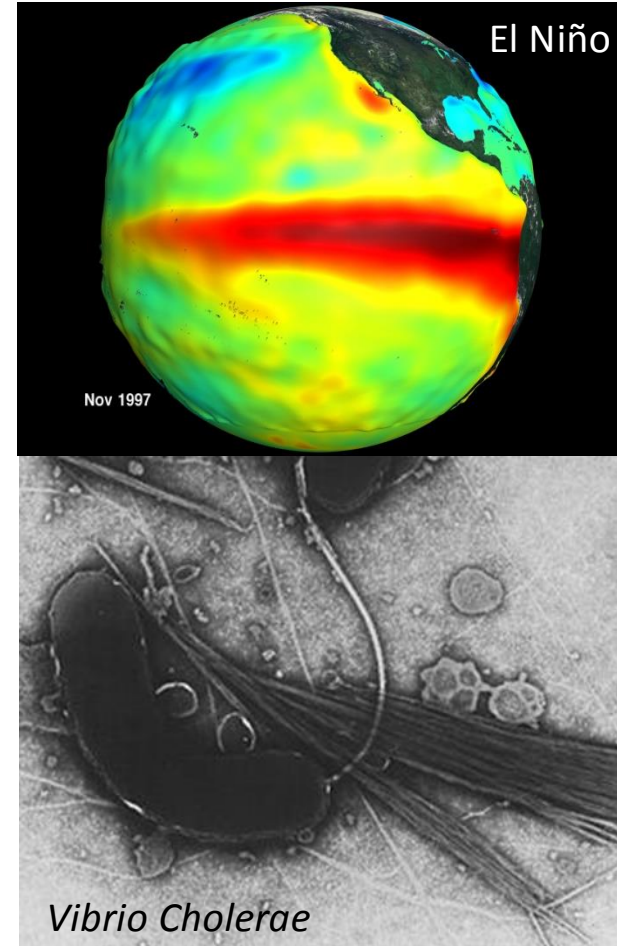


## Nonstationary and Mediated Dynamics between Climate and Cholera Incidence in Northern Peru, 1991-2001

96<sup>th</sup> American Meteorological Society Annual Meeting, Joint Session 2 *"Climate Change and Infectious Diseases,"* New Orleans, LA, 11 January, 2016

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**Sue C. Grady**, Ph.D., MPH, Department of Geography, Michigan State University, East Lansing, MI, [gradys@msu.edu](mailto:gradys@msu.edu)

