

# **Accounting for the global under-reporting of Emerging Infections Diseases**

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# Motivation

- Number of EIDs is increasing
- Local diseases can spread globally
- Significant morbidity and mortality
- Devastating effects on economies
- **Need to focus surveillance efforts**

**But how?**

- Step 1:

- Where is the highest risk?

# Emerging Infectious Disease Dataset

- 335 diseases that have emerged between 1940 and 2003
- Jones et al., Nature 2008

## Criteria for inclusion:

- Novel disease in human population
- New geographic locales
- Development of drug-resistance
- Dramatic changes in virulence

# What causes new diseases to emerge?

## Ecological changes

- Land use changes
- Climate change
- Agriculture Intensification

## Demographic changes

- Age shifts
- Population density



## Bioterrorism

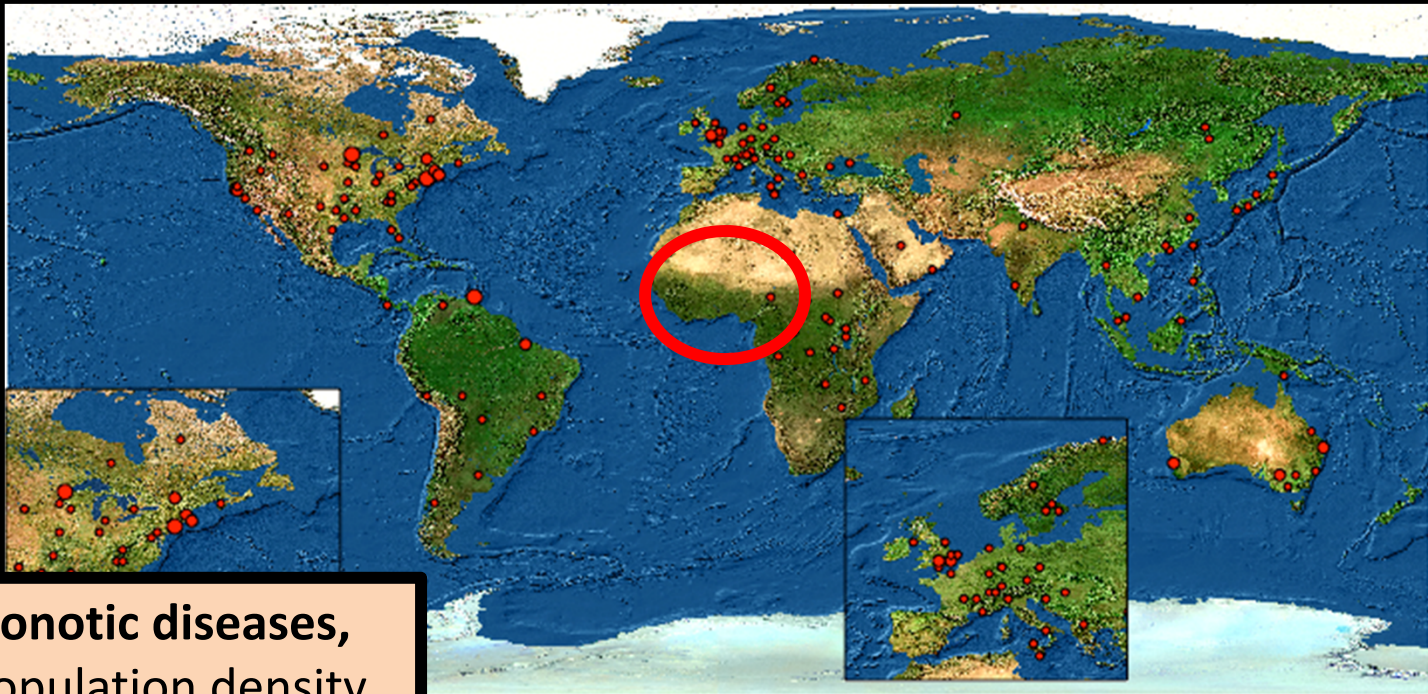
## Changes in drug use

- Personal
- Agriculture
- Factory runoff

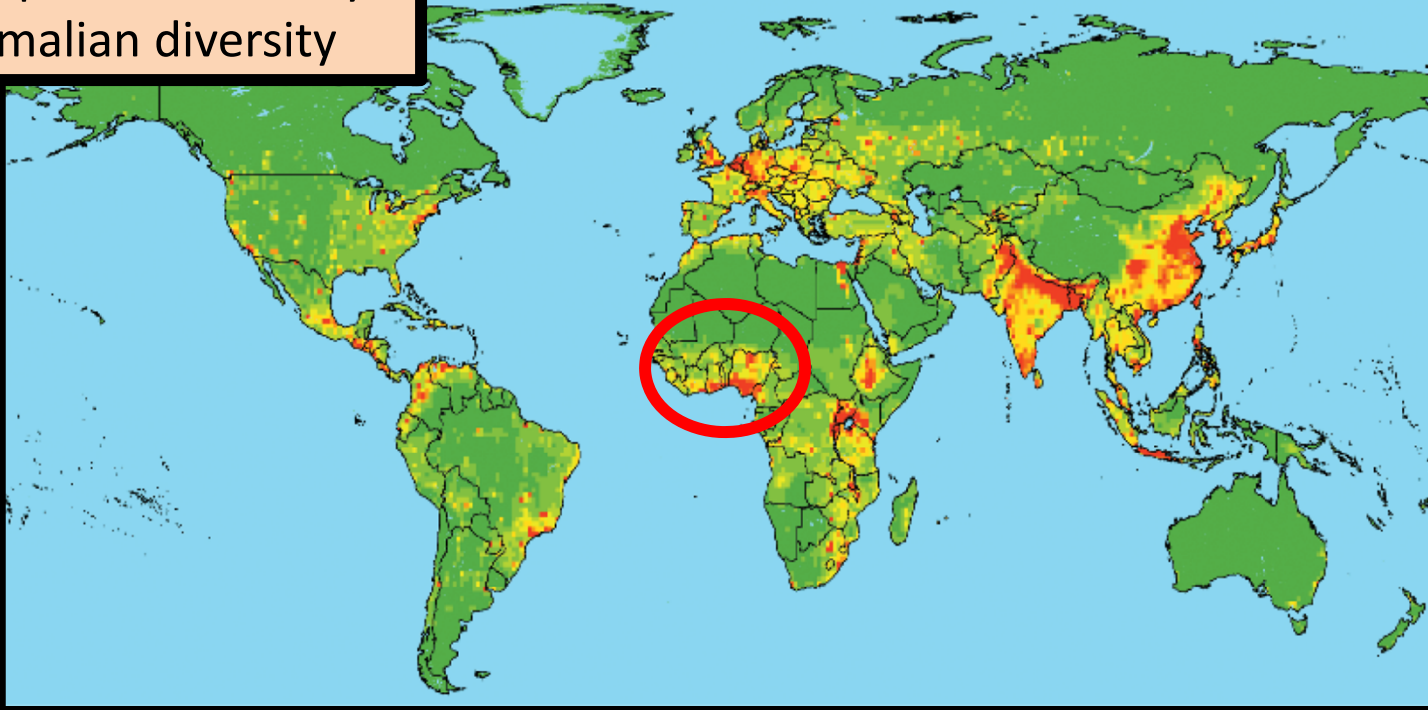


- ## Changes in immunity
- HIV status





**For zoonotic diseases,**  
High population density  
Mammalian diversity



- Step 1:
  - Where is the highest risk?
- Step 2:
  - Where is surveillance/reporting poor?





**Exposure**



**Novel EID Reported**



**Exposure**



**Symptom presentation**

**Medical visit and examination**

**Correct diagnosis**

**Alert authorities**

**Novel EID Reported**

- Cluster of cases
- Access to medical care
- Personal choices
- Medical technologies
- Uniqueness of symptoms
- Medical training
- Communications technology  
etc.



