

# What Question, Which Data and Why it Matters to Ask

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**Columbia University**



# What Question?

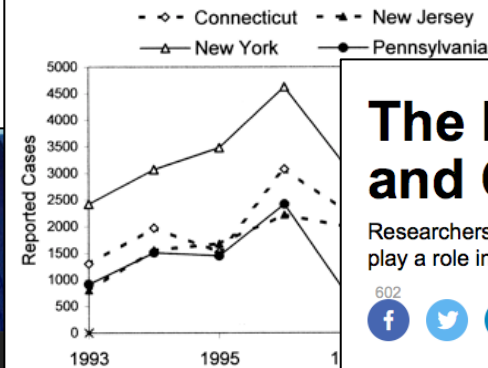
## The Telegraph India Heat Wave May 2016



American Journal of Epidemiology  
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### Effects of Climate on Variability in Lyme Disease Incidence in the Northeastern United States

Subak, 2003



## The Link Between Zika and Climate Change

Researchers are beginning to tease out the environmental factors that play a role in helping the virus to spread.

602



TEXT SIZE

GREG MERCER | FEB 24, 2016 |

HEALTH

The Atlantic

**“Changes in temperature, precipitation, and humidity can alter how long the mosquitoes live, how often they bite, how many offspring they have.”**

An Indian commuter uses the train water pipes to bath at railway station in Allahabad

Picture: Corbis <http://www.telegraph.co.uk>



# Which Data? Example 1

nature

Vol 465 | 20 May 2010 | doi:10.1038/nature09098

## LETTERS

### Climate change and the

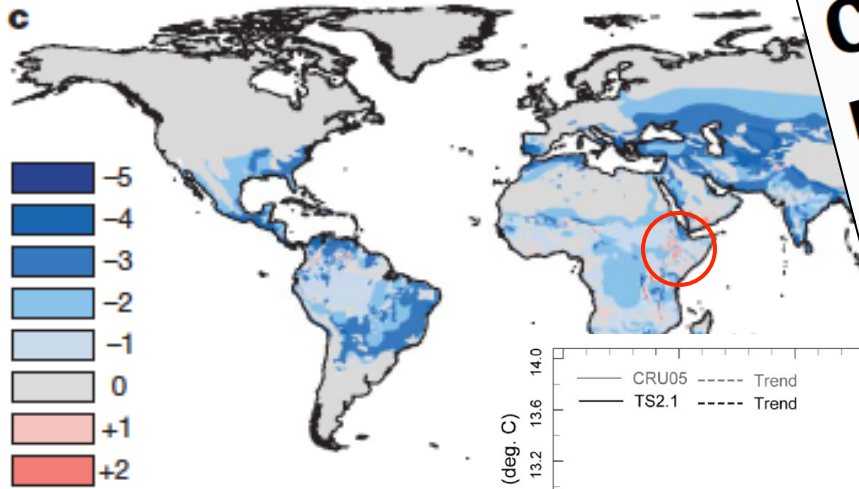


Figure 1 | Changing global malaria risk

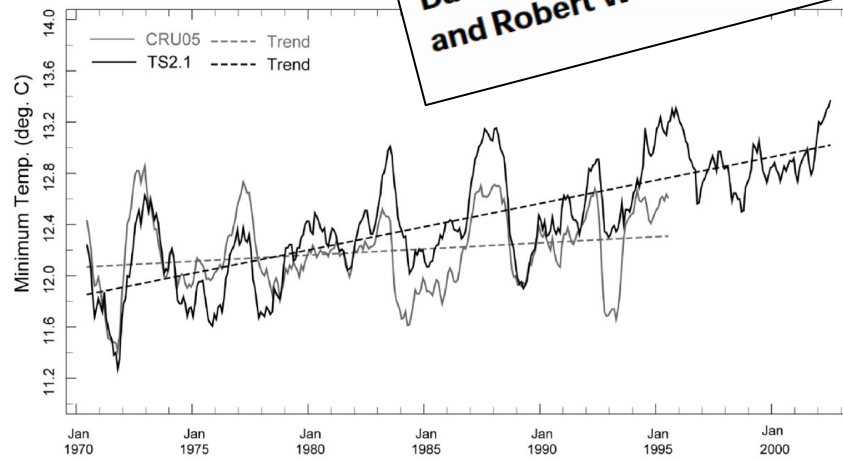
530

Opinion

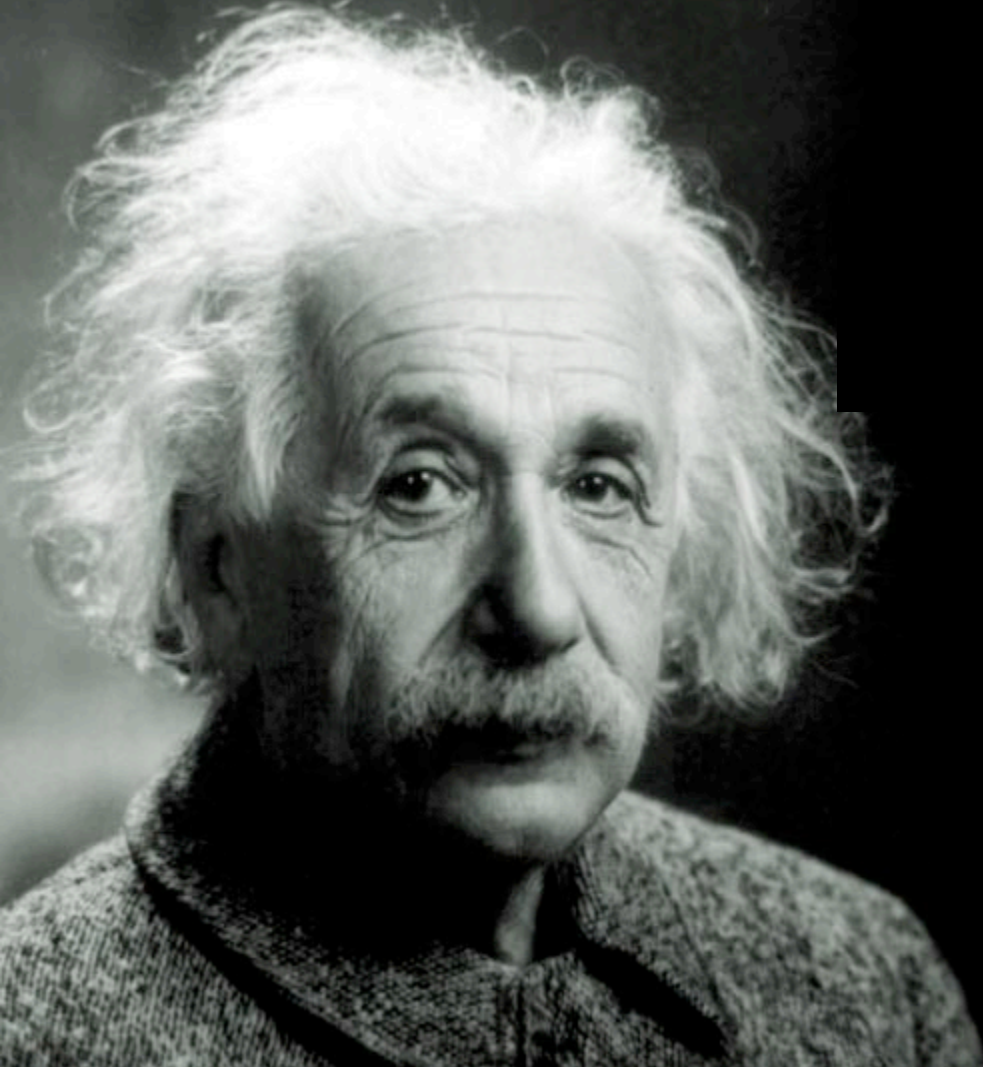
TRENDS in Parasitology Vol.18 No.12 December 2002

