

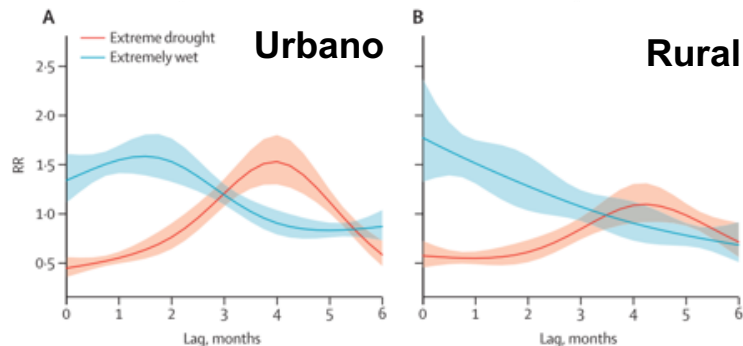
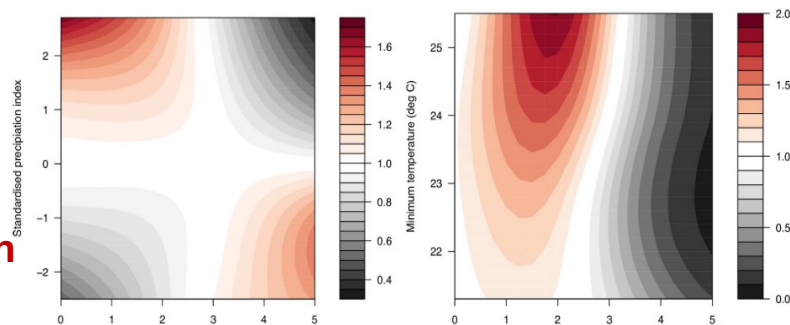
- a) Contenedores de agua artificiales
- b) Huecos en el tronco de árbol
- c) Piscinas



# Los factores climáticos son importantes predictores del riesgo de dengue



Nonlinear and delayed impacts of temperature and precipitation on dengue risk in Barbados (Lowe *et al.* 2018)



Dengue risk at different time lags under extreme wet and drought in Brazil (Lowe *et al.* 2021)





Urbanización no planificada e infraestructura inadecuada



# Los contenedores temporales de almacenamiento de agua se convierten en criaderos de mosquitos



Photo Credit: Christovam Barcellos, Fiocruz

# Modelado de asociaciones retrasadas y no lineares

Incidencia anual de dengue por cada 100,000 habitantes

$$y_t | \mu_t \sim \text{NegBin}(\mu_t = \overbrace{\rho_{T'(t)} \rho_t}^{\text{}} , \kappa)$$

$$\log(\mu_t) = \log(\rho_{T'(t)}) + \log(\rho_t)$$

$$\log(\rho_t) = \alpha + \underbrace{\beta_{t'(t)}}_{\text{Ciclo}} + \underbrace{\gamma_{T'(t)}}_{\text{variación}} + \underbrace{\text{f.w}(x_{1t}, l) + \text{f.w}(x_{2t}, l)}_{\text{funciones de exposición-}} + \text{f.w}(x_{2t}, l)$$