**Exposure**



**Symptom presentation**

**Medical visit and examination**

**Correct diagnosis**

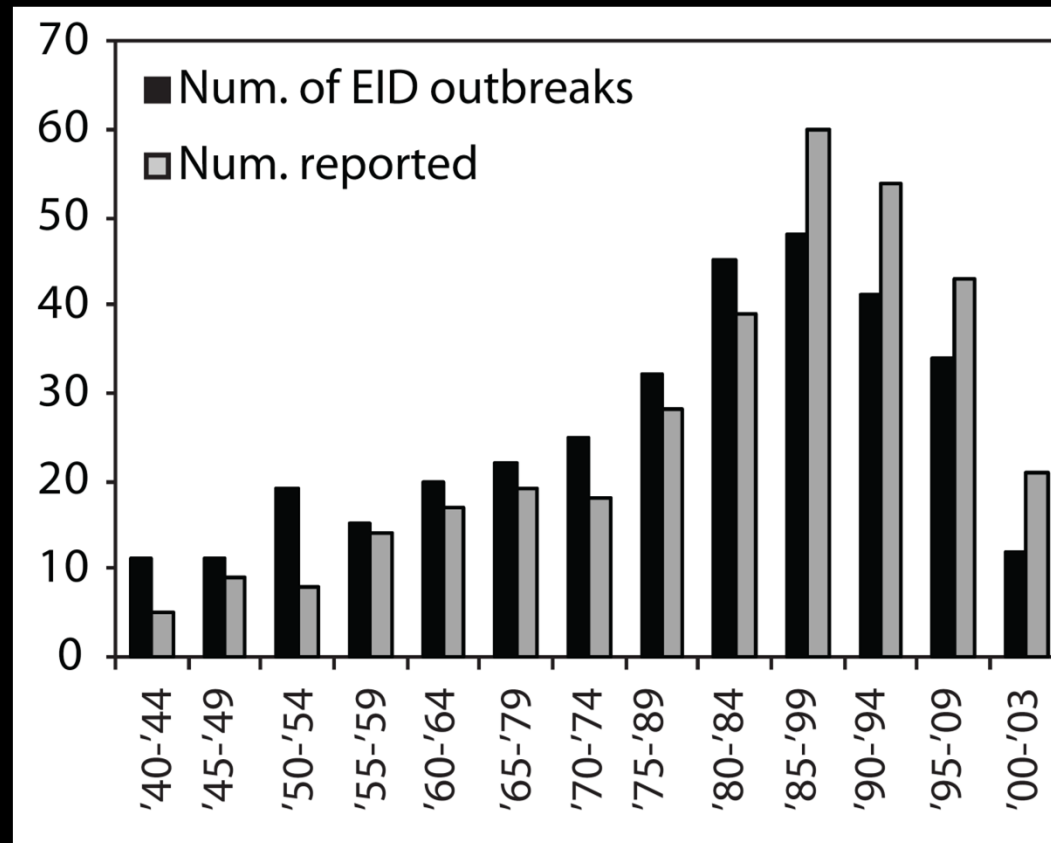
**Alert authorities**

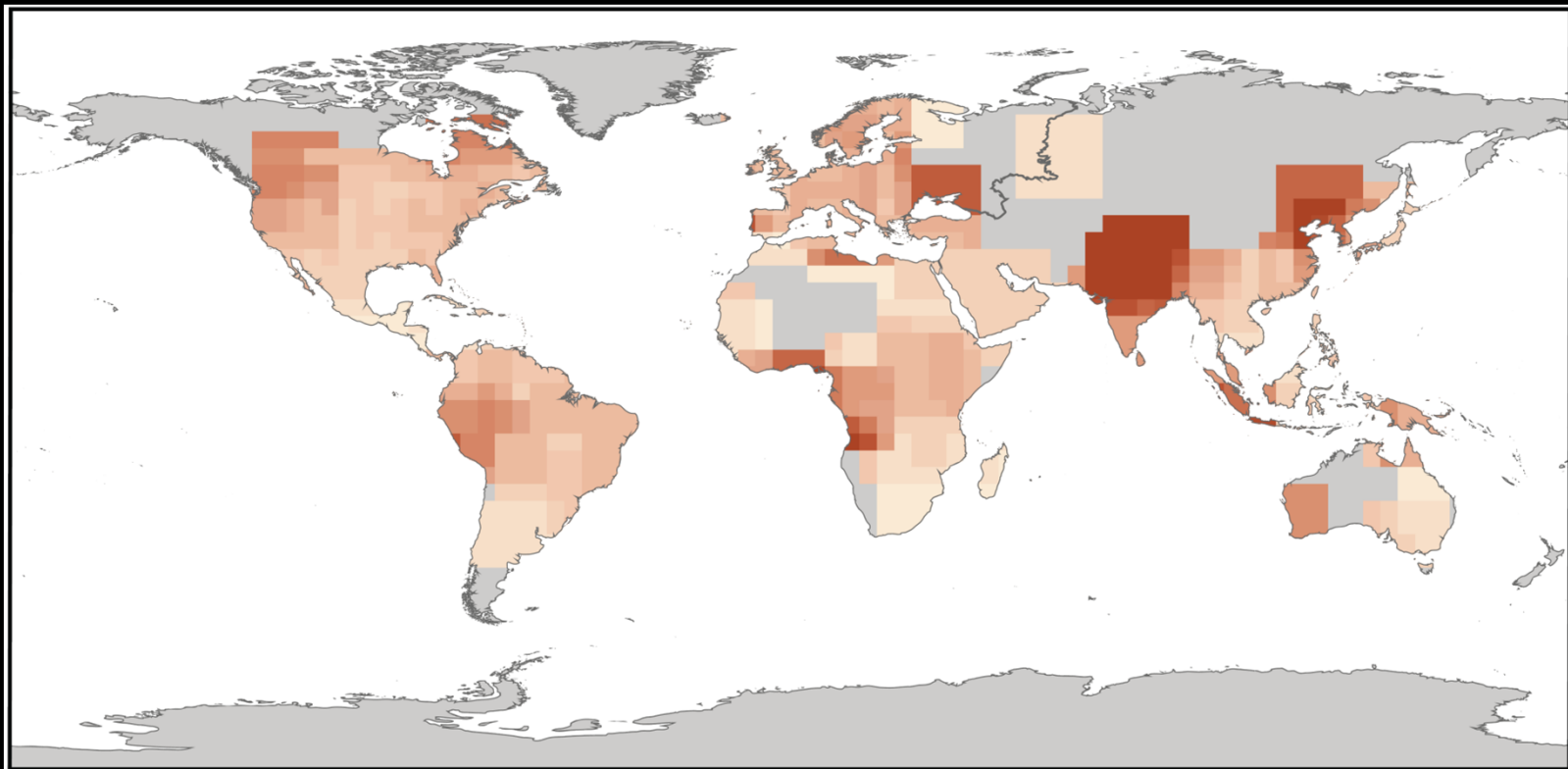
**Novel EID Reported**



**Lag in Reporting**

# Lag in