

# ROLE OF TEMPERATURE, HUMIDITY AND RAINFALL ON INFLUENZA TRANSMISSION IN GUATEMALA, EL SALVADOR AND PANAMA

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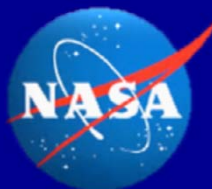
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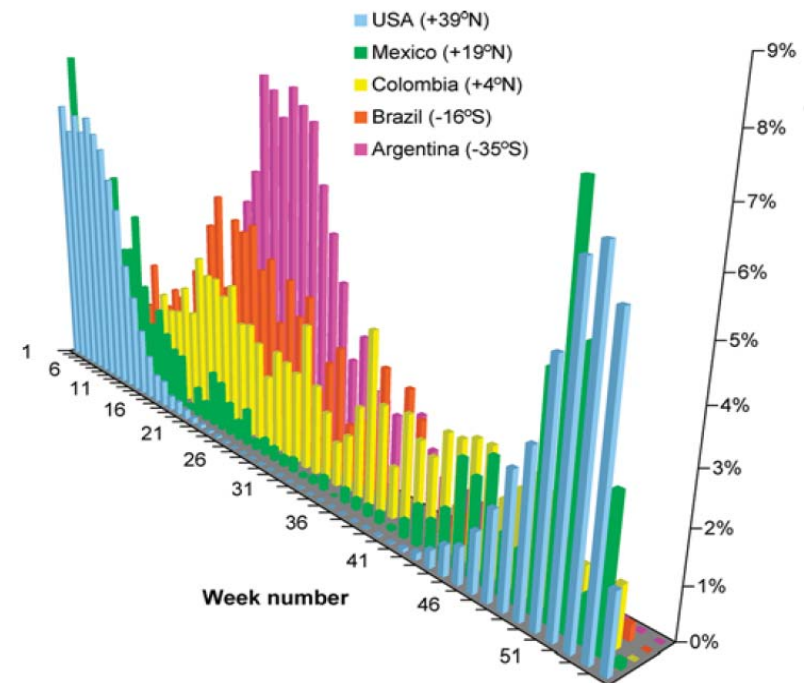
# INTRODUCTION

## Spatio-temporal pattern of influenza epidemics vary with latitude

- Temperate region
  - Distinct annual peak in winter
  - Cold and dry condition may bring seasonality
- Tropics
  - Less distinct seasonality
  - Often have multiple peaks
  - Coincides with rainy season

## Southward migration in Brazil<sup>(1)</sup>

- From low population in the tropics
- To dense area with temperate climate



Source: Viboud et al. (2006). PLoS Medicine 3:e89

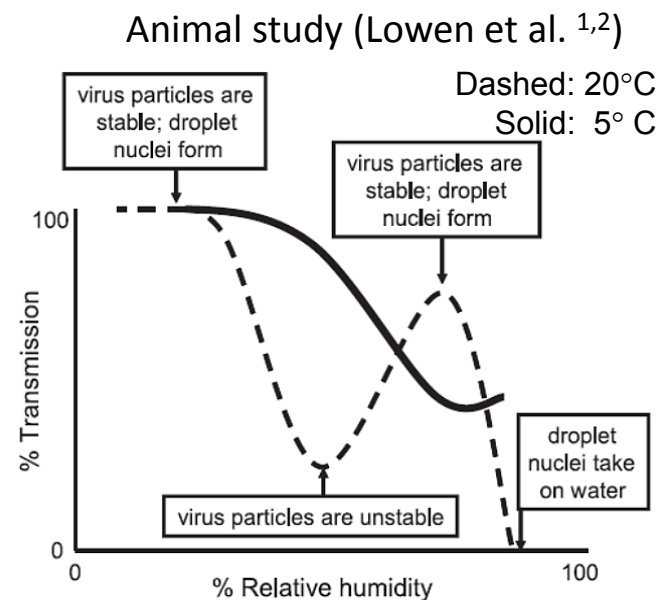
<sup>1</sup> Alonso et al. (2007). American Journal of Epidemiology 165: 1434

# INTRODUCTION

## FACTORS IMPLICATED IN INFLUENZA CIRCULATION

Virus Survival	Temperature	↓
	Humidity	↓
	Solar Irradiance	↓
Transmission	Temperature	↓
	Humidity	↓
	Vapor Pressure	↓
	Rainfall	↑
	ENSO	↑
	Holidays	↑
Host Susceptibility	Sunlight	↓
	Nutrition	↕