### Hot topic or hot air? Climate change and malaria resurgence in East African highlands

Simon I. Hay, David J. Rogers, Sarah E. Randolph,  
David I. Stern, Jonathan Cox, G. Dennis Shanks  
and Robert W. Snow



# Simple Questions with Difficult Answers



But not simpler

*Albert Einstein*

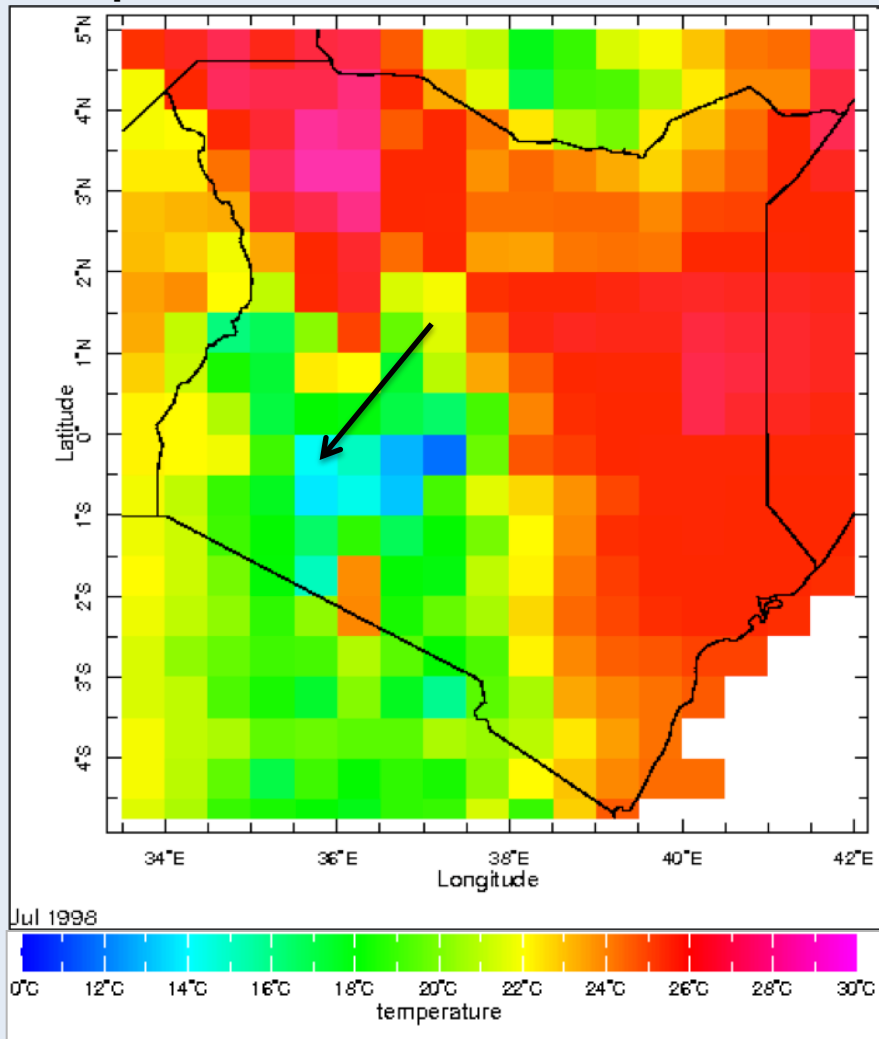
Climate Scientist

Epidemiologist

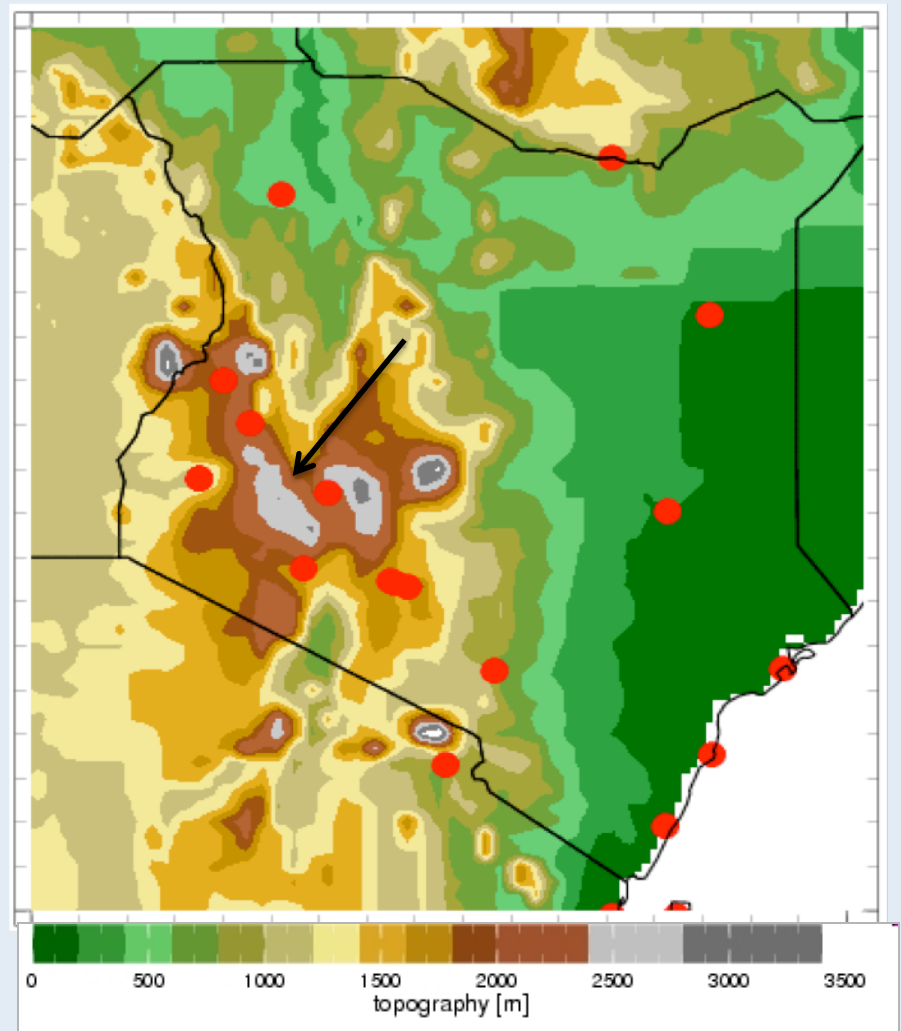
Rap Artist

# Which Data?

## Temperature JULY 1998

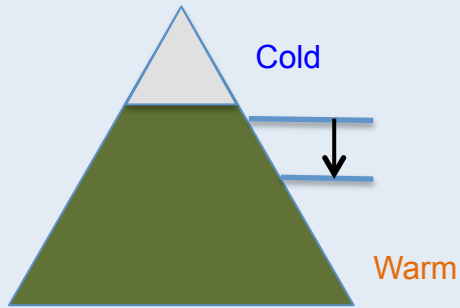


