

Epidemiological modelling in the public eye

Manoj Gambhir, manoj.gambhir@monash.edu

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NCEZID, Health Economics and Modeling Unit, CDC, Atlanta GA, USA

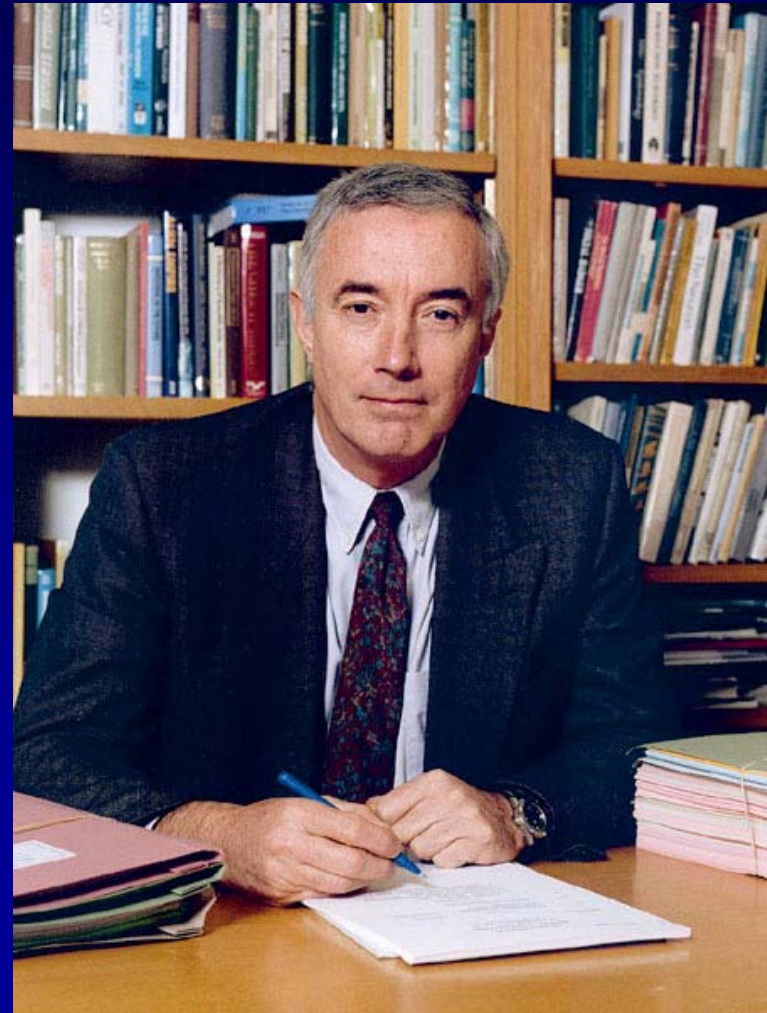
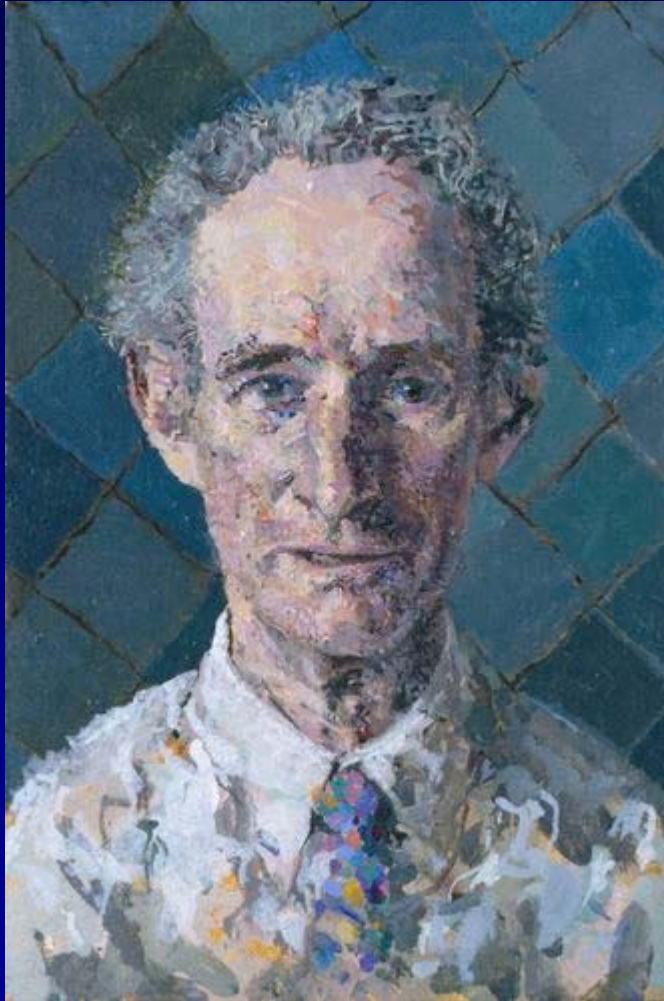
MRC Centre for Outbreak Analysis and Modelling, Imperial College London, UK

- Modelling at CDC
 - ✓ Pertussis
 - ✓ Ebola

Modelling at CDC



Lord Robert May & Sir Roy Anderson



Nature Vol. 280 2 Au

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The re-emergence of the viral aetiological agent of SARS
in China at the end of 2003 (Paterson 2004), following
the epidemic earlier in the year affecting many countries,
rang alarm bells in the WHO and elsewhere. Thankfully,

Male homosexual

The NEW ENGLAND JOURNAL of MEDICINE

ORIGINAL ARTICLE

Ebola Virus Disease in West Africa — The First 9 Months of the Epidemic and Forward Projections

WHO Ebola Response Team*

ABSTRACT

BACKGROUND

On March 23, 2014, the World Health Organization (WHO) was notified of an out
break of Ebola virus disease (EVD) in Guinea. On August 8, the WHO declared the
epidemic to be a "public health emergency of international concern."

METHODS

By September 14, 2014, a total of 4507 probable and confirmed cases, including
2296 deaths from EVD (Zaire species) had been reported from five countries in
West Africa — Guinea, Liberia, Nigeria, Senegal, and Sierra Leone. We analyzed a
detailed subset of data on 3343 confirmed and 667 probable Ebola cases collected
in Guinea, Liberia, Nigeria, and Sierra Leone as of September 14.

devastation earlier in 2003. A clear priority is further sur-
veillance of animals in settings where the human virus
spread extensively so as to better understand the origins of
the epidemic in humans and the role of animal reservoirs.

35 48

Host population



The simple SIR epidemic model

S

Susceptible

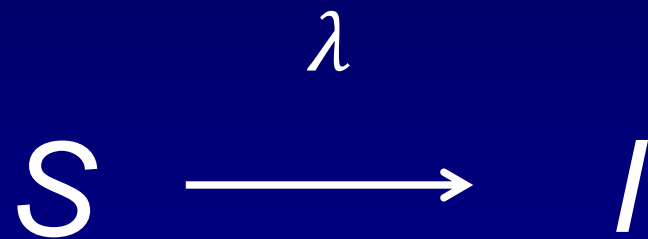
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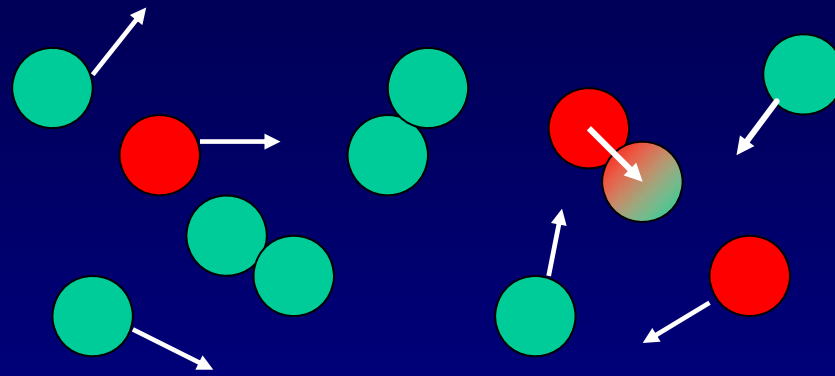
Infected

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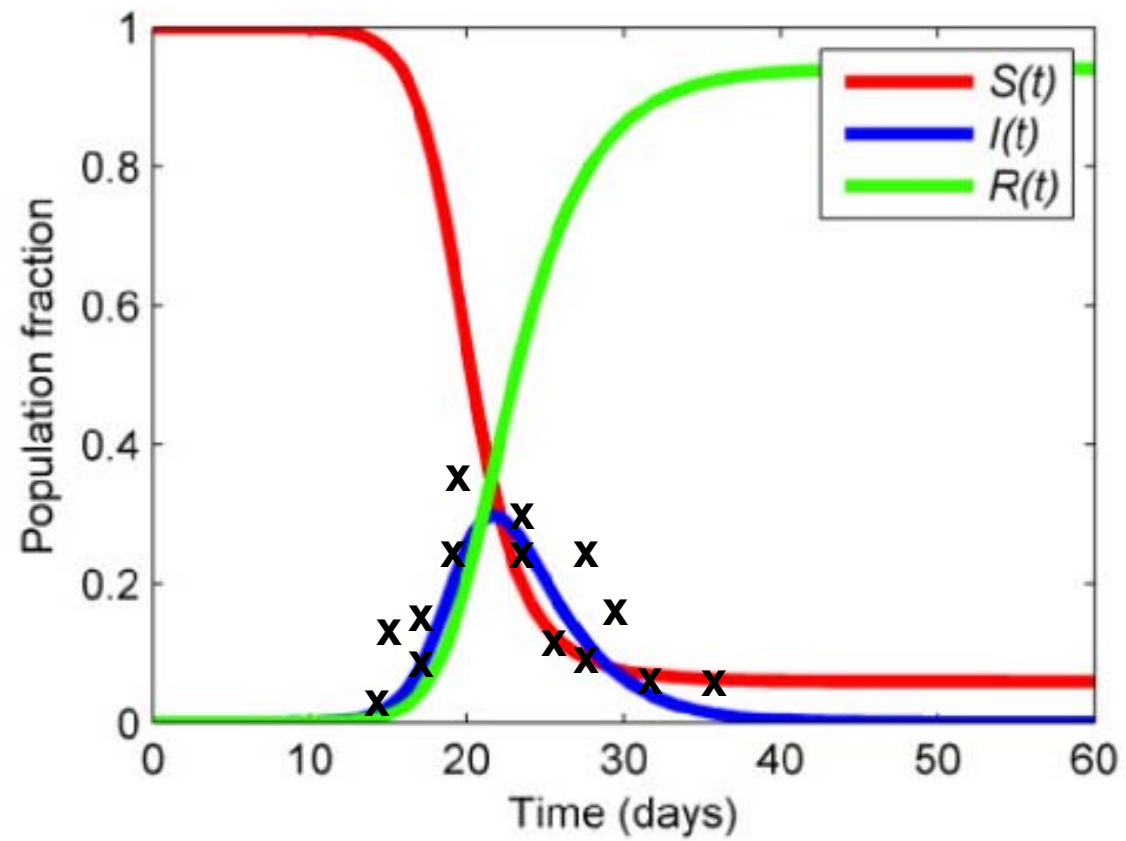
Recovered

The simple SIR epidemic model





As infecteds increase, *rate* increases



2009: H1N1 influenza pandemic



Projects throughout CDC

Pertussis Explaining the recent upsurge in cases in 7-10 yos and rise in overall cases

Ebola 2014-2015 West African epidemic



Projects throughout CDC

Pertussis Explaining the recent upsurge in cases in 7-10 yos and rise in overall cases

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Whooping Cough Epidemic

By JESSE MCKINLEY
Published: June 23, 2010

SAN FRANCISCO — Health authorities in California announced Wednesday that the state has the largest background — to go

The announcement comes as reports of pertussis often is mistaken for the common cold. In total, 910 cases have been reported under investigation, the largest in the state.

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Whooping-cough booster may soon be added The CDC advisory panel, however, rejected adding chicken pox, a setback for vaccine-maker Merck.

July 1, 2005

Chemical In Child Vaccines Stirs Debate

July 8, 1999

Web Site Makes Case For Vaccines Children's Hospital Of Phila. Aims To Ease Fears About The Growing Number Of Shots Required.

October 16, 2000

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Cases of whooping cough in United States highest since 1959

December 12, 2012 | By Don Sapatkin, Inquirer Staff Writer

With pertussis at its highest level nationally in a half-century, the Philadelphia region has been weathering a spike that in some places is more than triple the previous record set two years ago.

"We're sort of way off the scale this year," said Stephen Ostroff, Pennsylvania's acting physician general. "It really started picking up in the summer, and once kids got back to school, the [pertussis] was already there."

Cases of pertussis, also known as whooping cough, often decline in late fall into early winter. In Philadelphia, which recorded 50 cases for August - more typical of an entire year - infections plummeted last month. But there has been no major decrease statewide, Ostroff said.

Story continues below.

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How worried should we be about the whooping cough epidemic?

MARY-ROSE MACCOLL The Australian April 28, 2012 12:00AM



NAVIGATE TO A SECTION ▲

0 SAVED STORIES ▲

Newborn babies are most at risk of death from the disease.

Babies are offered a whooping cough vaccine at two, three and four months of age.

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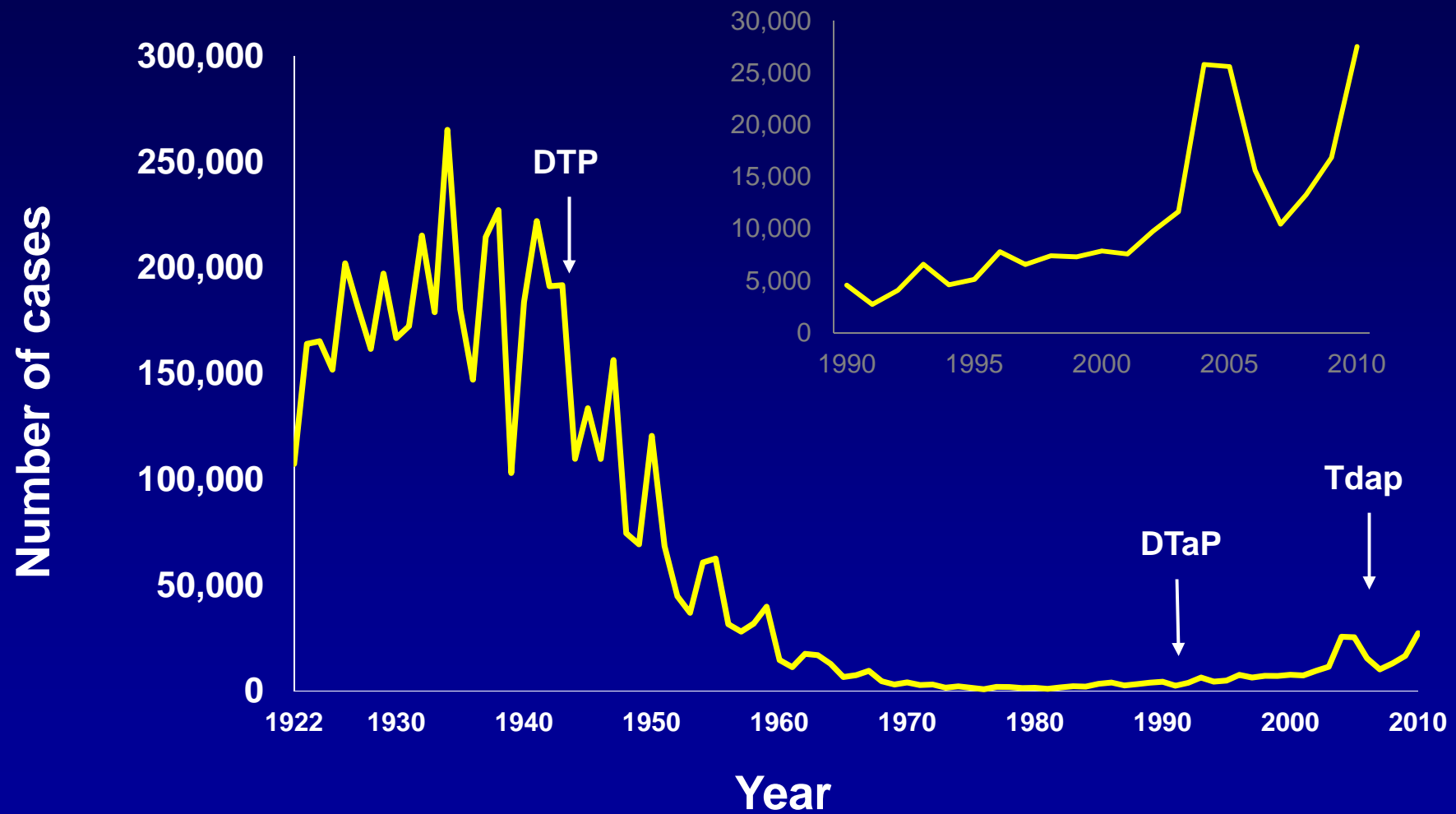
Features & Analysis



In harmony

Did this woman change history with one song?

Reported pertussis cases – 1922-2010



SOURCE: CDC, National Notifiable Diseases Surveillance System and Supplemental Pertussis Surveillance System and 1922-1949, passive reports to the Public Health Service

Questions from leadership

Is the effectiveness and duration of protection of the new vaccine different to the old?

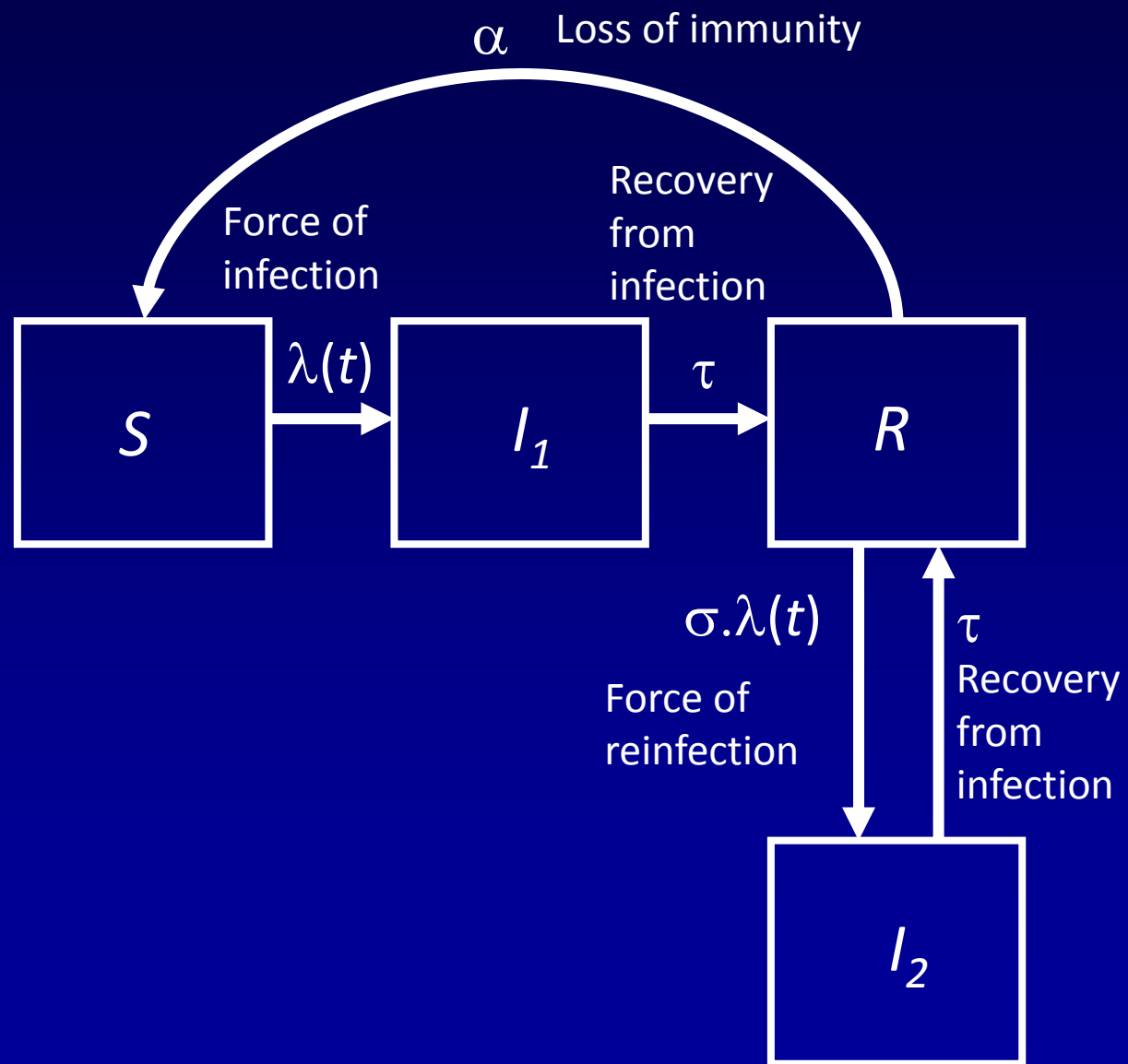


Table 1. Descriptions of the nested models that were fitted to the NNDSS incidence data.