## TEMPERATURE AND HUMIDITY

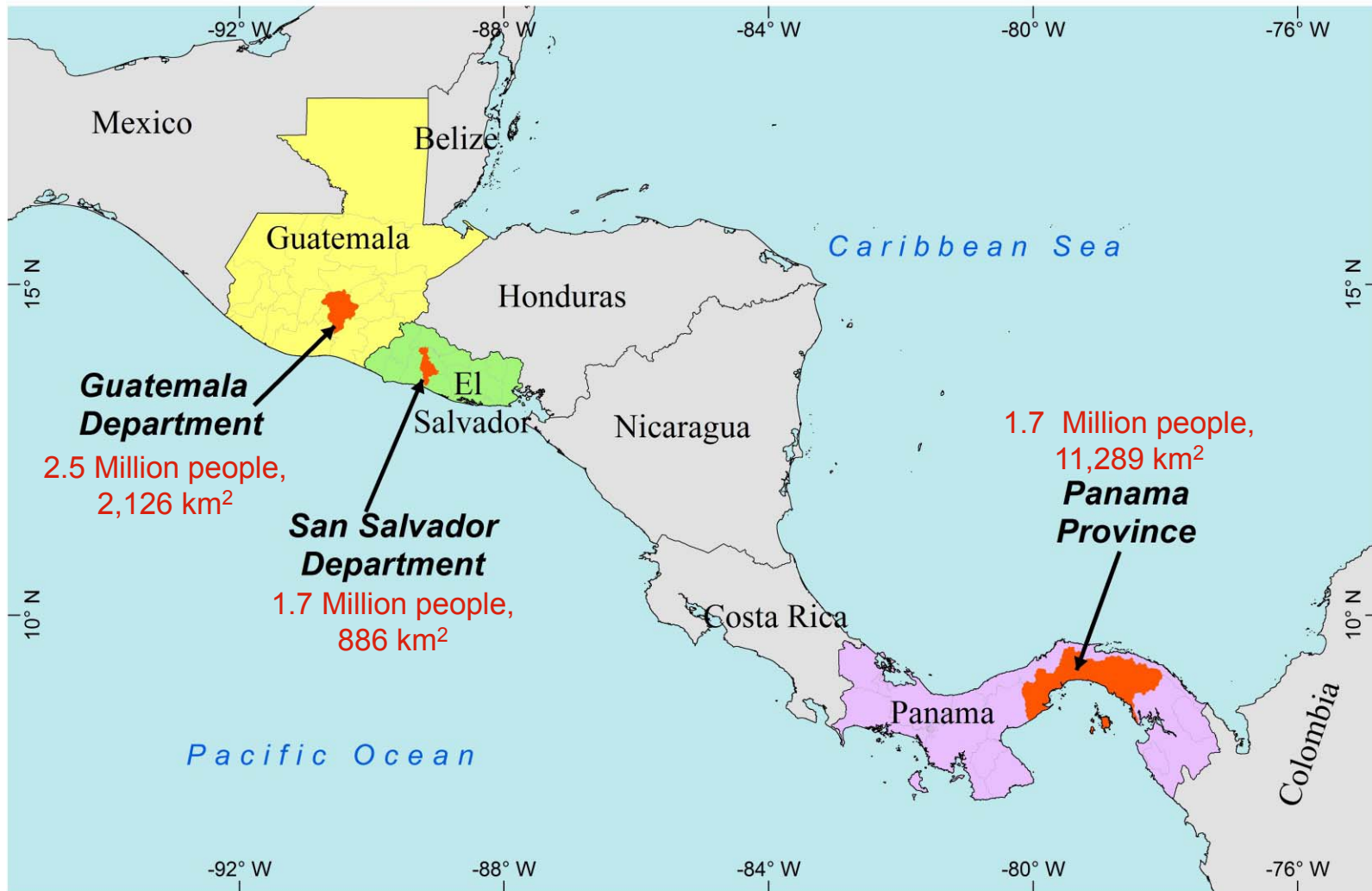


High temperature (30°C) blocks aerosol transmission *but not contact transmission*