## ● Publicly Available Stations

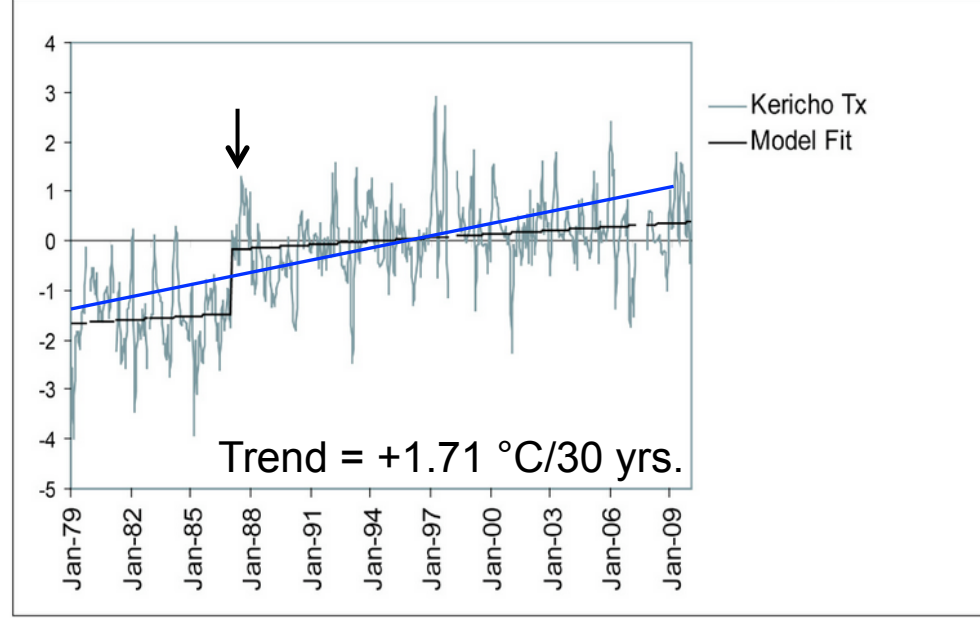


# Which Data?

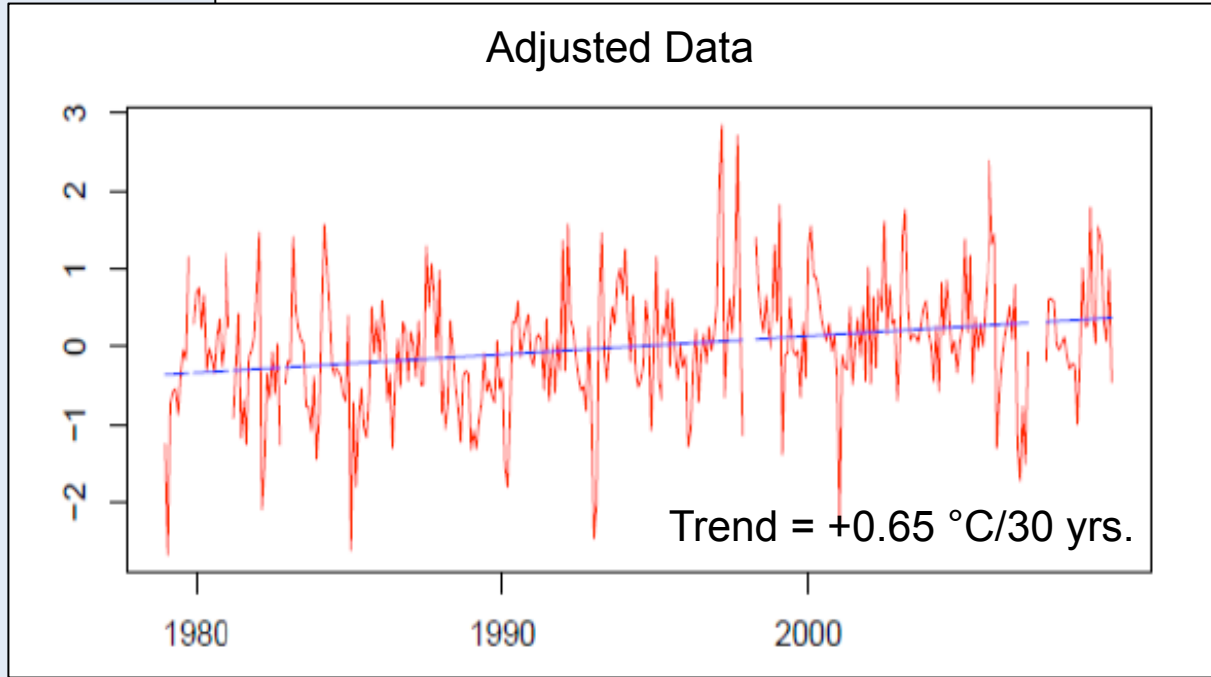
**Kericho Station  
Observations  
Maximum Temperature**



a) Original Tx time series (after removing seasonality)



Adjusted Data



Omumbo et al., 2012



# Which Data?

**“Temperature” is Not a Single Variable...**

Differing values when using mean temp., maximum temp. and minimum temperature.

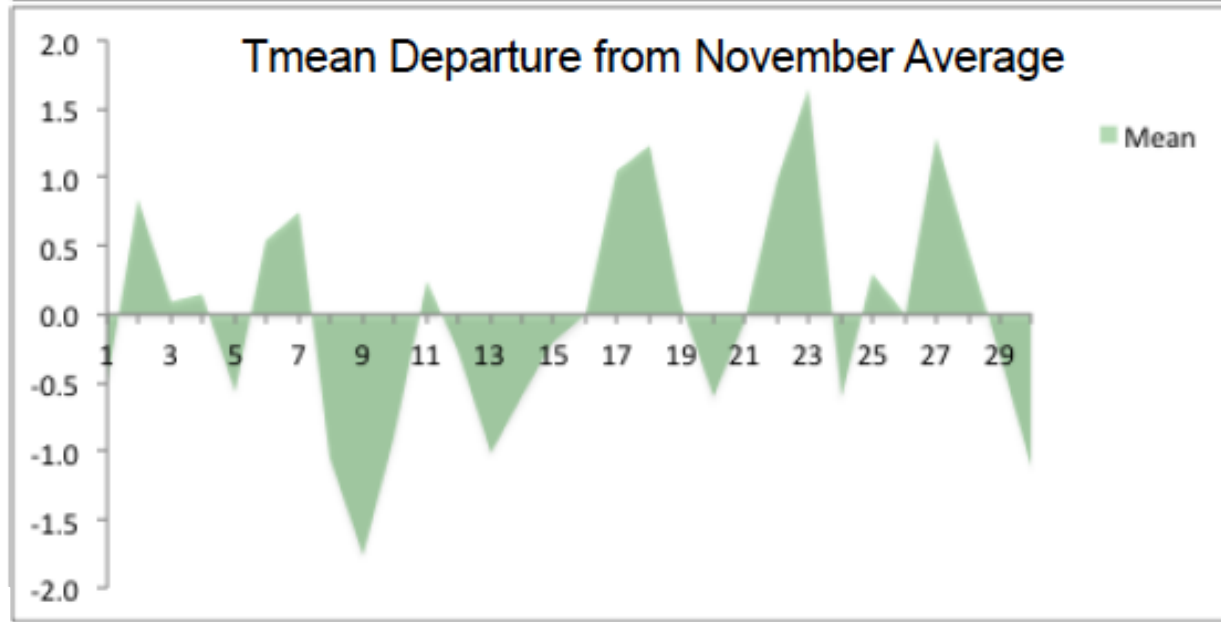
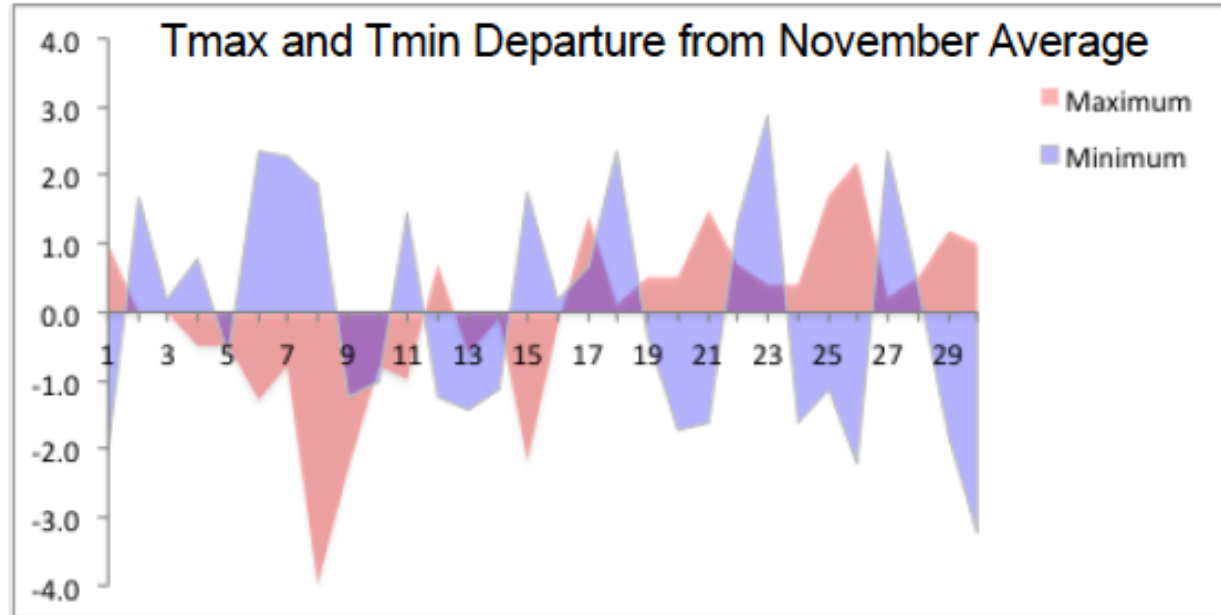
Example for Nov. 2008 at Kericho, Kenya

