


Simulated Transmission of the Dengue Virus across the US-Mexico Border Using Remotely Sensed and Ground Based Weather Data

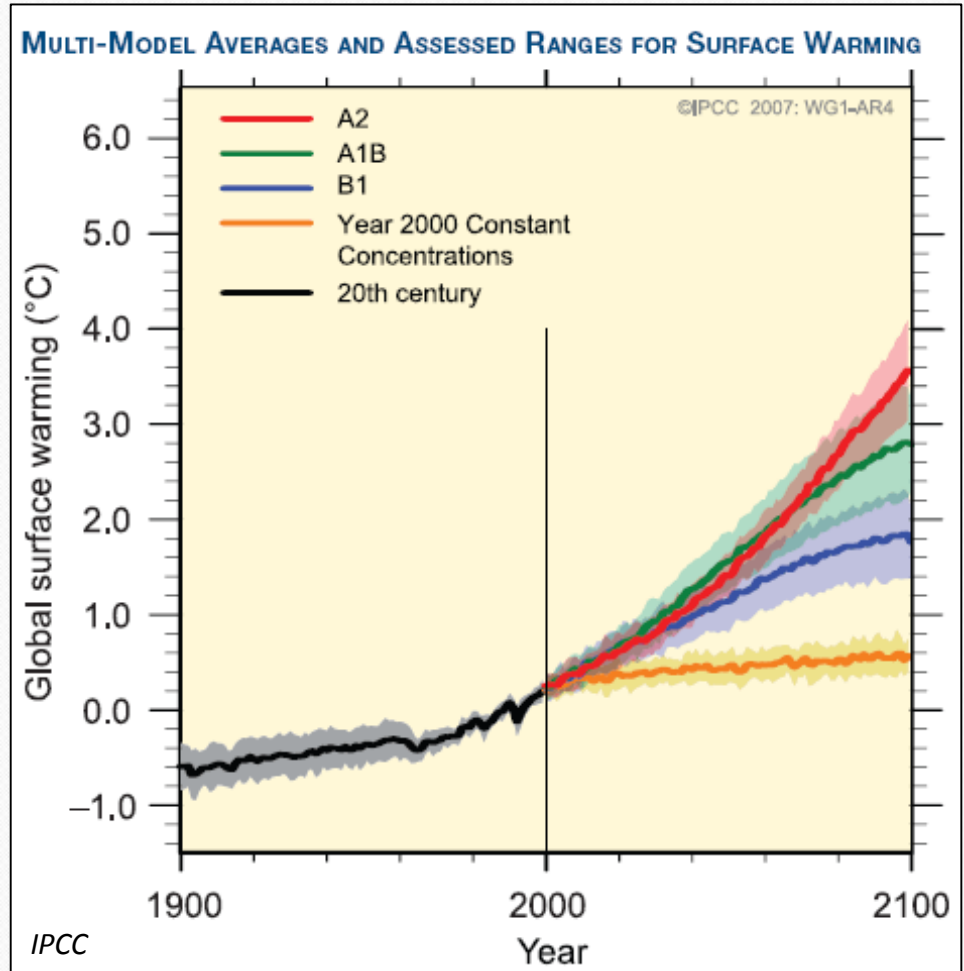
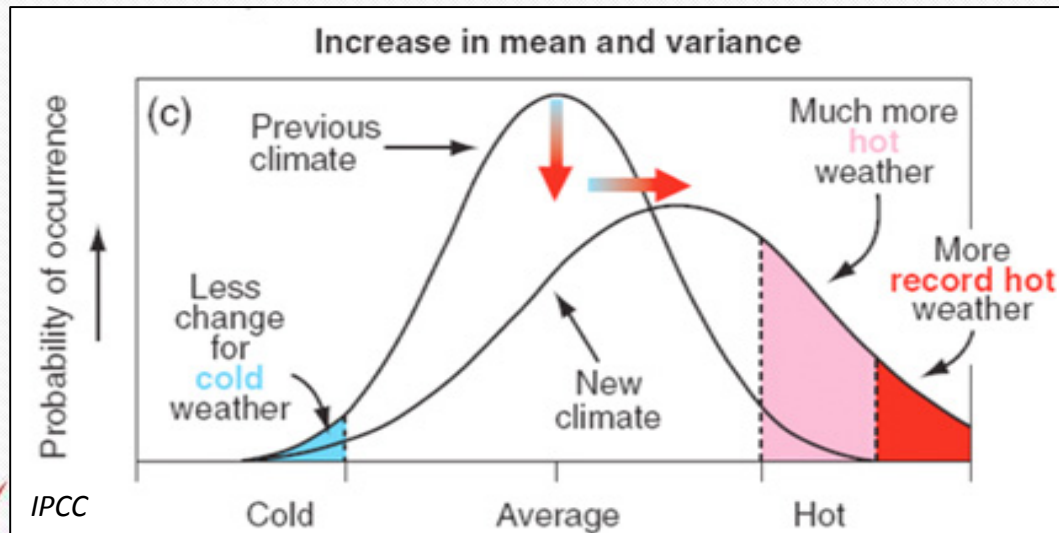