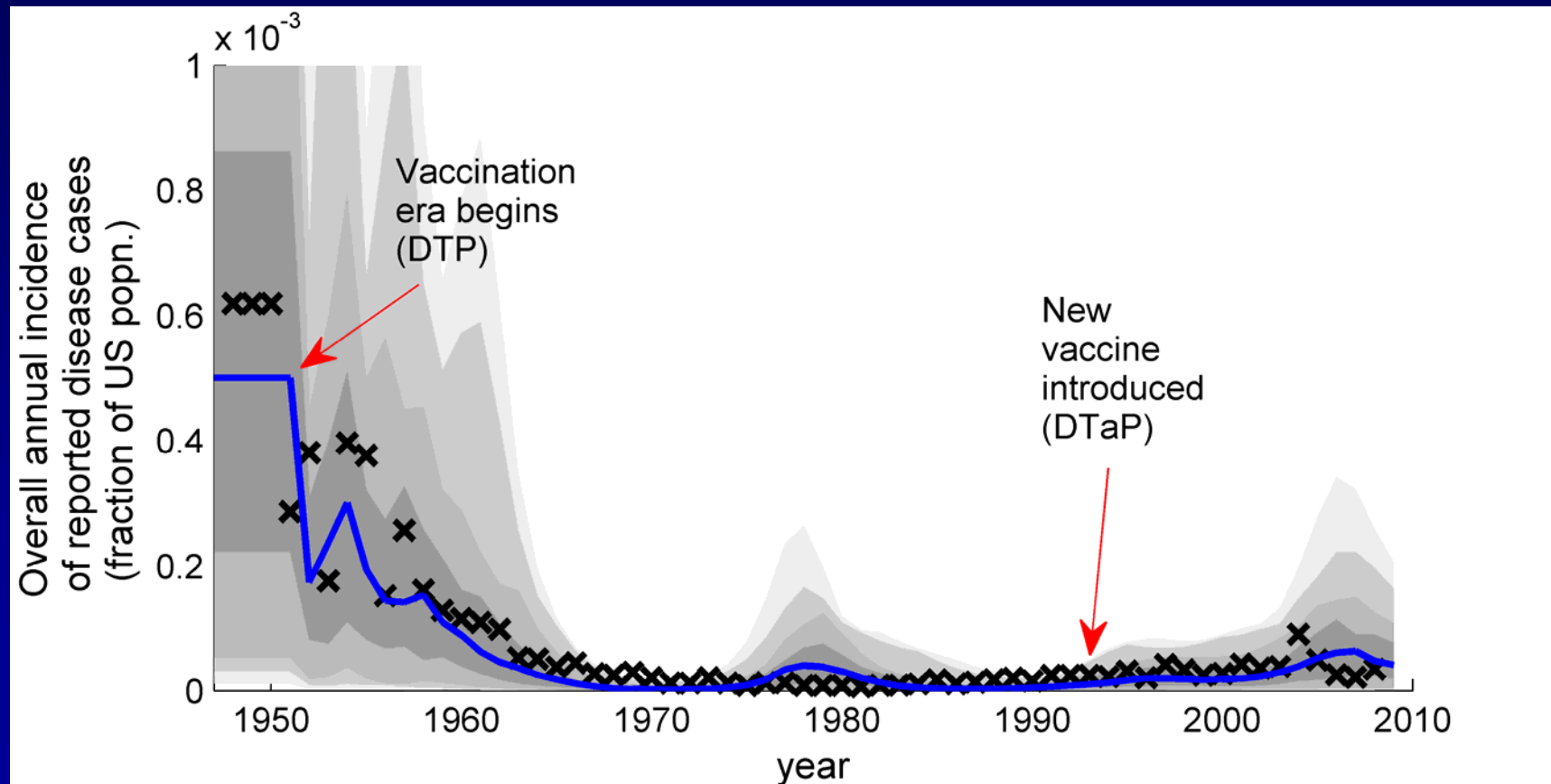
Model	Description	DIC
1	Protection duration of whole cell vaccine same as natural infection; acellular vaccine same as whole-cell	-9720
2	Protection duration of whole cell vaccine same as natural infection; different efficacy for acellular vaccine	-9570
3	Protection duration of whole cell vaccine same as natural infection; different protection duration for acellular vaccine;	-9250
4	Protection duration of whole cell vaccine different from natural infection; acellular vaccine same as whole-cell	-9800
5	Protection duration of whole cell vaccine same as natural infection; protection duration and efficacy different for acellular vaccine	-8422
6	Whole cell vaccine protection duration different from natural infection; different efficacy for acellular vaccine	-9183
7	Whole cell vaccine protection duration different from natural infection; different protection duration for acellular vaccine	-9230
8	Whole cell vaccine protection duration different from natural infection; protection duration and efficacy different for acellular vaccine	-8417
The mean posterior values of the Deviance Information Criterion (DIC) of the models are given in the rightmost column.		
doi:10.1371/journal.pcbi.1004138.t001		

Gambhir M, Clark TA, Cauchemez S, Tartof SY, Swerdlow DL, et al. (2015) A Change in Vaccine Efficacy and Duration of Protection Explains Recent Rises in Pertussis Incidence in the United States. PLoS Comput Biol 11(4): e1004138.

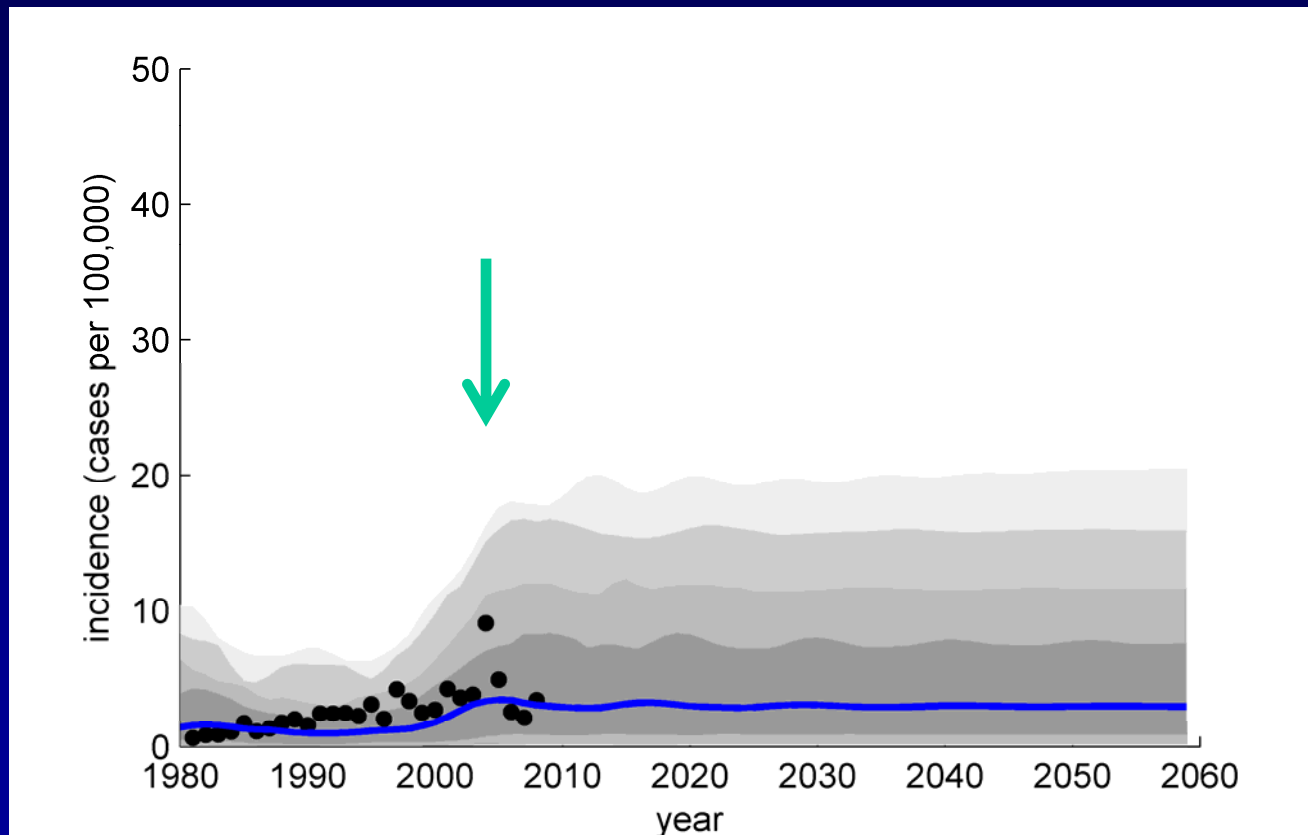
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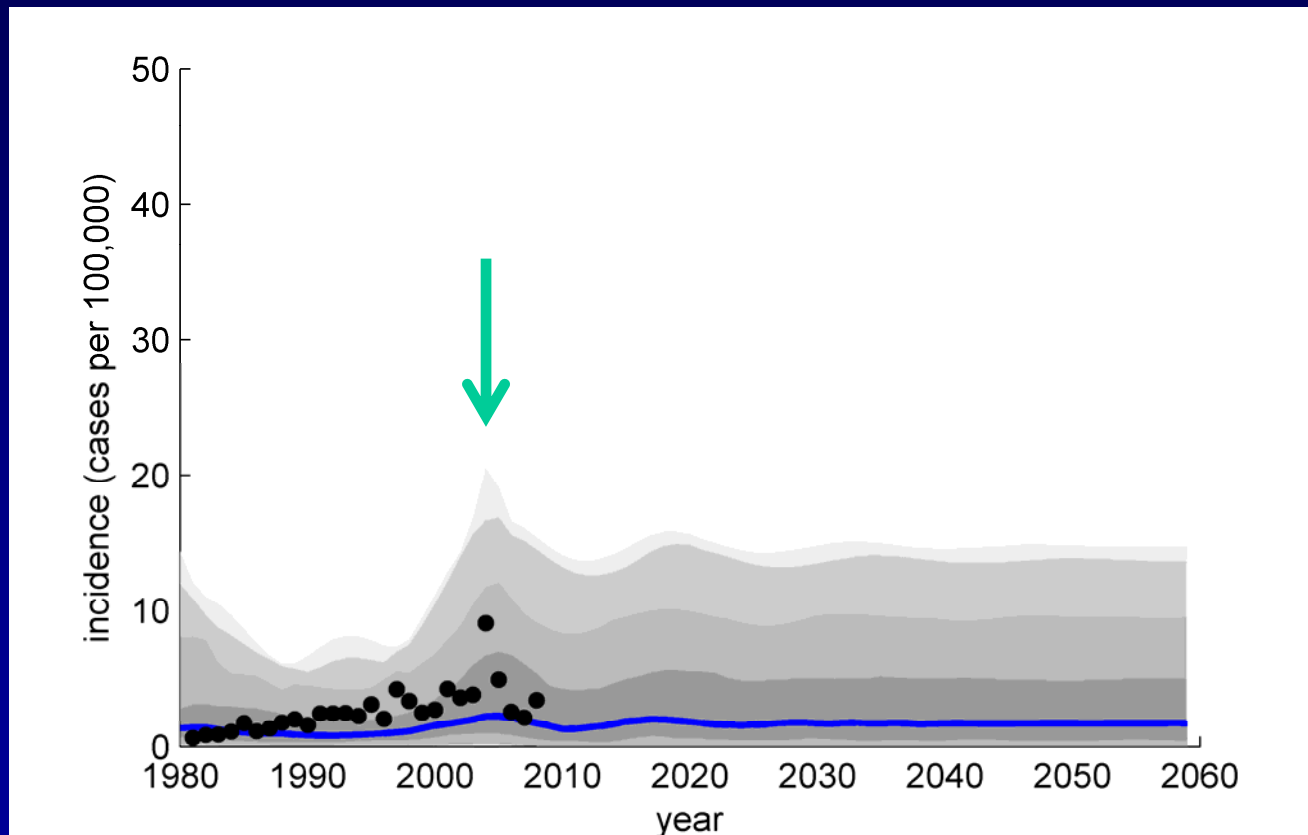
Total incidence since vaccination began: model vs. data



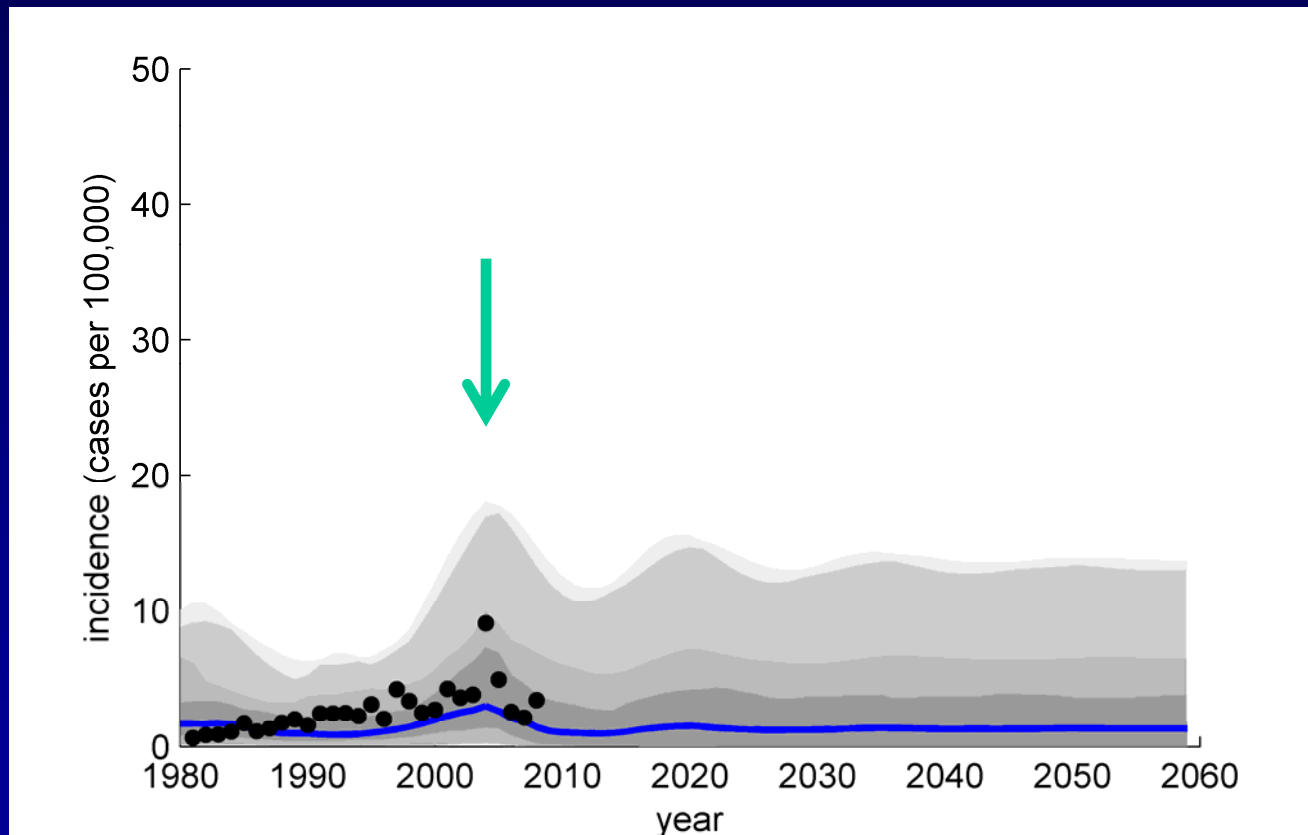
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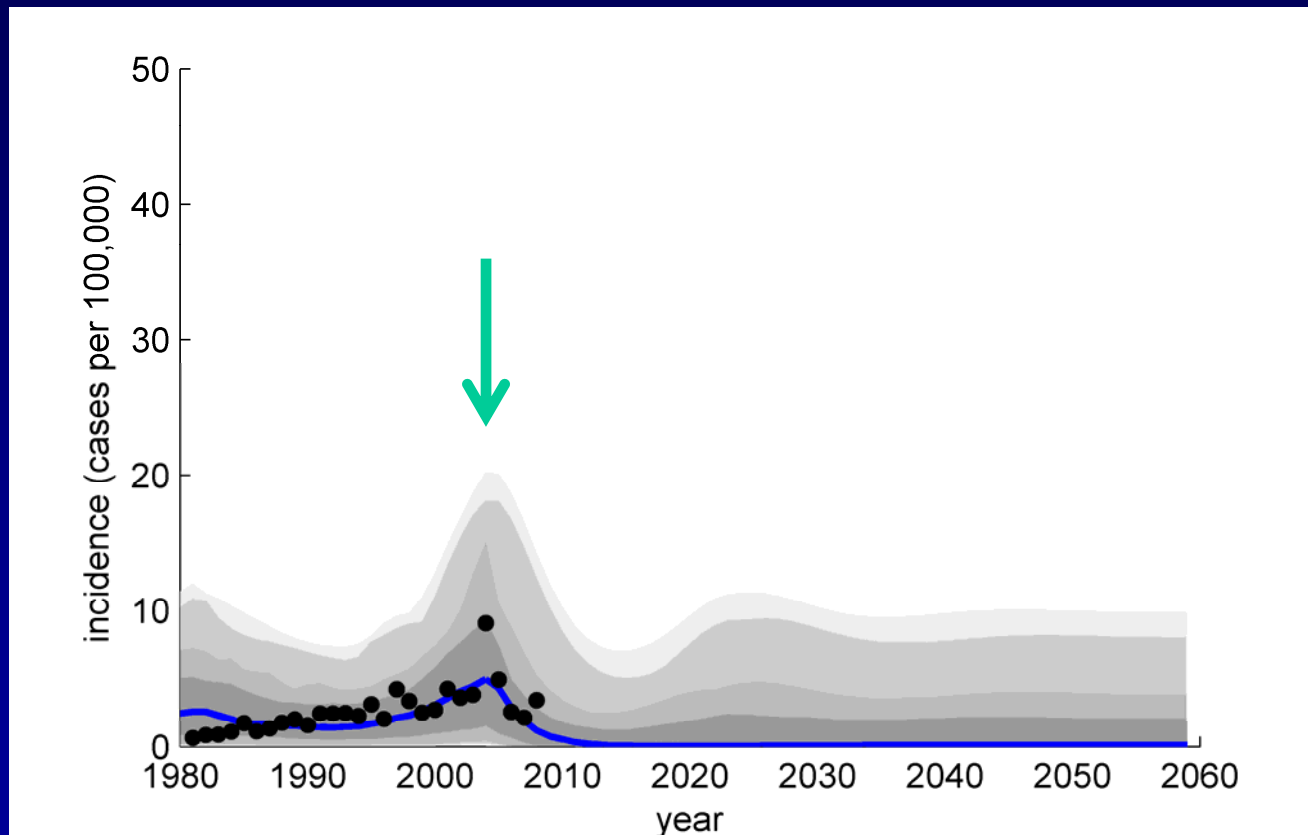
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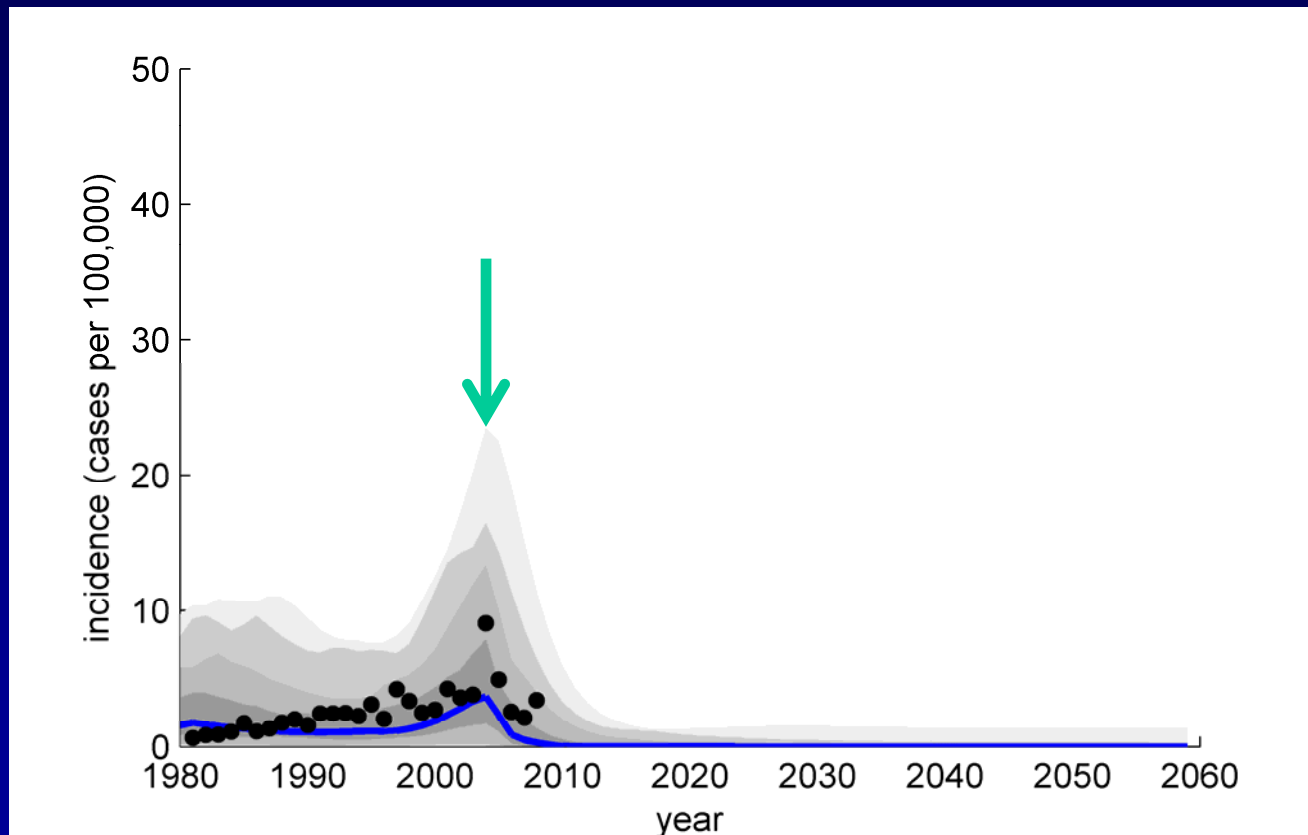
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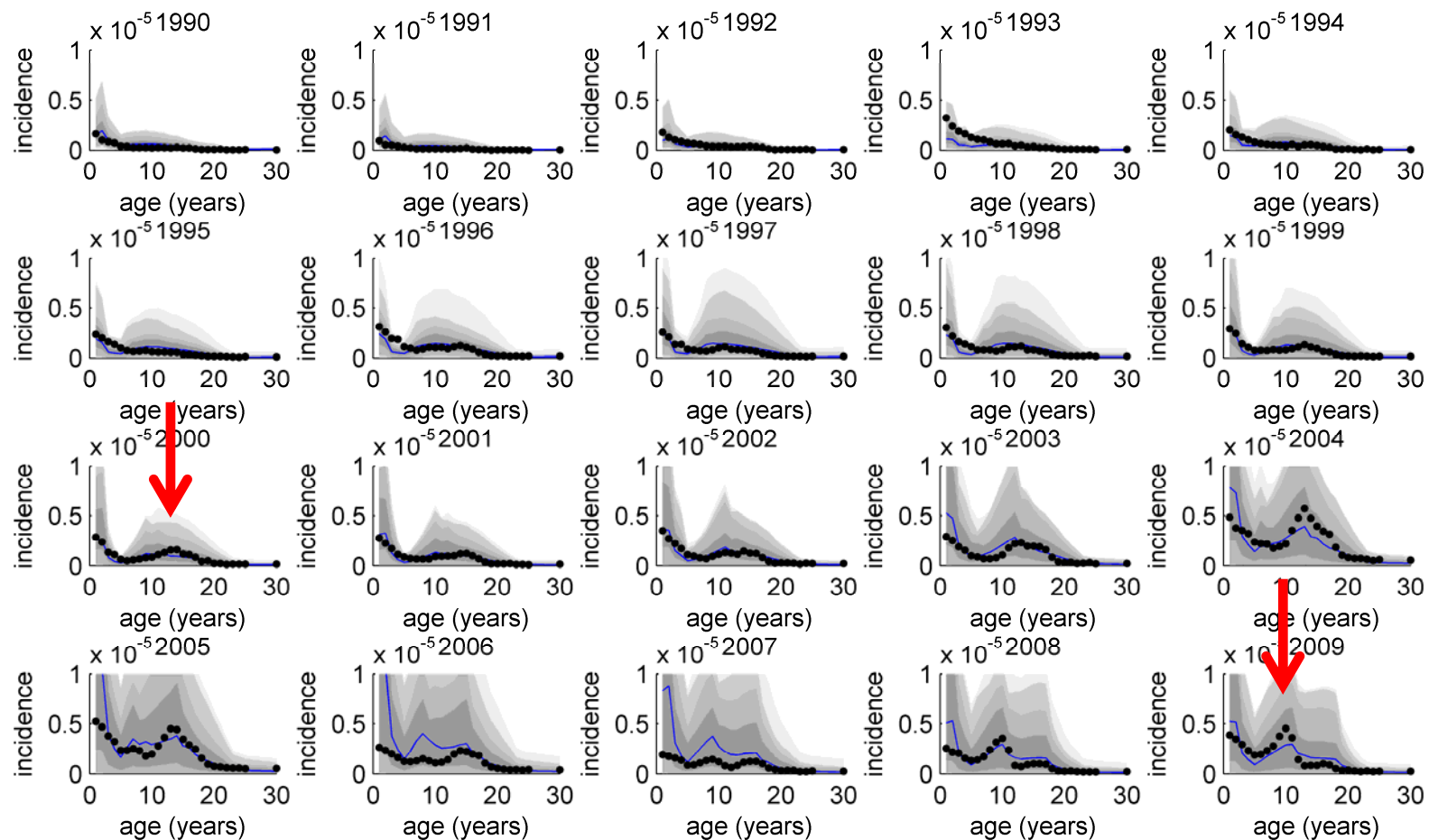
RESEARCH ARTICLE