disease reporting





Small Publishing Lag

Large Publishing Lag

# Components of Reporting Lag

## Infrastructure

Healthcare spending

Number of doctors, hospitals

Communications

Technology

## Biological

Disease etiology

Disease symptoms

Pathogenicity

# Disease Traits

## More Likely to Report

- High transmission rate → Large clusters
- High disease severity
- Symptom abnormality

## Less Likely to Report

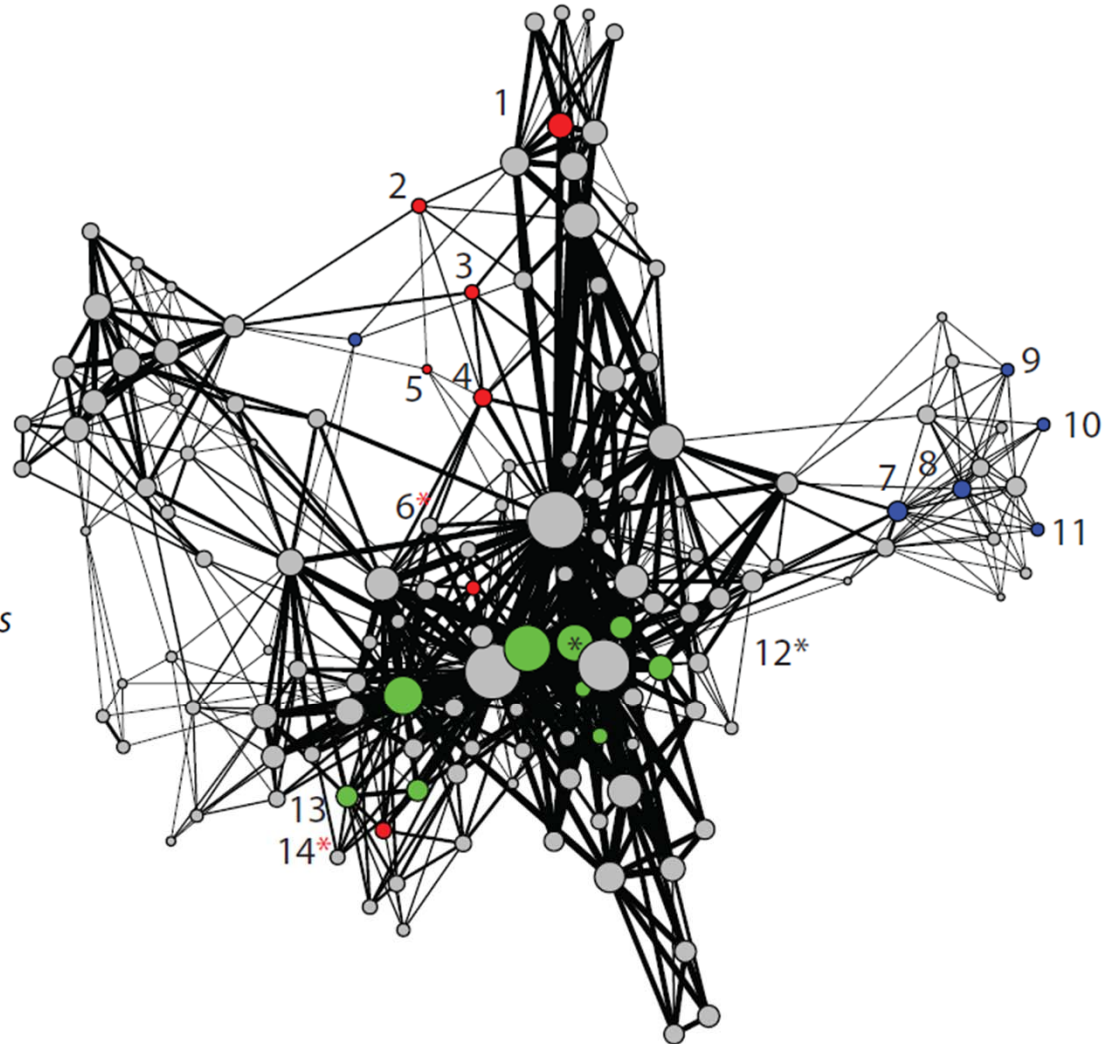
- Fast recovery times
- Overlapping symptoms with commonplace diseases