Cory Morin*
Dale Quattrochi*

* ZP11-Earth Science Office, NASA Marshall Space Flight Center, Huntsville, AL

Climate Variability and Change

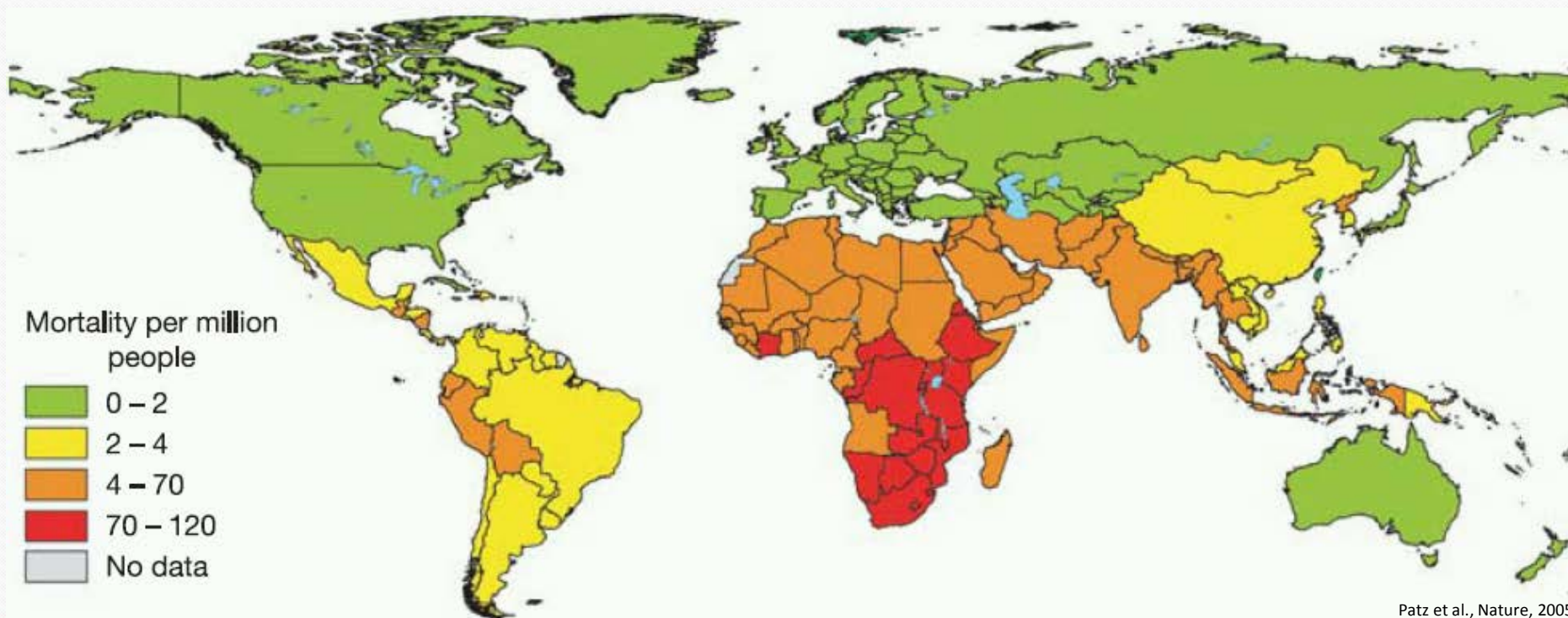
- Shift in mean and variance of current conditions
- Increase in frequency of extreme conditions



Climate Change Deaths

- 150,000 lives annually over last 30 years (WHO)
- Who & where? How & why?

WHO estimated mortality attributable to climate change by the year 2000



Patz et al., Nature, 2005

Climate Effects on Human Health

Extreme Temperatures

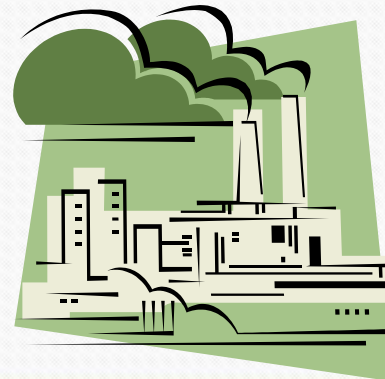
A collection of medical supplies including a large blue syringe, a small red pill bottle, a single yellow pill, and a white glove.