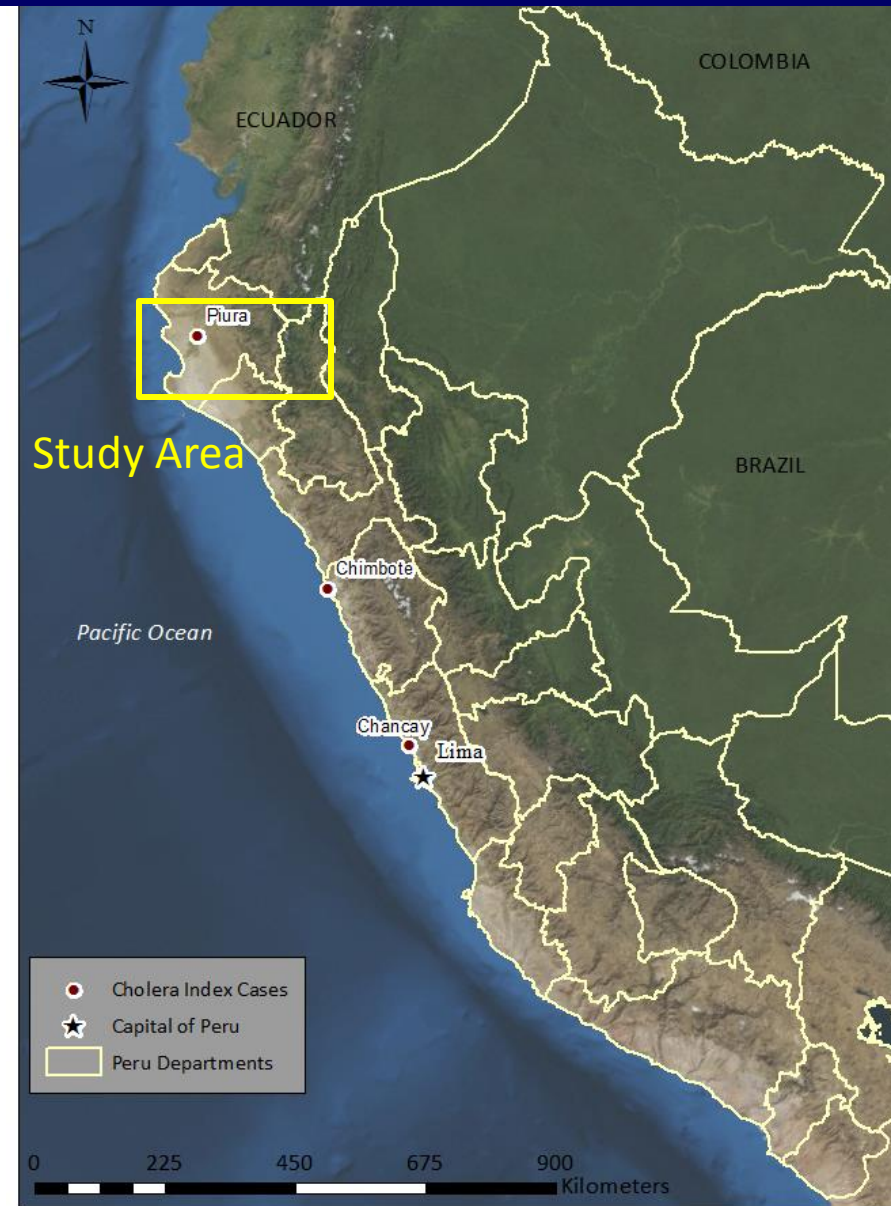


# Presentation Outline

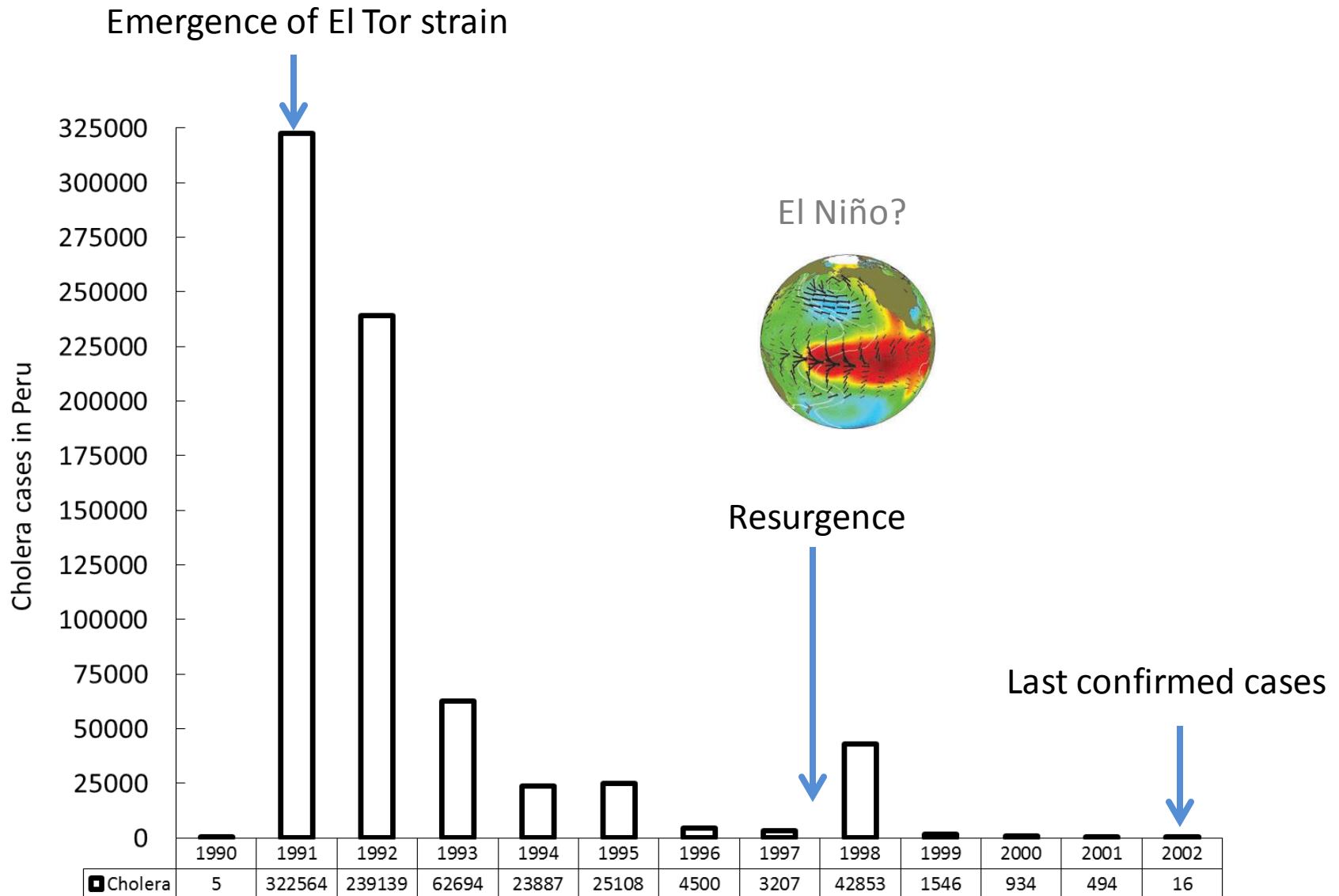
- I. Background
- II. Statement of Problem
- III. Data and Methods
- IV. Results
- V. Conclusions
- VI. Current and Future Research

# Cholera Emergence in Peru

- Cholera emerged in Peru in 1991 and the source(s) and cause(s) remain unknown;
- Spread to South and Central America, ~ 1.2 million cases by 2001
- Some evidence suggests El Niño and climate as factors. Pathways remain poorly understood.
- **This study presents results from a temporal investigation of climate and cholera patterns in northern Peru.**

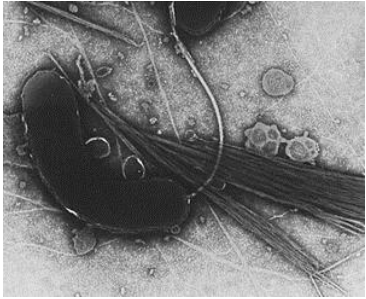


# Annual Cholera in Peru, 1990-2002



Source: Ramirez 2015 in GeoJournal

# Cholera Ecology

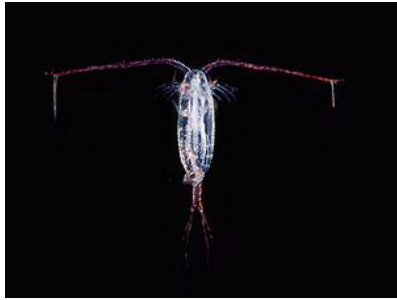


*Vibrio cholerae*, the **bacterial agent** that **causes watery diarrhea**, vomiting, and can lead to dehydration and death.

---

**Vibrios can live** in the natural environment and live symbiotically with aquatic organisms.

---



Zooplankton



Crustaceans



Algae

**Aquatic reservoirs** that harbor vibrios that cause cholera.



Cholera is transmitted when humans drink or eat contaminated water or food.