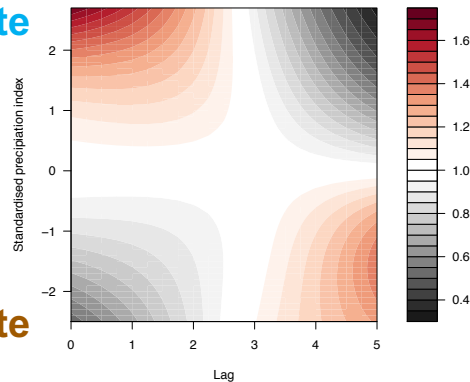
Ciclo  
annual

variación  
inter-annual

funciones de exposición-  
respuesta-tardía para  
SPI-6 y Tmín

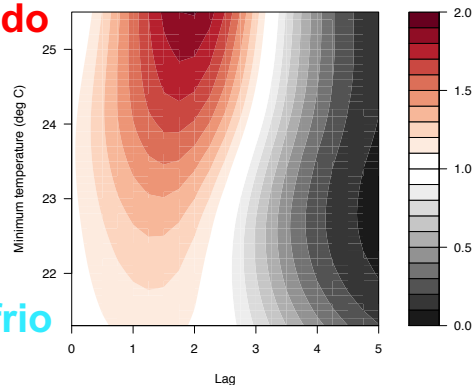
Excepcionalmente  
húmedo

Excepcionalmente  
seco



Mas calido

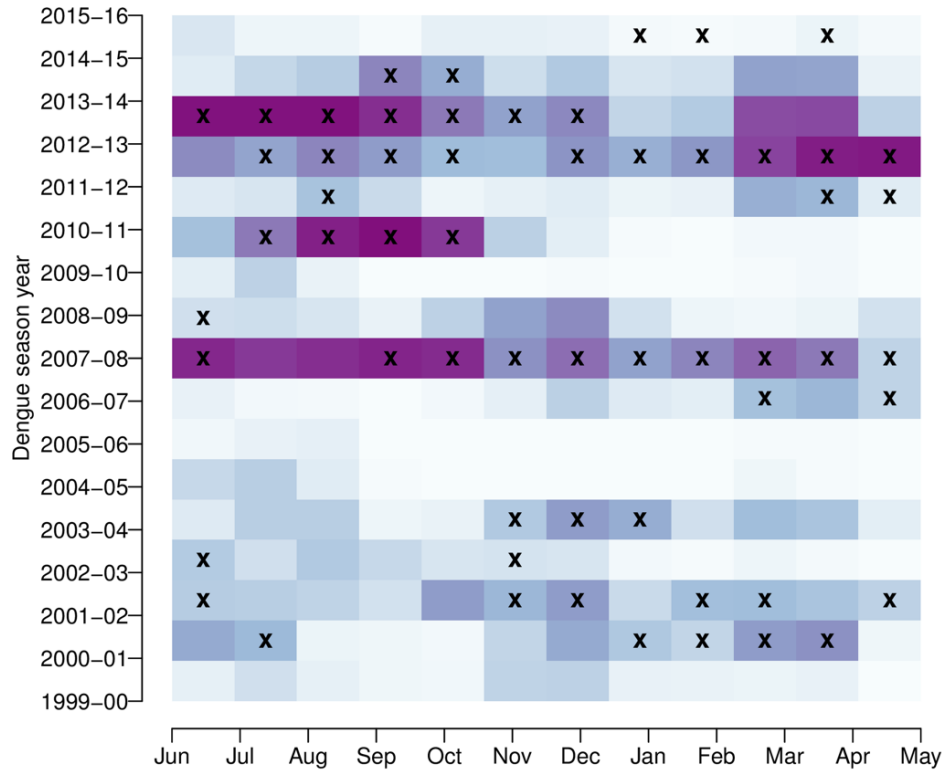
Mas frio



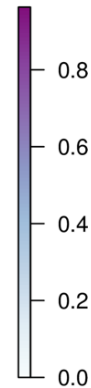
Short lag

Long lag

# Probabilidad de exceder el límite de epidemia

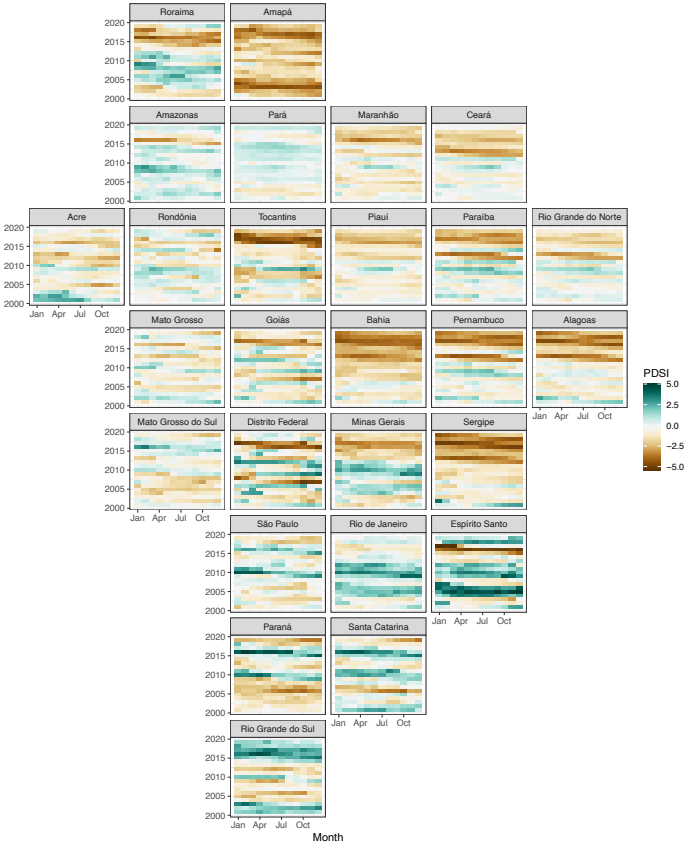
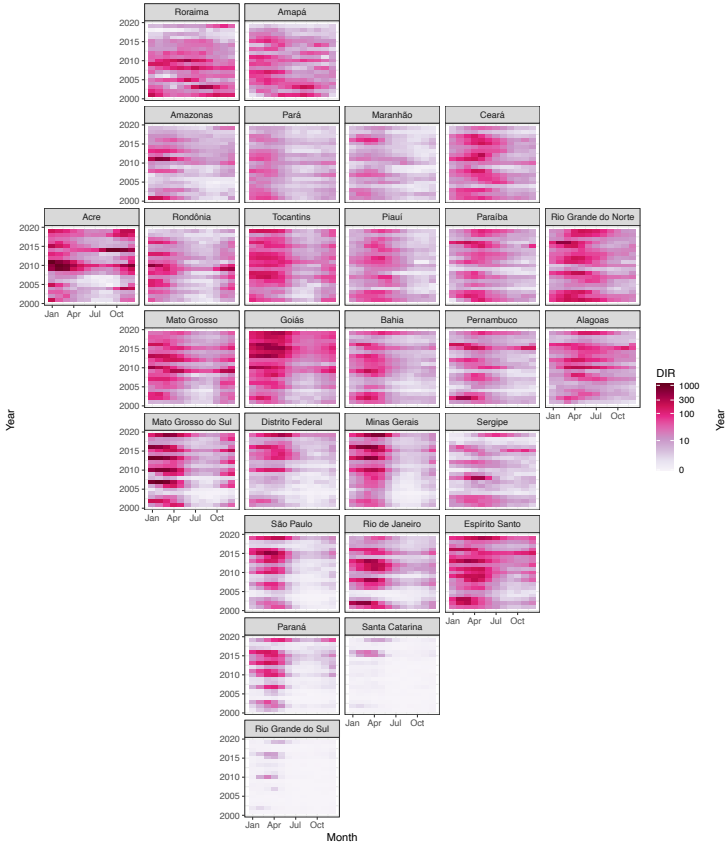