**Correlations:**

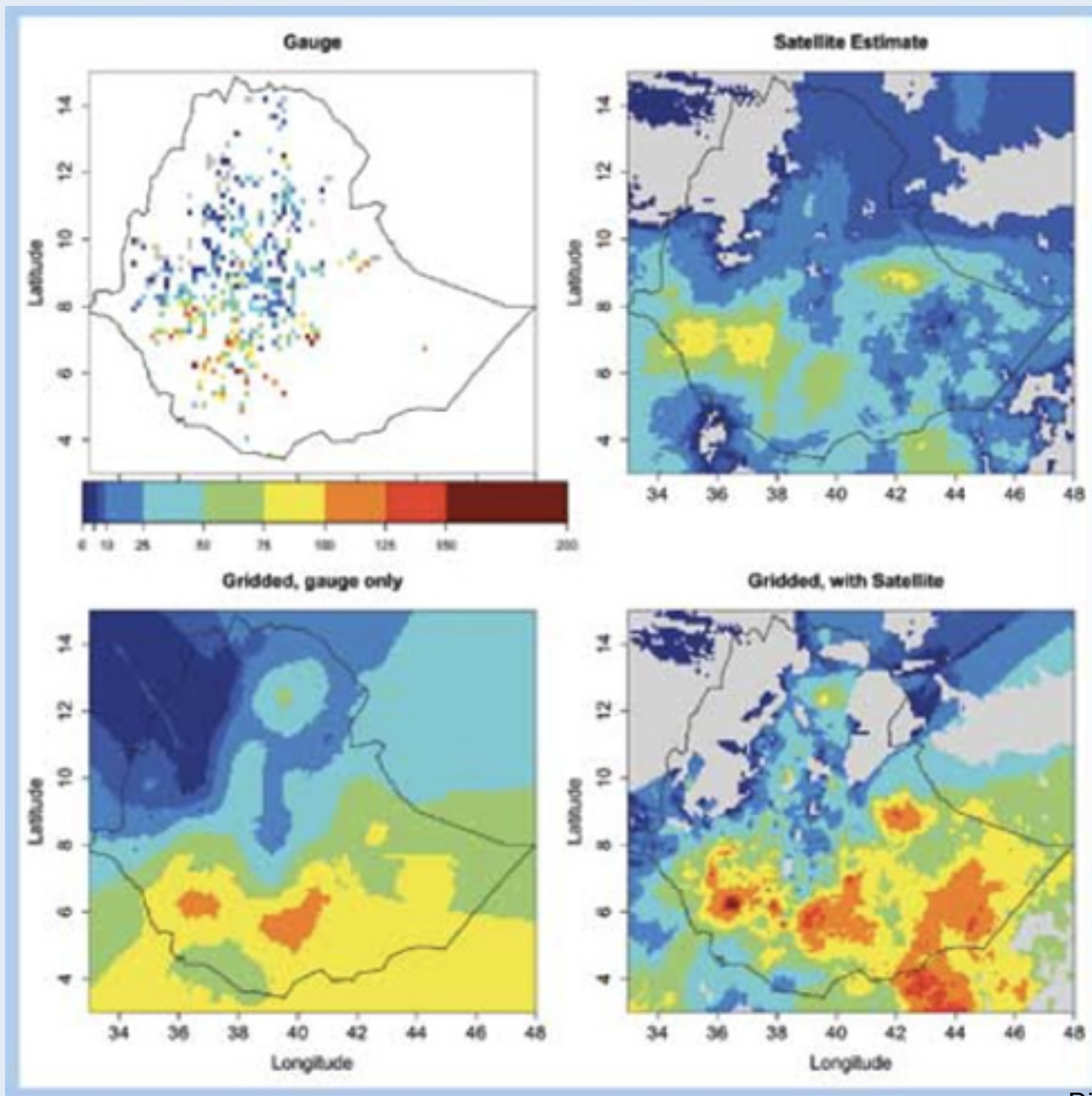
$$r(T_{\max}, T_{\min}) = -0.44$$

$$r(T_{\text{mean}}, T_{\min}) = +0.70$$

$$r(T_{\text{mean}}, T_{\max}) = +0.32$$



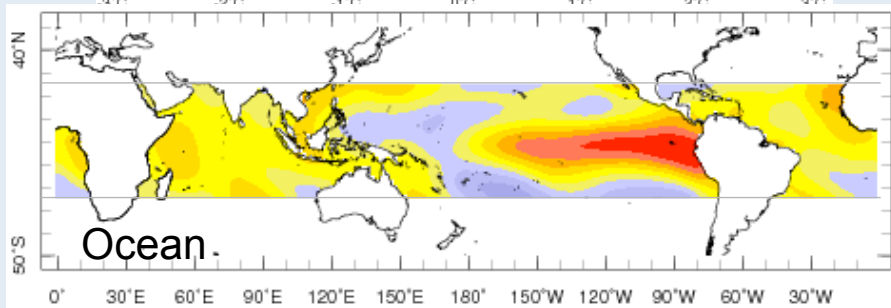
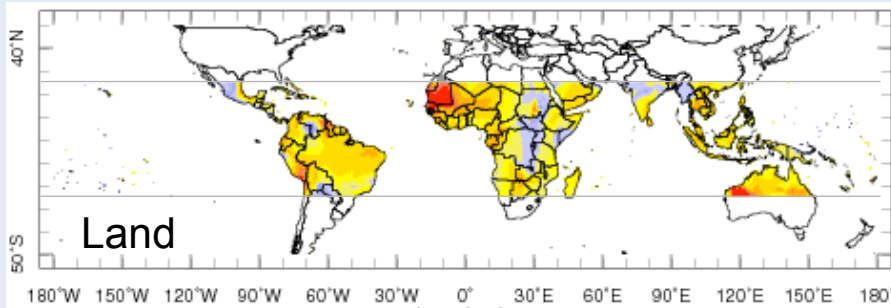
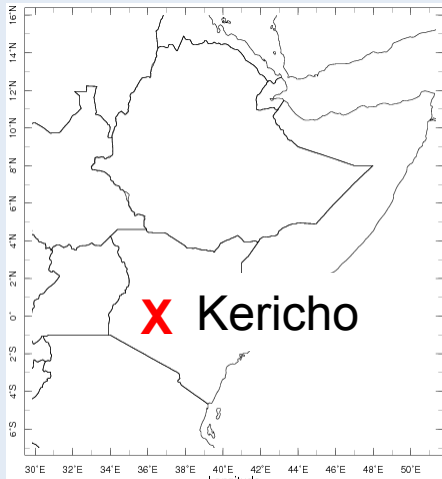
# Which Data?