# El Niño-Southern Oscillation Hypothesis

Papua  
New  
Guinea,  
Australia

High and Dry

Low and Wet

Equator

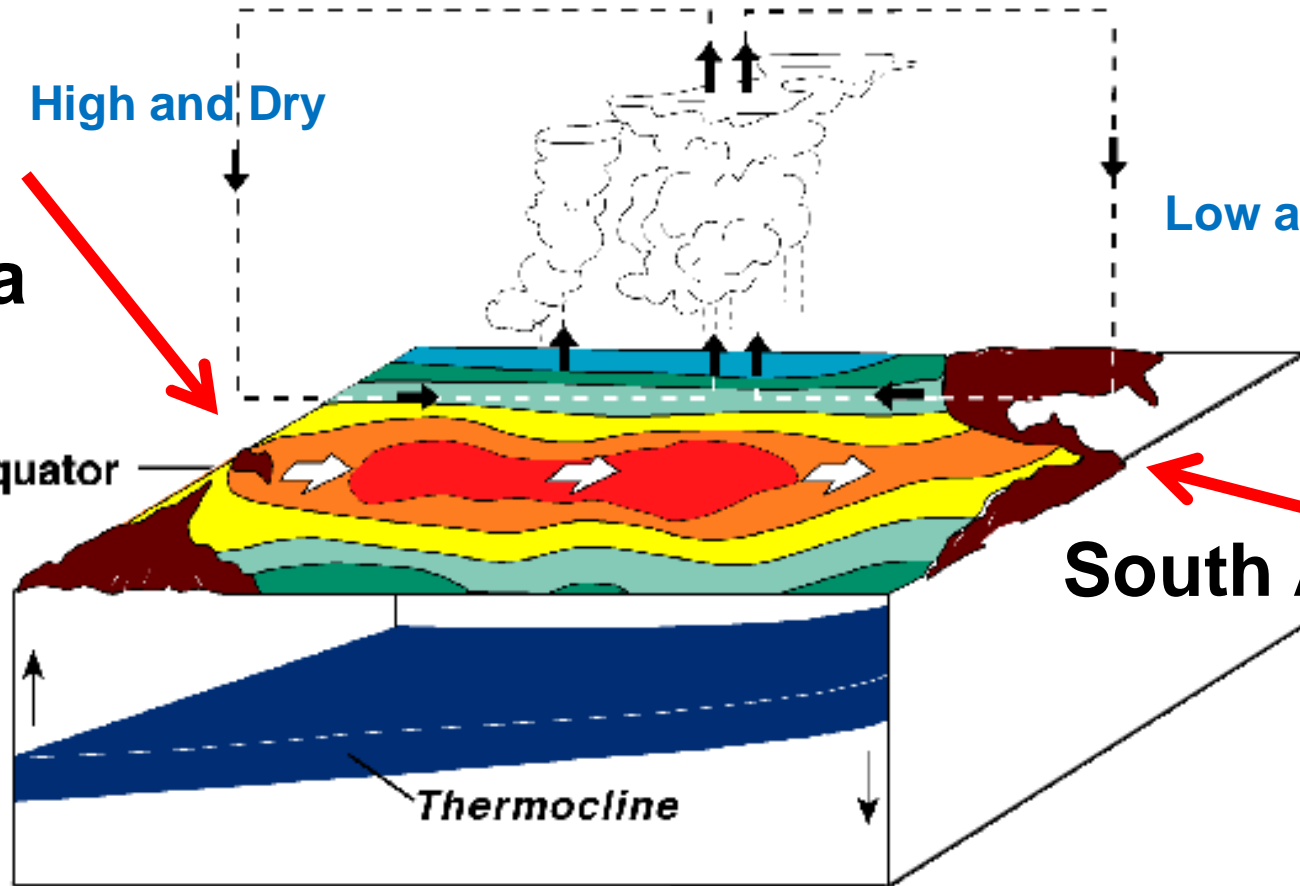
South America

Thermocline

120°E

80°W

Air-sea interactions Impact on global to local weather patterns





# Climate Evidence in Peru

## Peru

- Temporal association in **warmest months** (e.g., Jan-Mar in Lima);
- Air and seawater temperatures, rainfall, **1997-98 El Niño**;
- ***V. cholerae* in water sources**, e.g., sewage and lagoons ['amplified fecal contamination']) and coastal waters;
- Diarrheal disease and air temperature, **1997-98 El Niño**;
- Internal ocean waves modeled with proxy vibrios, **1997-98**;

## Global evidence

- Bangladesh, Brazil, Ghana, Haiti, India, Senegal, South Africa, Vietnam, Zambia, and Zanzibar.

# Statement of Problem

## **Problem:**

While Cross-sectional studies have demonstrated some evidence of a climate-cholera link in Peru, it is uncertain whether this relationship is consistent or strong across the decade. A decade-wide study has yet to be undertaken.

## **Question:**

What are the temporal associations between El Niño and climate and cholera incidence from 1991-2001?

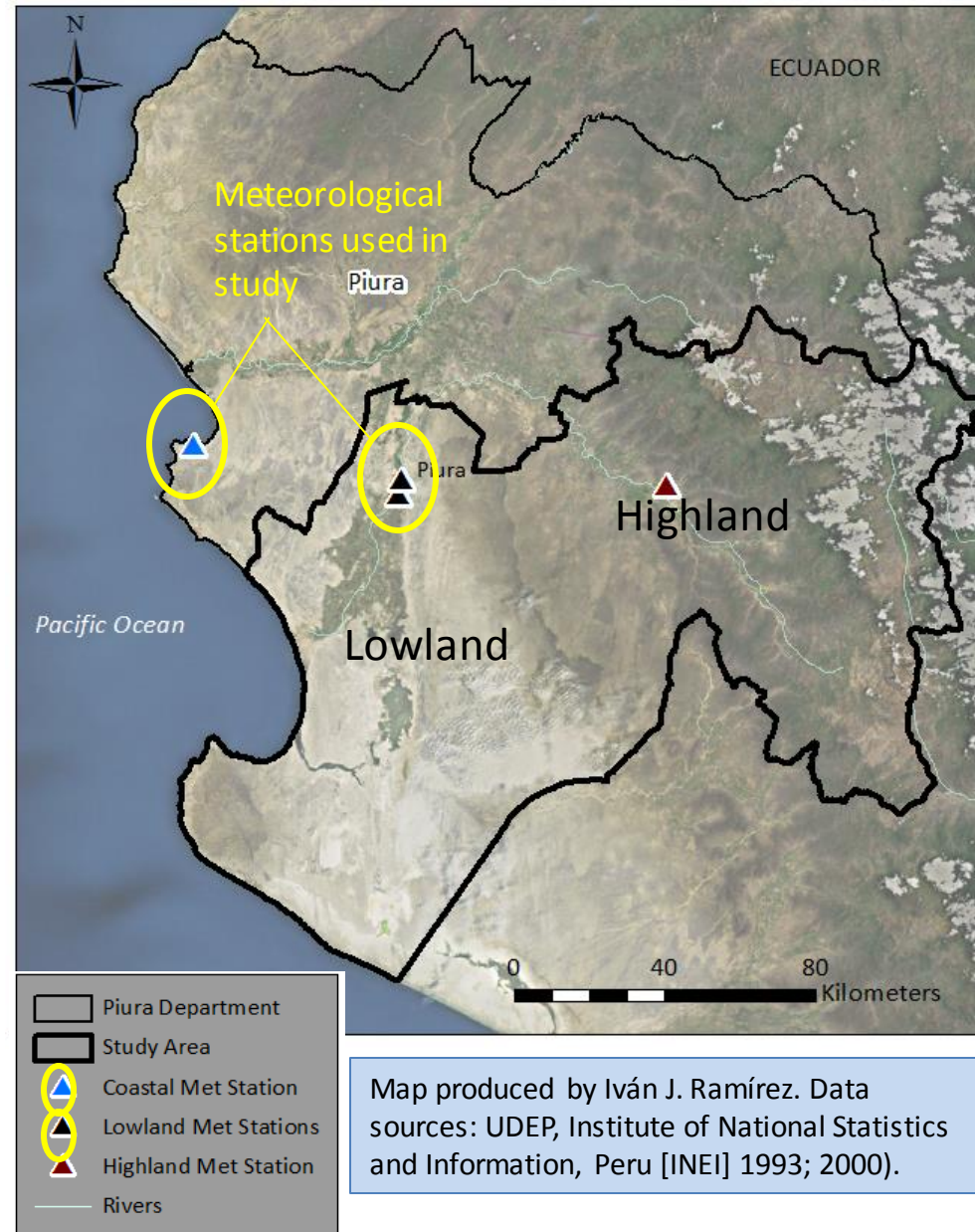
## **Hypothesis:**

El Niño-cholera associations were discontinuous and mediated by local climate teleconnections.