X mes epidémico

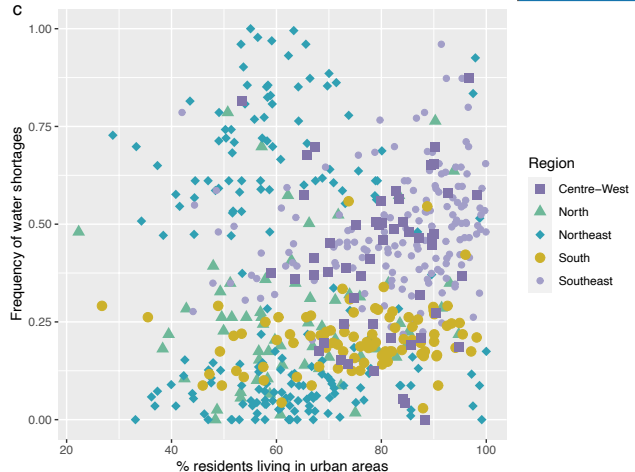
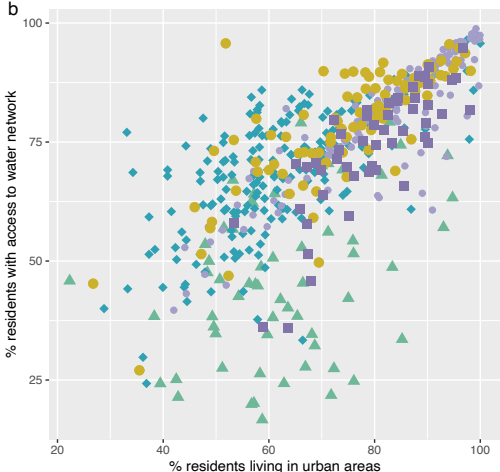
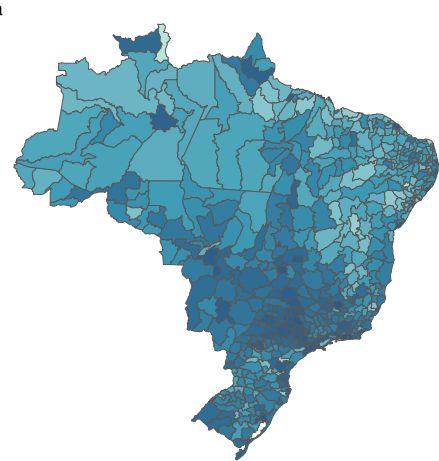


Límite probabilístico de detección del 30%

# Dengue y sequías 2001-2019



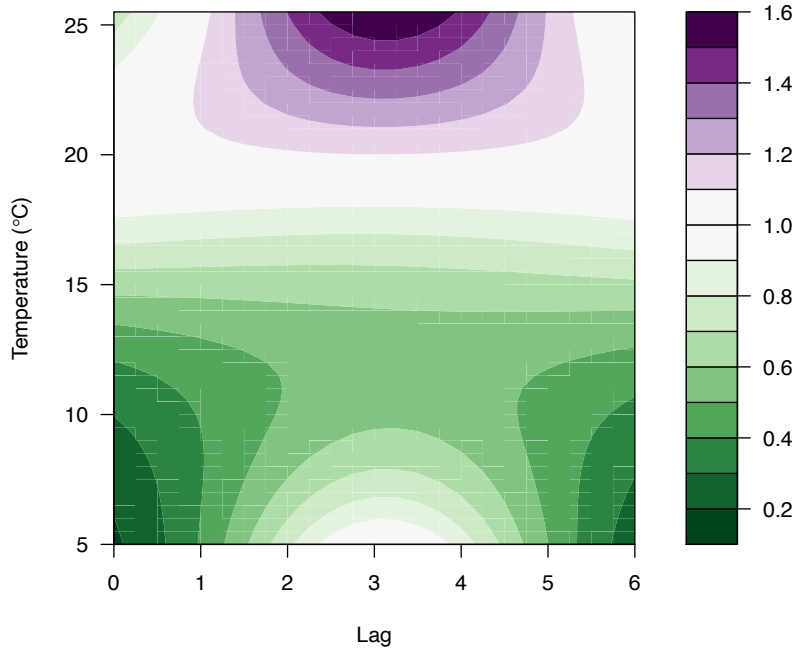
# Nivel de urbanización, acceso a agua corriente y frecuencia de escasez de agua