Pathogens

- Vector-borne
- Water-borne
- Air-borne

Extreme Weather

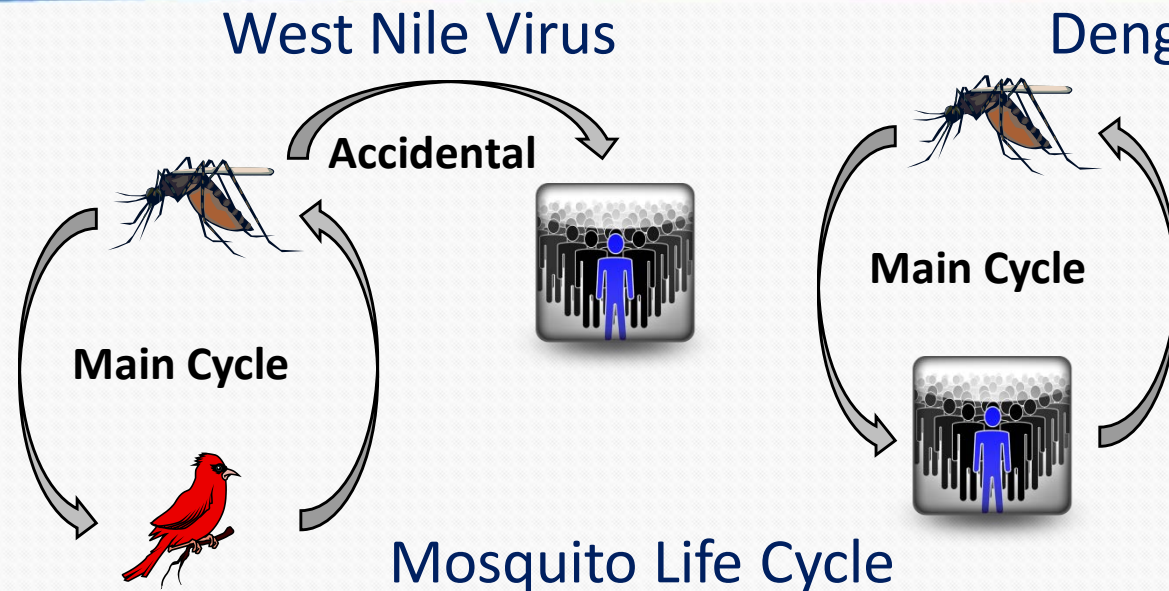
- Flooding
- Hurricanes
- Tornadoes



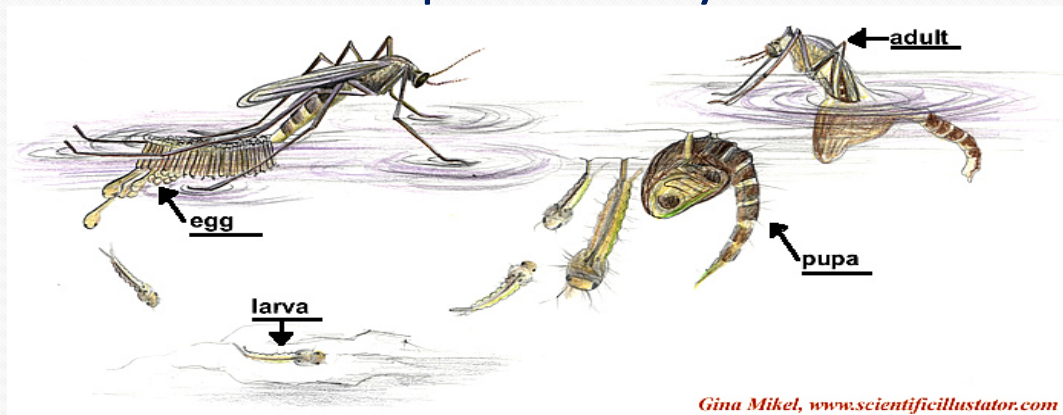
Air Quality

- Pollen
- Ozone
- Particulate Matter

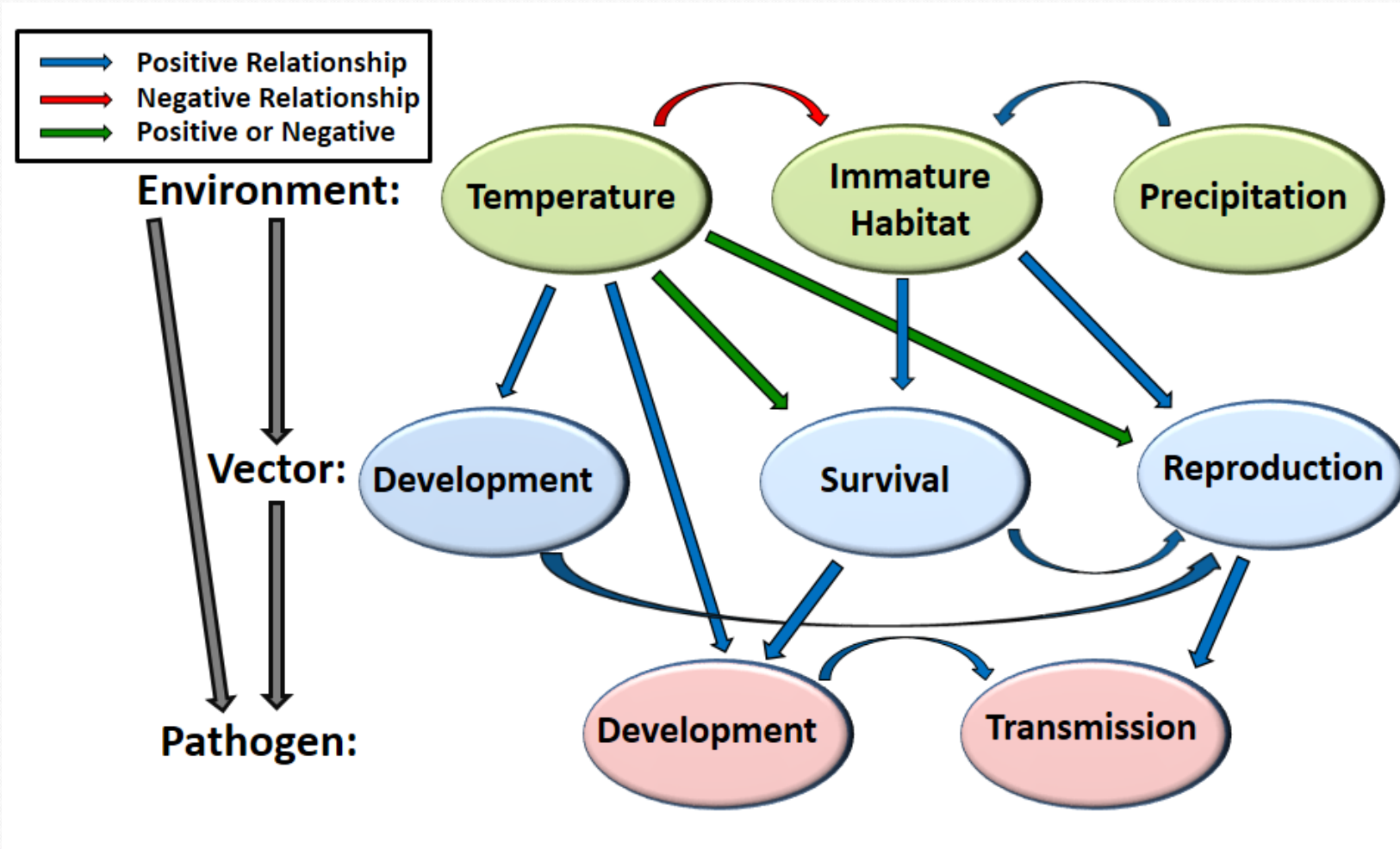
Mosquito-borne Disease Ecology



- Annually ~96 million cases of disease world wide
- Endogenous transmission in Florida + Texas
- Symptoms: muscle and bone ache, fever, and hemorrhagic manifestations in rare cases
- 4 serotypes of virus