# Study Area

- Population –
  - 1993: 780,266
  - 1998: 847,257
- Density –
  - 42 habitants per km<sup>2</sup>
- Urban –
  - 51.0%
- Potable Water –
  - 44.0%

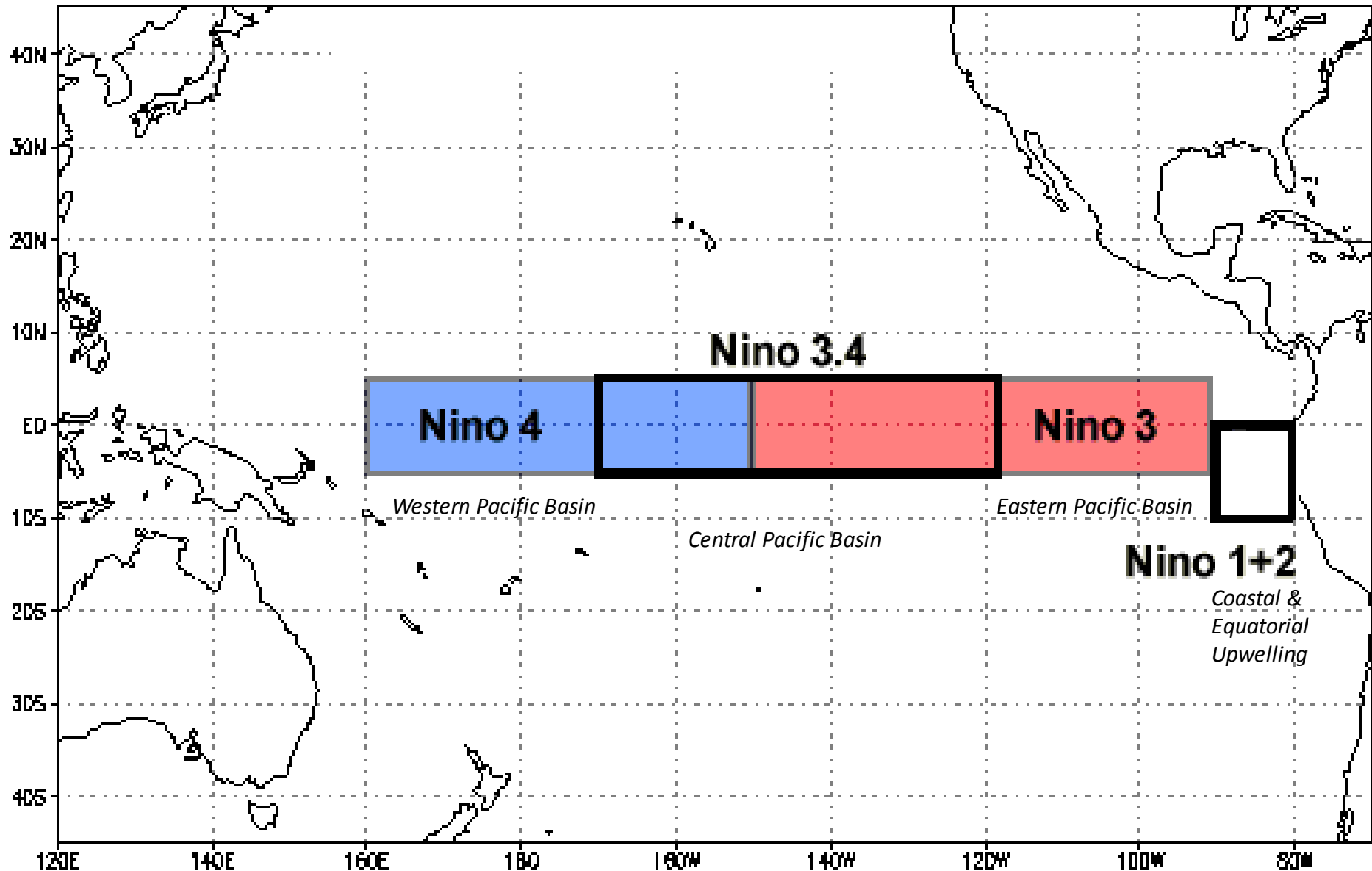


# Data

Fieldwork in Peru was conducted in 2008 and 2009. I collected secondary data, documents, reports, powerpoints, and interviewed personnel at Census and Health institutions in Lima and Piura, Peru. I also collected documents at NCAR from 2006-2008.

Data Variable	Spatial Scale	Temporal Scale	Time	Source
<i>Cholera cases</i> - suspected and confirmed (square-root transformed)	Subregion	Monthly	1991-2001	Epidemiology Department, MINSA, Lima and Piura
<i>Nino 3.4 SST</i> (°C, anomalies)	Central and Eastern Pacific	Monthly	1971-2001	<a href="http://www.cpc.ncep.noaa.gov/products/analysis_monitoring/ensostuff/ensoyears.shtml">http://www.cpc.ncep.noaa.gov/products/analysis_monitoring/ensostuff/ensoyears.shtml</a> - NOAA
<i>Nino 1+2 SST</i> (°C, anomalies)	Upwelling and Coastal	Monthly	1971-2001	NOAA
<i>Paita SST</i> (°C, anomalies)	Coastal Piura	Monthly	1971-2001	University of Piura
<i>Air Temperature</i> (°C, anomalies)	Piura City (coastal)	Monthly	1971-2001	University of Piura
<i>Rainfall</i> (mm, square-root transformed)	Piura City (coastal)	Monthly	1971-2001	University of Piura
<i>River Discharge</i> (square-root transformed)	Piura River	Monthly	1971-2001	University of Piura