A Change in Vaccine Efficacy and Duration of Protection Explains Recent Rises in Pertussis Incidence in the United States

Manoj Gambhir^{1,2,3*}, Thomas A. Clark⁴, Simon Cauchemez^{5,6}, Sara Y. Tartof⁷, David L. Swerdlow^{2,8}, Neil M. Ferguson⁵



1 Department of Epidemiology and Preventive Medicine, Monash University, Melbourne, Australia, **2** Modeling Unit, National Center for Immunization and Respiratory Diseases (NCIRD), Centers for Disease Control and Prevention (CDC), Atlanta, Georgia, United States of America, **3** IHRC, Inc., Atlanta, Georgia, United States of America, **4** Meningitis and Vaccine Preventable Diseases Branch, Division of Bacterial Diseases, NCIRD, CDC, Atlanta, Georgia, United States of America, **5** Medical Research Council Centre for Outbreak Analysis and Modelling, Imperial College London, London, United Kingdom, **6** Mathematical Modelling of Infectious Diseases Unit, Institut Pasteur, Paris, France, **7** Kaiser Permanente Southern California, Kaiser Permanente Research, Department of Research & Evaluation, Pasadena, California, United States of America, **8** Office of Science and Integrative Programs, NCIRD, CDC, Atlanta, Georgia, United States of America



Gambhir M, Clark TA, Cauchemez S, Tartof SY, Swerdlow DL, et al. (2015) A Change in Vaccine Efficacy and Duration of Protection Explains Recent Rises in Pertussis Incidence in the United States. *PLoS Comput Biol* 11(4): e1004138.

doi:10.1371/journal.pcbi.1004138

<http://journals.plos.org/ploscompbiol/article?id=info:doi/10.1371/journal.pcbi.1004138>

Projects throughout CDC

Pertussis Explaining the recent upsurge in cases in 7-10 yos and rise in overall cases

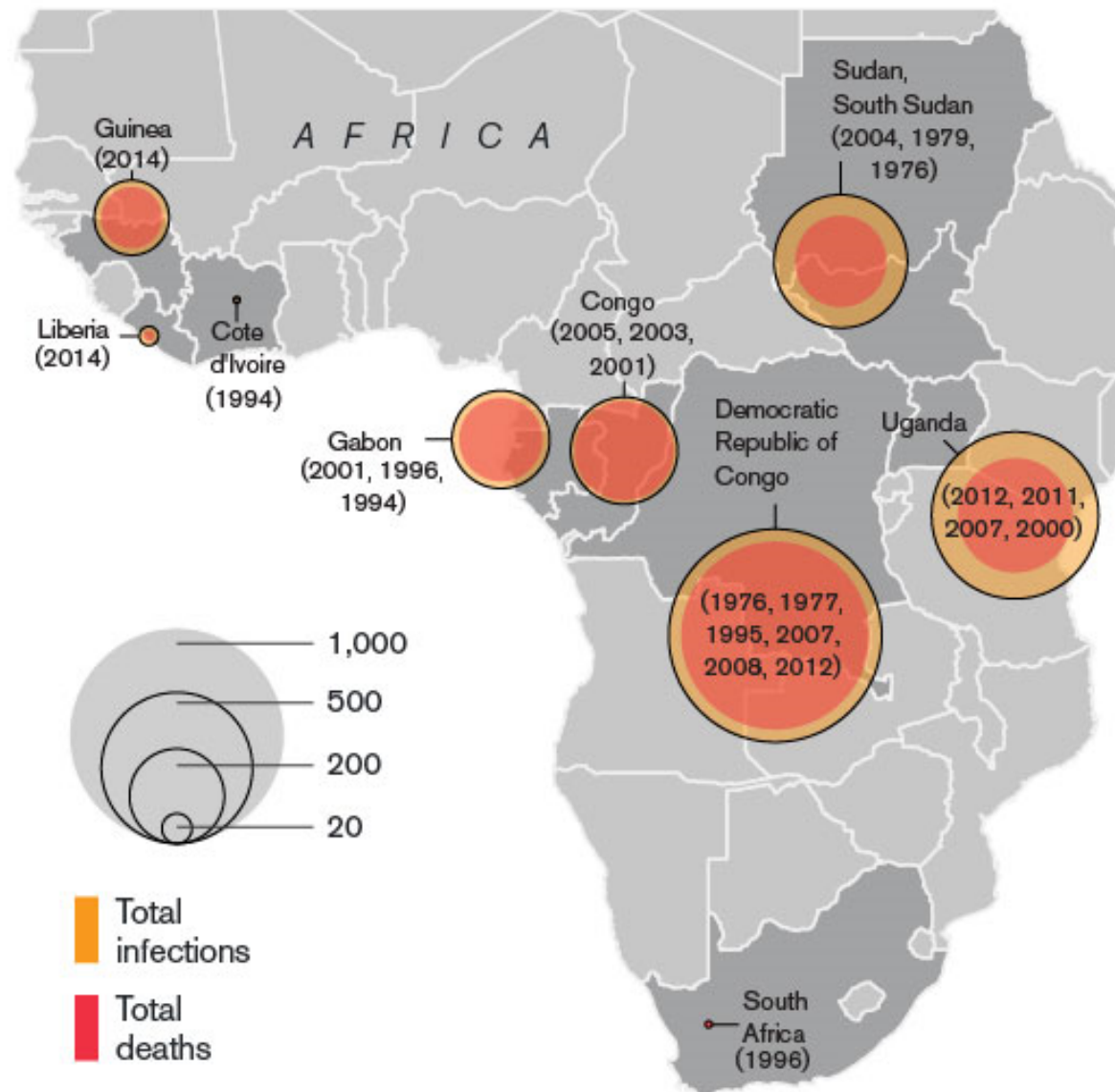
Ebola 2014-2015 West African epidemic



Ebola

Major Ebola Outbreaks

Confirmed cases and years



Ebola outbreaks

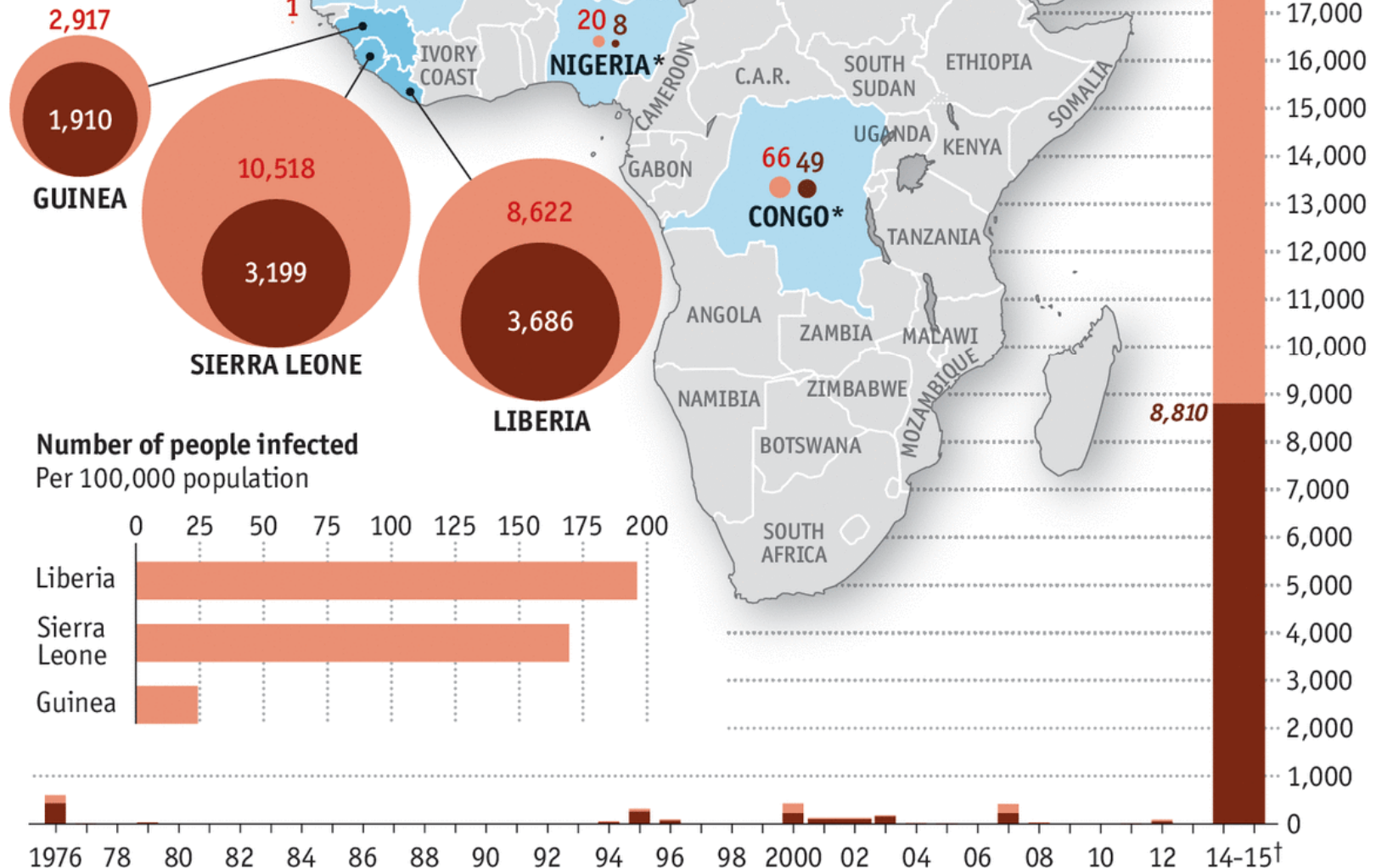
To January 25th 2015

Number of people:

● infected

of whom:

● dead



Sources: WHO; UN; *The Economist*

*Declared Ebola-free †Excluding Congo



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CDC 24/7: Saving Lives. Protecting People.™

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CDC Emergency Response Activation Levels

1

Level 1

The highest level of response reserved for critical emergencies. CDC assigns the largest number of staff possible to work 24/7 on the response. To date, there have been three Level 1 responses: Ebola outbreak (2014), H1N1 influenza outbreak (2009) and Hurricane Katrina (2005).

2

Level 2

The CDC experts in the particular disease lead the response with a large number of other staff from the program area. A large number of staff from CDC's Emergency Operations Center may assist with the response.

3

Level 3

The CDC experts in the particular disease lead the response with some of their own staff. Some staff from CDC's Emergency Operations Center may assist in the response. CDC decides when a different level of response is needed.

CDC Emergency Response
When public health emergencies occur, CDC's Emergency Operations Center (EOC) manages the response. The EOC has three levels of response.



U.S. Department of
Health and Human Services
Centers for Disease
Control and Prevention

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CDC Emergency Response Activation Levels

1

Level 1

The highest level of response reserved for critical emergencies. CDC assigns the largest number of staff possible to work 24/7 on the response. To date, there have been three Level 1 responses: Ebola outbreak (2014), H1N1 influenza outbreak (2009) and Hurricane Katrina (2005).

2

Level 2





CDC leaders integral to the Ebola response, including epidemiologists, laboratorians, logistics, and more, assemble in agency's command center to discuss next steps in directing the response at CDC Emergency Operations Center in Atlanta, August 8. Spencer Lowell for TIME magazine

Questions from leadership

How many cases might there be?

When will the epidemic end?

What will it take to end the epidemic?

Understanding the dynamics of Ebola epidemics

J. LEGRAND*, R. F. GRAIS, P. Y. BOELLE, A. J. VALLERON AND A. FLAHAULT

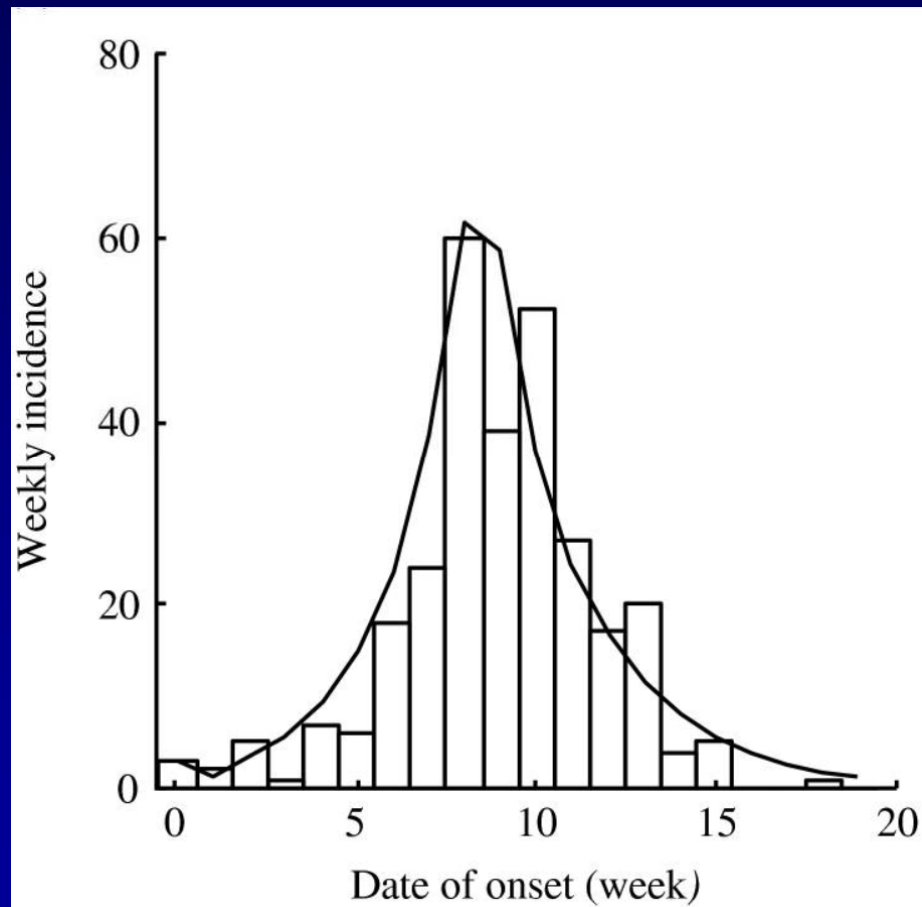
INSERM, UMR-S 707, Paris, France, and Université Pierre et Marie Curie-Paris 6, UMR-S 707, Paris, France

(Accepted 14 July 2006; first published online 26 September 2006)

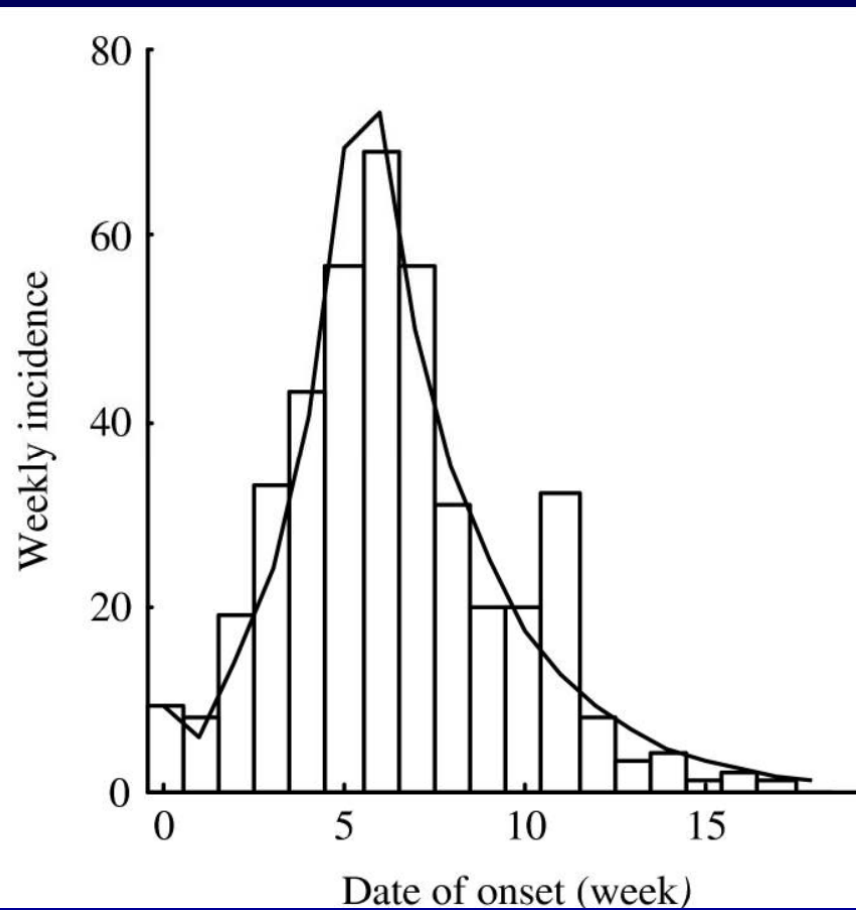
SUMMARY

Ebola is a highly lethal virus, which has caused at least 14 confirmed outbreaks in Africa between 1976 and 2006. Using data from two epidemics [in Democratic Republic of Congo (DRC) in 1995 and in Uganda in 2000], we built a mathematical model for the spread of Ebola haemorrhagic fever epidemics taking into account transmission in different epidemiological settings. We estimated the basic reproduction number (R_0) to be 2·7 (95% CI 1·9–2·8) for the 1995 epidemic in DRC, and 2·7 (95% CI 2·5–4·1) for the 2000 epidemic in Uganda. For each epidemic, we quantified transmission in different settings (illness in the community, hospitalization, and traditional burial) and simulated various epidemic scenarios to explore the impact of control interventions on a potential epidemic. A key parameter was the rapid institution of control

DRC (1995)



Uganda (2000)



Copy of Ebola Response_v5_Sierra Leone_Bishwa_JAN6 - Excel

Gambhir, Manoj (CDC/OID/NCIRD) (CTR)

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**CENTERS FOR DISEASE CONTROL & PREVENTION
(CDC)**

Sierra Leone EbolaResponse (ER)
Modeling the spread of disease impact & intervention
Version 3.0