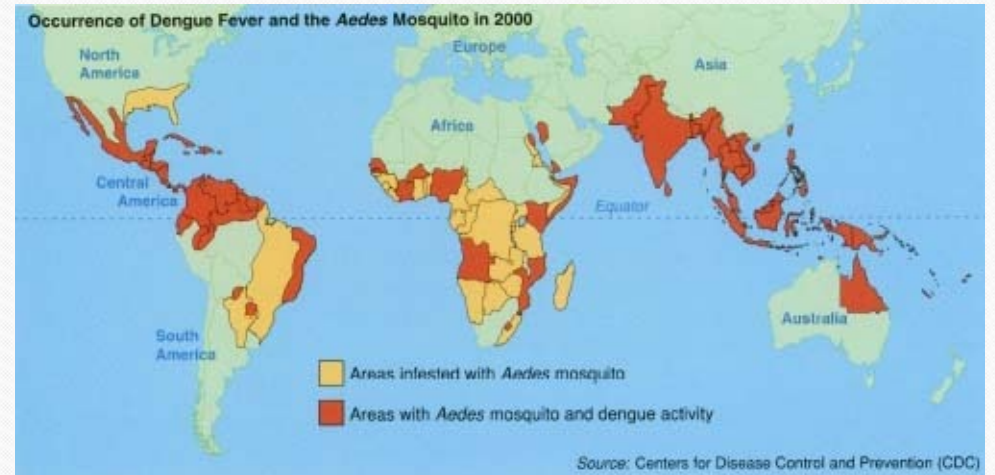


Environment - Vector - Virus Connections



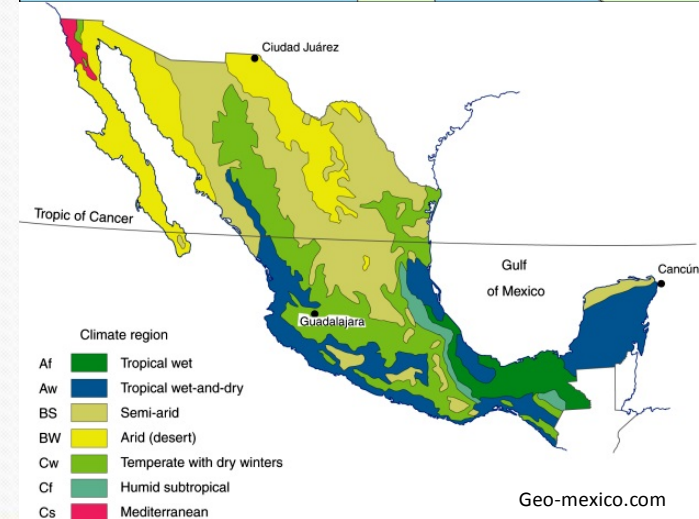
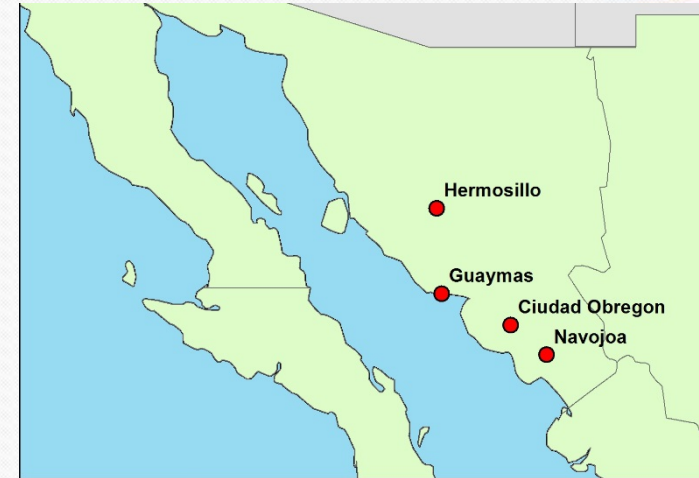
Modeling Dengue Fever in Sonora, Mexico

- Vector population are not always reliable measures of transmission risk
 - Added pathogen and human transmission component to the model
- *Aedes aegypti* mosquitoes
 - Urban, container breeding
 - Live in tropical habitats
 - Anthropophilic
- Sonora Mexico
 - Arid climate
 - Monsoon precipitation
 - Seasonal cycles of dengue transmission
 - Large annual variations