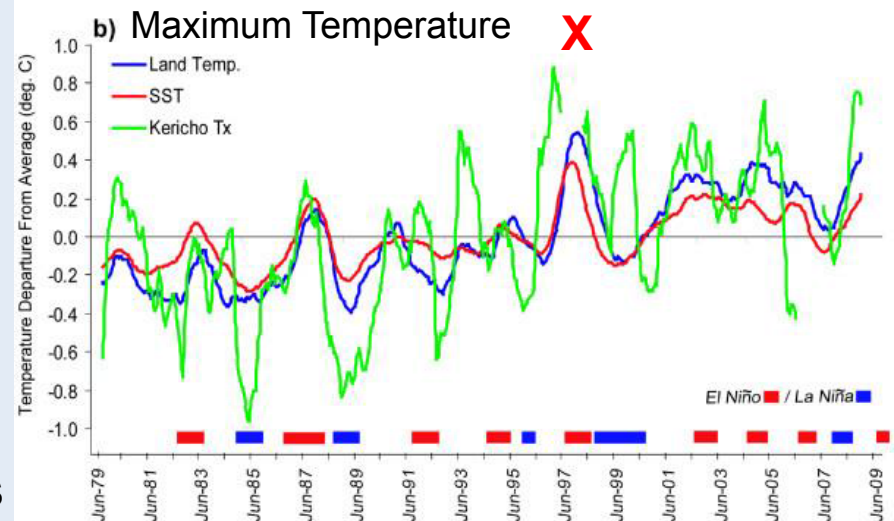
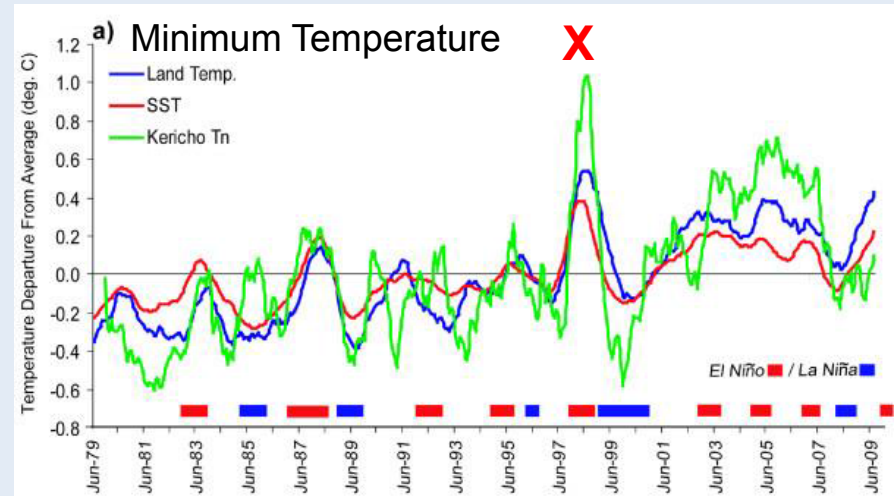


# What Scale(s)?

## Global Changes in Local Places



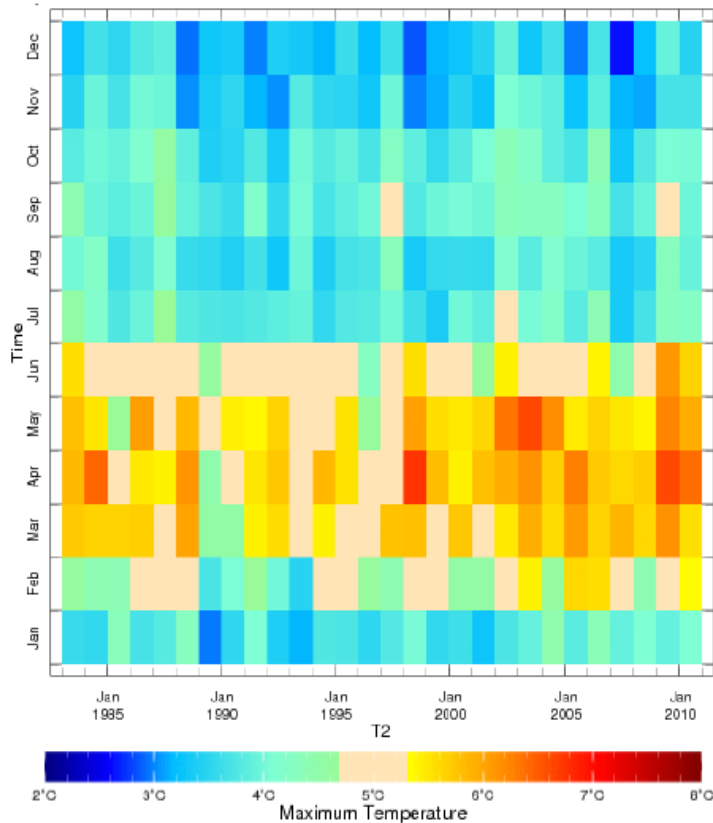
Land and ocean temperature departures from average, February 1998



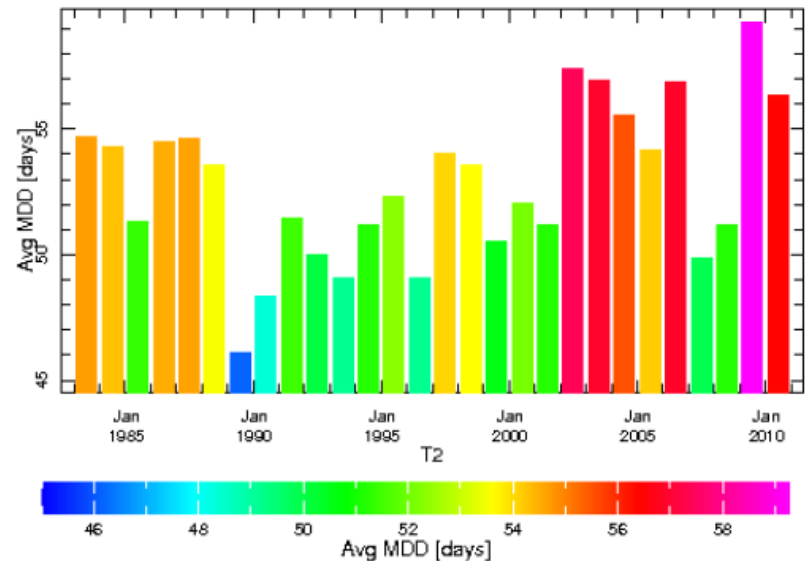
# What is Now Feasible

## Malaria Degree Days in ENACTS ( $T_{\text{mean}} - 15.4$ )

Average Monthly MDD, Elevation > 1500m



Annual MDD, Elevation > 1500m





**“Here’s a list of 100,000  
warehouses full of data. I’d like  
you to condense them down to  
one meaningful warehouse.”**