Contributors: Michael Washington, Charisma Atkins, Martin Meltzer

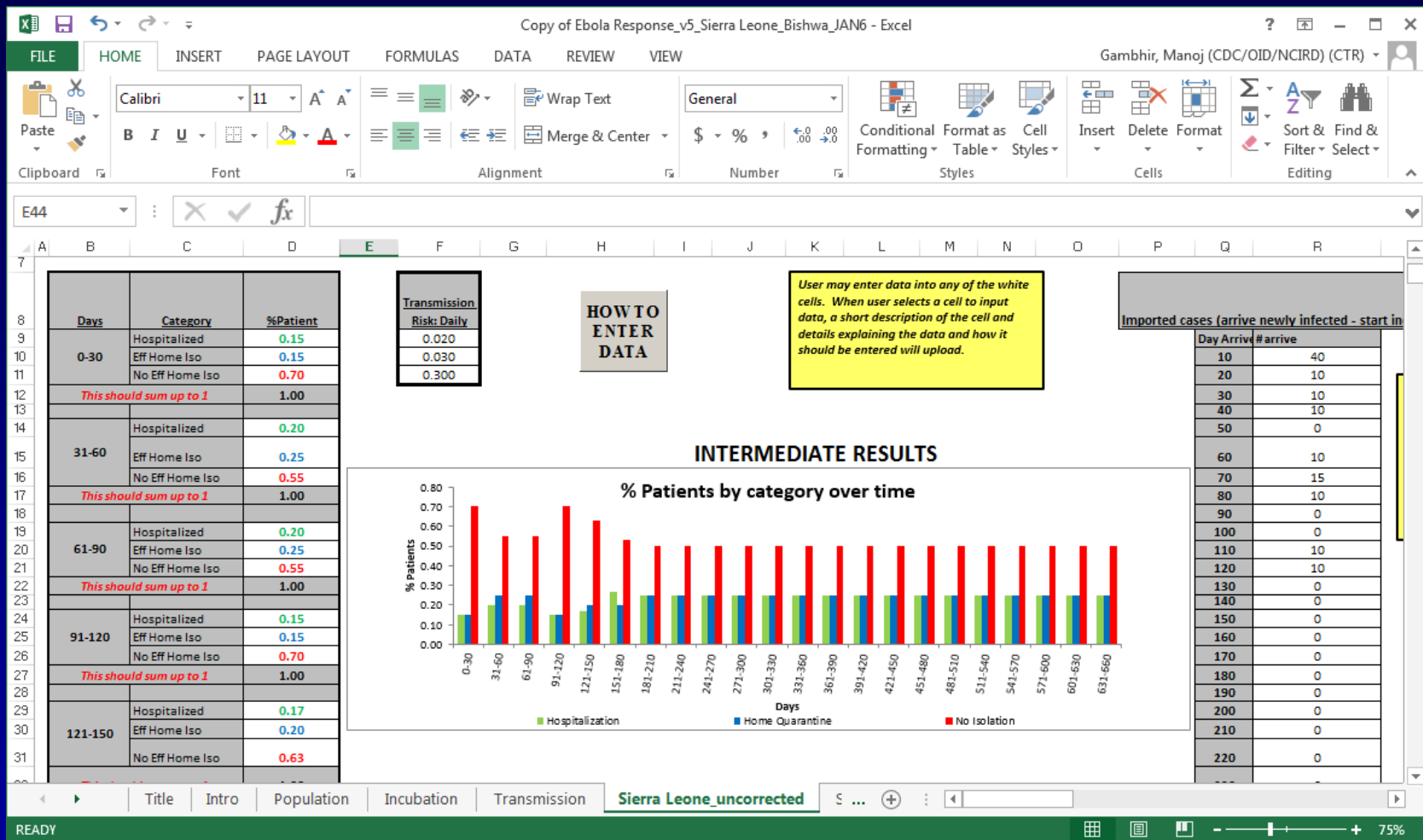
Division of Preparedness & Emerging Infections
Health Economics & Modeling Unit (HEMU)
December 4, 2014

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**Estimating the Future Number of Cases
in the Ebola Epidemic —
Liberia and Sierra Leone, 2014–2015**



U.S. Department of Health and Human Services
Centers for Disease Control and Prevention

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MORBIDITY AND MORTALITY WEEKLY REPORT

- 249 Dengue Type 4 Infections in U.S. Travelers to the Caribbean
- 250 *Pneumocystis Pneumonia* — Los Angeles
- 252 Measles — United States, Five Weeks
- 253 Risk-Factor-Prevalence Survey
- 259 Surveillance of Childhood Lead Poisoning — United States
- 261 Quarantine Measures

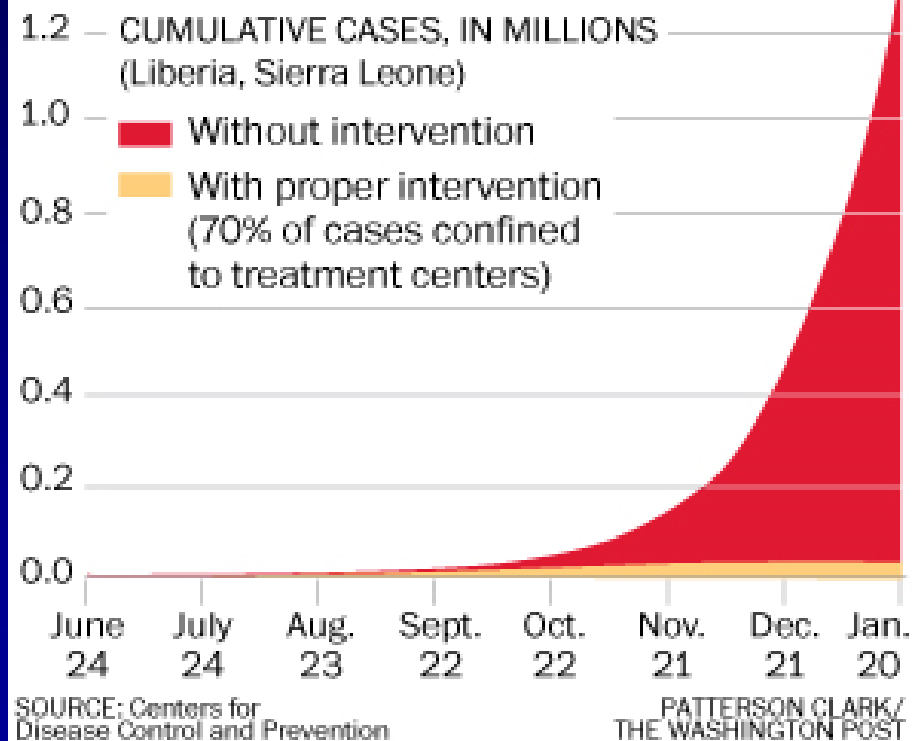
Pneumocystis Pneumonia — Los Angeles

In the period October 1980–May 1981, 5 young men, all active homosexuals treated for biopsy-confirmed *Pneumocystis carinii* pneumonia at 3 different hospitals in Los Angeles, California. Two of the patients died. All 5 patients had laboratory-confirmed previous or current cytomegalovirus (CMV) infection and candidal infection. Case reports of these patients follow.

Patient 1: A previously healthy 33-year-old man developed *P. carinii* pneumonia in March 1981 after a 2-month history of fever associated with oral mucosal candidiasis, leukopenia, and CMV viremia. The serum complement levels and liver enzymes were normal. In May 1981 it was 32. The patient's treatment with trimethoprim-sulfamethoxazole was discontinued.

Ebola estimate

Without intervention, the total number of Ebola cases in the West African countries of Liberia and Sierra Leone could top 1 million by January.



A10

Ebola Cases Could Reach 1.4 Million Within Four Months, C.D.C. Estimates

Worst-Case Scenario Can Still Be Avoided

By DENISE GRADY

Yet another set of ominous projections about the Ebola epidemic in West Africa was released Tuesday, in a report from the Centers for Disease Control and Prevention that gave worst- and best-case estimates for Liberia and Sierra Leone based on computer modeling.

In the worst-case scenario, the two countries could have a total of 21,000 cases of Ebola by Sept. 20 and 1.4 million cases by Jan. 20 if the disease keeps spreading without effective methods to contain it. These figures take into account the fact that many cases go undetected, and estimate that there are actually 2.5 times as many as reported.

In the best-case model, the epidemic in both countries would be "almost ended" by Jan. 20, the report said. Success would require conducting safe funerals at which no one touches the bodies, and treating 70 percent of patients in settings that reduce the risk of transmission. The report said the proportion of patients now in such settings was about 18 percent in Liberia and 40 percent in Sierra Leone.

The caseload projections are based on data from August, but Dr. Thomas R. Frieden, the C.D.C. director, said the situation appeared to have improved since then because more aid had begun to reach the region.

"My gut feeling is, the actions we're taking now are going to make that worst-case scenario not come to pass," Dr. Frieden said in a telephone interview. "But it's important to understand that it could happen."

Outside experts said the modeling figures were in line with estimates by others in the field.

"It's a nice job," said Ira Longini, a professor of biostatistics at the University of Florida who has helped design computer modeling of



DANIEL BEREHULAK FOR THE NEW YORK TIMES

A Red Cross team removed the body of a woman believed to have died of Ebola in Monrovia, Liberia, last week. Officials urge caution in handling victims' bodies.

low compared with those generated by other models. He said that if some of the latest data from the World Health Organization is plugged into the C.D.C. model, "the very large numbers of estimated cases are, unfortunately, even larger."

The current official case count is 5,845, including 2,803 deaths, according to the W.H.O.

from the C.D.C., but the W.H.O. report also noted that many cases were unreported and said that without effective help, the three most affected countries would soon be reporting thousands of cases and deaths per week. It said its projections were similar to those from the C.D.C.

The W.H.O. report also raised, for the first time, the possibility

when those hospitals would be ready, or who would staff them.

Dr. Frieden said the Defense Department had already delivered parts of a 25-bed unit that would soon be set up to treat health workers who become infected, a safety measure he said was important to help encourage health professionals to volunteer. He said that more aid groups

He added, "If even the medium case comes to pass, with, say, 700,000 cases by January, the epidemic will quickly overwhelm the capabilities that the U.S. plans to send."

The W.H.O. reported that a new center had just opened in Monrovia, the Liberian capital, with 120 beds for treatment and 30 for triage. Patients were also being treated at the day

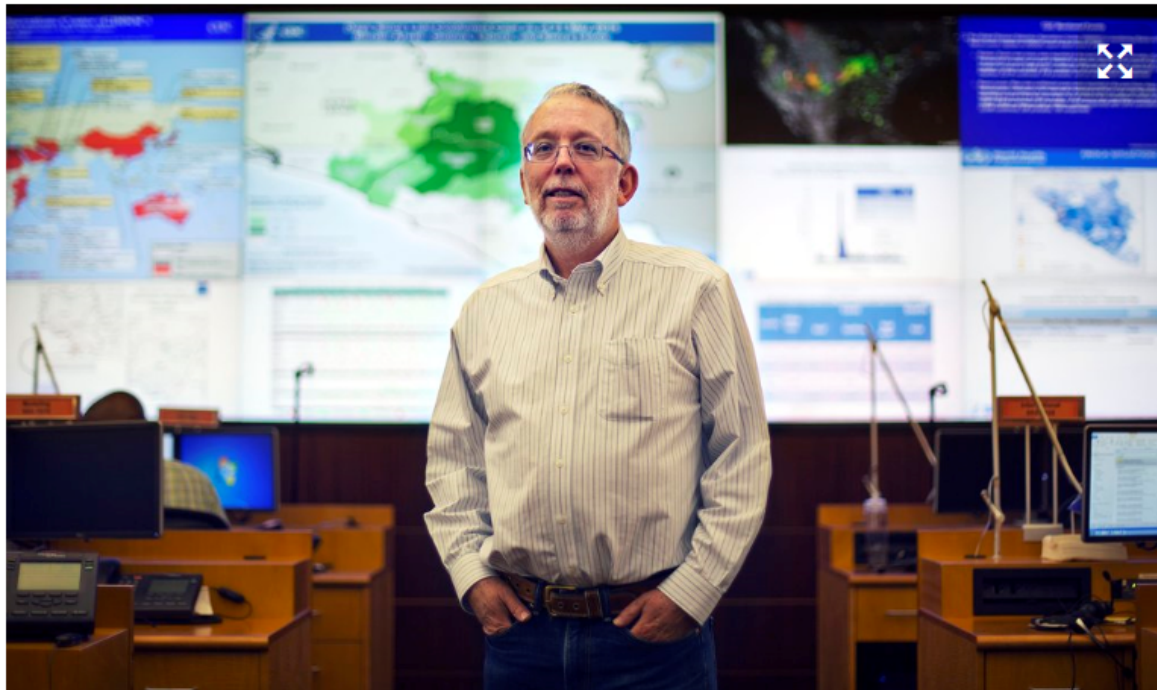
"Where are they going to go?" he said.

Though providing home-care kits may seem like a pragmatic approach, some public health authorities said they were no substitute for beds in isolation or containment wards.

But Dr. Frieden said that home care had been used to help stamp out smallpox in Africa in the 1960s. The caregivers were often

CDC's overblown estimate of Ebola outbreak draws criticism

Originally published August 1, 2015 at 2:24 pm | Updated August 1, 2015 at 5:51 pm



Martin Meltzer, standing in the Emergency Operations Center at the Centers for Disease Control and Prevention in Atlanta, is a disease modeler for the agency. (David Goldman/AP)

Disease modelers use math to try to provide a more precise picture of a certain situation or to predict how the situation will change, and have become critical in the world of infectious diseases. But the accuracy — or inaccuracy — of such models is increasingly a talking point.

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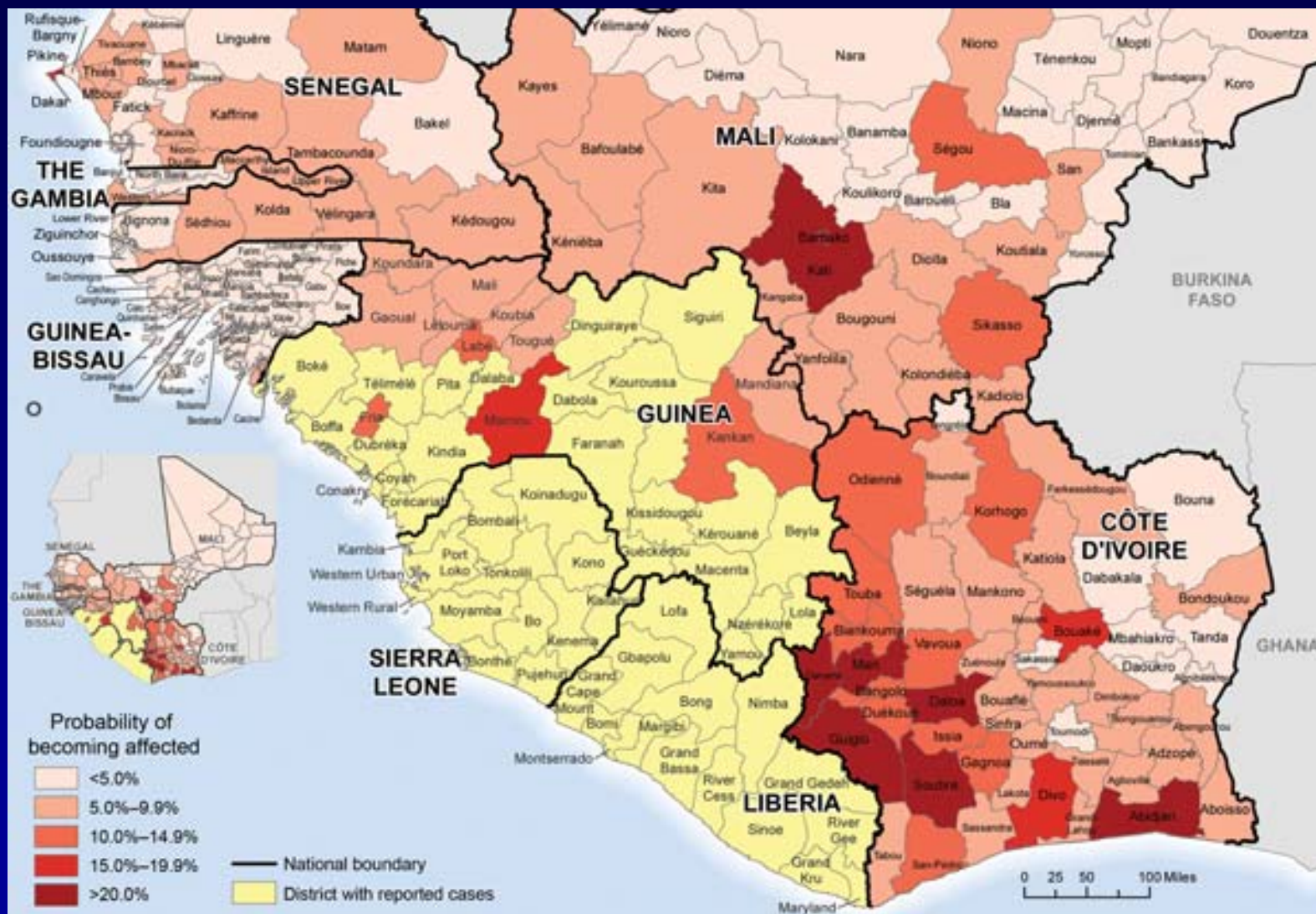
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Questions from leadership

Where should ETUs be constructed next?

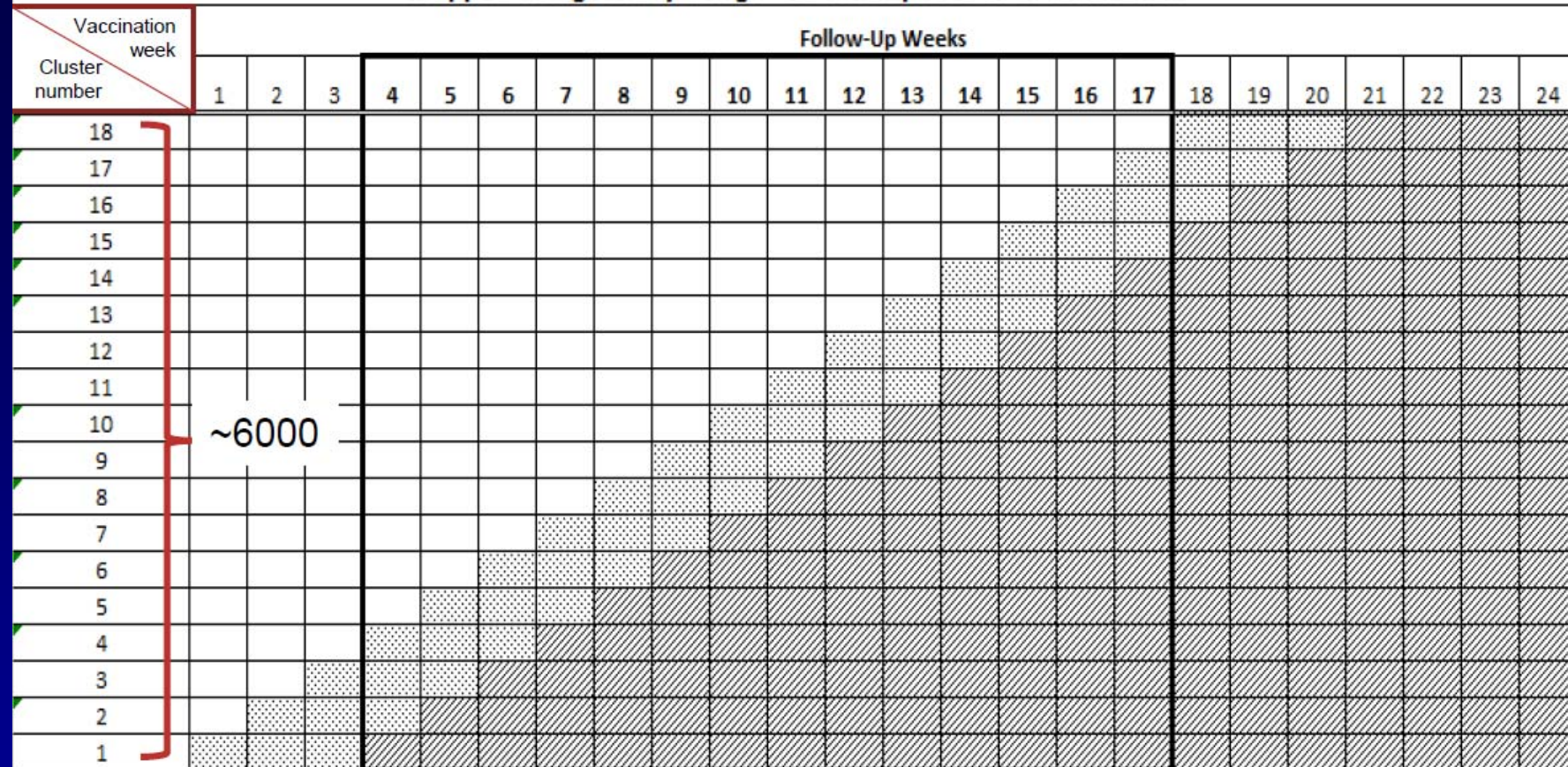
Which neighboring countries are at the highest risk?



Questions from leadership

What's a viable vaccine trial design during the outbreak?

Stepped wedge study design - 18 week phase-in of vaccination



type of person-time		proportions
unvaccinated		0.50
vaccinated, seroconverting		n/a
vaccinated, seroconverted		0.50

Bolded square highlights follow-up time usable for efficacy analyses, excluding 21 day sero-conversion time. Usable follow-up weeks contain both unvaccinated and vaccinated cohort time.