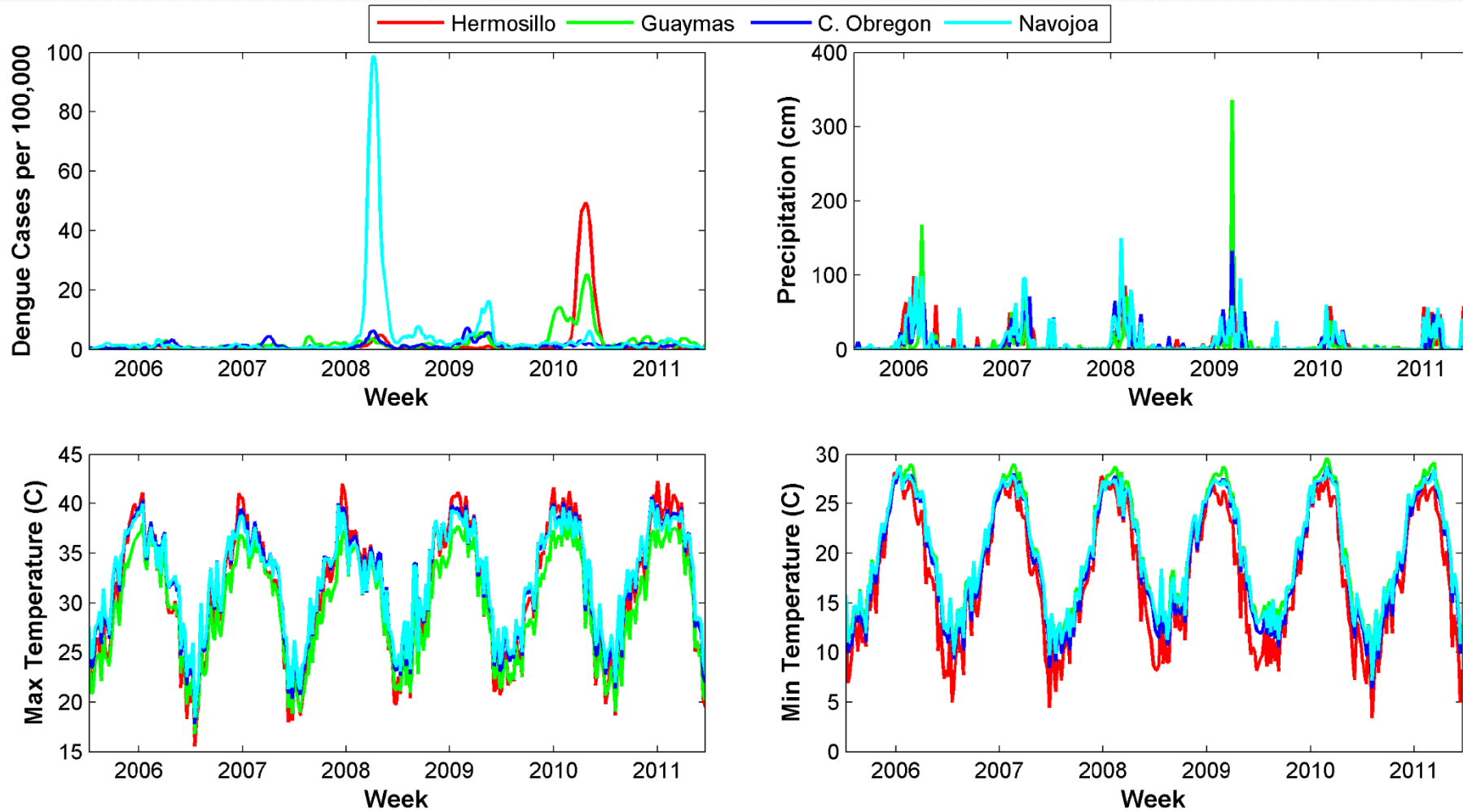


Data and Methods

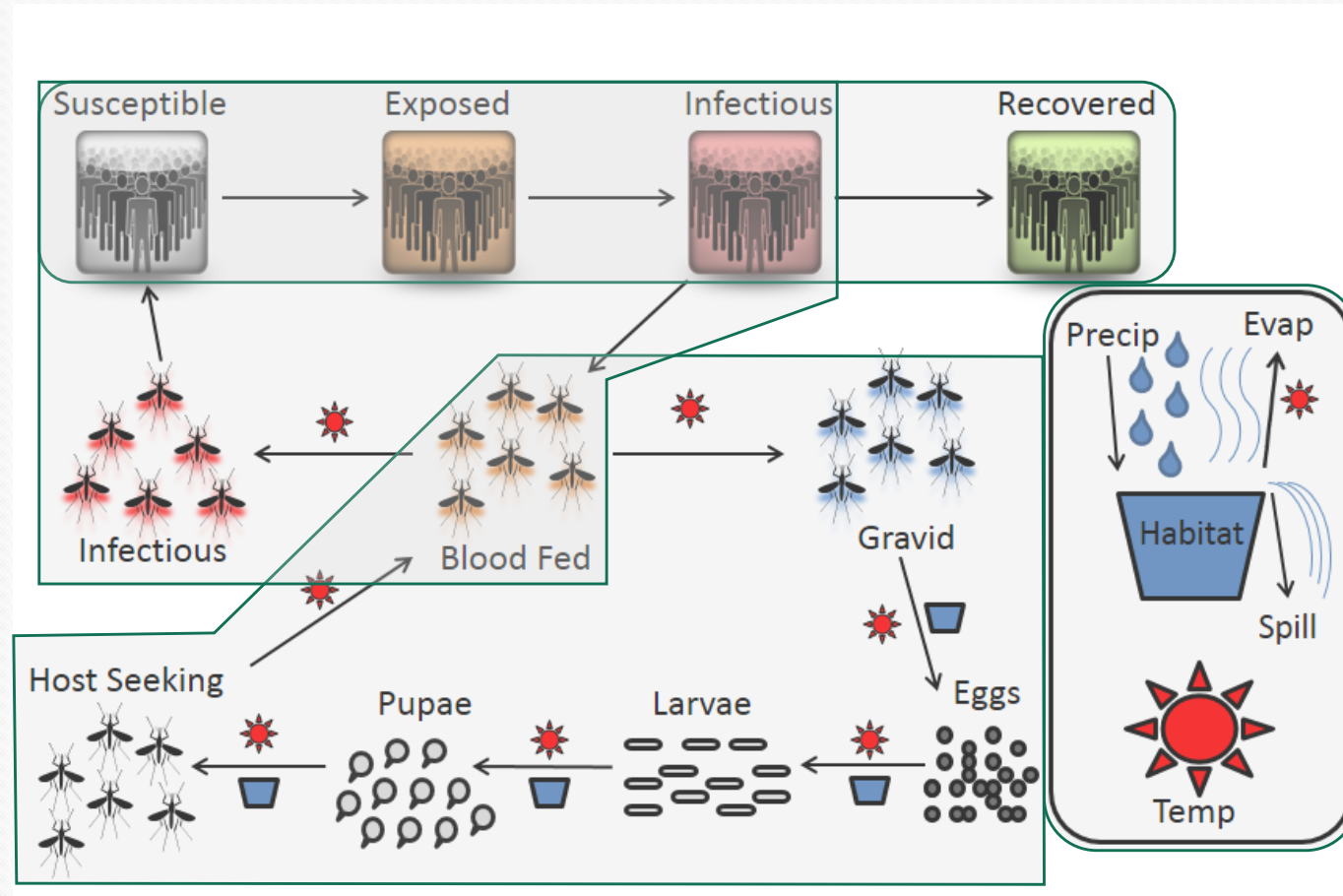
- Study area
 - Sonora, Mexico
- Meteorological/Dengue case data
 - Daily maximum and minimum temperatures (NLDAS)
 - Daily precipitation (TRMM, NLDAS)
 - Weekly suspected dengue cases by city 2006-2011
- Model
 - Parameterized for *Aedes aegypti* mosquitoes, daily time step
 - Run from 2005-2011 under varying parameters (500)
 - Best 3% of runs chosen by comparison with suspected case data (R^2)



Dengue and Climate Comparisons



Modeling *Aedes aegypti* and Dengue Virus Ecology



Model Parameter Estimation

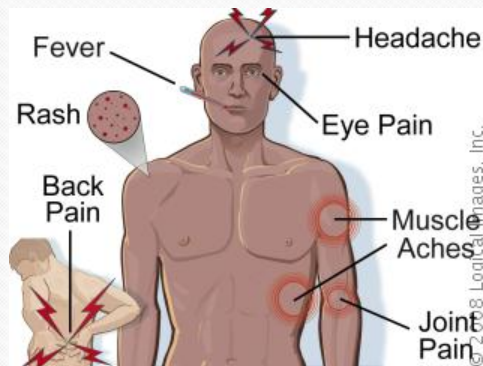
- Containers

- Based on household surveys
- Human managed and open containers
- Used mean values and +/- 25% and 50%



Mosquitoeater.com

beingalison.com



- Minimum infectious rate

- Minimum amount of infectious humans
- Maintains virus within the population
- Based on case data and previous study in San Juan, PR