# Example 2 -- An East African “Climate Paradox”

## A Wetter East Africa Due to Climate Change?

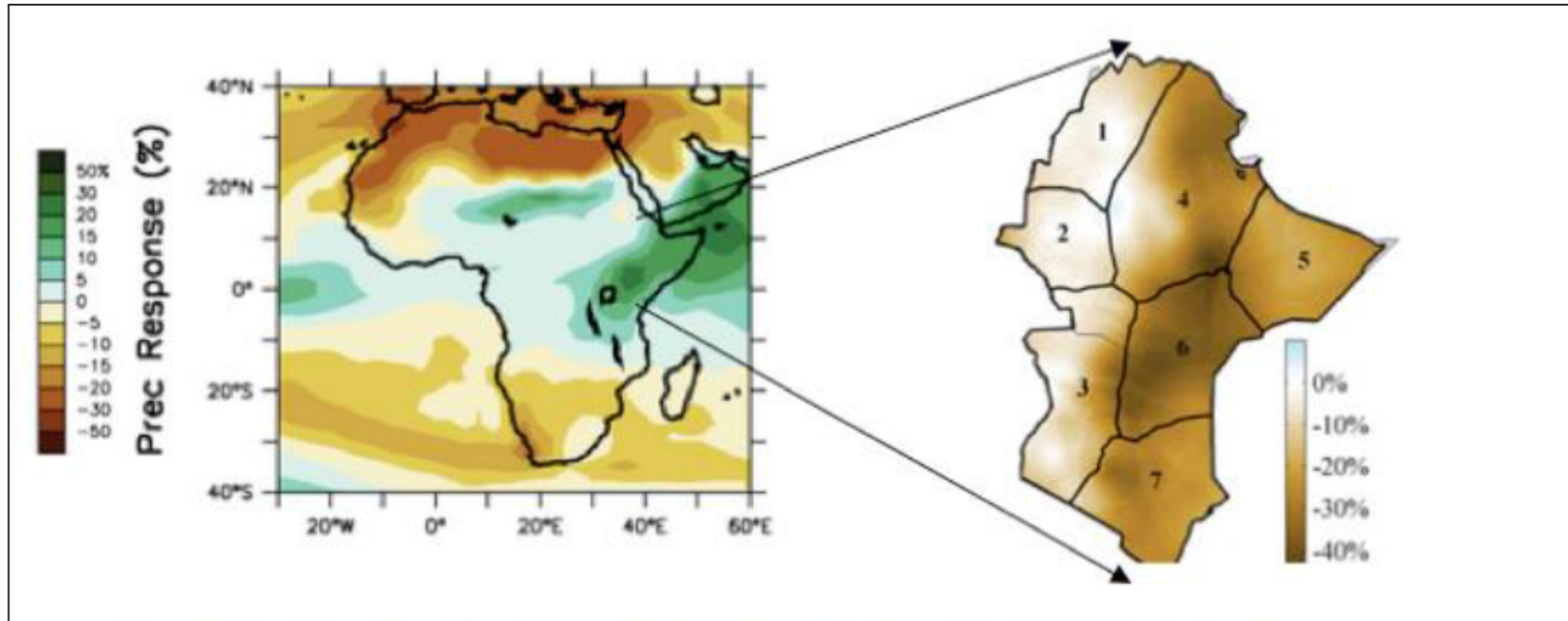
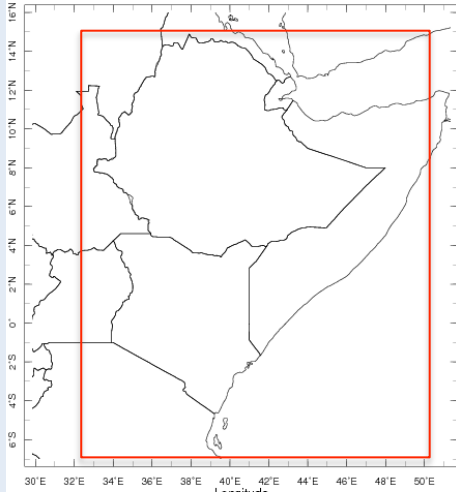
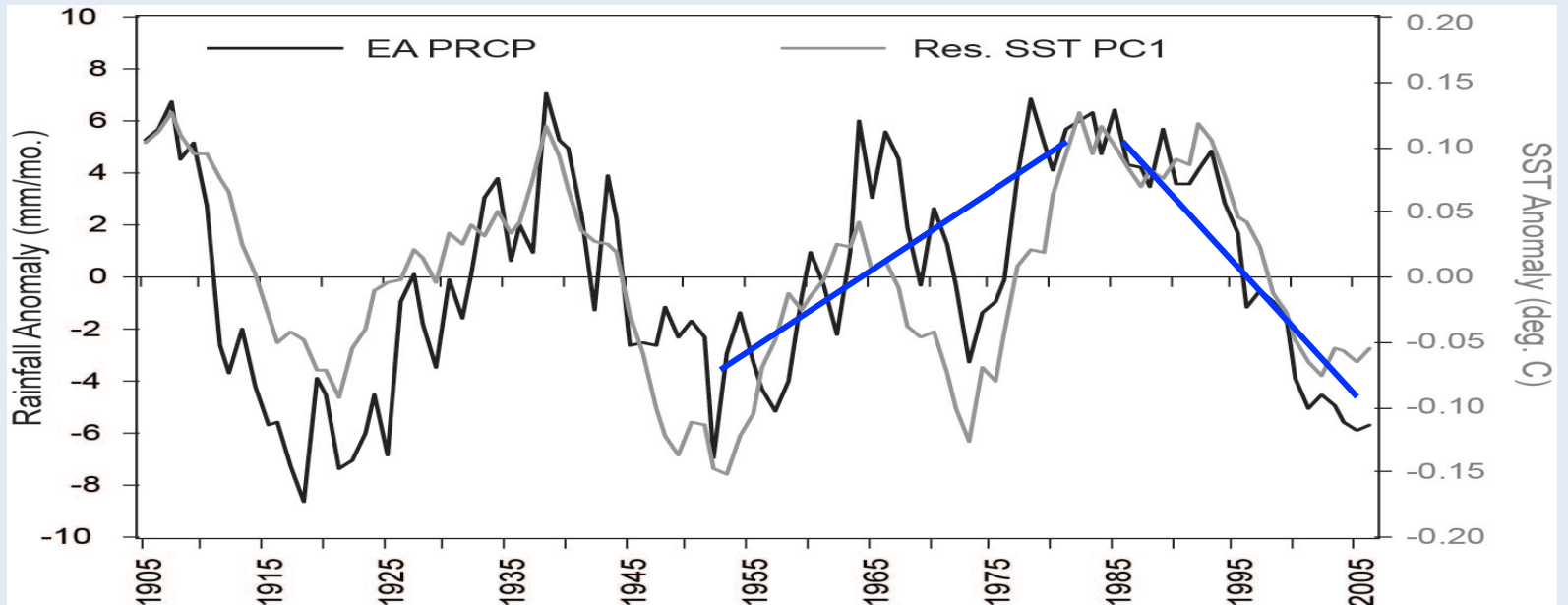
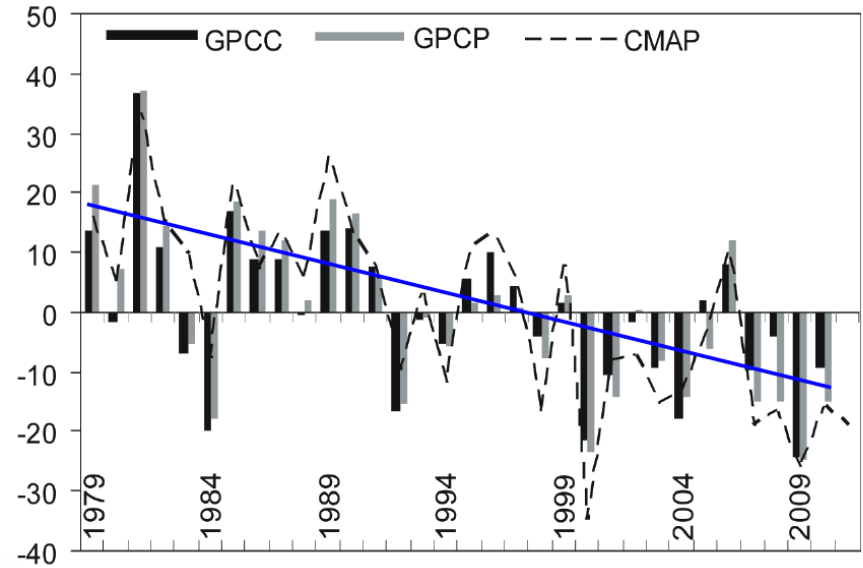


Figure 1. (Left) Projected change in annual precipitation 2080-2099 relative to the observed climate 1980-1999. From IPCC Fourth Assessment Report Working Group I Figure 11.2. (Right) Observed percent change in long rains precipitation (March to June) in the Greater Horn 1979-2009 relative to 1950-1979. From Williams and Funk (2011).