# El Niño SST Regions Map

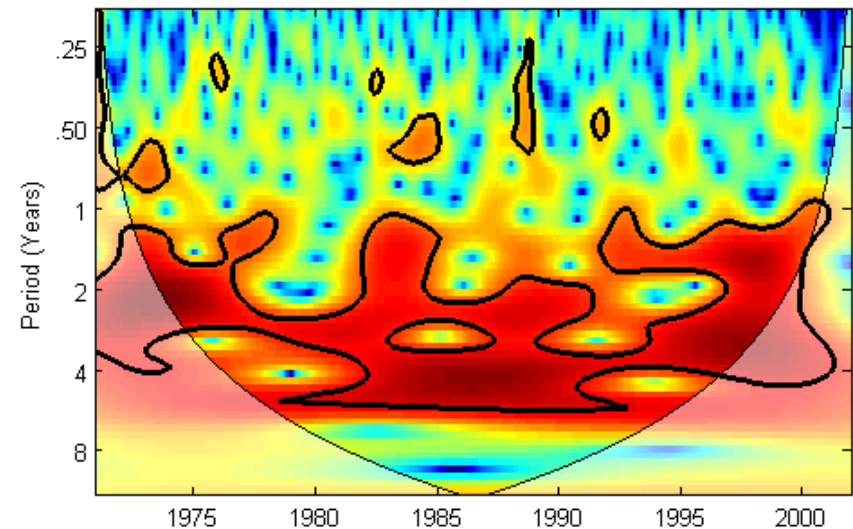
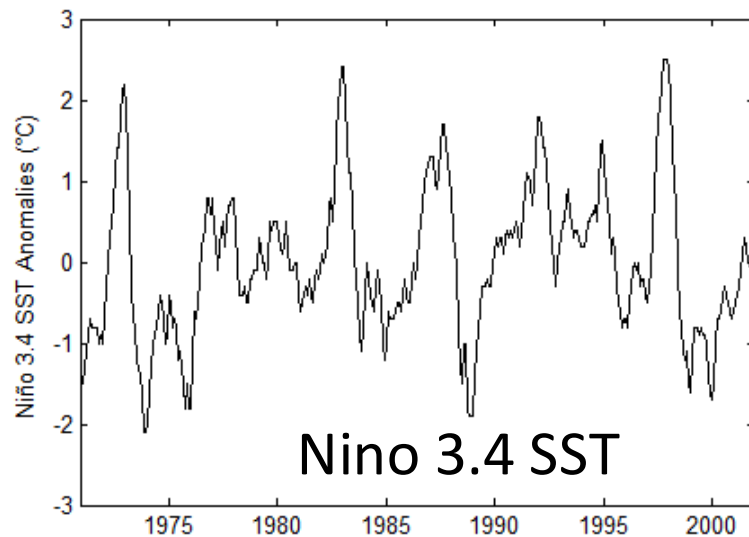
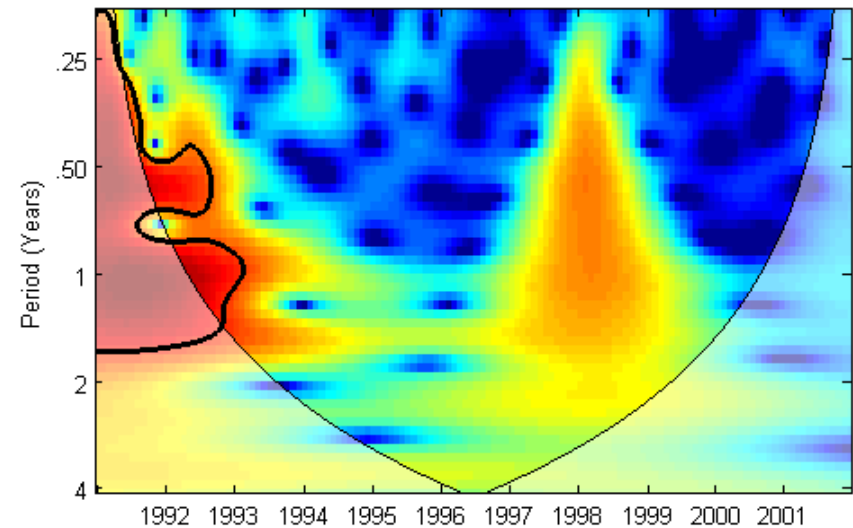
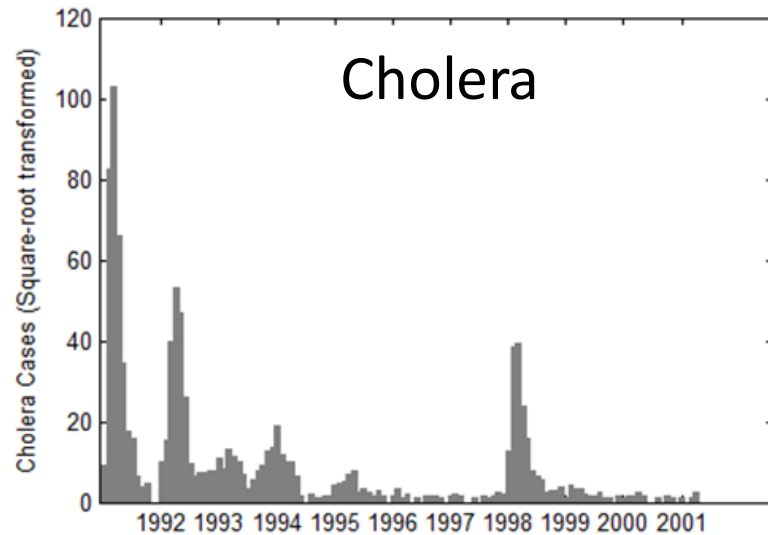


# Methods

## 1) Wavelet Analysis - Univariate and Bivariate

- **Continuous Wavelet Transform (CWT)** - Decompose one data series into *frequency* scales (periods) and *time* intervals
- **Wavelet Coherence (WTC)** - Identify *common areas* in time-frequency space where two data series are *linearly correlated*
- Identify *direction* of relationships (in or out of phase) and *temporal lags* (indicated by arrows in figures)
- Autoregressions were controlled for using a first-order autoregressive term.