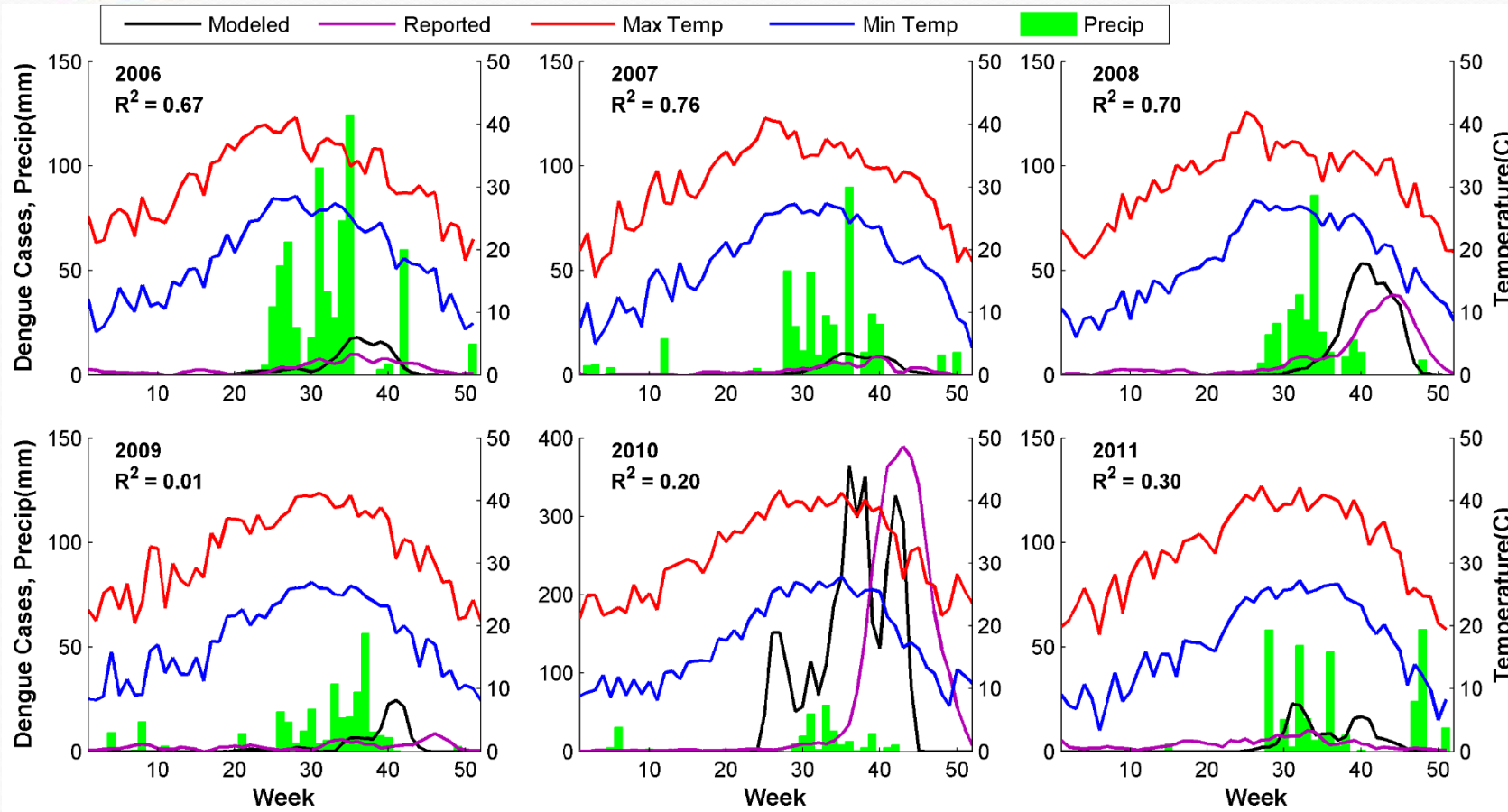
- Maximum larval density

- Used to calculate density-dependent mortality
- Based on observations, literature, and previous study in San Juan, PR