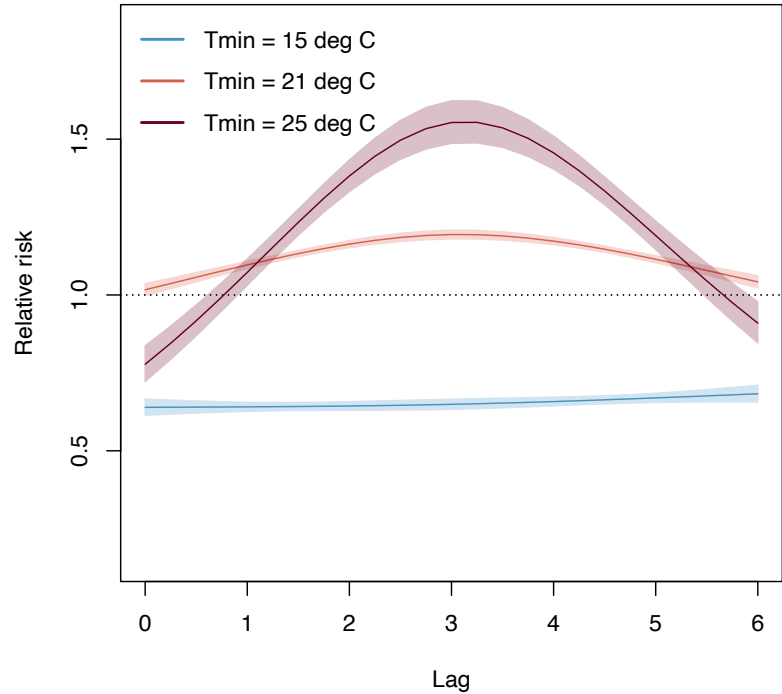


# Temperaturas más cálidas y riesgo de dengue

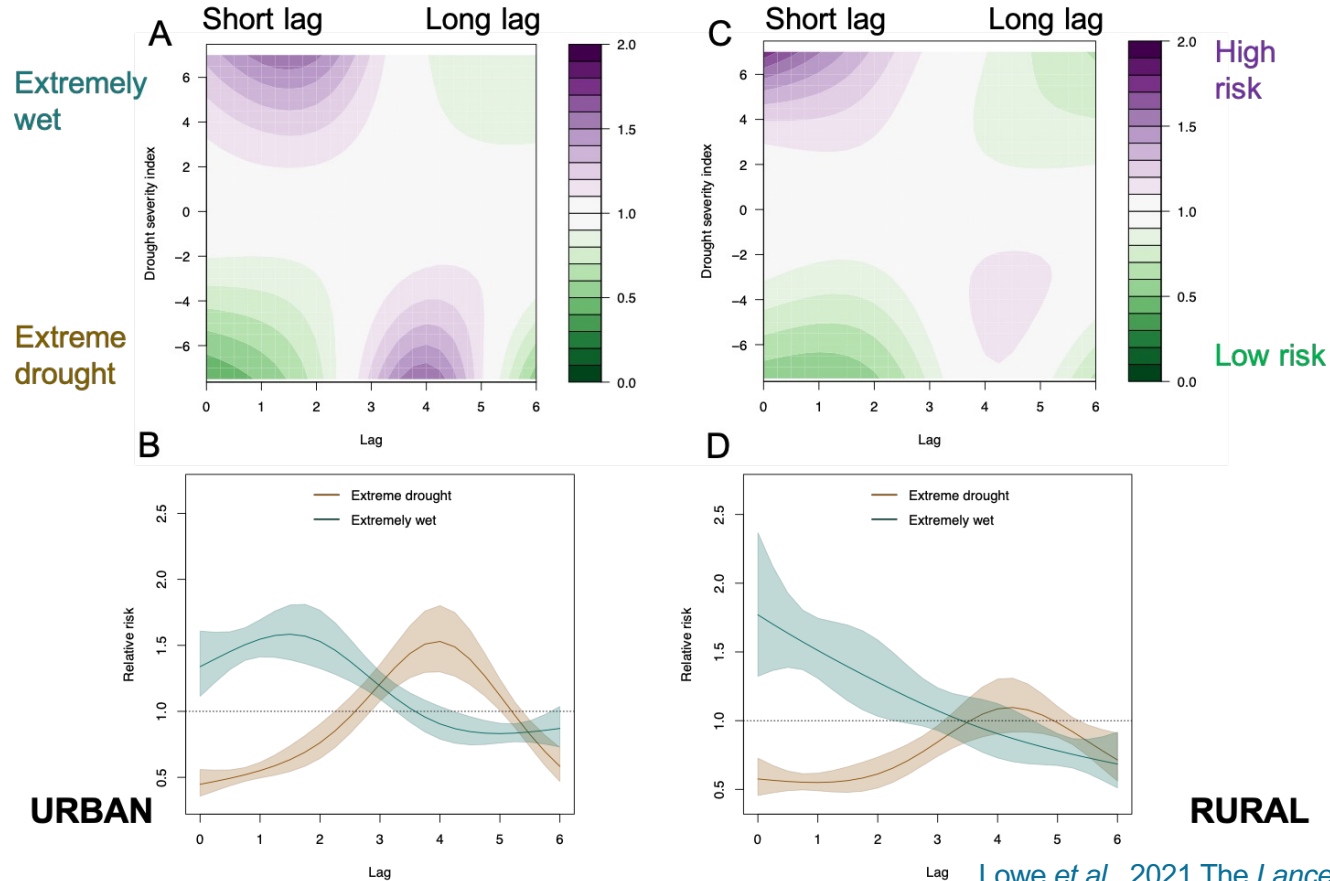
a



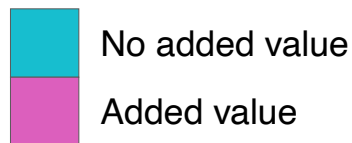
