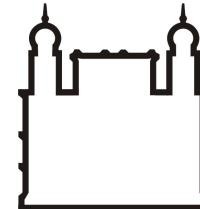




# Seasonality and spatial dynamics of dengue fever

Cláudia Codeço  
Fiocruz, Rio de Janeiro  
[codeco@fiocruz.br](mailto:codeco@fiocruz.br)

San Jose, january 2012

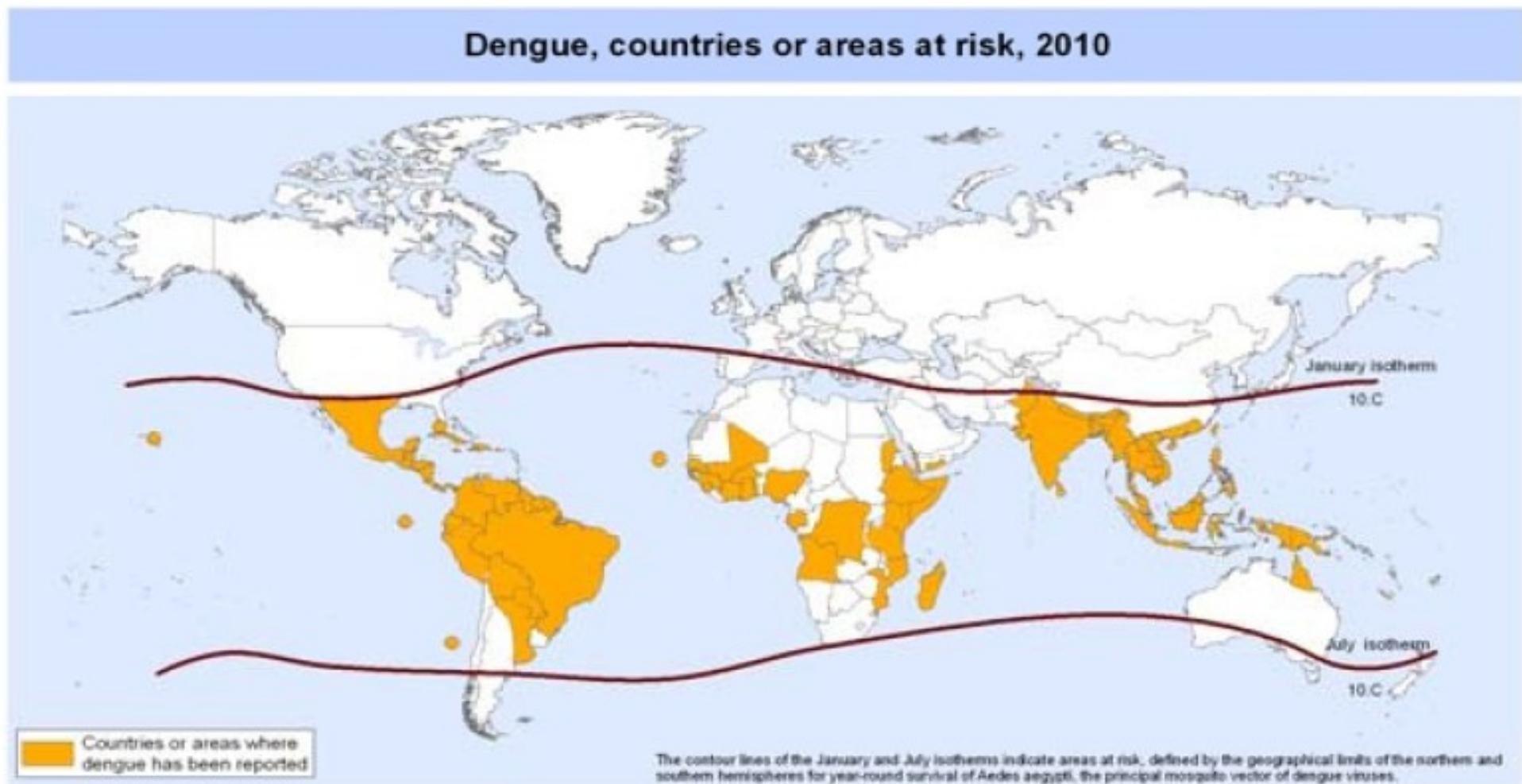


Ministério da Saúde