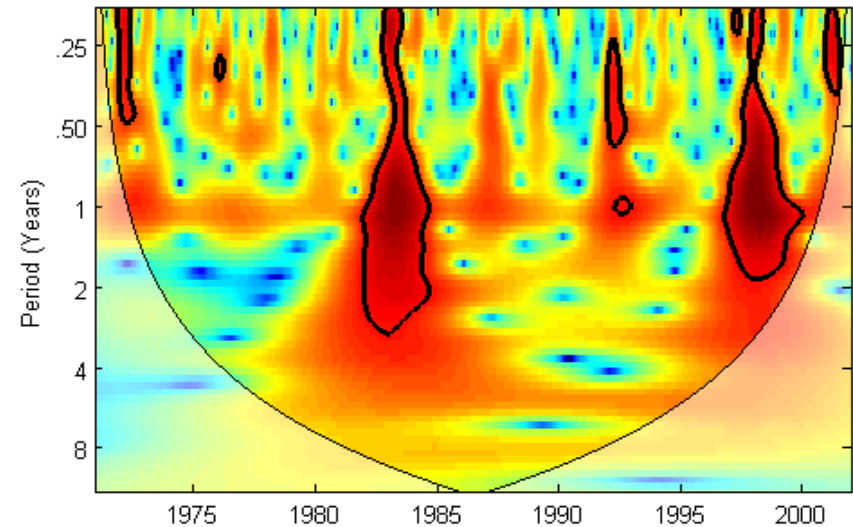
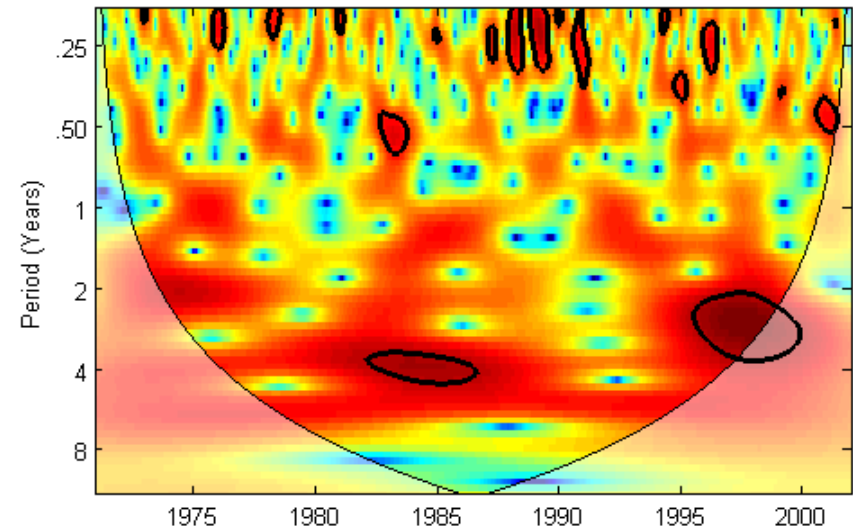
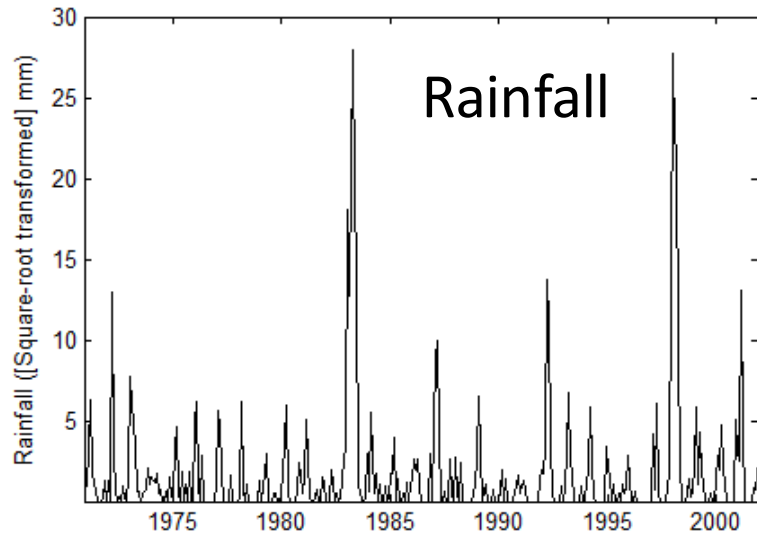
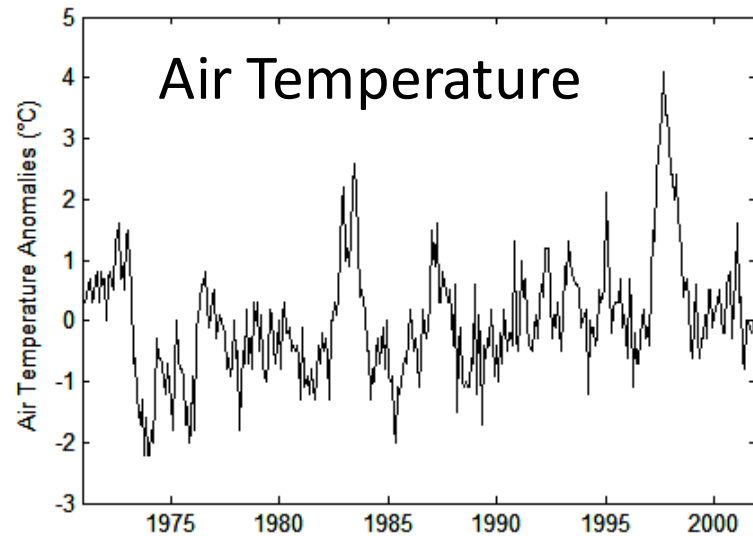
# Results: CWT (Univariate)



Source: Ramirez and Grady 2016, *EcoHealth*  
<http://link.springer.com/article/10.1007%2Fs10393-015-1095-3>

The color code for power values increases from *low* (dark blue) to *high* (dark red), and statistical significance (95.0% confidence level) is indicated by areas within thick black outlines.

# Results: CWT (Univariate)

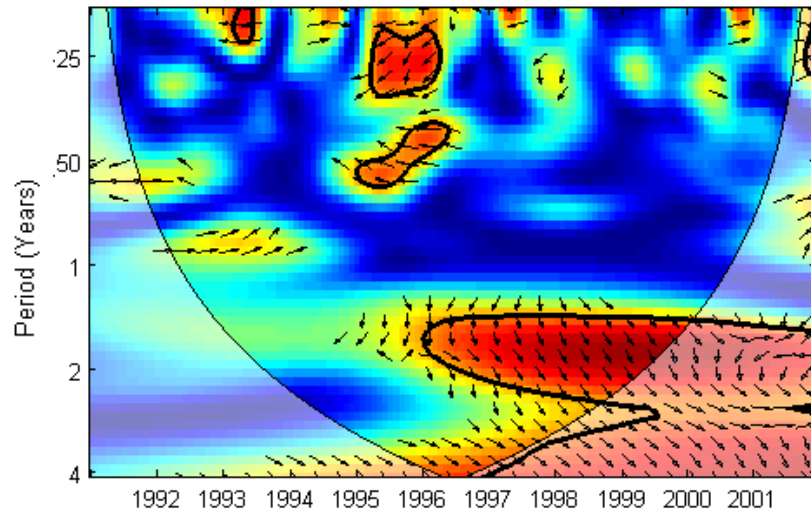


Source: Ramirez and Grady 2016, *EcoHealth*,  
<http://link.springer.com/article/10.1007%2Fs10393-015-1095-3>