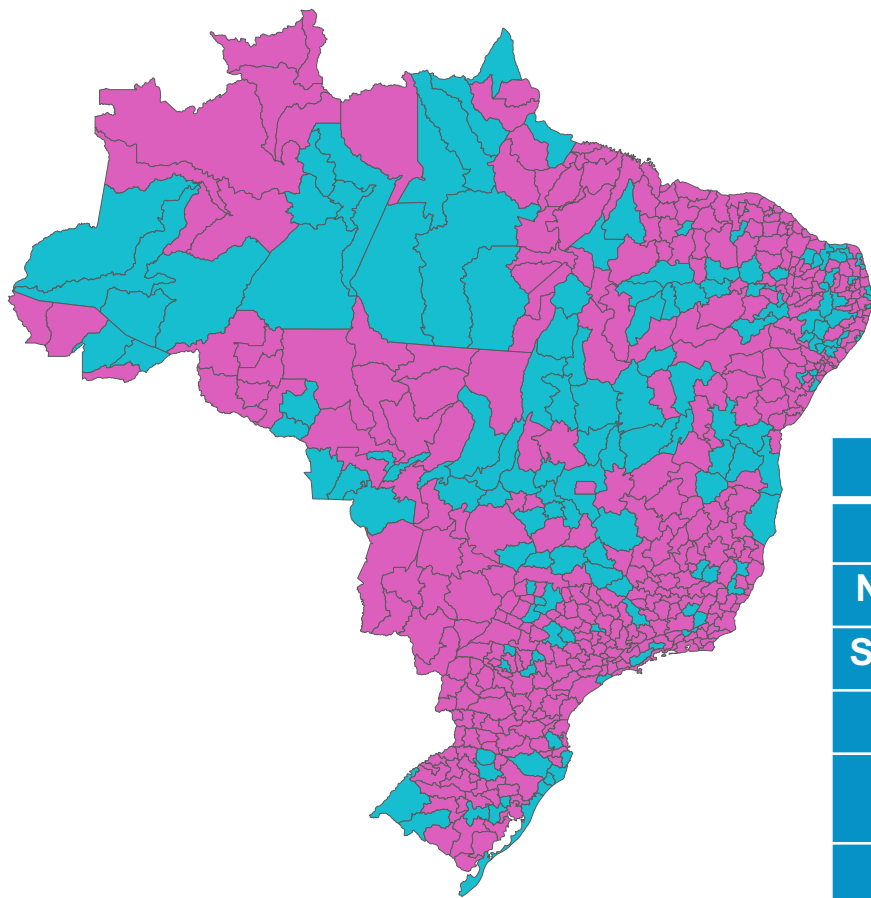
b



# Extremos hidrometeorológicos a lo largo de un gradiente urbano

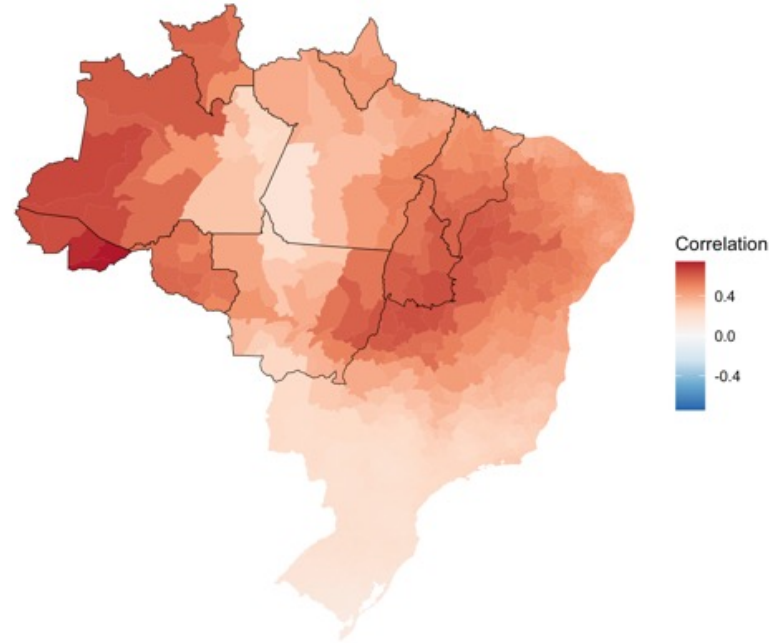
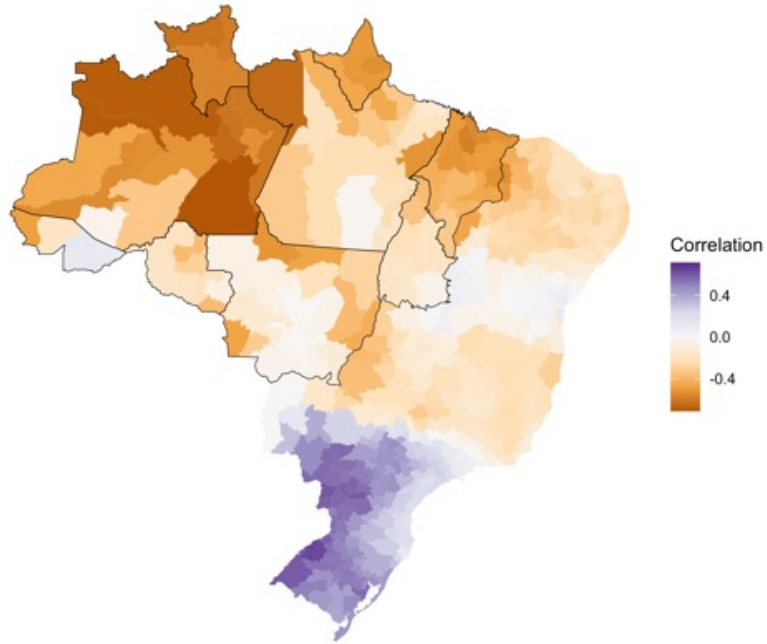