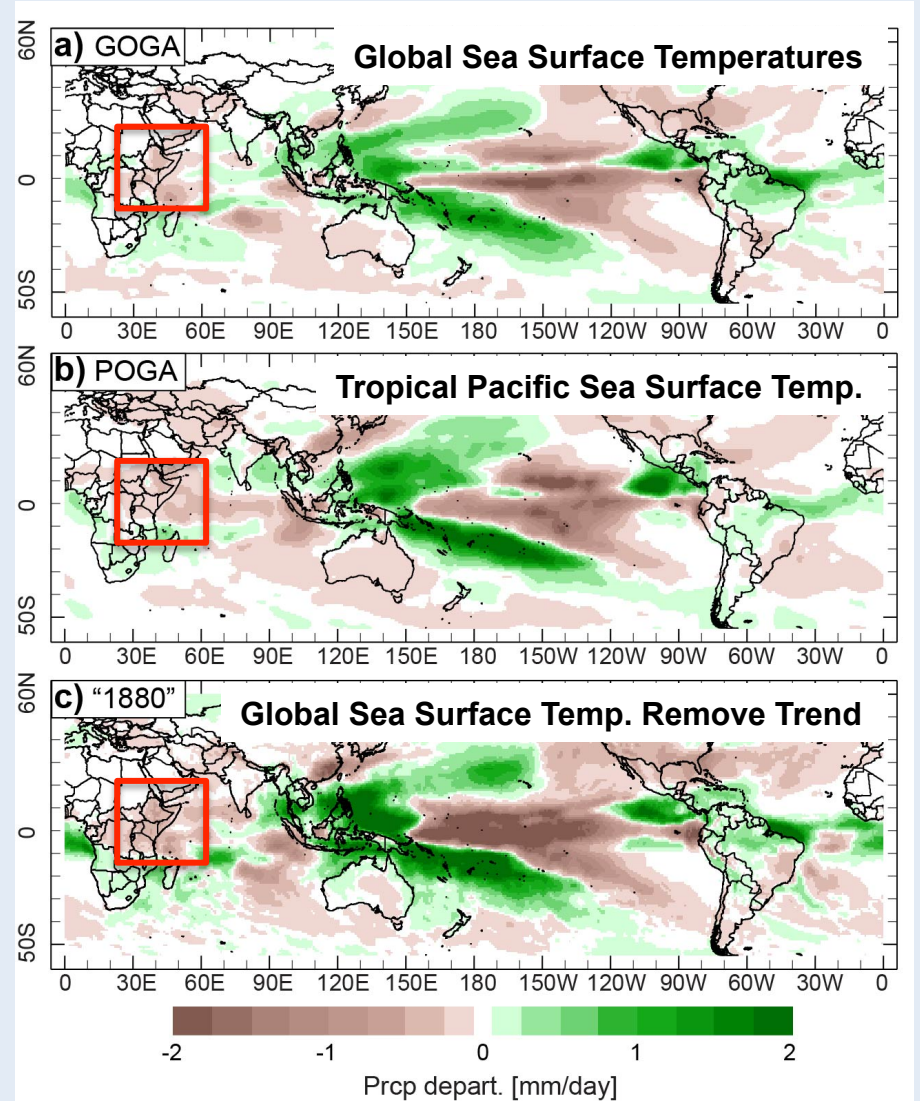
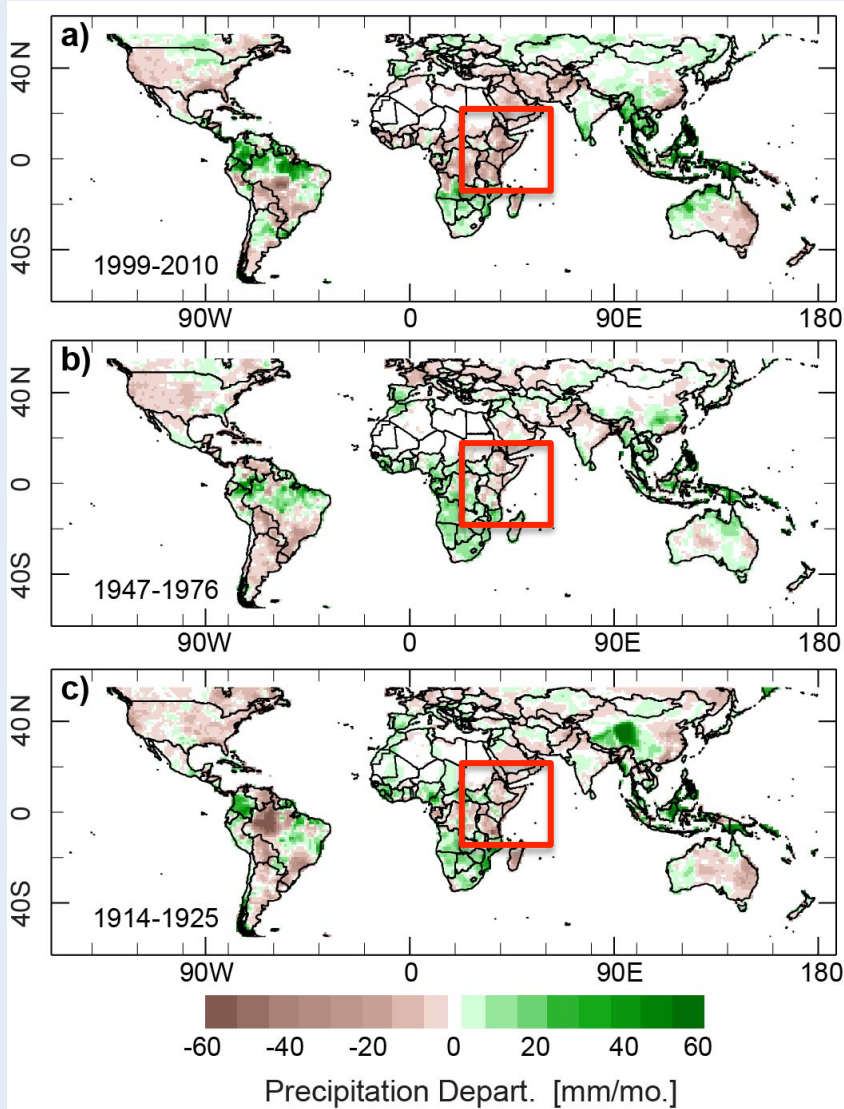
# East African “Climate Paradox”