<sup>1</sup>Lowen AC et al. (2007) PLoS Pathogen 3: 1470

<sup>2</sup>Lowen AC et al. (2008) J Virol 82: 5650

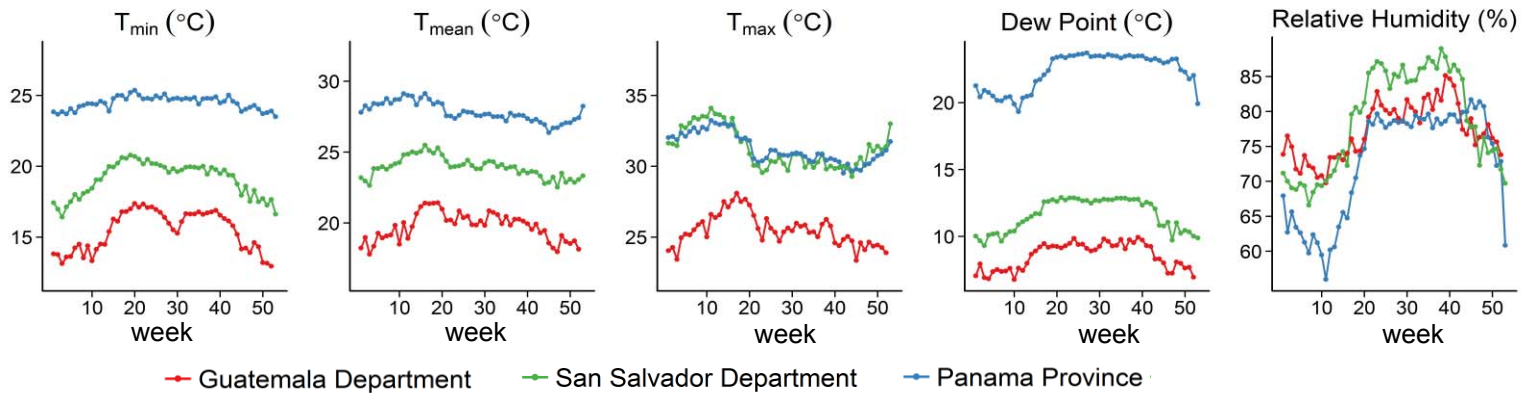
# STUDY AREA



# METEOROLOGICAL VARIABLE

## Ground Station Data

- Country's Meteorological Agency (Guatemala and El Salvador)
- US National Oceanic and Atmospheric Administration (NOAA)



### Definition for humidity-related measures

**Dew Point :** Temperature at which the air can no longer hold all the water vapor it contains

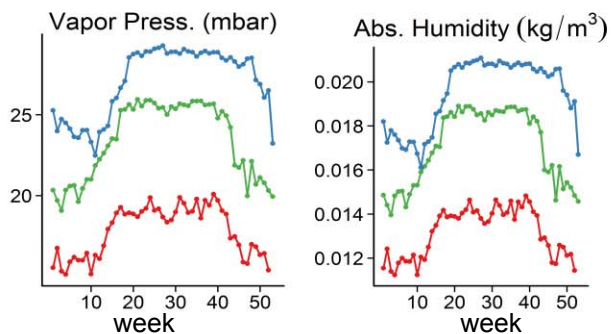
**Absolute Humidity:** Amount of water vapor in a unit volume of air

**Vapor Pressure :** Partial pressure of water vapor

**Specific Humidity:** Ratio between mass of water vapor to the total mass of air

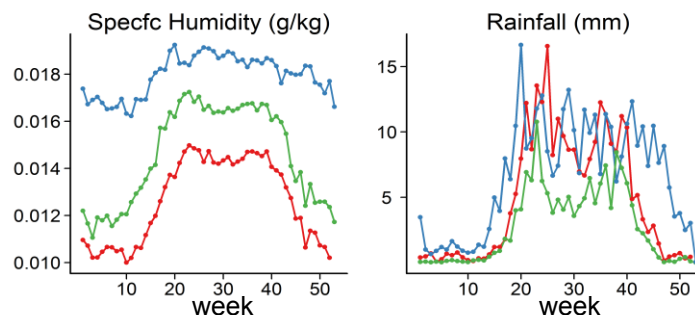
**Relative Humidity:** Ratio between the amount of moisture in the air to the amount of the air can "hold" at that temperature