# Valor añadido de los predictores hidrometeorológicos



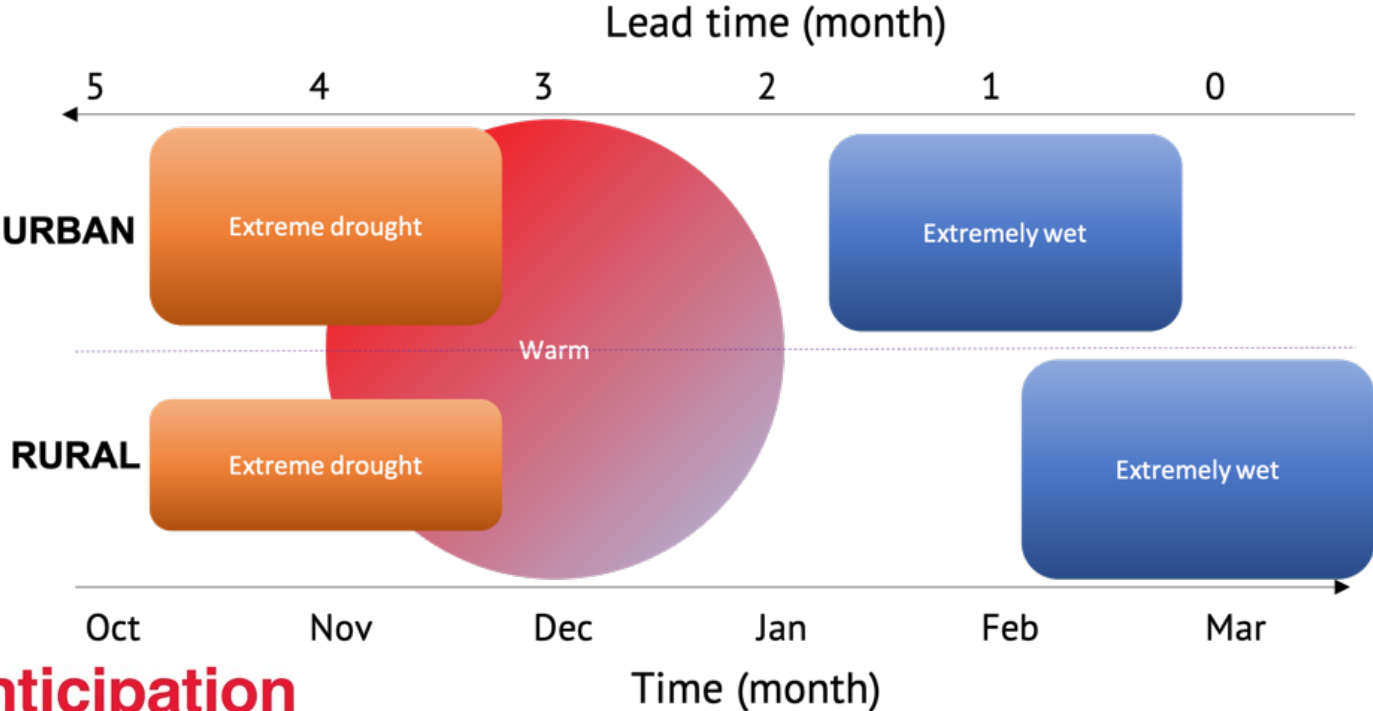
Region	Added value	Total	Proportion
North	37	64	58%
Northeast	130	188	69%
Southeast	135	160	84%
South	75	94	80%
Centre-West	32	52	62%
Brazil	409	558	73%

# Donde funcionaría mejor un sistema de alerta?



Teleconexión entre El Niño-Oscilación del Sur (Nov-Dic-Ene), precipitaciones extremas y temperatura en Brasil (Feb-Mar-Abr)

# Adaptar el pronóstico dependiendo del paisaje







## Air Quality Services

Developing air quality products and services tailored to user's needs, from global/regional to local urban scale.