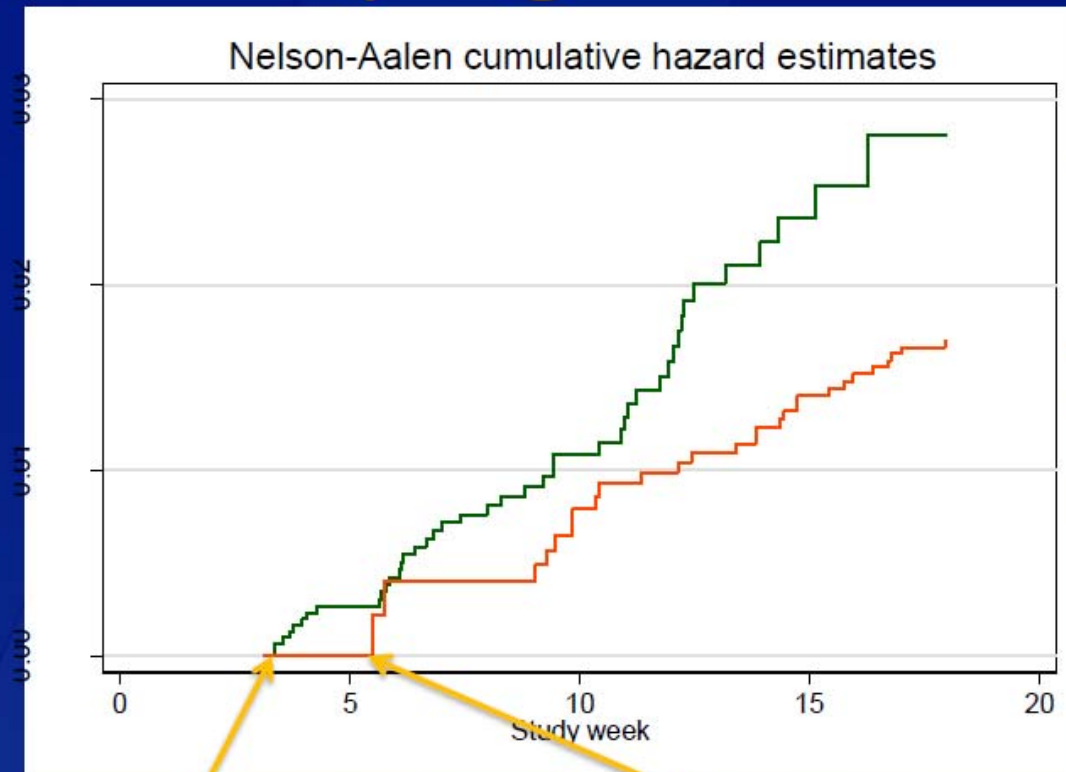
Example Vaccination Groups: (1) facility HCW such as doctors, nurses, phlebotomists (2) facility support such as cooking and food delivery, housekeeping, sanitation (3) ambulance teams (4) burial teams. Each of 3 shifts is treated as a different Vaccination Group. Vaccination Groups and shifts are distributed evenly across Vaccination Weeks, with a vaccination weeks assigned at random.

Specific questions

Will an e.g. Cox Proportional Hazards approach be able to account for:

- Declining background disease risk
- Clustering of disease risk
- Healthy vaccinee effect

Example simulation (single model run):



Unvaccinated: 43 cases
0.81 cases/person-month

Vaccinated: 27 cases
0.51 cases/person-month

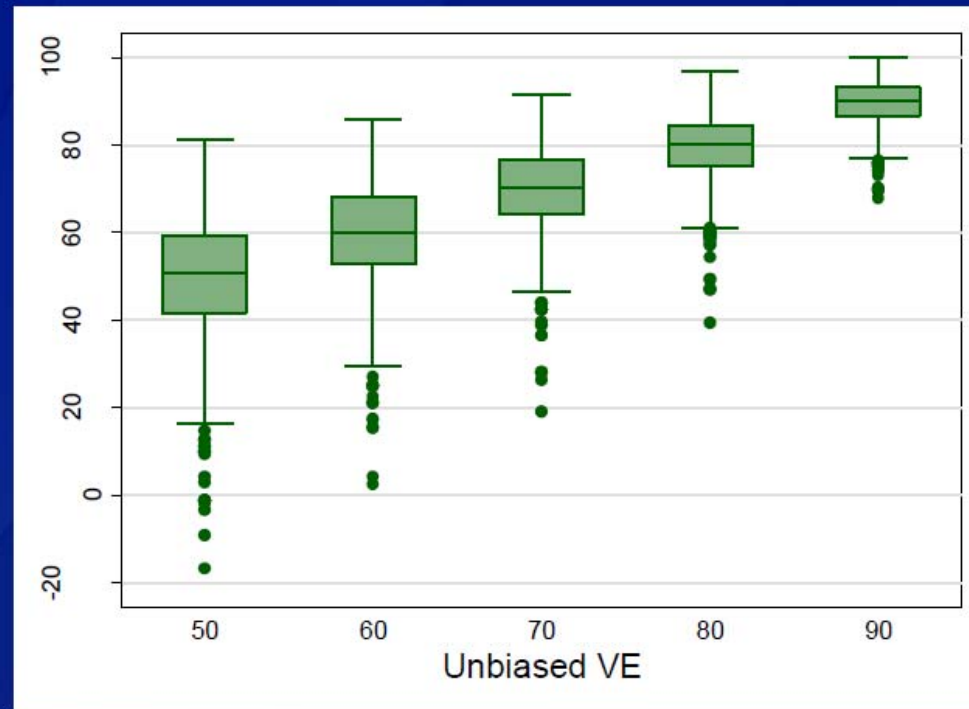
No cases included until first vaccinee reaches end of seroconversion period

Longer lag to accrue vaccinated cases

Hazard ratio:
0.55 (0.32 – 0.96)
Vaccine Efficacy:
45% (4% -68%)

No bias: Predicted VE

1000 runs at each VE input (range 50% to 90%)



Statistical power and validity of Ebola vaccine trials in Sierra Leone: a simulation study of trial design and analysis



Steven E Bellan, Juliet R C Pulliam, Carl A B Pearson, David Champredon, Spencer J Fox, Laura Skrip, Alison P Galvani, Manoj Gambhir, Ben A Lopman, Travis C Porco, Lauren Ancel Meyers, Jonathan Dushoff

Summary

Background Safe and effective vaccines could help to end the ongoing Ebola virus disease epidemic in parts of west Africa, and mitigate future outbreaks of the virus. We assess the statistical validity and power of randomised controlled trial (RCT) and stepped-wedge cluster trial (SWCT) designs in Sierra Leone, where the incidence of Ebola virus disease is spatiotemporally heterogeneous, and is decreasing rapidly.

Methods We projected district-level Ebola virus disease incidence for the next 6 months, using a stochastic model fitted to data from Sierra Leone. We then simulated RCT and SWCT designs in trial populations comprising geographically distinct clusters at high risk, taking into account realistic logistical constraints, and both individual-level and cluster-level variations in risk. We assessed false-positive rates and power for parametric and non-parametric analyses of simulated trial data, across a range of vaccine efficacies and trial start dates.

Findings For an SWCT, regional variation in Ebola virus disease incidence trends produced increased false-positive rates (up to 0.15 at $\alpha=0.05$) under standard statistical models, but not when analysed by a permutation test, whereas analyses of RCTs remained statistically valid under all models. With the assumption of a 6-month trial starting on Feb 18, 2015, we estimate the power to detect a 90% effective vaccine to be between 49% and 89% for an RCT, and between 6% and 26% for an SWCT, depending on the Ebola virus disease incidence within the trial population. We estimate that a 1-month delay in trial initiation will reduce the power of the RCT by 20% and that of the SWCT by 49%.

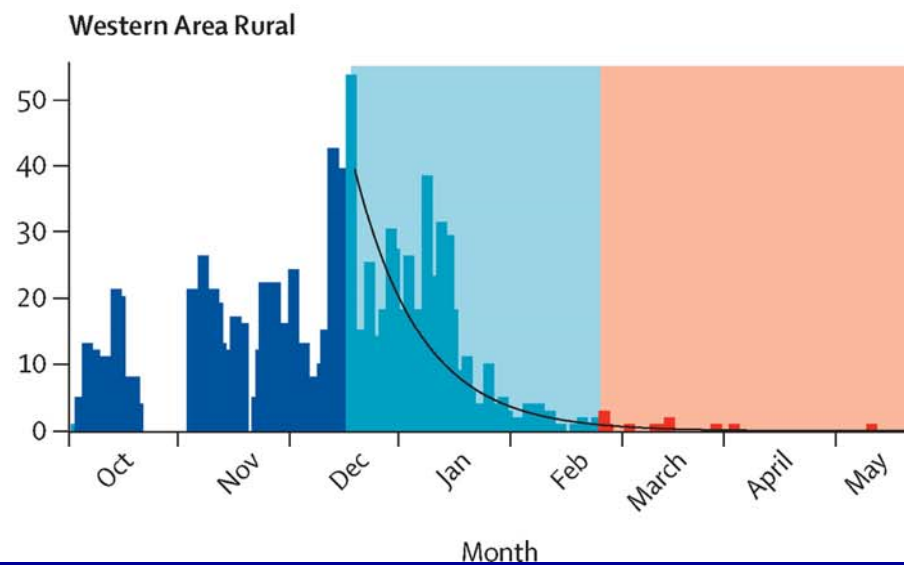
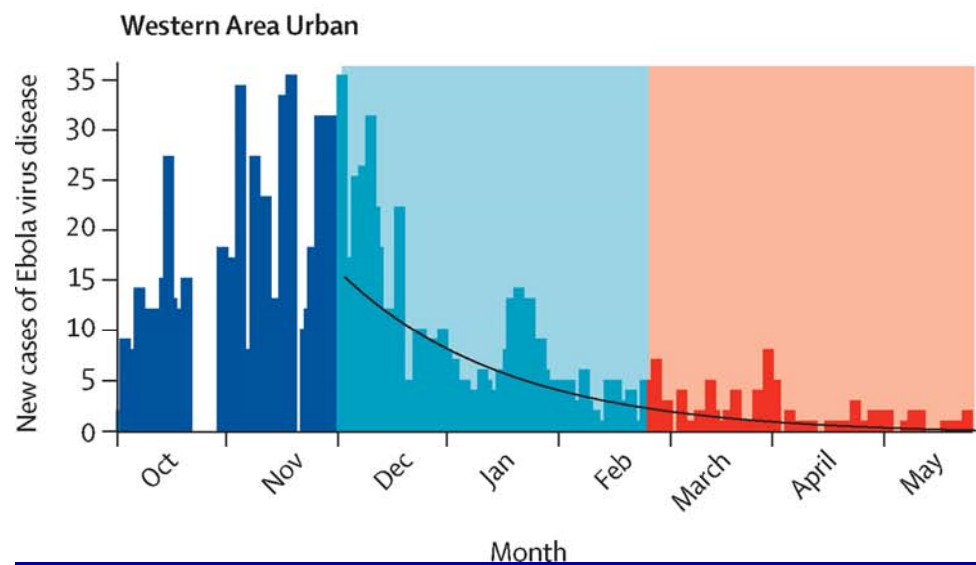
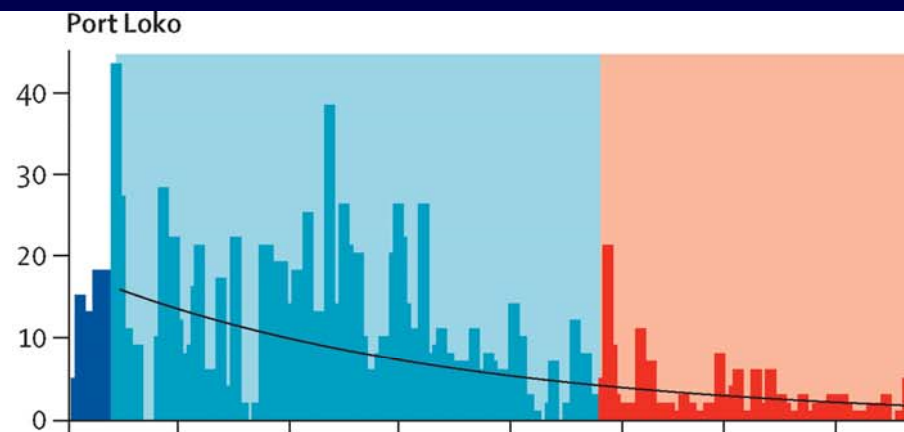
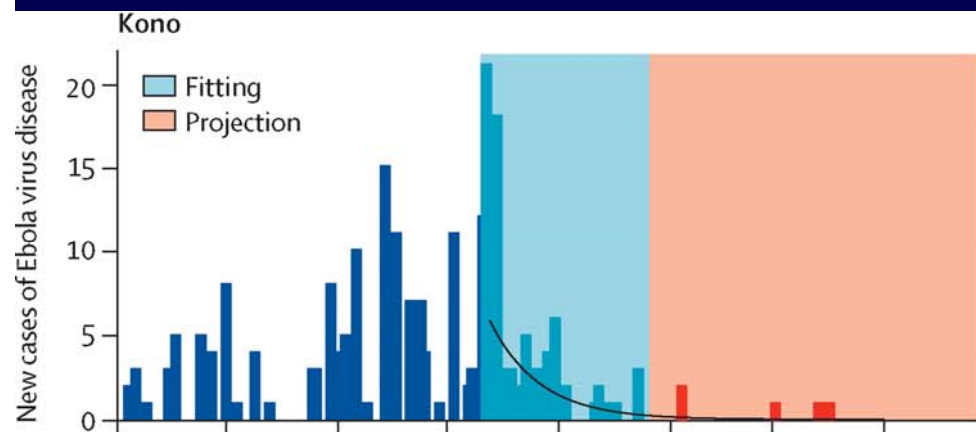
Interpretation Spatiotemporal variation in infection risk undermines the statistical power of the SWCT. This variation also undercuts the SWCT's expected ethical advantages over the RCT, because an RCT, but not an SWCT, can prioritise vaccination of high-risk clusters.

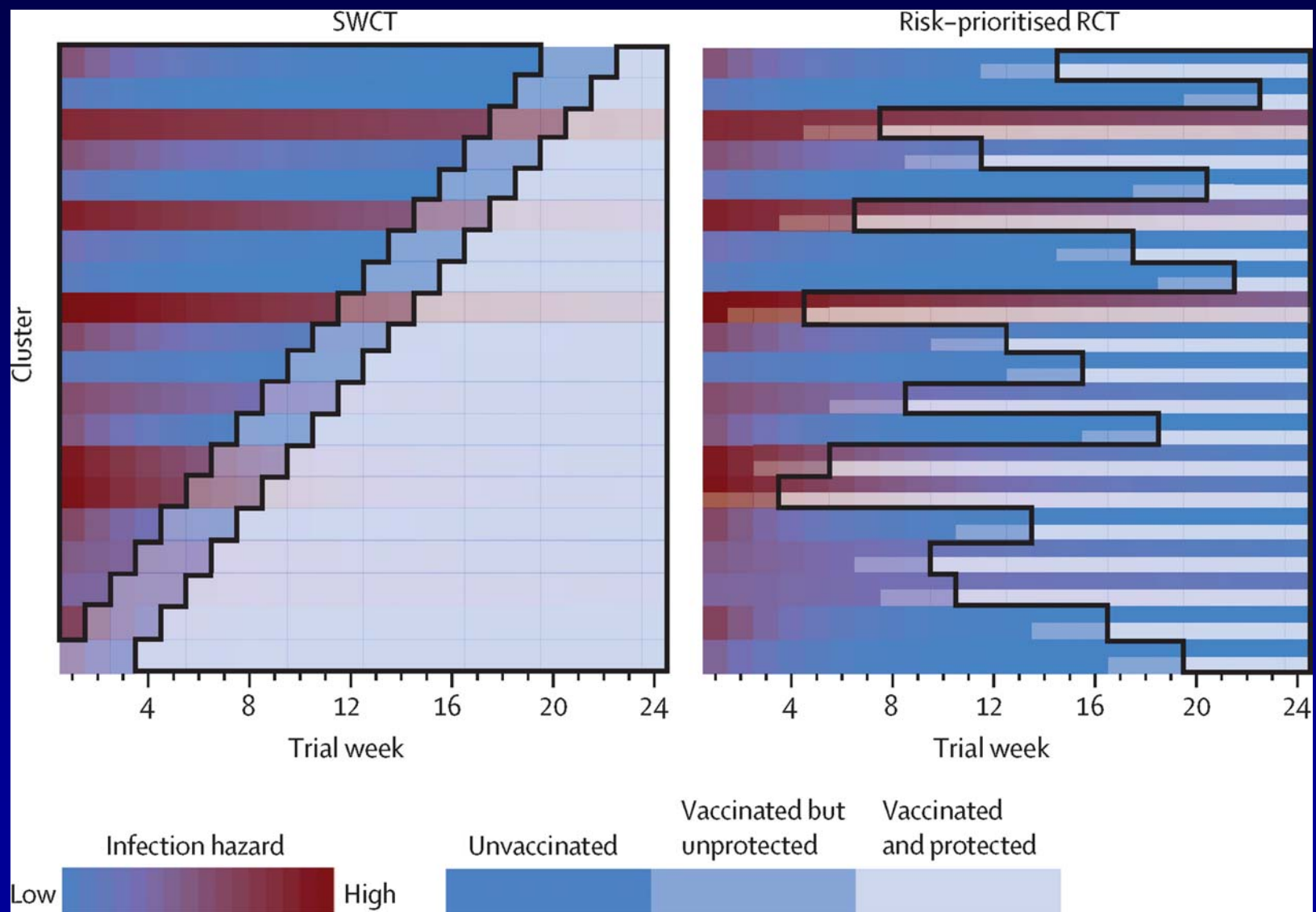
Lancet Infect Dis 2015

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[http://dx.doi.org/10.1016/S1473-3099\(15\)70159-3](http://dx.doi.org/10.1016/S1473-3099(15)70159-3)

Center for Computational Biology and Bioinformatics (S E Bellan PhD) and Department of Integrative Biology (S J Fox BS, Prof L A Meyers PhD), The University of Texas at Austin, Austin, TX, USA; Department of Biology (J R C Pulliam PhD) and Emerging Pathogens Institute (J R C Pulliam, C A B Pearson PhD), University of Florida, Gainesville, FL, USA; School of Computational Science and Engineering (D Champredon MSc) and Department of Biology (J Dushoff PhD), McMaster University, Hamilton, ON





The work of other groups

ORIGINAL ARTICLE

Ebola Virus Disease in West Africa — The First 9 Months of the Epidemic and Forward Projections

WHO Ebola Response Team*

ABSTRACT

BACKGROUND

On March 23, 2014, the World Health Organization (WHO) was notified of an outbreak of Ebola virus disease (EVD) in Guinea. On August 8, the WHO declared the epidemic to be a “public health emergency of international concern.”

METHODS

By September 14, 2014, a total of 4507 probable and confirmed cases, including 2296 deaths from EVD (Zaire species) had been reported from five countries in West Africa — Guinea, Liberia, Nigeria, Senegal, and Sierra Leone. We analyzed a detailed subset of data on 3343 confirmed and 667 probable Ebola cases collected in Guinea, Liberia, Nigeria, and Sierra Leone as of September 14.

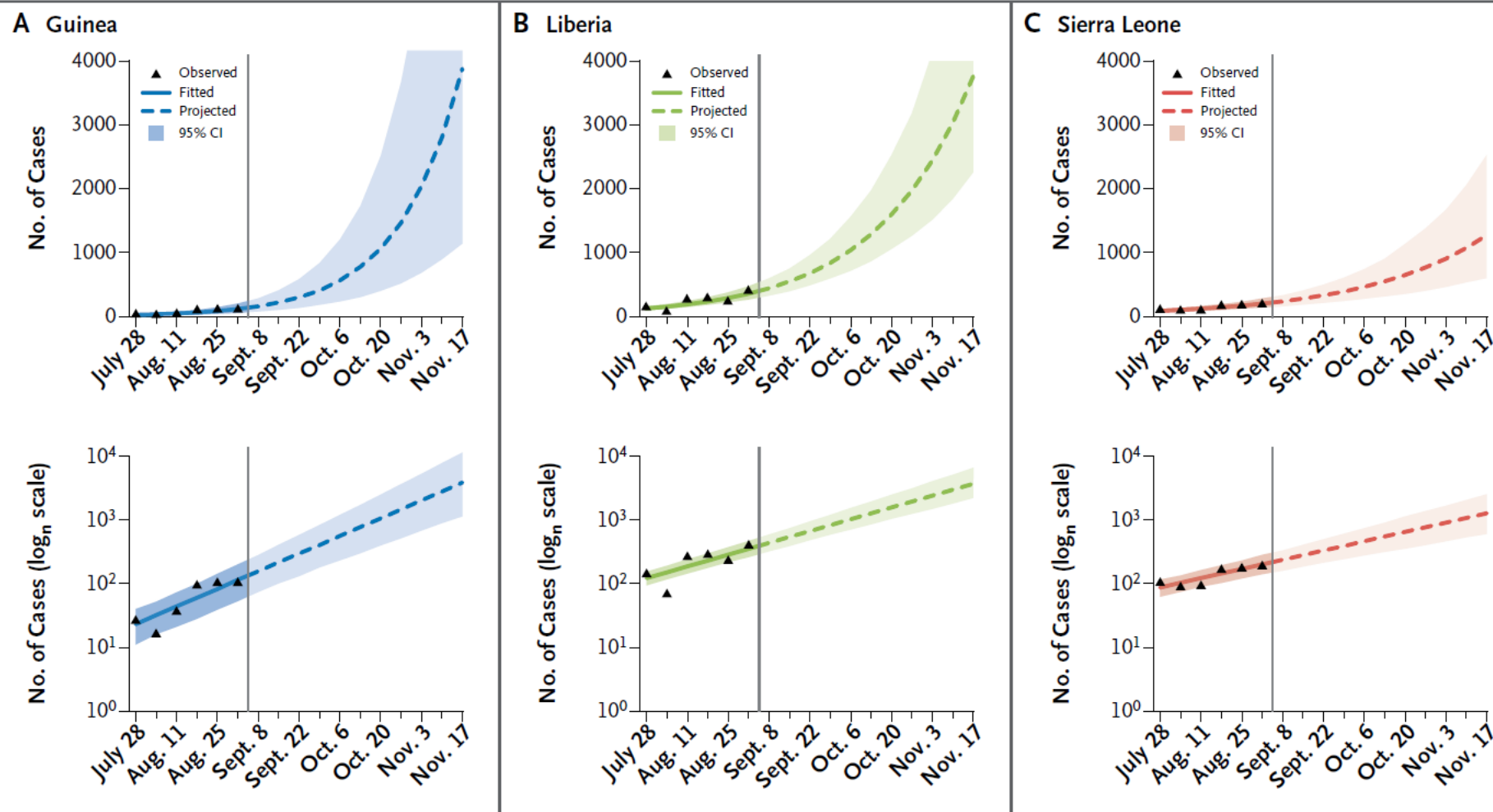


Figure 4. Observed and Projected Case Incidence.