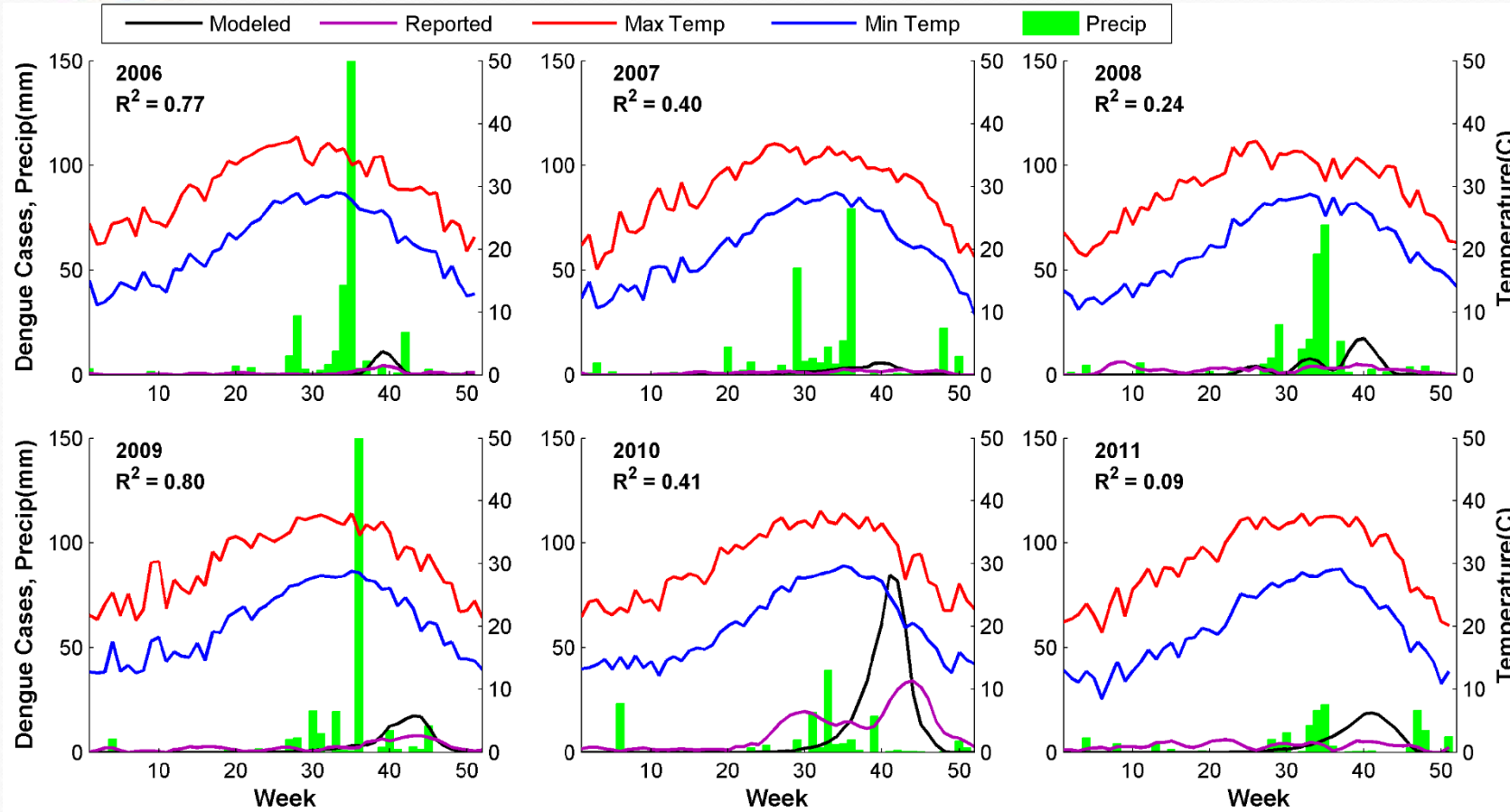
answers.yahoo.com

Climate, Dengue, Parameters: Hermosillo



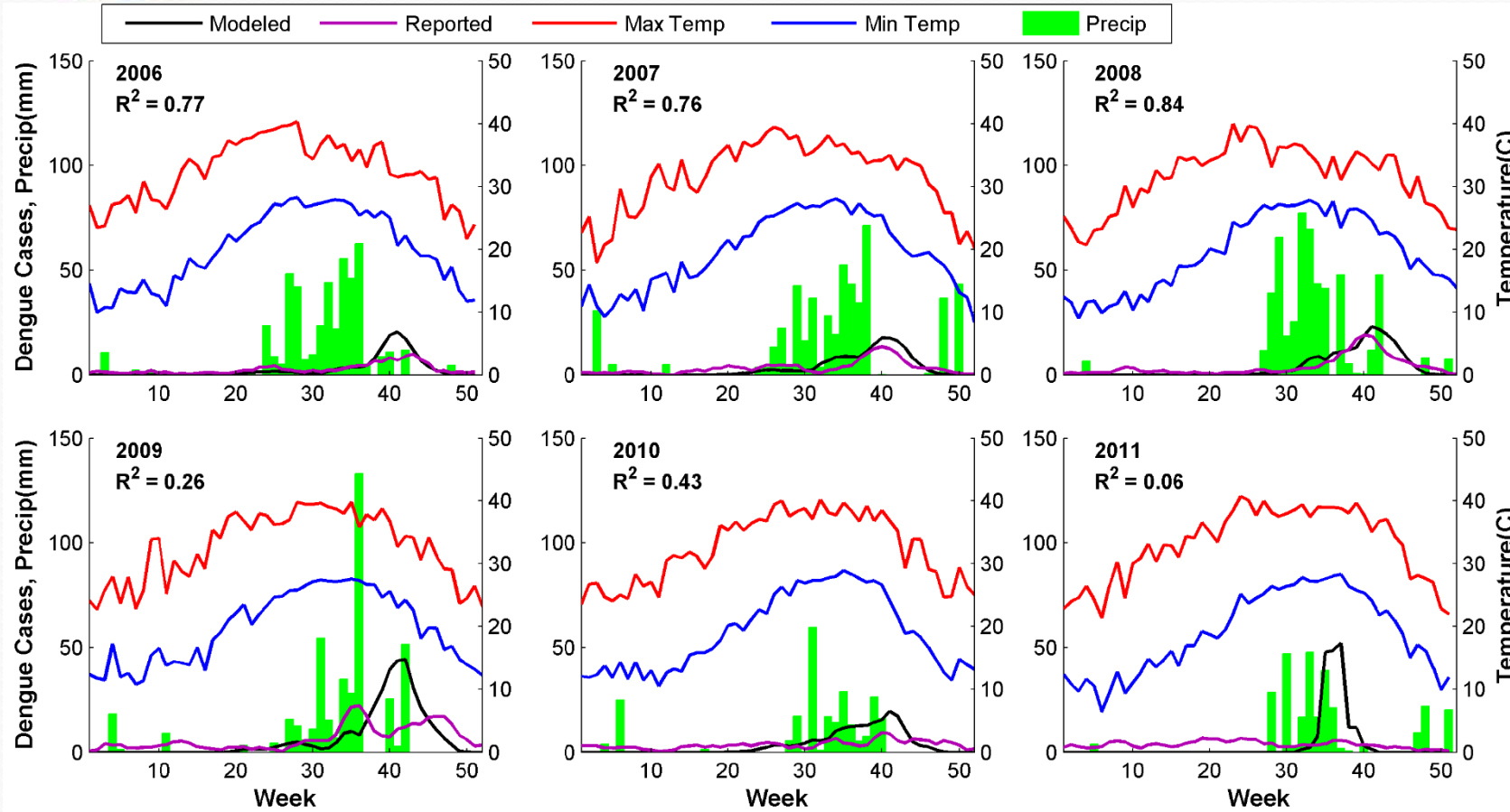
- 2008 and 2010 are largest dengue years
- Generally epidemics follow monsoon rains
- Precipitation magnitude has little influence on dengue magnitude
- Introduction from nearby areas is likely important

Climate, Dengue, Parameters: Guaymas



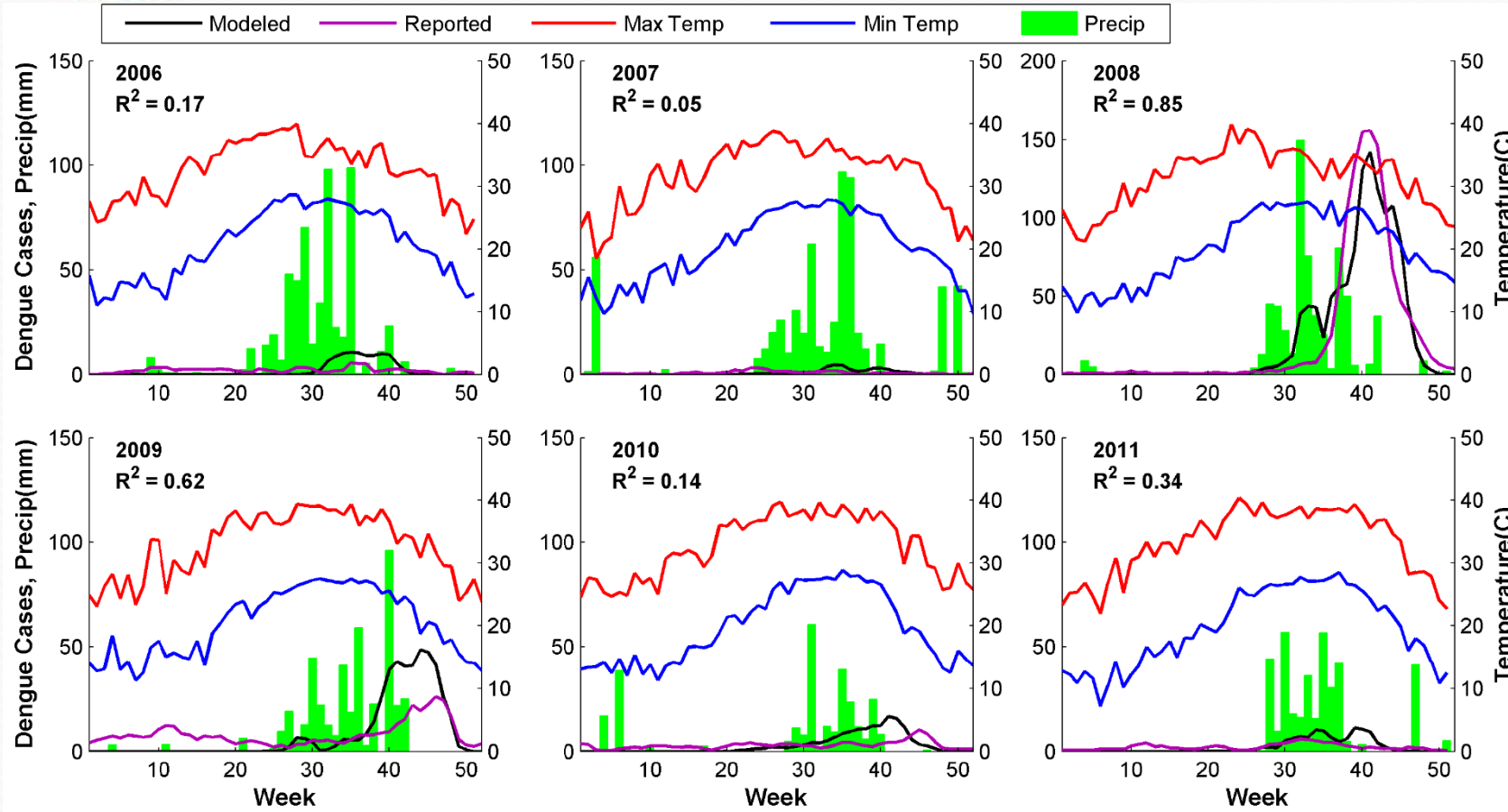
- Dengue is highest in 2010 despite dry conditions
 - Similar to Hermosillo
- Driest of the modeled cities
 - Importance of human managed water sources
- Model has difficulty simulating years without a seasonal peak
 - 2011