## Climate Services

Applying state-of-the-art climate knowledge for the co-development of climate information and solutions for key societal sectors to adapt to climate change.

# Earth System Services



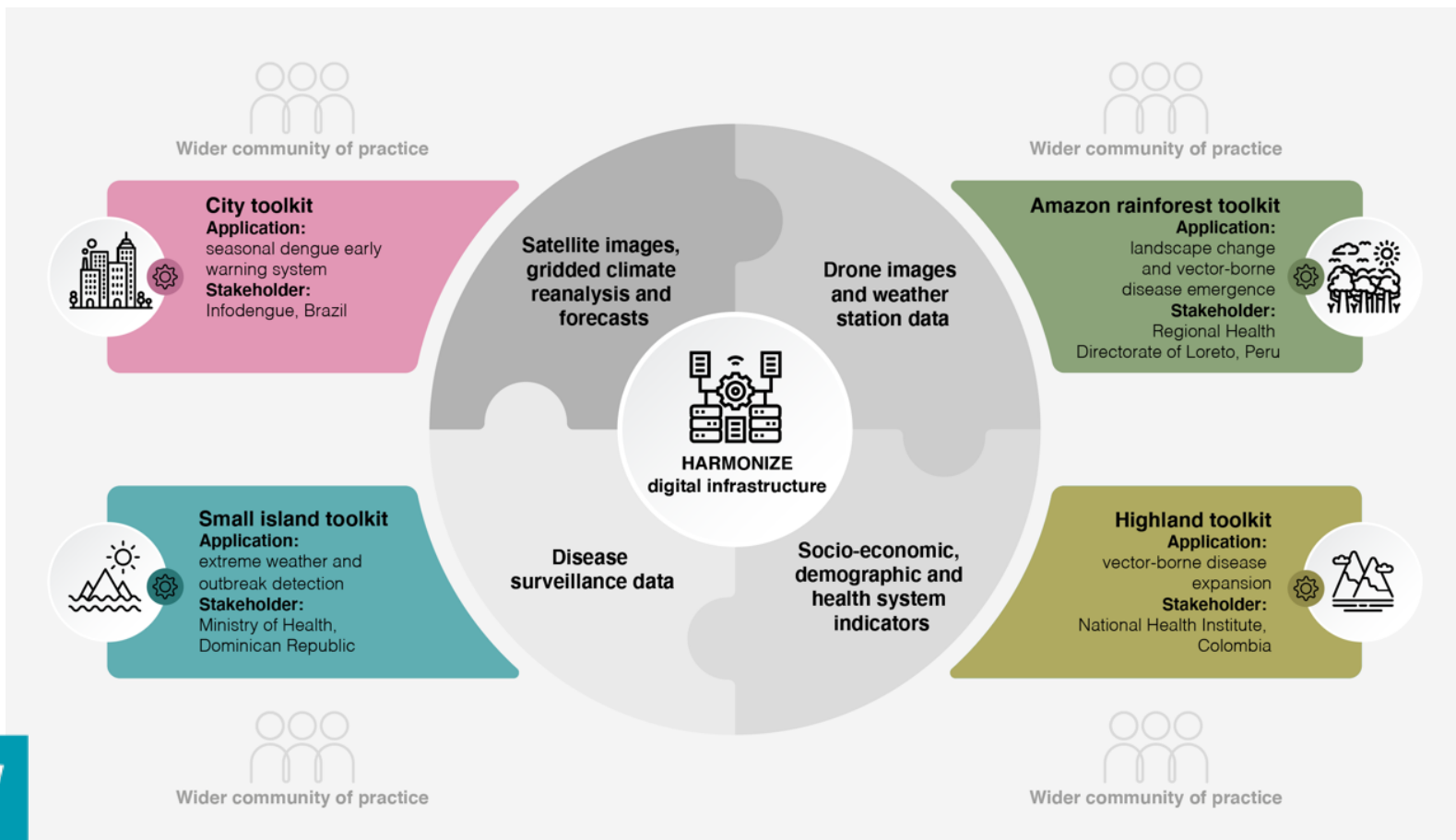
## Global Health Resilience

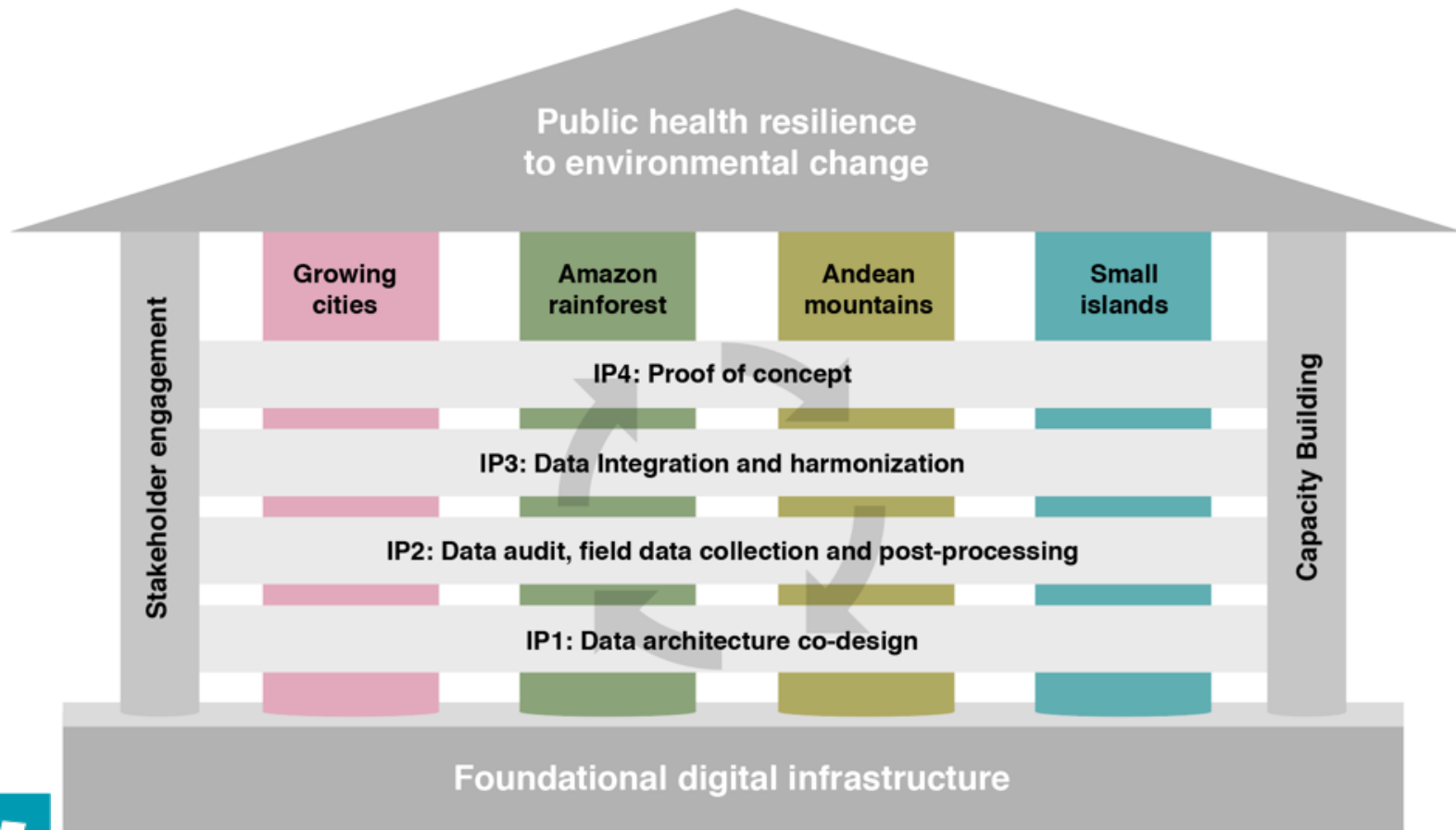
Applying a transdisciplinary approach to co-designing policy-relevant solutions to enhance response to climate-sensitive disease outbreaks and emergence.

## Knowledge Integration

Coproducing knowledge regarding environmental topics, as well as technology transfer, communication and dissemination, visualisation, education, and outreach.

# HARMONIZE





# Referencias

Strengthening the global response to climate change and infectious disease threats  
<https://doi.org/10.1136/bmj.m3081>

Climate services for health: From global observations to local interventions  
[https://www.cell.com/med/pdfExtended/S2666-6340\(21\)00112-4](https://www.cell.com/med/pdfExtended/S2666-6340(21)00112-4)