## Derived/Calculated



## Model-Based

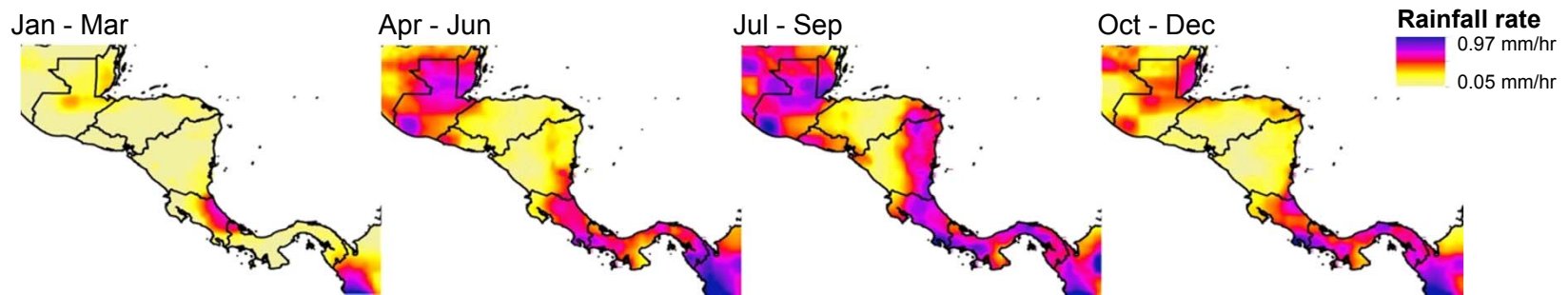
NASA's Global Land Data Assimilation System (GLDAS)



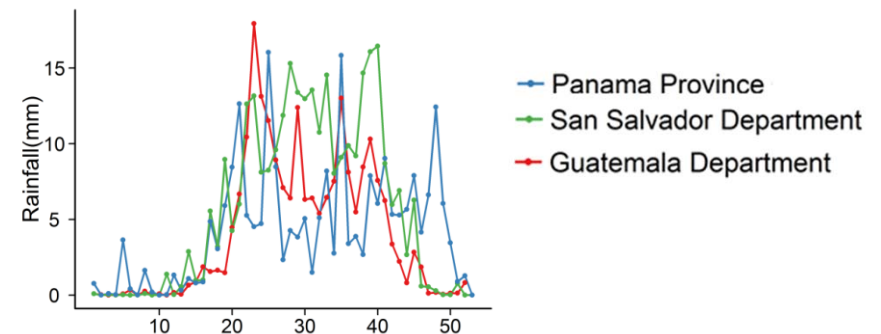
# METEOROLOGICAL VARIABLE

## Satellite Data

- Tropical Rainfall Measuring Mission (TRMM) – NASA and Japanese Aerospace Exploration Agency



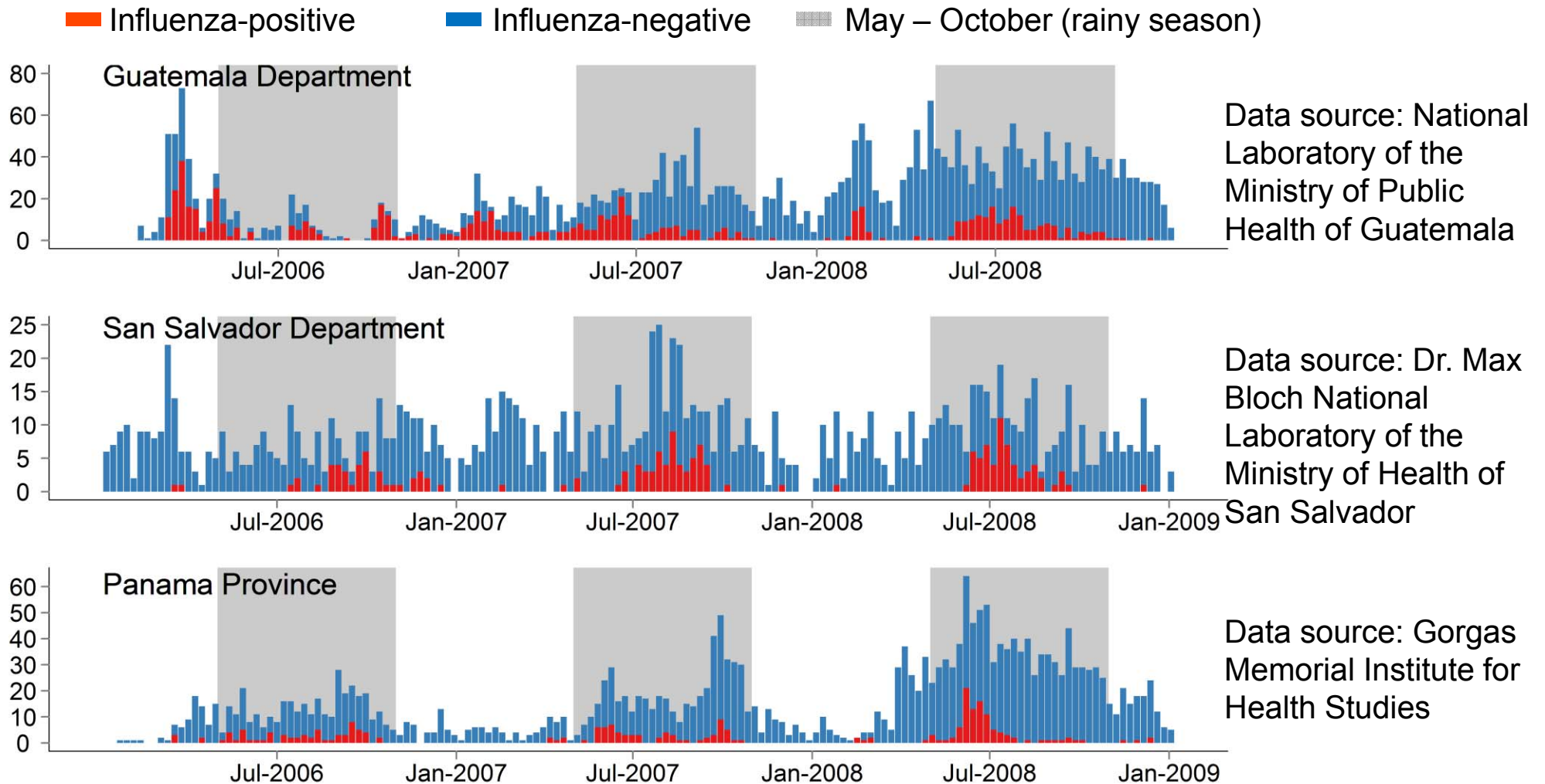
- Spatial resolution:  $0.25^\circ$  (~ 25 km)
- Averaged over pixels in which 10% or more of the area were covered by the region