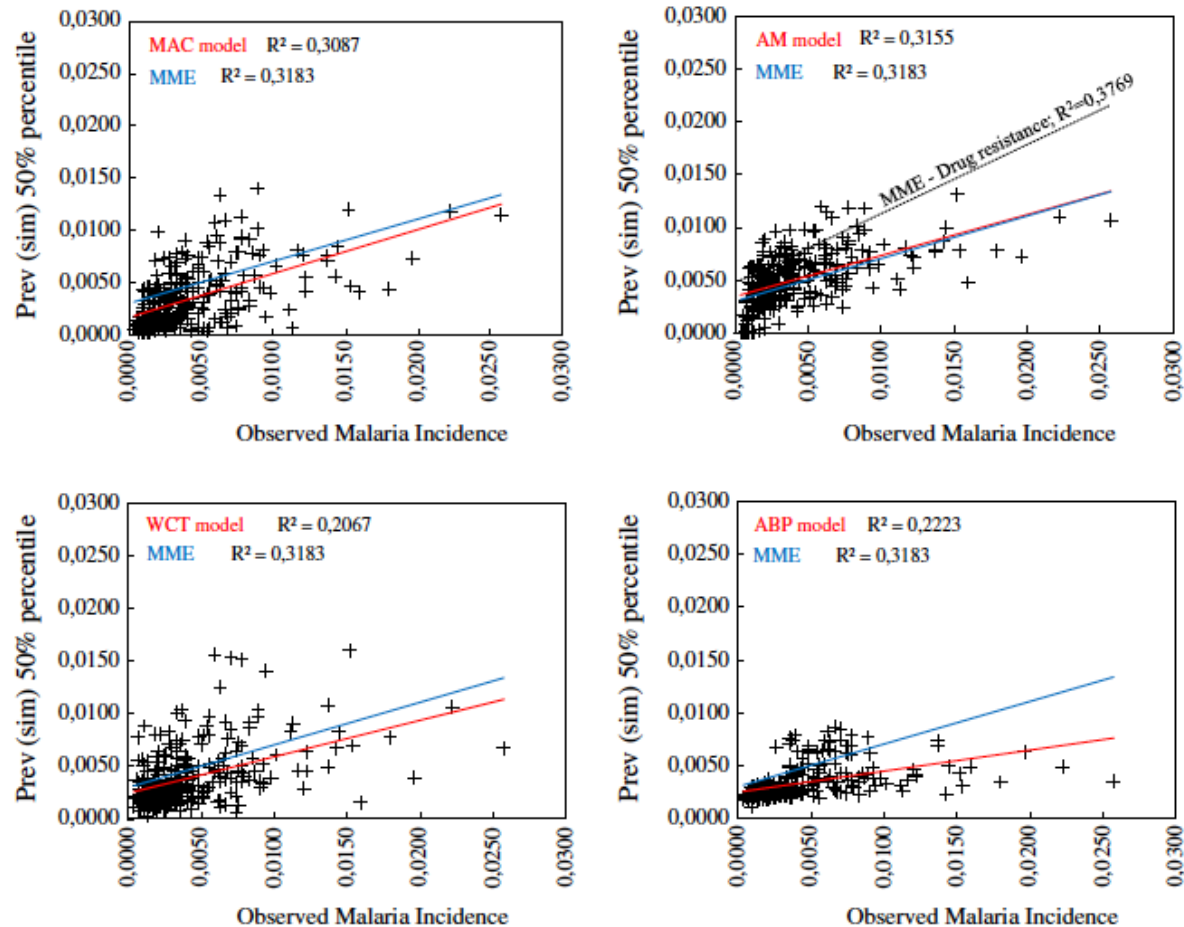
## Mar-Apr-May Rainfall East Africa



# East African “Climate Paradox”



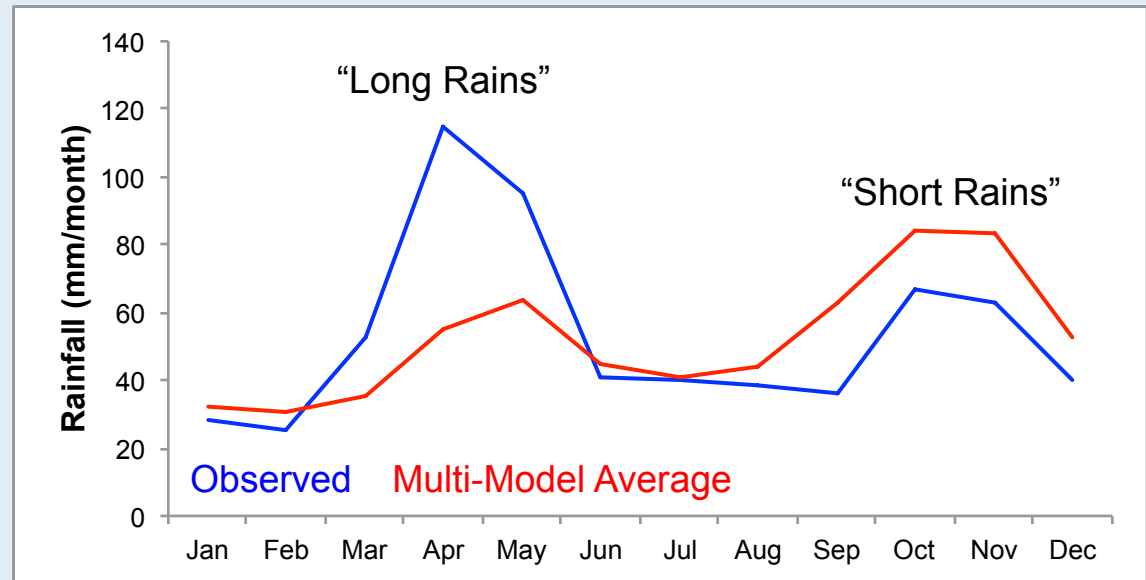
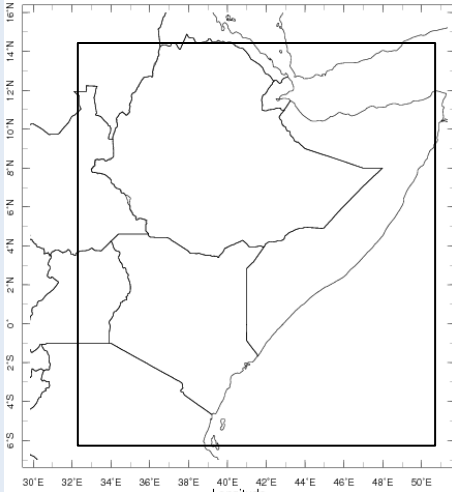
# Example 3: Data for Modeling...



**Figure 2 Malaria-model ensemble simulation outputs.** Monthly *P. falciparum* malaria incidence observed in Kericho over the period spanning January, 1979 to October, 2004 (x-axes) versus the 50% percentile of the distributions of monthly *P. falciparum* malaria prevalence (y-axes) simulated by the MAC (upper left panel), AM (upper right), WCT (lower left), and ABP (lower right) models, for the actual climatic conditions, for the period spanning January, 1979 to December, 2009, and for 1-, 1-, 2-, and 0-month time lags, respectively. Red and blue solid lines represent the adjusted linear trends (see  $R^2$ -values on each panel) for each model and for the four-malaria-model ensemble (MME), respectively. Dashed black line in the upper-right panel depicts the adjusted linear trend for the MME when non-linear changes in the mean duration of host's infectivity to vectors are considered.

Ruiz et al., 2014

## Example 3: ... and Model Data



**Many climate models struggle to capture average rainfall conditions in E. Africa**

- Are some models better suited to the question being addressed than others?
- Be careful in blindly taking model data directly off the shelf...
- There are other methods available to address uncertainty in future climate conditions, particularly in the next 10-30 years.



# Conclusions

- **Know thy data: If it involves climate, involve a climate scientist**
  - An enormous amount of weather and climate data is available
  - This provides many new opportunities for research and “operations”
  - The challenge is selecting which data is most appropriate....
- **Need to match climate data to the specific question be addressed**
  - Spatial scale (local, regional, global)
  - Time scale (“weather”, sub-seasonal, interannual, decadal, CC)
- **Current monitoring and prediction capabilities of global weather and climate are unprecedented. This includes an increasing amount of data available in near “real-time.”**
  - Linking available weather and climate data to useable information in the health community (and other fields) is an unprecedented opportunity. Collaboration across disciplines is the necessary mechanism to overcome the attendant challenges.