Climate, Dengue, Parameters: C. Obregon



- No particularly high dengue years
- Least annual variability in dengue cases
- Unable to model low dengue cases in 2011

Climate, Dengue, Parameters: Navojoa

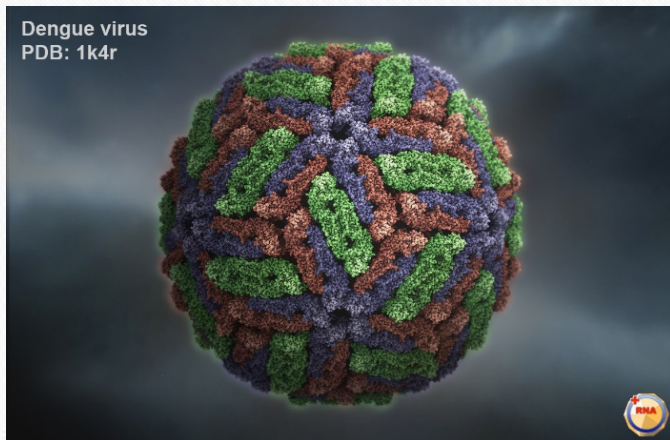


- 2008 is the highest dengue year
- Unlike Hermosillo and Guaymas, dengue transmission in 2010 is low
- Model has difficulty simulating low dengue years
 - Randomness

Challenges in Climate and Health Research



- Reporting problems
 - Misdiagnosis
 - Subclinical cases
 - Reporting errors/bias
 - Availability of data

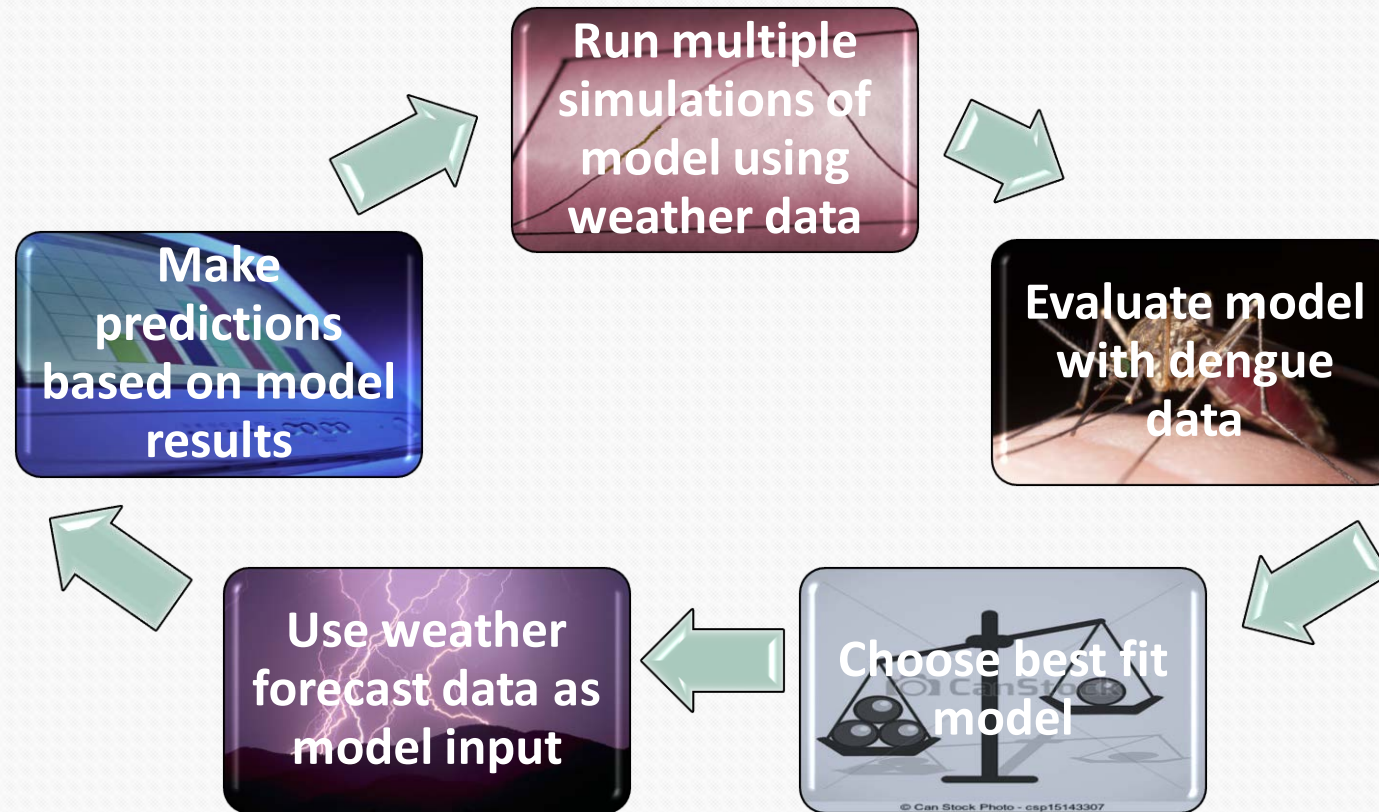


- Knowledge gaps
 - Incubation periods
 - Transmission probabilities
 - Evolution and adaptation of virus and human immunity

- Human vs. climate influences
 - Socioeconomic status
 - Microclimatic influences
 - Human adaptations to climate

An Operational Model?

- Iterative : Using weather forecast and weekly reported dengue data



Conclusions

- Nearby locations can exhibit very different patterns of dengue transmission
 - Differences in virus introduction
 - Small climatic differences
- Dengue epidemics follows monsoon rains
 - Timing is consistent, however, the magnitude is not well correlated
- Dengue transmission dynamics in northern Mexico may affect dengue risk in the United States
 - Travel, climate change
 - Recent dengue epidemic in Nogales
- Remotely sensed data can be used to inform model input and parameters
 - Temperature, precipitation, land use/cover, soil moisture, ect.



Next Steps

- Run model for additional locations along US/Mexico border
 - Does transmission vary?
 - Why?
- Perform fine scaled model runs
 - How does risk vary within a city?



Thank You for Your Attention!

Questions?