**All daily meteorological variables were averaged to obtain weekly composite (1- to 3-week averages were computed)**

**Lags from previous 1 to 4 weeks were also calculated**

# INFLUENZA DATA



Higher influenza activity coincides with rainy season except for Guatemala which showed additional activities outside the season

# METHOD

## Quasi-Poisson regression

$$\ln(Y) = \mu + \alpha \cdot pop + \gamma \cdot month + \beta \cdot x_{met}$$

Where, Y= Influenza-positive samples      pop = population

$\mu$  = Intercept

$x_{met}$  = meteorological factors

$\alpha, \gamma, \beta$  = coefficients

## Divided meteorological variables into 3 categories in order to avoid collinearity

- **Temperature:** minimum, mean and maximum
- **Humidity:** relative, absolute & specific humidity; vapor pressure; dew point
- **Rainfall:** TRMM or GLDAS data set

## Month variables were entered using stepwise method

## Seek for the best meteorological 'averaging' period

(i.e. Average from current week to 2, 3 or 4 previous weeks)

## Models were parameterized to each study site individually

## Assessed model performance by pseudo-R<sup>2</sup>



# RESULTS

## Best meteorological input combinations based on R<sup>2</sup>

	$\beta$	95 % CI	p-value	R <sup>2</sup>
<b>Guatemala Department</b>				0.64
Mean Temperature <sub>(0-3 wk ave)</sub>	0.95	(0.61, 1.29)	< 0.05	
Dew Point <sub>(0-3 wk ave)</sub>	0.15	(-0.33, 0.64)	0.4	
Rainfall <sub>GLDAS (0-3 wk ave)</sub>	0.09	(0.04, 0.14)	< 0.05	
<b>Panama Province</b>				0.51
Mean Temperature <sub>(0-3 wk ave)</sub>	1.22	(0.80, 1.64)	< 0.05	
Dew Point <sub>(0-3 wk ave)</sub>	0.16	(-0.11, 0.43)	0.15	
Rainfall <sub>GLDAS (0-3 wk ave)</sub>	0.16	(0.09, 0.23)	< 0.05	
<b>San Salvador Department</b>				0.64
Mean Temperature <sub>(1-4 wk ave)</sub>	0.17	(-0.4, 0.74)	0.5	
Specific Humidity <sub>(1-4 wk ave)</sub>	0.92	(0.63, 1.20)	< 0.05	
Rainfall <sub>TRMM (1-4 wk ave)</sub>	-0.02	(-0.11, 0.07)	0.7	