Climate-sensitive disease outbreaks in the aftermath of extreme climatic events: A scoping review  
[https://www.cell.com/one-earth/pdf/S2590-3322\(22\)00144-0.pdf](https://www.cell.com/one-earth/pdf/S2590-3322(22)00144-0.pdf)

Climate services for health: predicting the evolution of the 2016 dengue season in Machala, Ecuador  
[https://www.thelancet.com/journals/lanplh/article/PIIS2542-5196\(17\)30064-5/fulltext](https://www.thelancet.com/journals/lanplh/article/PIIS2542-5196(17)30064-5/fulltext)

Combined effects of hydrometeorological hazards and urbanisation on dengue risk in Brazil: a spatiotemporal modelling study  
[https://www.thelancet.com/journals/lanplh/article/PIIS2542-5196\(20\)30292-8/fulltext](https://www.thelancet.com/journals/lanplh/article/PIIS2542-5196(20)30292-8/fulltext)



# ¡Muchísimas gracias!



rachel.lowe@bsc.es

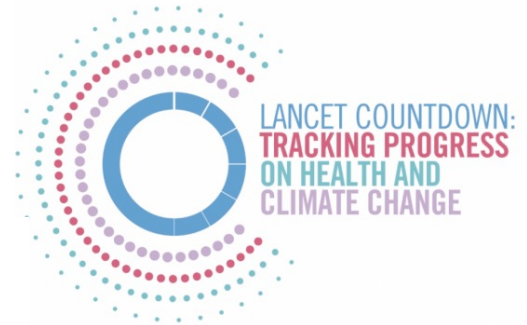


@drrachellowe



European  
Environment  
Agency

THE  
ROYAL  
SOCIETY



European  
Commission