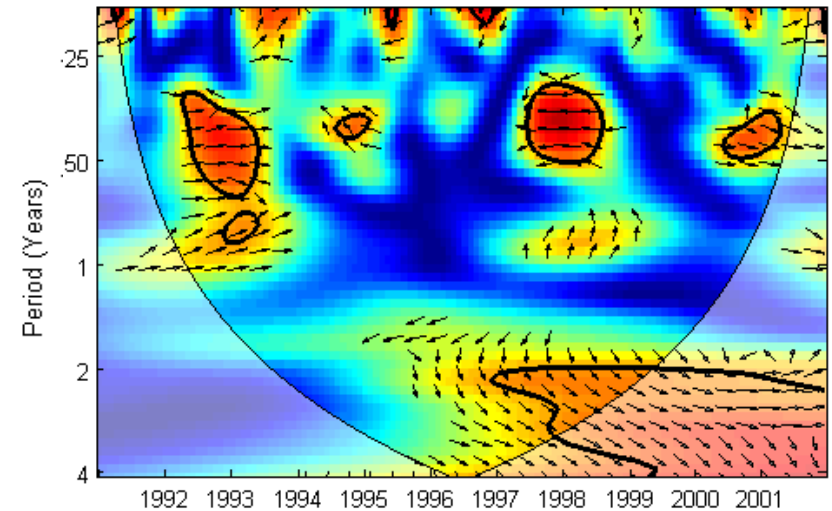
The color code for power values increases from dark blue (low) to dark red (high), and statistical significance (95.0% confidence level) is indicated by areas within thick black outlines.



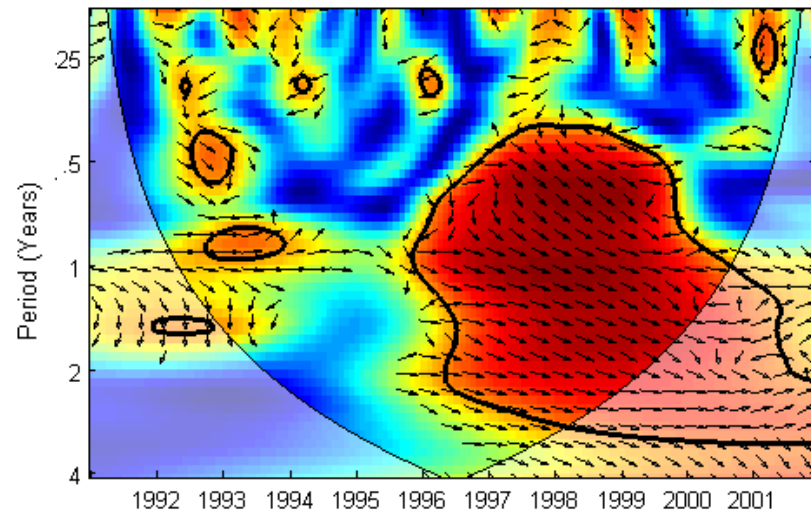
# Results – WTC (Bivariate)



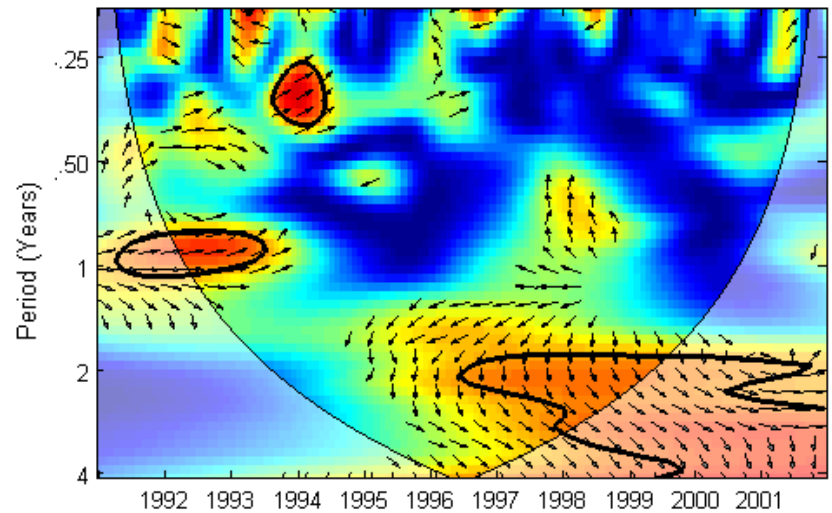
Nino 3.4 SST - Cholera



Nino 1+2 SST - Cholera

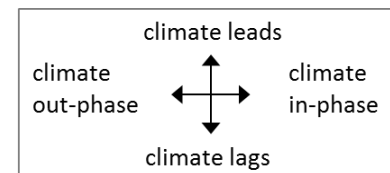


Rainfall - Cholera



Air Temperature - Cholera

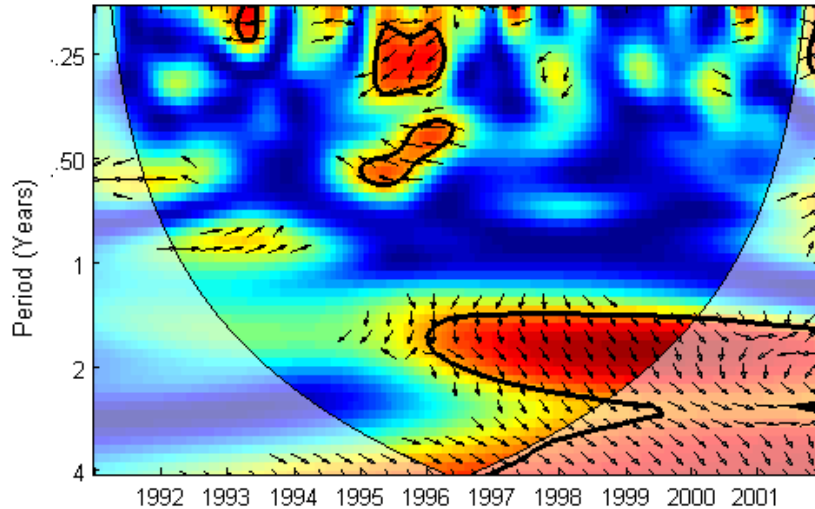
Coherence was estimated from *low* (dark blue) to *high* (dark red) correlations. Statistical significance (95.0% confidence level) is indicated by areas with black outlines.