# RESULTS

## Sensitivity of influenza activities with respect to the meteorological variables

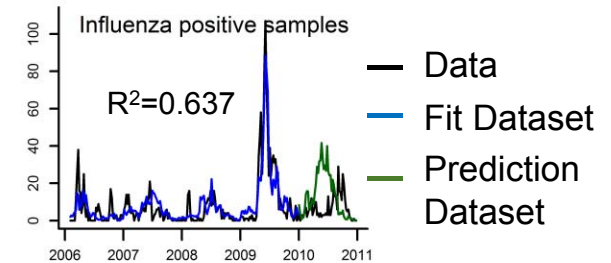
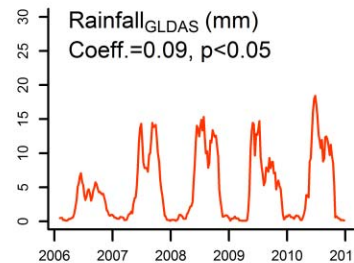
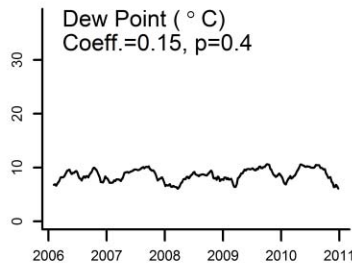
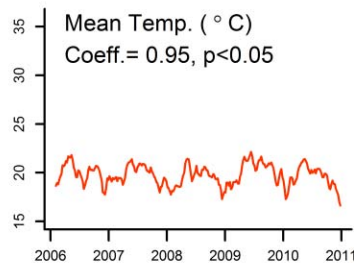
Meteorological variable increased	by	Changed the weekly influenza-positive sample by
<b>Guatemala Department</b>		
Mean temperature over the past 3 weeks	1°C	2.8 times
Mean rainfall over the past 3 weeks	5 mm	1.6 times
<b>Panama Province</b>		
Mean temperature over the past 3 weeks	1°C	3.4 times
Mean rainfall over the past 3 weeks	5 mm	2.2 times
<b>San Salvador Department</b>		
Specific humidity in the past 4 weeks	1 g/kg	2.5 times

# RESULTS

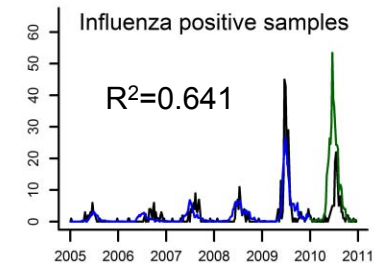
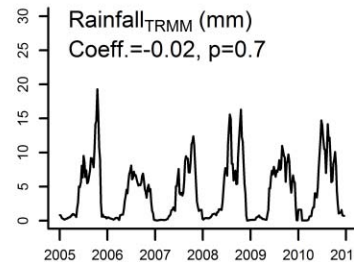
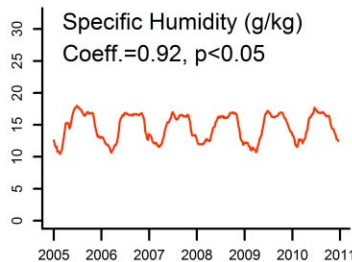
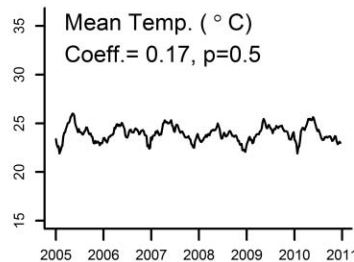
## Meteorological parameters and modeled influenza-positive

— Significant variable (p-value <0.05)

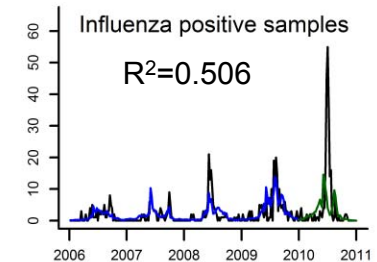
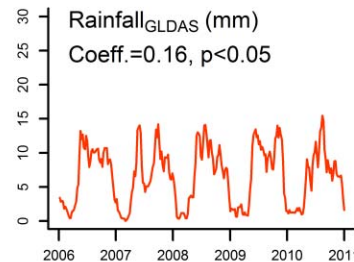
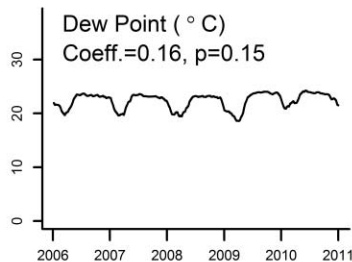
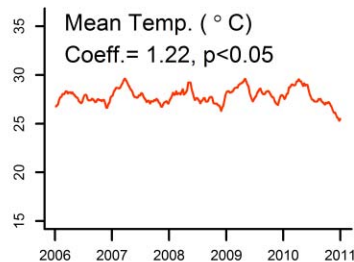
**Guatemala Department**