Observed and projected weekly case incidence in Guinea (Panel A), Liberia (Panel B), and Sierra Leone (Panel C) are shown on linear (upper panels) and logarithmic (lower panels) scales

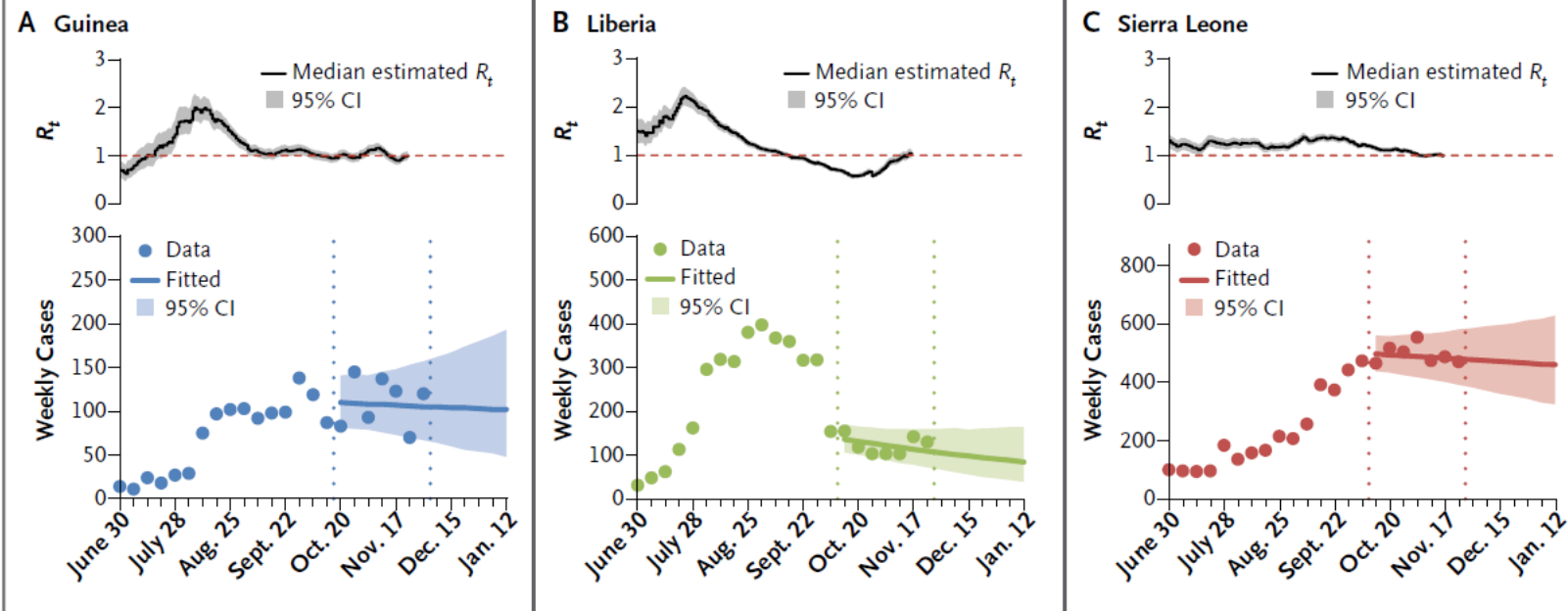


Figure 1. Case Reproduction Numbers and Weekly Incidence in Guinea, Liberia, and Sierra Leone.

Shown are the estimated case reproduction number (R_t) over time (upper panels) and the observed and projected weekly incidence (lower panels) of confirmed and probable cases of Ebola virus disease (EVD), according to the date of symptom onset, from the week beginning June 30, 2014, until the week beginning January 12, 2015, on the basis of data reported through December 7 for Guinea and November 30 for Liberia and Sierra Leone. The projections shown in the lower panels were generated from R_t estimates derived from data on case incidence (daily situation reports) for the 7 weeks through December 7 for Guinea and November 30 for Liberia and Sierra Leone (the time period delineated by the vertical dotted lines).

Assessing the International Spreading Risk Associated with the 2014 West African Ebola Outbreak

SEPTEMBER 2, 2014 · RESEARCH



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■ REVISIONS

This article is either a revised version or has previous revisions

Edition 1 - September 2, 2014 ▼

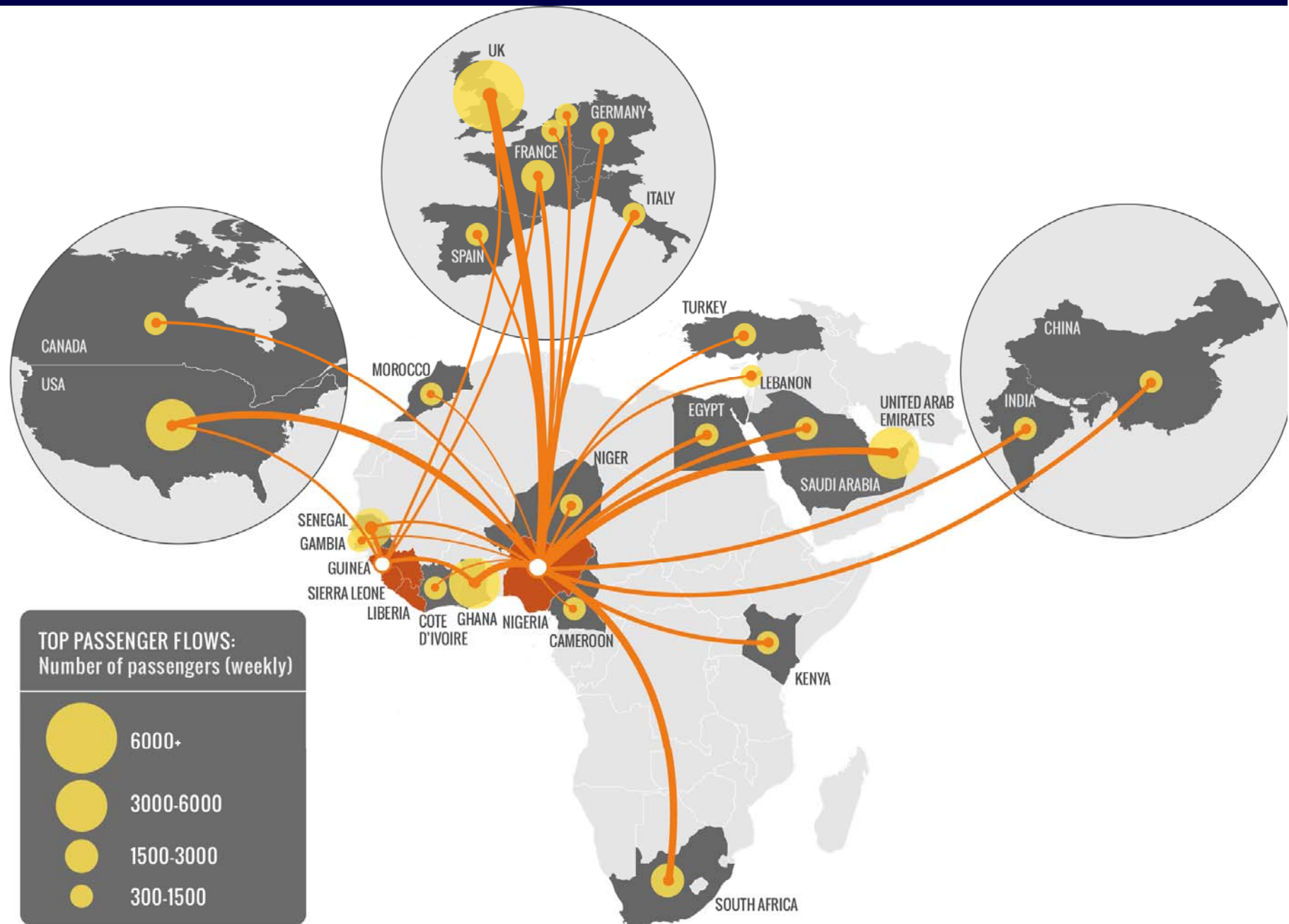
■ AUTHORS

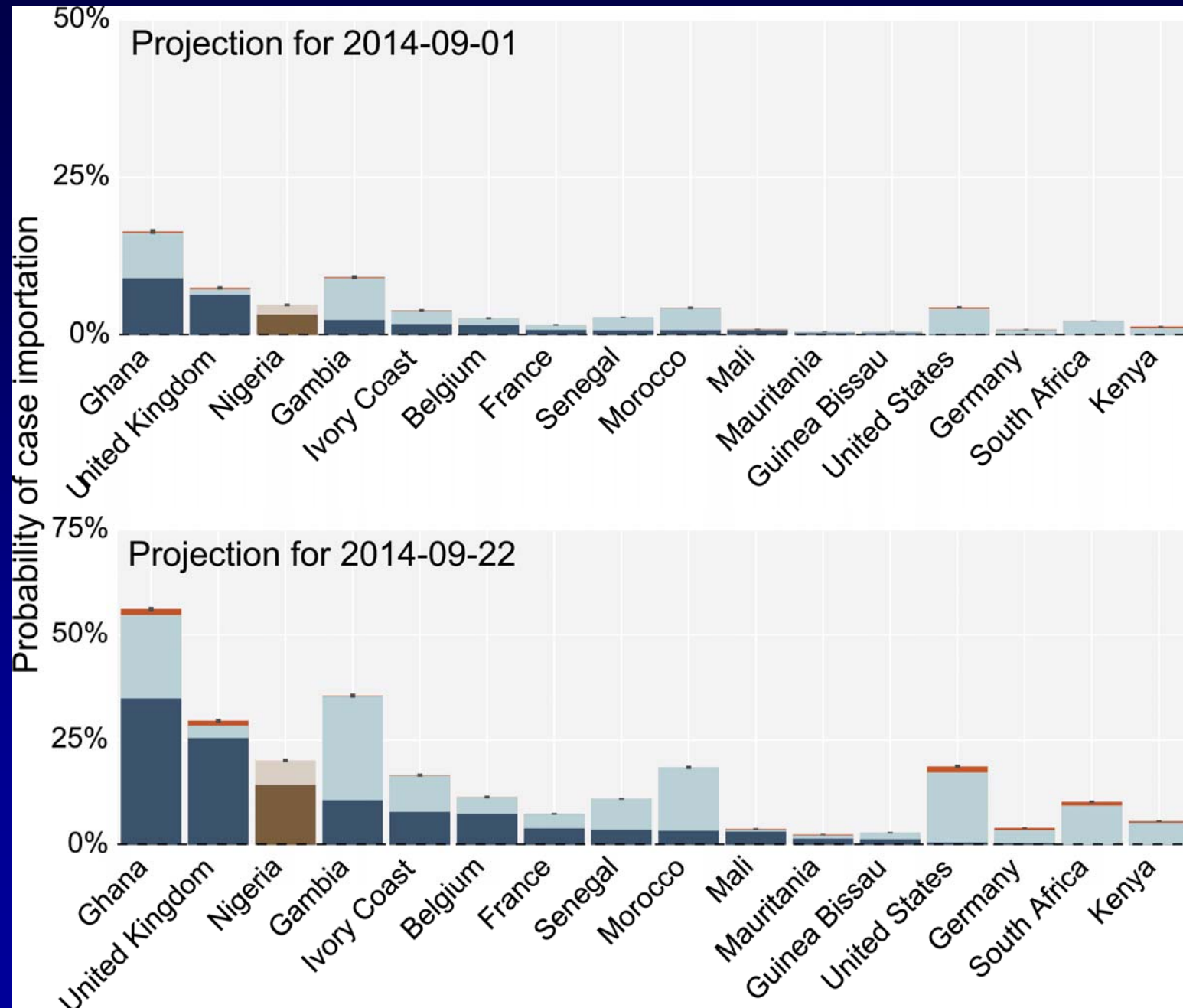
Marcelo F. C. Gomes Ana Pastore y Piontti Luca Rossi Dennis Chao Ira Longini M. Elizabeth Halloran
Alessandro Vespignani

■ ABSTRACT

Background: The 2014 West African Ebola Outbreak is so far the largest and deadliest recorded in history. The affected countries, Sierra Leone, Guinea, Liberia, and Nigeria, have been struggling to contain and to mitigate the outbreak. The ongoing rise in confirmed and suspected cases, 2615 as of 20 August 2014, is considered to increase the risk of international dissemination, especially because the epidemic is now affecting cities with major commercial airports.

Method: We use the Global Epidemic and Mobility Model to generate stochastic, individual based simulation





Lessons

Modelling's major contribution comes very early
(when sit. awareness is poor)

Embed within a public health agency

Academic publication often isn't useful during an
emergency (but is afterward)

Thank you for your time!

Special thanks to:

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Carrie Reed

Matt Biggerstaff

Cristina Carias

Martin Meltzer

Rebekah Borse

Isaac Fung

Neil Ferguson

Simon Cauchemez

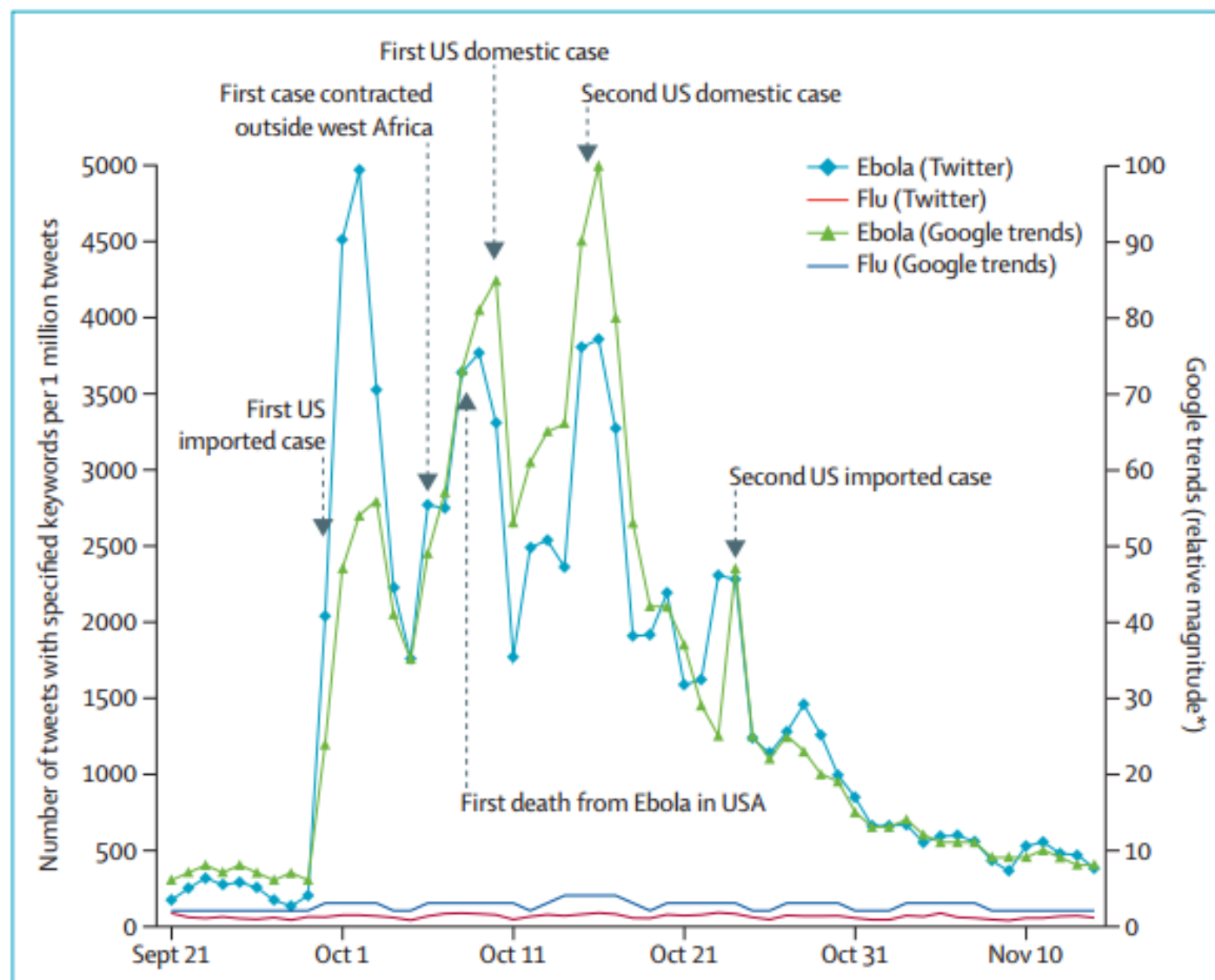
Christl Donnelly

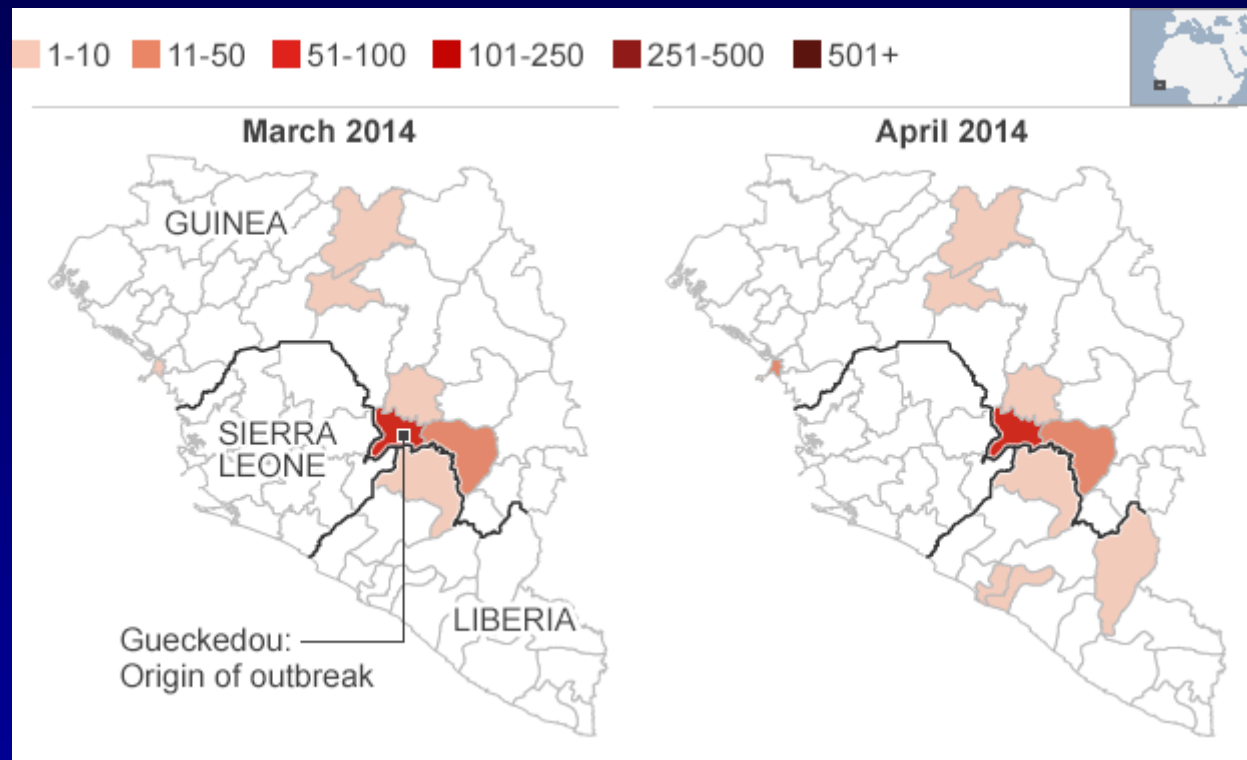
Tom Clark

Ben Lopman

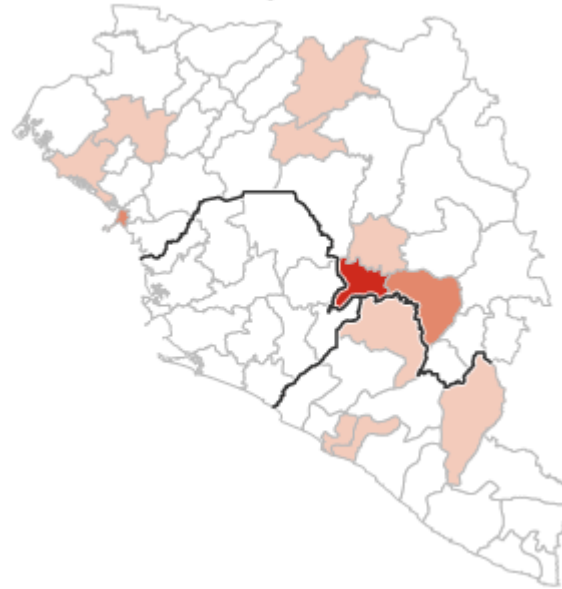
Amy Pinsent

+ many others

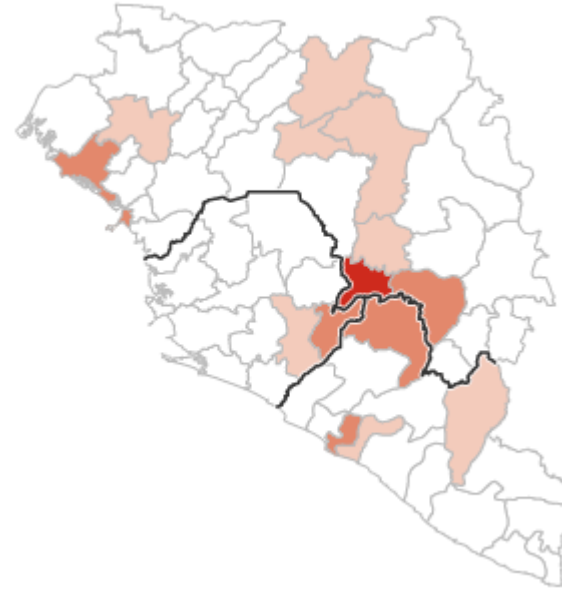


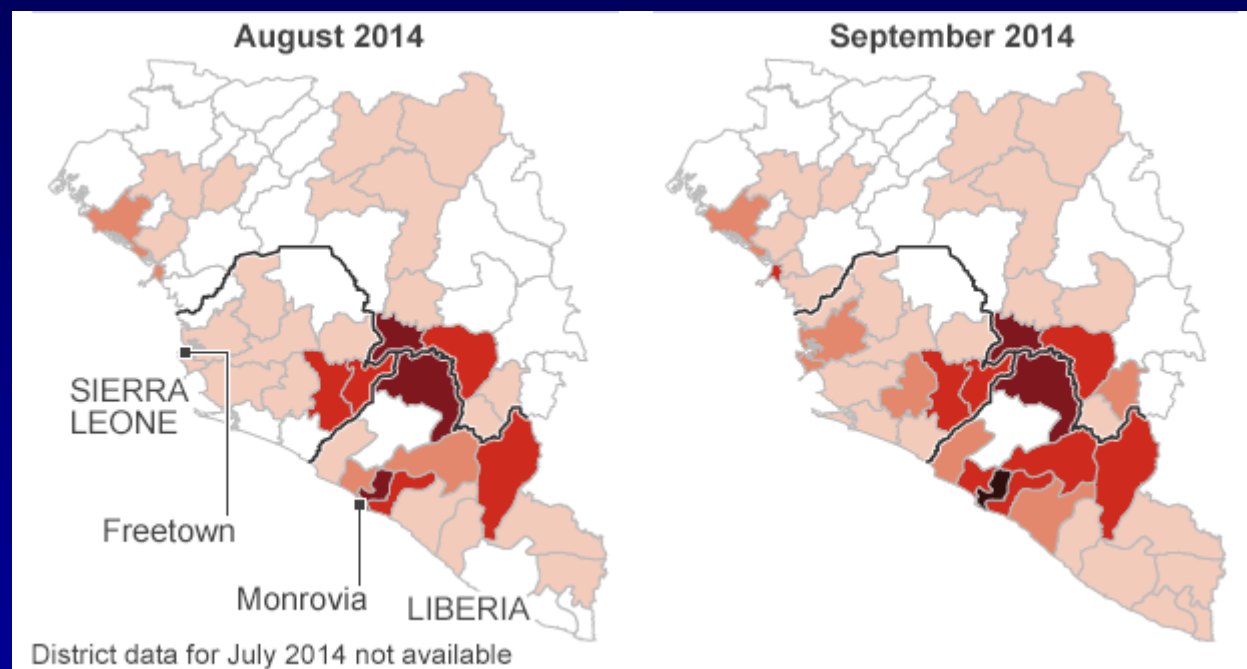


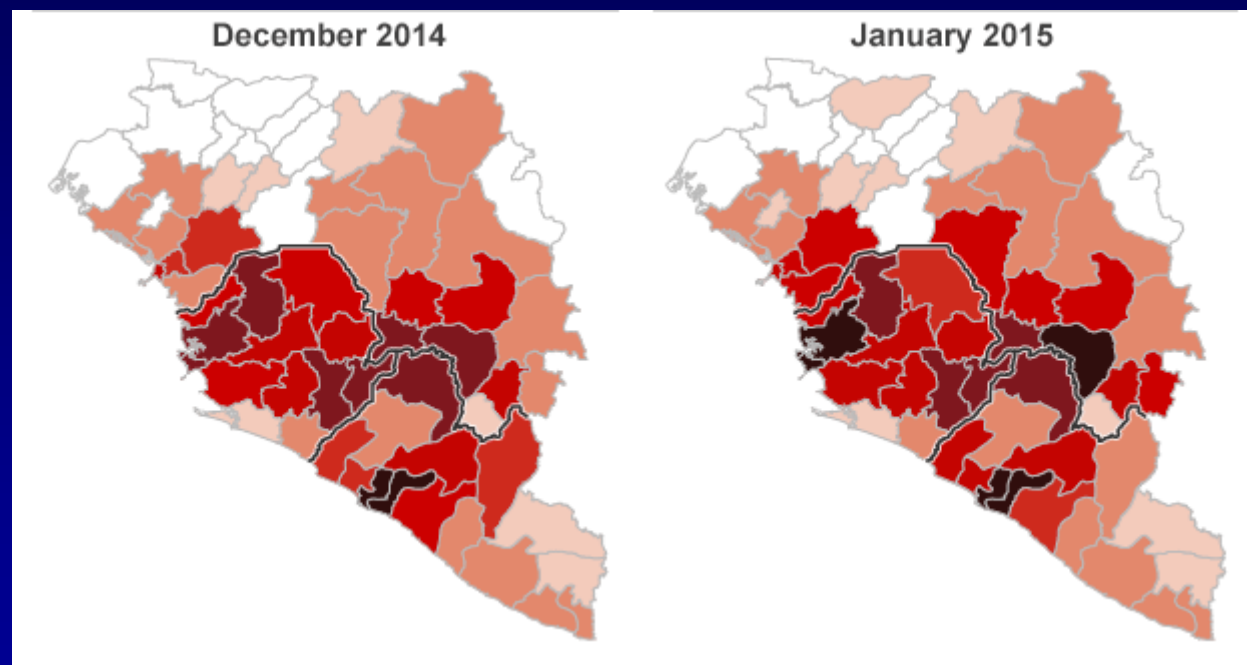
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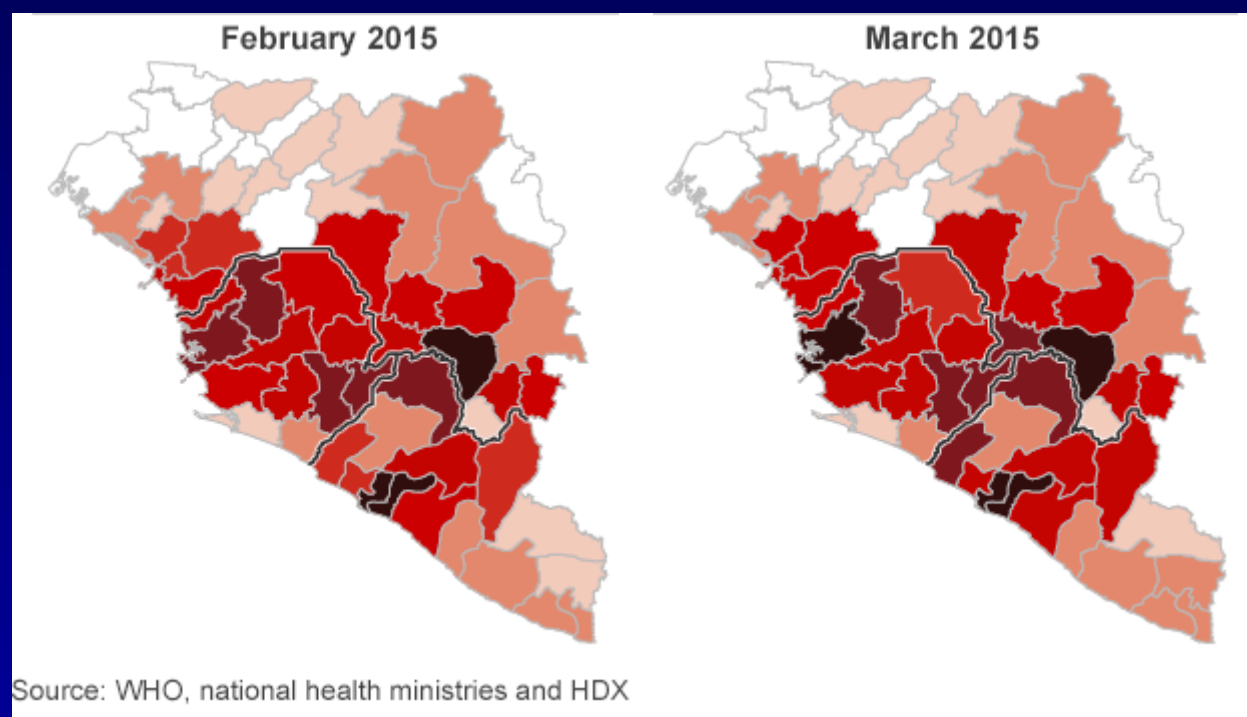


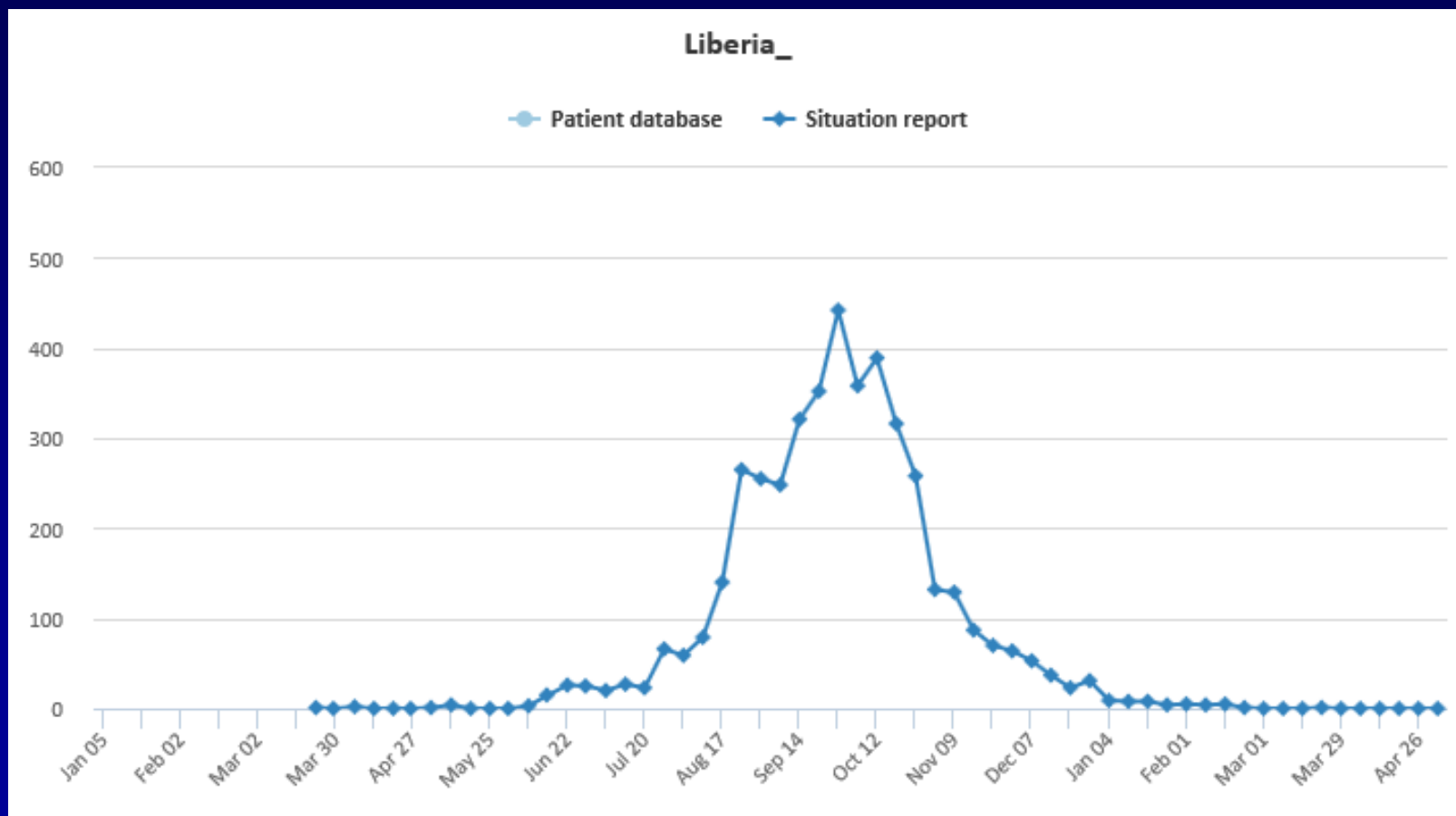
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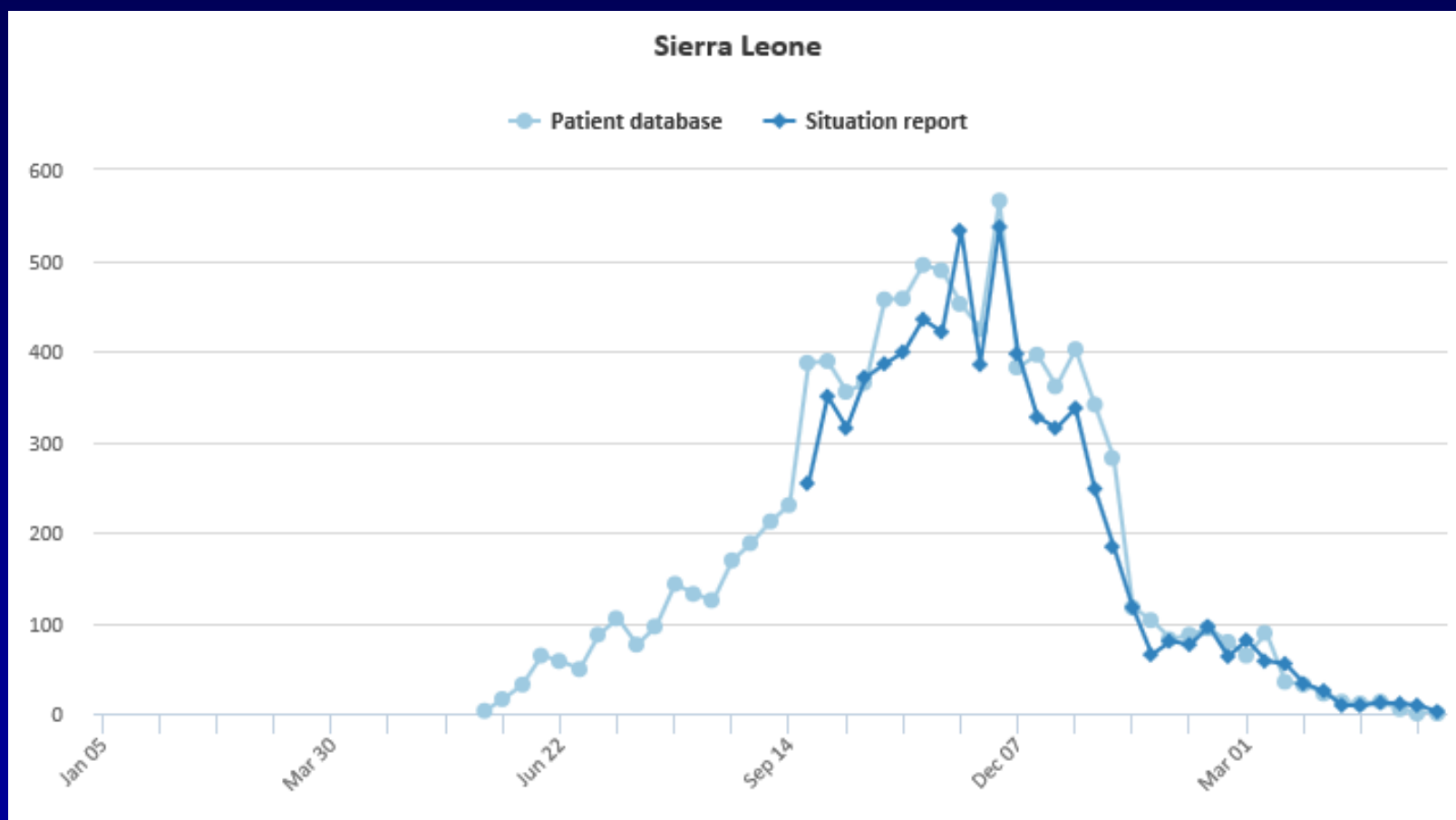