# Overlapping symptoms

A

1. Tuberculosis
2. Adenovirus
3. SARS coronavirus
4. Influenza A
5. Common cold
6. Malaria
7. Rotavirus A
8. *Shigella dysenteriae*
9. *Escherichiae coli*
10. *Salmonella enteritidis*
11. *Giardia duodenalis*
12. Ebola virus
13. Dengue
14. West Nile virus

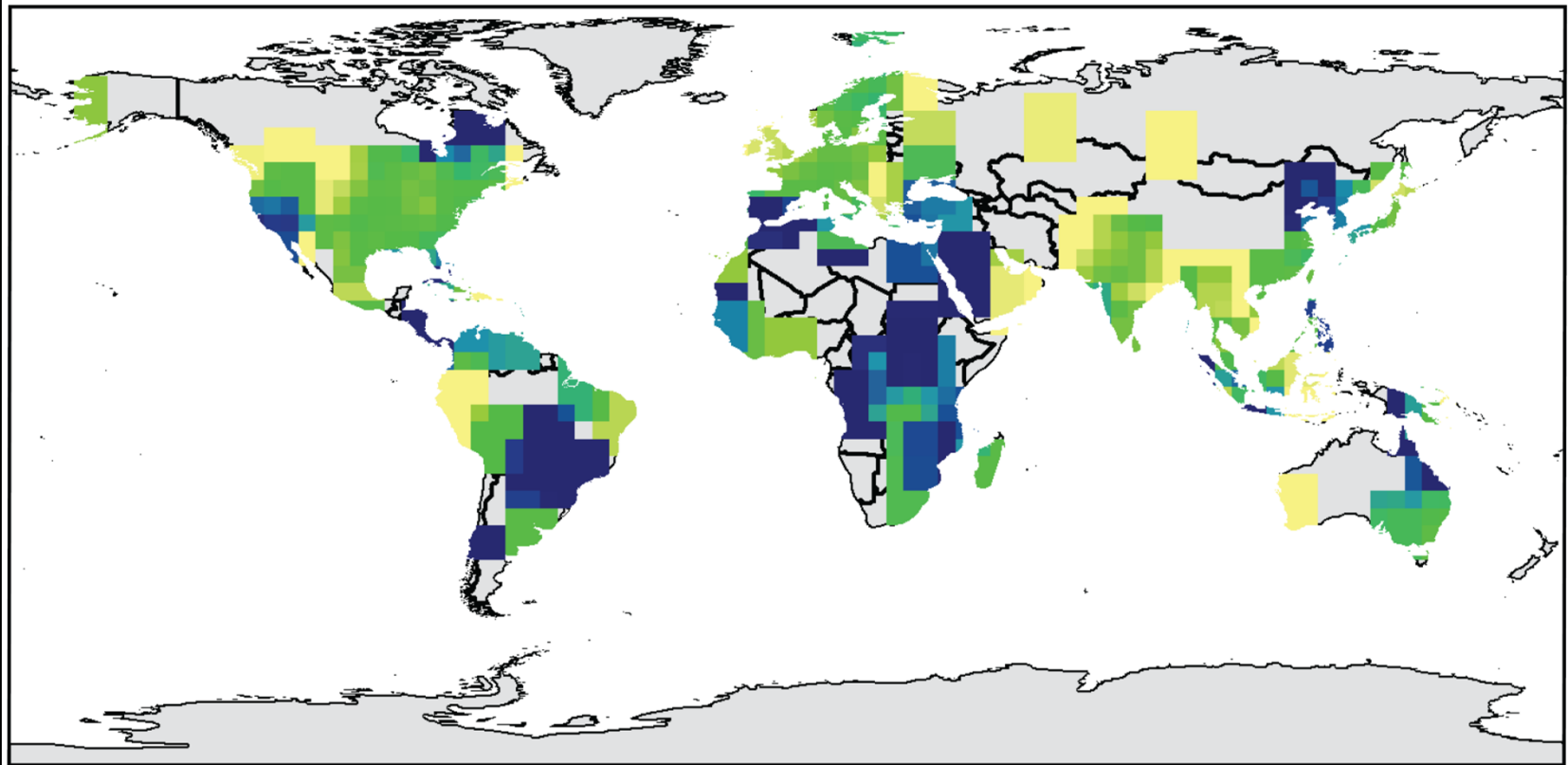


B



# Scoring Symptoms

Symptom	Score
Headache, Cough, Abdominal pain, Sneezing, Back pain	1
Fever, Diarrhea, Localized rash, Muscle swelling, Pustules	2
Cardiac or pulmonary pain, Genital lesions, Abdominal mass, Vomitting, Macules, Blood in urine	3
Pneumonia, Gastrointestinal obstruction, Eye worm, Hemorrhagic rash, Seizures, Meningitis	4
Death, Hemmohagic fever, Paralysis, Coma	5