**San Salvador Department**



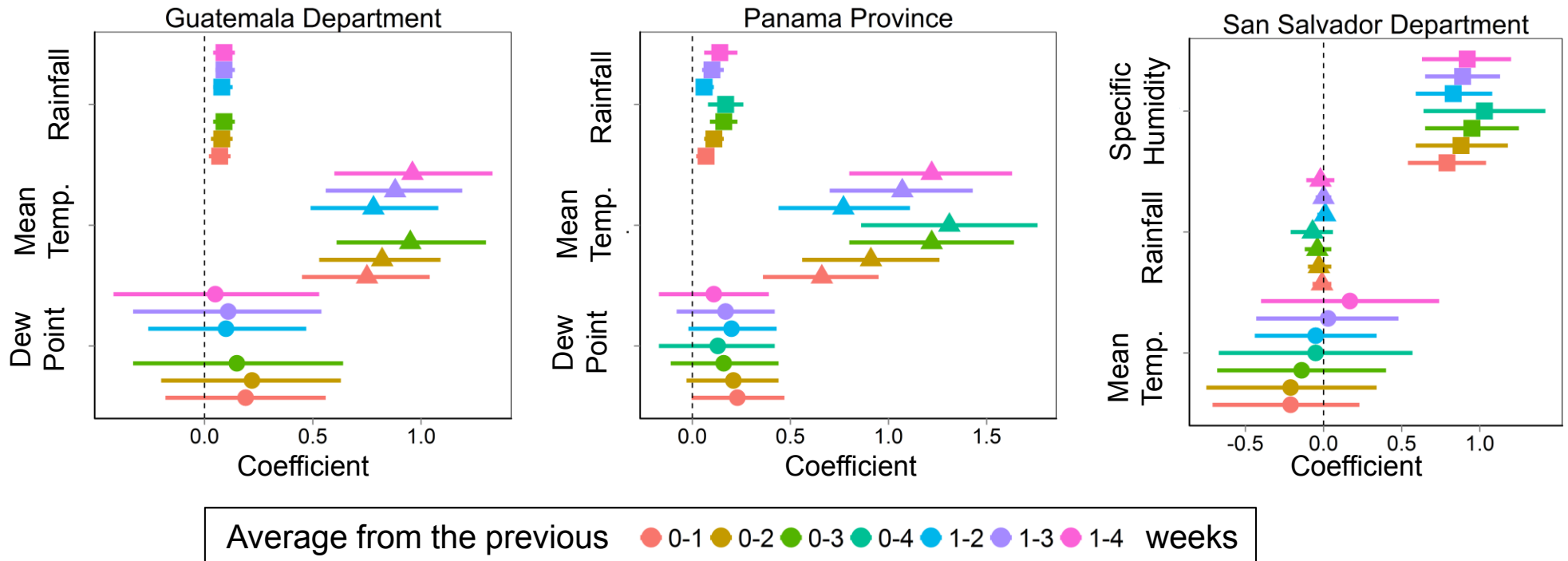
**Panama Province**



# RESULTS

## Varying the 'averaging period' did not change the meteorological variables significance

Regression Coefficients and their 95% CI for the different averaging period

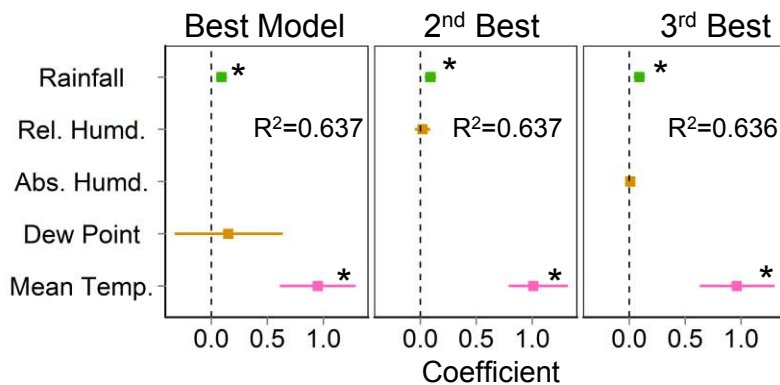


# RESULTS

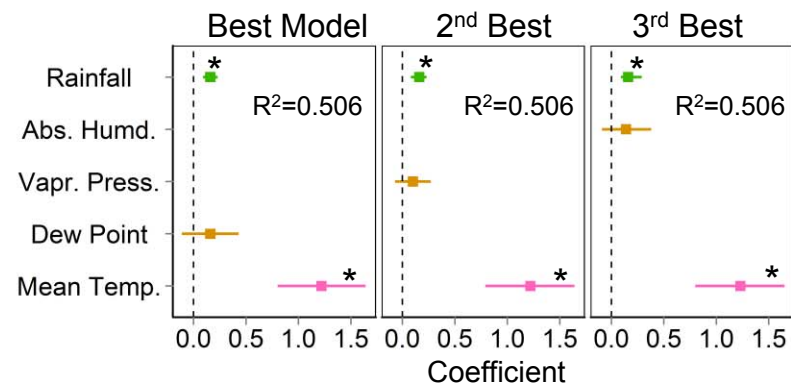
**2<sup>nd</sup> and 3<sup>rd</sup> best models (based on R<sup>2</sup>) showed the significant meteorological variables are still in the same category**

- Indicates the robustness and stability of meteorological variable association with influenza

**Guatemala Department**

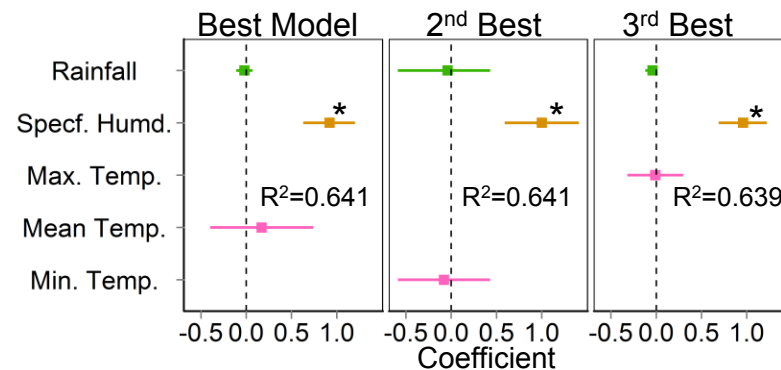


**Panama Province**



\* Denotes significant variable (p<0.05)

**San Salvador Department**



# RESULTS

## Used influenza-positive proportion (rate) instead of counts

As compared to the regression with counts:

- The same category of meteorological variables remained significant for Guatemala and San Salvador
- Temperature was no longer significant in Panama
- Averaging period changed

	$\beta$	95 % CI	p-value	R <sup>2</sup>
<b>Guatemala Department</b>				0.52
Mean Temp. <small>(0-1 wk ave)</small>	0.23	(0.09, 0.38)	0.002	
Specific Humd. <small>(0-1 wk ave)</small>	0.11	(-0.03, 0.24)	0.12	
Rainfall <small>GLDAS (0-1 wk ave)</small>	0.04	(0.002, 0.08)	0.04	