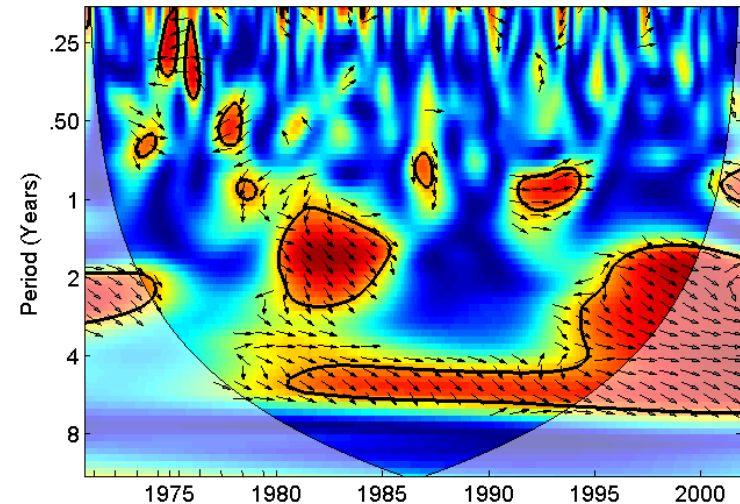


# Mediating Mechanisms

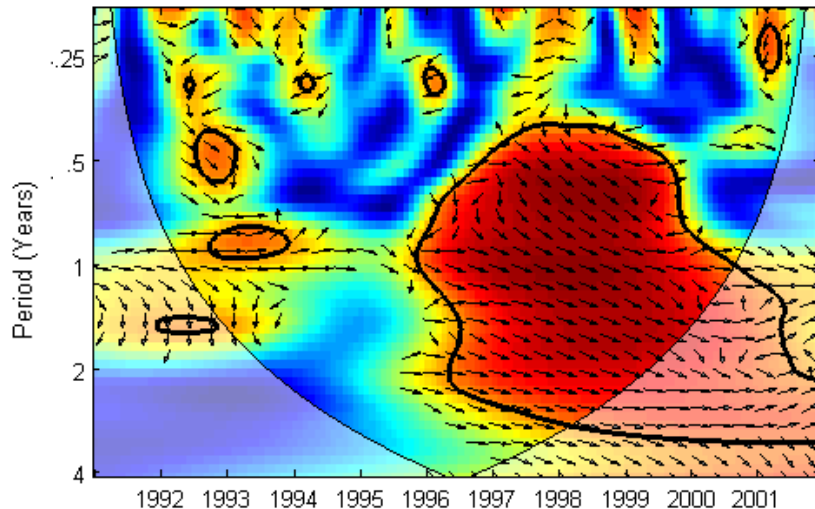
Global Climate  
Nino 3.4 SST & Cholera



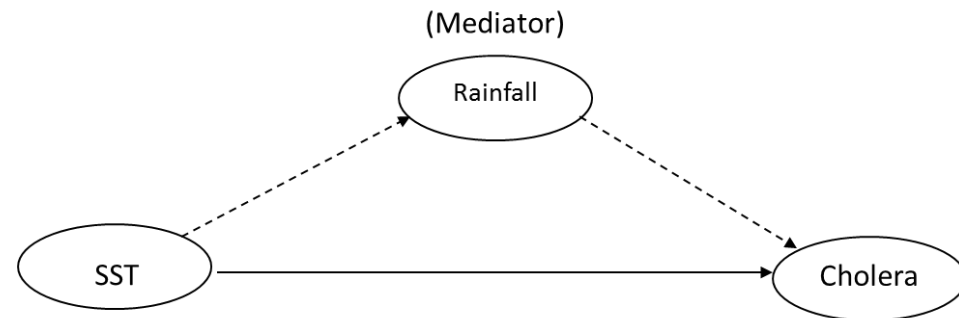
Global & Local Climate  
Nino 3.4 SST & Rainfall



Local Climate  
Rainfall & Cholera



Proposed model for mediation  
One example associated with hydrology



Source: Ramirez and Grady 2016, *EcoHealth*,  
<http://link.springer.com/article/10.1007%2Fs10393-015-1095-3>

# Conclusions

- Strong and Discontinuous El Nino-cholera link in the latter 1990s (resurgence), mediated by hydrometeorology;
- No evidence of El Nino link in early 1990s (emergence);
- Strongest links: Rainfall and River Discharge (flooding);
- Plausible explanations for discontinuity: El Niño variability, immunity, and social dynamics;
- Lessons for public health: climate variability influenced impacts on cholera; El Nino information is useful but may not always be reliable; other information must be integrated into models (climatic and nonclimatic influences).

# Current and Future Research

- Exploring SST, hydrology and upwelling – role of SST mechanisms (multiple pathways) (*manuscript in preparation*);
- Examine mediating effects of social vulnerability, spatial analysis;
- Exploring community resilience to public health threats from climate change (El Nino 2015-16); and
- Exploring Nino variability and definition effects on relationships – (Taking Global South scientific perspectives into account).

# Acknowledgements

- Funding by Michigan State University, The New School, Provost Office and Tishman Environment and Design Center.
- University of Piura and University of the Pacific in Lima, Peru

## Collaborators in Piura, Peru

UDEP: Monitoring El Niño



Census:  
Monitoring  
social and  
demographic



UDEP: El Niño in the classroom



Ministry of Health: Monitoring public health



# Publications related to this work

Ramírez, I.J. and S. Grady, 2016: El Niño, Climate and Cholera Associations in Piura, Peru, 1991-2001: A Wavelet Analysis. *EcoHealth*, first online, 29, January 2016. DOI: 10.1007/s10393-015-1095-3.  
<http://link.springer.com/article/10.1007%2Fs10393-015-1095-3>.

Ramírez, I.J., 2015: Cholera resurgence in Piura, Peru: examining climate associations during the 1997-98 El Niño. *GeoJournal*, 80, 129-143. DOI: 10.1007/s10708-014-9541-2.  
<http://link.springer.com/article/10.1007%2Fs10708-014-9541-2>.

Ramírez, I.J., S.C. Grady, and M.H. Glantz, 2013: Reexamining El Niño and cholera in Peru: a climate affairs approach. *Weather, Climate and Society*, 5, 148–161. DOI: <http://dx.doi.org/10.1175/WCAS-D-12-00032.1>.

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Thank you.  
Questions?