Low Symptom Severity

High Symptom Severity

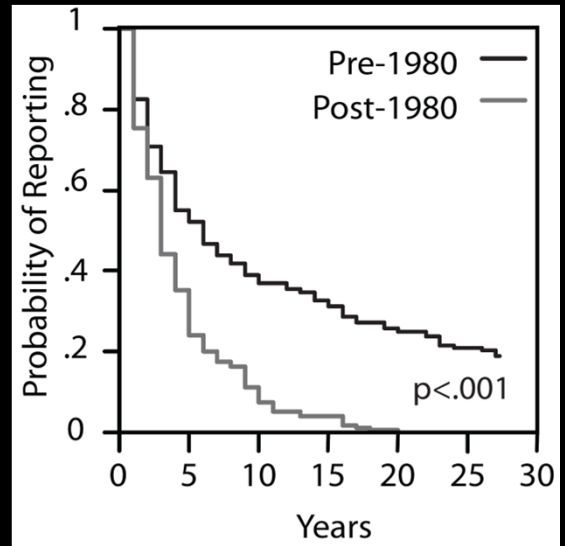
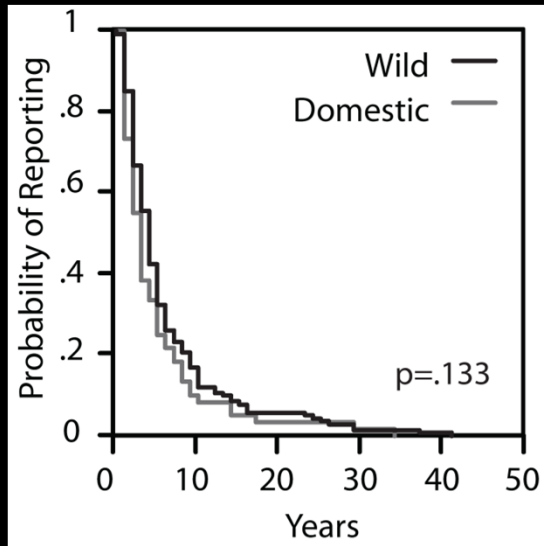
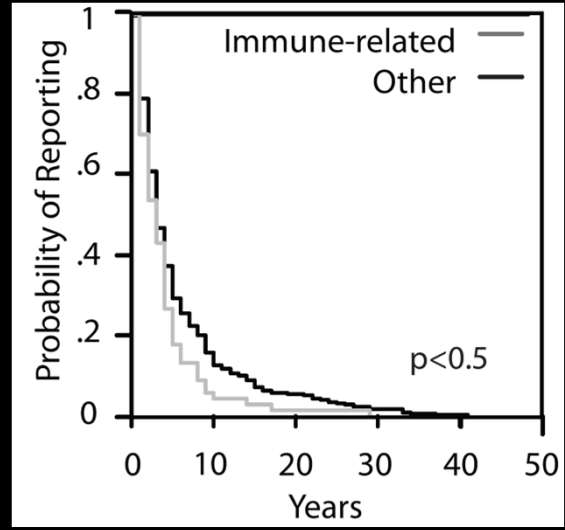
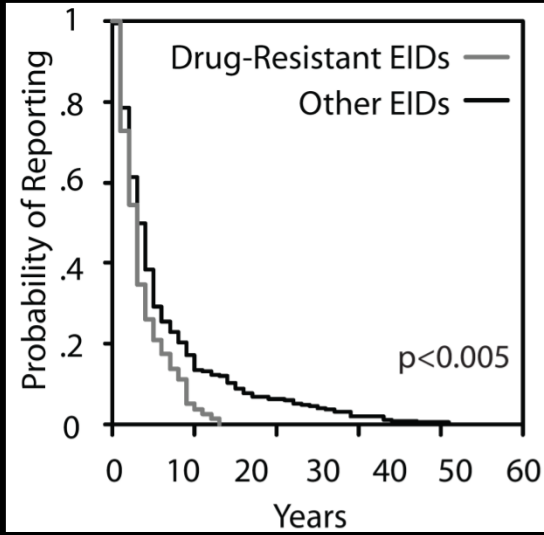
# Applying Survival Analysis to Reporting Lag

Product Release  $\longrightarrow$  Product Failure

Disease Onset  $\longrightarrow$  Mortality

Disease Emergence  $\longrightarrow$  Disease Report

$$h_i(t) = h_0(t) e^{\{\beta_1 X_{i1} + \dots + \beta_k X_{ik}\}}$$



# What factors contribute the lag?

- Type of disease (zoonotic, vector-borne, drug-resistance)
- Pathogen type (virus, bacteria etc.)
- Disease severity
- Population Density
- Disease Burden
- Hospital beds
- Health expenditure (as % of GDP)
- Political rights and Civil liberties
- Number of Physicians (per 1000 people)
- Immunizations
- Civilian coverage (birth and death certificates)
- Internet Users (per 100 people)
- Telephone Lines (per 100 people)
- Cell phone Subscriptions (per 100 people)

Cluster size

Health Infrastructure

Communication Infrastructure

# Model to account for reporting lag

## Zoonotic disease (n=158)

<u>Variable</u>	<u><math>\beta</math></u>	<u>s.e.(<math>\beta</math>)</u>	<u>p-value</u>
Disease burden (all causes/10,000 people)	$-1.9 \times 10^{-7}$	$9.3 \times 10^{-8}$	*
Disease severity score	.0054	.002	**

## Including drug resistant diseases (n=204)

<u>Variable</u>	<u><math>\beta</math></u>	<u>s.e.(<math>\beta</math>)</u>	<u>p-value</u>
Disease burden (all causes/10,000 people)	$-9.6 \times 10^{-8}$	$8.0 \times 10^{-8}$	
Disease severity score	.0018	.0019	

Healthcare (% GDP) also significant

# Conclusions

- Spatial pattern to the lag in disease reporting
- Use the lag to understand which diseases are reported in a more timely fashion.
- Lag is associated with disease types, severity of symptoms, and disease burden.
- Overlapping symptoms make novel disease detection more difficult without additional technology.



## 2 Final Thoughts:

- Knowing where diseases may emerge and where the gaps in disease reporting are suggests where surveillance efforts should be bolstered.
- Diseases may be observed (now or at any later time) or never observed at all. What is the true burden of EIDs?

# Thank you!



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LIVING CONSERVATION

Kate Jones

Sebastian Funk



PREDICT