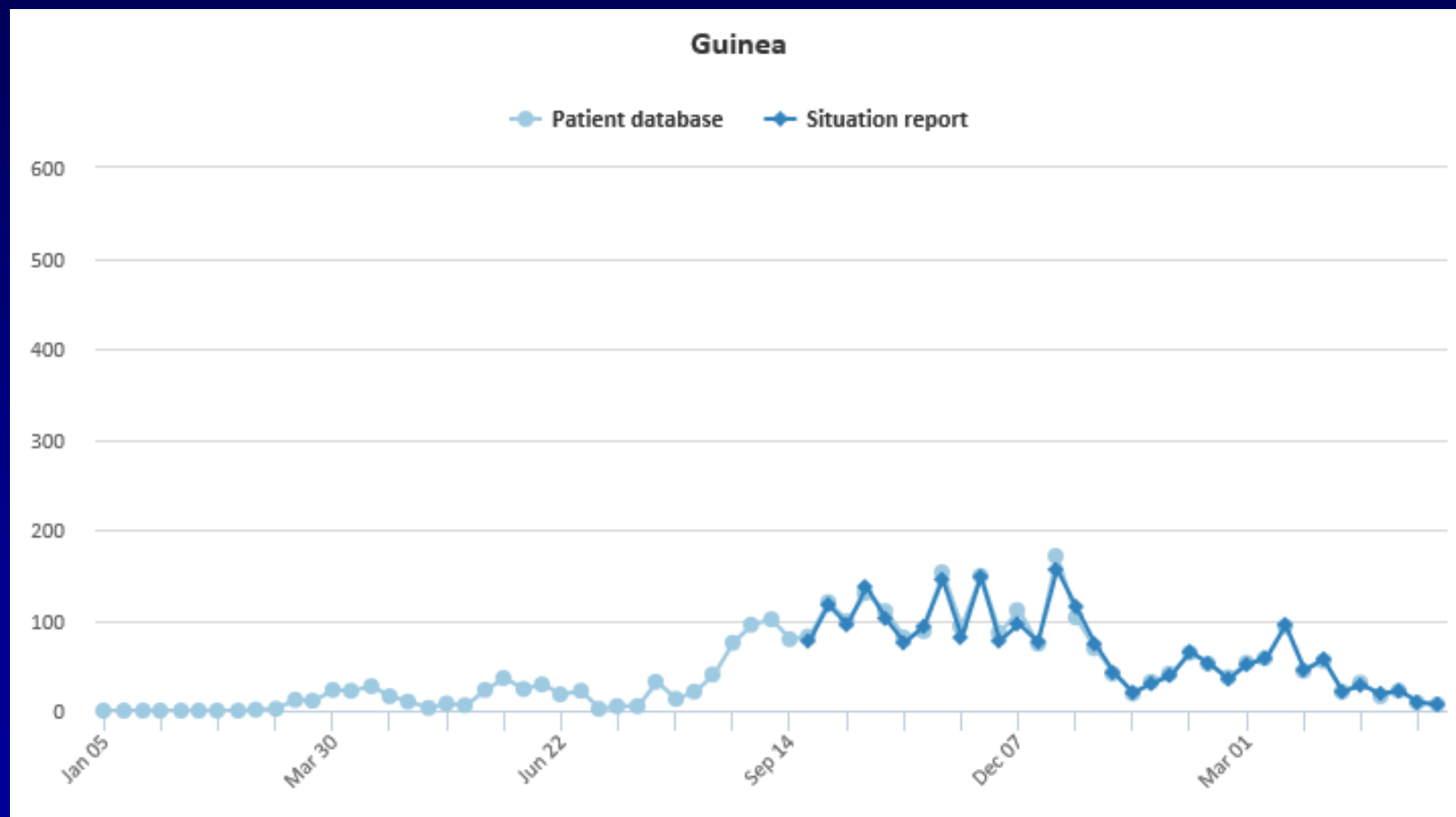




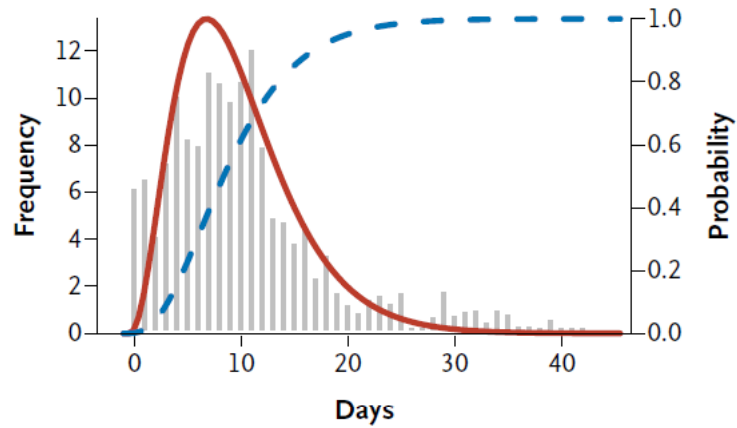




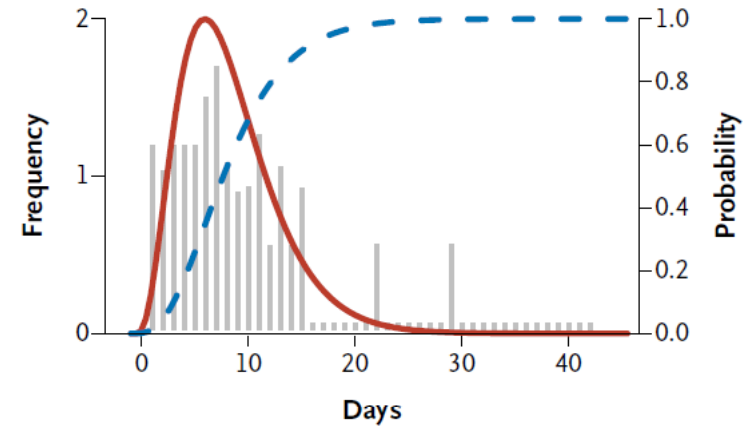




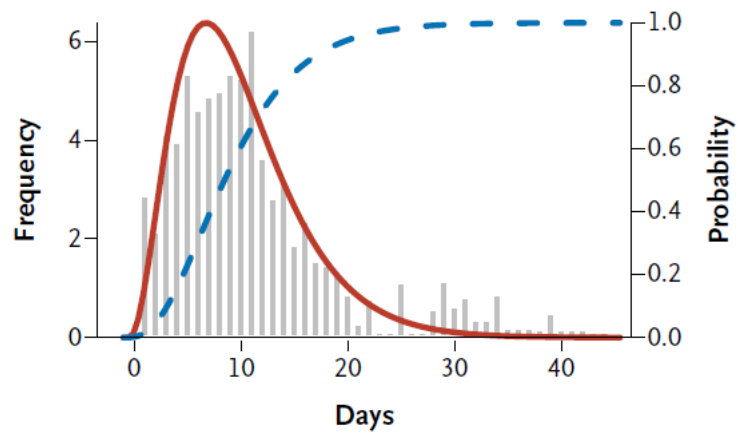
A All Countries Combined



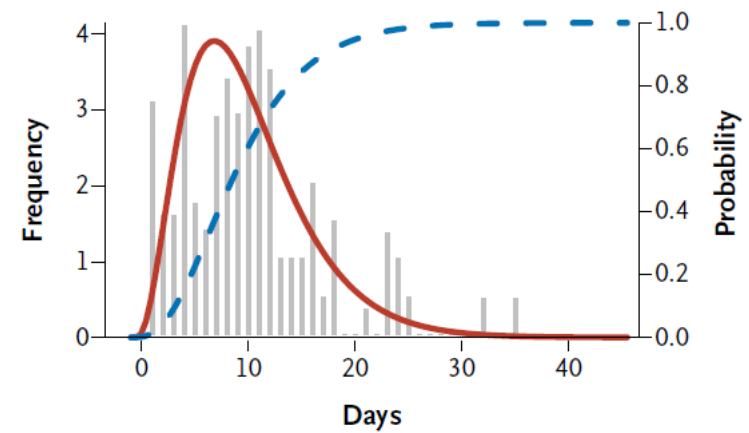
B Guinea



C Liberia



D Sierra Leone



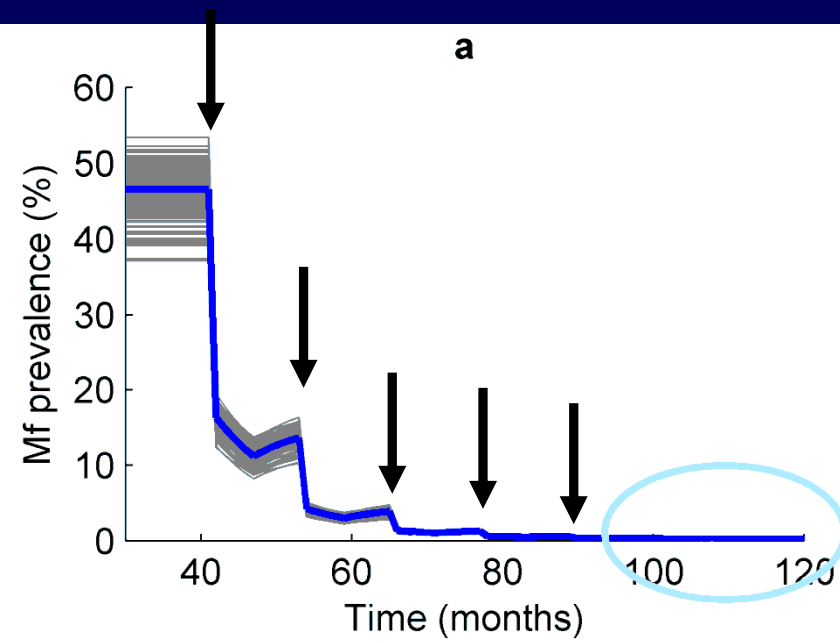


Table 2. Parameter estimates for the best-fitting model, Model 8 (models outlined in Table 1).

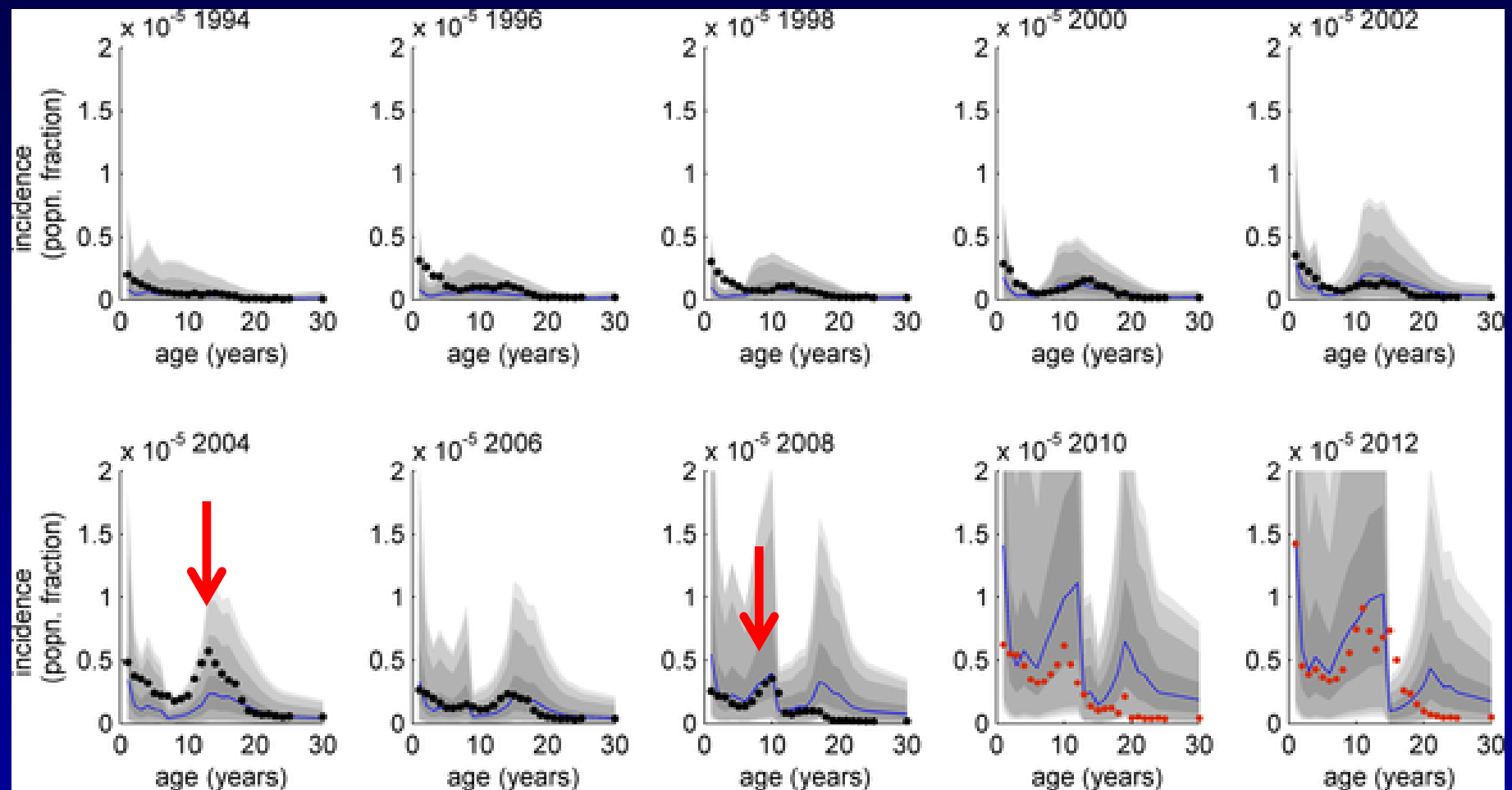
Parameter description	Value
Vaccine efficacies & waning	
<i>Whole-cell</i>	
Vaccine efficacy of 1 st 3 doses/4 th /5 th dose	90% [87%, 94%]
Rate of loss of whole-cell vaccine immunity	$3 \times 10^{-5} \text{yr}^{-1}$ [2×10^{-6} , 2×10^{-4}] i.e. essentially lifelong
<i>Acellular</i>	
Vaccine efficacy of 1 st 3 doses/4 th /5 th dose	80% [78%, 82%]
Rate of loss of acellular vaccine immunity	0.018yr^{-1} [0.015, 0.020] i.e. average of approx. 50 yrs protection
<i>Tdap</i>	
Vaccine efficacy	As acellular
Epidemiological Parameters	
Basic reproduction number, R_0	11.0 [9.9, 11.5]
Rate of loss of natural immunity	$3 \times 10^{-5} \text{yr}^{-1}$ [2×10^{-6} , 2×10^{-4}] i.e. essentially lifelong (as for whole-cell)
Relative susceptibility of individuals to subsequent infection (with reference to naïve individuals)	32% [29%, 35%]
Relative infectiousness of individuals with subsequent infection (with reference to primary-infected individuals)	17% [14%, 23%]
Year of reporting rate change	None
Mean reporting rate prior to change	6.0% [0.1%, 22%]
Mean reporting rate after change	n/a
doi:10.1371/journal.pcbi.1004138.t002	

Gambhir M, Clark TA, Cauchemez S, Tartof SY, Swerdlow DL, et al. (2015) A Change in Vaccine Efficacy and Duration of Protection Explains Recent Rises in Pertussis Incidence in the United States. PLoS Comput Biol 11(4): e1004138.

doi:10.1371/journal.pcbi.1004138

<http://journals.plos.org/ploscompbiol/article?id=info:doi/10.1371/journal.pcbi.1004138>

Fig 3. Cross-sectional incidence of disease over age of population.



Gambhir M, Clark TA, Cauchemez S, Tartof SY, Swerdlow DL, et al. (2015) A Change in Vaccine Efficacy and Duration of Protection Explains Recent Rises in Pertussis Incidence in the United States. *PLoS Comput Biol* 11(4): e1004138.

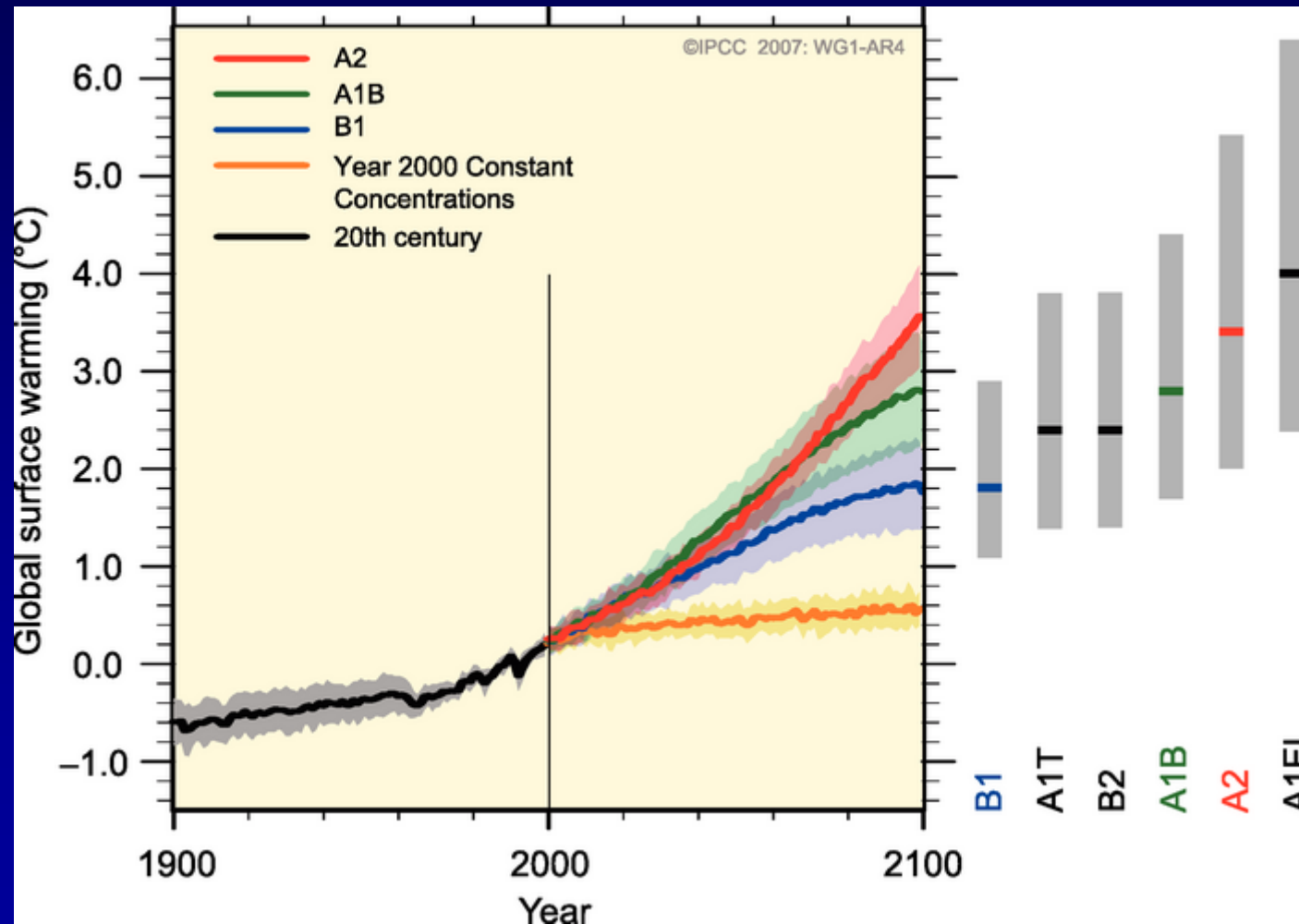
doi:10.1371/journal.pcbi.1004138

<http://journals.plos.org/ploscompbiol/article?id=info:doi/10.1371/journal.pcbi.1004138>

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The HIV Modelling Consortium aims to help improve scientific support for decision making by co-coordinating a wide range of research activities in mathematically modelling the HIV epidemic.

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HIV Treatment as Prevention: Systematic Comparison of Mathematical Models of the Potential Impact of Antiretroviral Therapy

Jeffrey W. Eaton^{1*}, Leigh F. Johnson², Anna Bershteyn⁶, David E. Bloom³, Salal Humair^{3,11}, Daniel J. Klein⁶, Edward A. Wenger⁶, Brian G. Williams¹³

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Abstract

Background: Many mathematical models have been used to estimate the impact of new HIV infections. Comparing results from different models can help to answer slightly different questions and have revealed that different mathematical models simulating the same scenario can produce different results about the epidemiological impact of expanded treatment coverage. **Methods and Findings:** Twelve independent mathematical models were used to assess the impact of expanded treatment coverage in South Africa and reported a median threshold for treatment eligibility, access to treatment, and the number of individuals start treatment on average 1.3 y, the models projected that HIV incidence would decrease by 30% in a counterfactual scenario in which there was no uncertainty about the theoretical impact of treatment. The impact of optimistic intervention scenarios on the theoretical impact of treatment was substantial uncertainty about the theoretical impact of treatment in the next four decades. The number of people who start treatment on average 1.3 y, the models projected that HIV incidence would decrease by 30% in a counterfactual scenario in which there was no uncertainty about the theoretical impact of treatment.

Health benefits, costs, and cost-effectiveness of earlier eligibility for adult antiretroviral therapy and expanded treatment coverage: a combined analysis of 12 mathematical models

Jeffrey W. Eaton¹, Leigh F. Johnson², Anna Bershteyn⁶, David E. Bloom³, Salal Humair^{3,11}, Daniel J. Klein⁶, Edward A. Wenger⁶, Brian G. Williams¹³, Cliff C. Kerr⁴, Daniel J. Klein⁶, Sharmistha Mishra⁵, Kate M. Mitchell⁷, Brooke E. Nichols⁸, Peter Vickerman⁹, Roel Bakker¹⁰, Täll Bärnighausen¹⁰, Anna Bershteyn⁶, David E. Bloom³, Marie-Claude Boily¹⁰, Stewart T. Chang¹⁰, Ted Cohen¹⁰, Peter J. Dodd¹⁰, Christophe Fraser¹⁰, Chaitra Gopalappa¹⁰, Jens Lundgren¹⁰, Natasha K. Martin¹⁰, Evelinn Mikkelsen¹⁰, Elisa Mountain¹⁰, Quang D. Pham¹⁰, Michael Pickles¹⁰, Andrew Phillips¹⁰, Lucy Platt¹⁰, Carel Pretorius¹⁰, Holly J. Prudden¹⁰, Joshua A. Salomon¹⁰, David A. M. C. van de Vijver¹⁰, Sake J. de Vlas¹⁰, Bradley G. Wagner¹⁰, Richard G. White¹⁰, David P. Wilson¹⁰, Lei Zhang¹⁰, John Blandford¹⁰, Gesine Meyer-Rath¹⁰, Michelle Remme¹⁰, Paul Revill¹⁰, Nalinee Sangruee¹⁰, Fern Tennis-Prestholt¹⁰, Meg Doherty¹⁰, Nathan Shaffer¹⁰, Philippa J. Easterbrook¹⁰, Gottfried Hirschall¹⁰, Timothy B. Hallett¹⁰

Summary

Background New WHO guidelines recommend initiation of antiretroviral therapy for HIV-positive adults with CD4 counts of 500 cells per μ L or less, a higher threshold than was previously recommended. Country decision makers have to decide whether to further expand eligibility for antiretroviral therapy accordingly. We aimed to assess the potential health benefits, costs, and cost-effectiveness of various eligibility criteria for adult antiretroviral therapy and expanded treatment coverage.

Methods We used several independent mathematical models in four settings—South Africa (generalised epidemic, moderate antiretroviral therapy coverage), Zambia (generalised epidemic, high antiretroviral therapy coverage), India (concentrated epidemic, moderate antiretroviral therapy coverage), and Vietnam (concentrated epidemic, low antiretroviral therapy coverage)—to assess the potential health benefits, costs, and cost-effectiveness of various eligibility criteria for adult antiretroviral therapy under scenarios of existing and expanded treatment coverage, with results projected over 20 years. Analyses assessed the extension of eligibility to include individuals with CD4 counts of 500 cells per μ L or less, or all HIV-positive adults, compared with the previous (2010) recommendation of initiation with CD4 counts of 350 cells per μ L or less. We assessed costs from a health-system perspective, and calculated the incremental cost (in US\$) per disability-adjusted life-year (DALY) averted to compare competing strategies. Strategies were regarded very cost effective if the cost per DALY averted was less than the country's 2012 per-head gross domestic product (GDP; South Africa: \$8040; Zambia: \$1425; India: \$1489; Vietnam: \$1407) and cost effective if the cost per DALY averted was less than three times the per-head GDP.

Findings In South Africa, the cost per DALY averted of extending eligibility for antiretroviral therapy to adult patients with CD4 counts of 500 cells per μ L or less ranged from \$237 to \$1691 per DALY averted compared with 2010 guidelines. In Zambia, expansion of eligibility to adults with a CD4 count threshold of 500 cells per μ L ranged from improving health outcomes while reducing costs (ie, dominating the previous guidelines) to \$749 per DALY averted. In both countries results were very cost effective for expansion of eligibility to all HIV-positive adults, and when substantially expanded treatment coverage was assumed. Expansion of treatment coverage in the general population was also cost effective. In



Lancet Glob Health 2013

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See Online for an audio interview with Tim Hallett

*Contributed equally

MRC Centre for Outbreak Analysis and Modelling (A Cori PhD, Prof C Fraser PhD), Department of Infectious Disease Epidemiology (J W Eaton PhD, S Mishra MD, M-C Boily PhD, E Mountain MSc, M Pickles PhD), Prof T B Hallett PhD, Imperial College London, London, UK; Center for Health Decision Science (N A Menzies MPH, Prof J A Salomon PhD), Department of Global Health and Population



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- 9 diseases incl: schistosomiasis, lymphatic filariasis, trachoma, soil transmitted helminths

2 questions from BMGF

Are we on target for the 2020 goals with current strategies?

If not, what other strategies will be required, and where?

Gambhir and Pinsent *Parasites & Vectors* (2015) 8:530
DOI 10.1186/s13071-015-1133-6



RESEARCH

Open Access

Possible trachoma reduction

Manoj Gambhir*

Pinsent et al. *BMC Medicine* (2016) 14:71
DOI 10.1186/s12916-016-0614-6

BMC Medicine

RESEARCH ARTICLE

Open Access

Enhanced antibiotic distribution strategies and the potential impact of facial cleanliness and environmental improvements for the sustained control of trachoma: a modelling study

Amy Pinsent^{1*}, Matthew J. Burton² and Manoj Gambhir¹

Abstract

Background: Trachoma is a leading cause of blindness and is essential to sustained control of trachoma infection with each successive round of treatment.

Methods: In this study, we assessed the impact of treatment on the possibility of incipient endemic setting

Abstract

Background: Despite some success in controlling trachoma with repeated mass drug administration (MDA), some hyperendemic regions are not responding as fast as anticipated. Available data suggests that individuals with higher bacterial infection loads are less likely to resolve infection following a single dose of treatment, and thus remain a source of re-emergent infection following treatment. We assessed the potential impact of a new double-dose



Citation: Liu F, Por B, West SK, et al. (2016) the Prevalence of Trachoma