<b>Panama Province</b>				0.37
Mean Temp. <small>(0-3 wk ave)</small>	0.45	(-0.002, 0.9)	0.051	
Vapor Pressure <small>(0-3 wk ave)</small>	0.13	(-0.006, 0.3)	0.06	
Rainfall <small>GLDAS (0-3 wk ave)</small>	0.07	(0.009, 0.13)	0.025	
<b>San Salvador Department</b>				0.36
Min. Temp. <small>(lag 2 wk)</small>	-0.12	(-0.4, 0.2)	0.41	
Dew Point <small>(lag 2 wk)</small>	0.45	(0.16, 0.75)	0.003	
Rainfall <small>TRMM (lag 2 wk)</small>	0.001	(-0.05, 0.05)	0.95	

# CONCLUSION

**Higher influenza activity in the 3 Central American sub-divisions are associated with either humid, hot, or rainy condition**

**Results are consistent with other studies in the tropics<sup>(1-3)</sup> but are different from those in the temperate region**

**Most laboratory and animal studies showed increased influenza activity with lower temperature and humidity**

- Our results may indicate that hot and humid condition provide uncomfortable condition that further promote indoor crowding and hence, contact transmission

**The meteorological indicators can be used to estimate current and future influenza activity**

1. Yang L, Chen PY, He JF, Chan KP, Qu CQ (2011). BMC Infectious diseases 11: 342
2. Chadha MS, Broor S, Gunasekaran P, Potdar V, Krishnan A (2012). Infl. & other resp. vir. 6: 196
3. Hampson AW (1999). Vaccine 17: 19

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