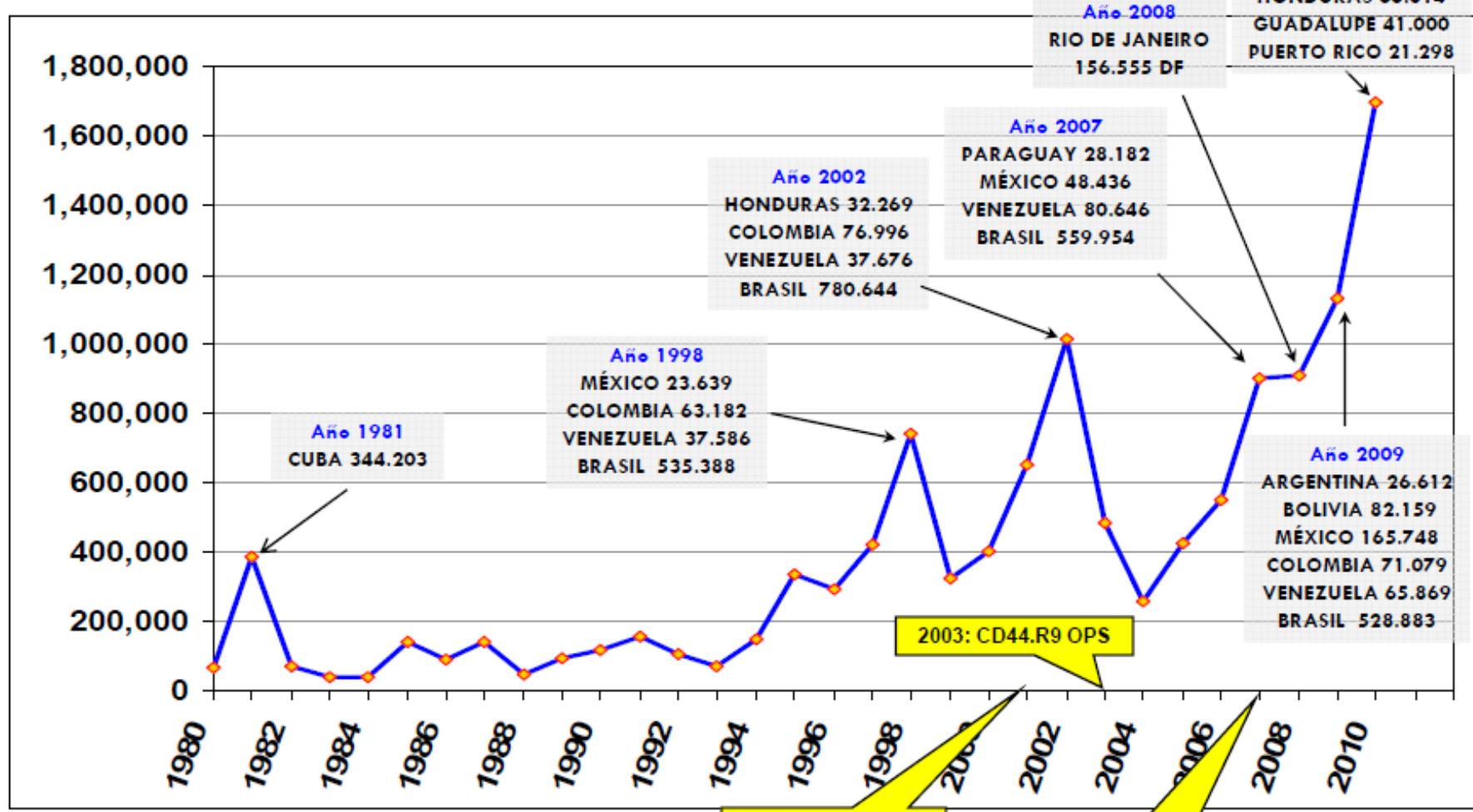
FIOCRUZ

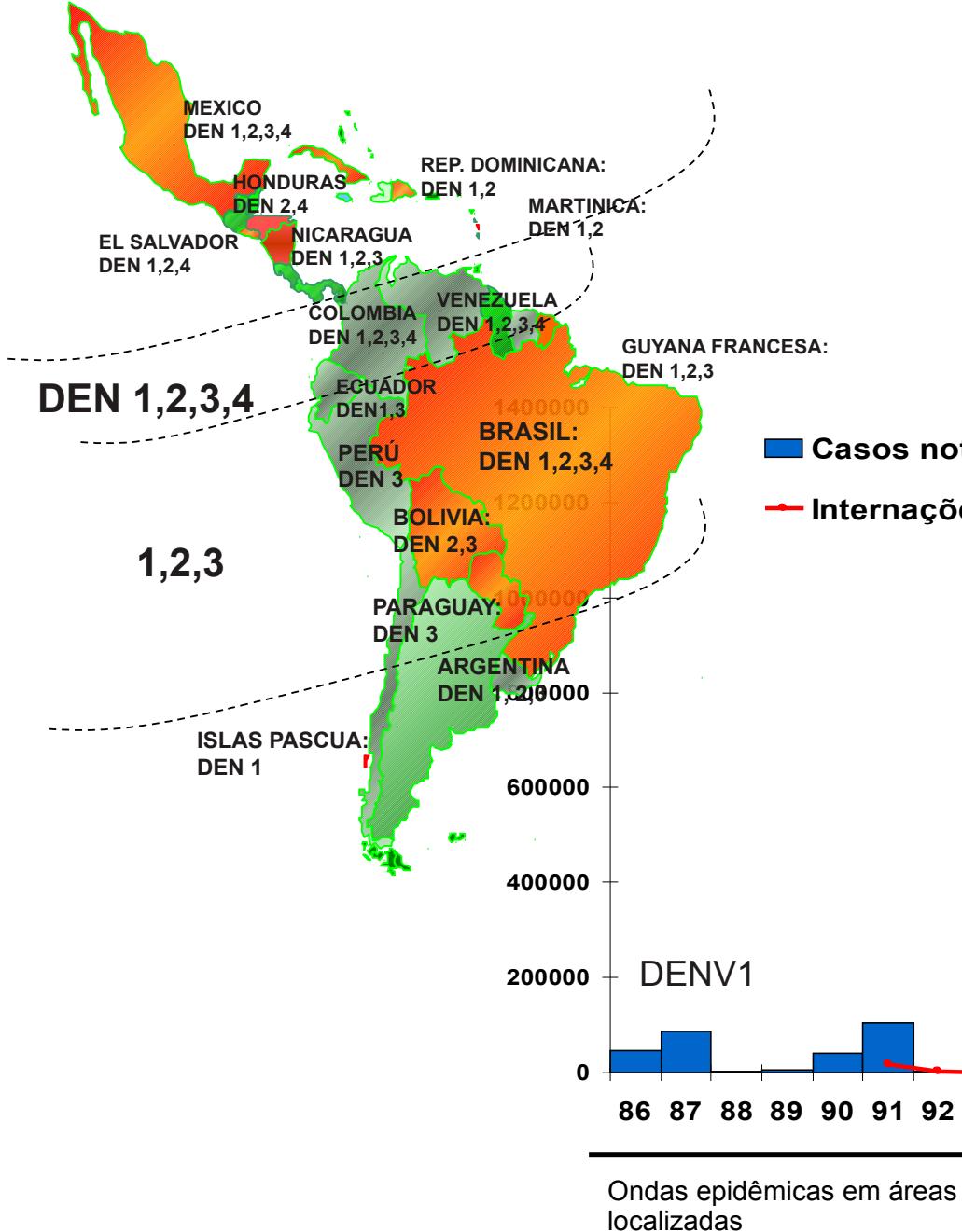
Fundação Oswaldo Cruz

# In the world

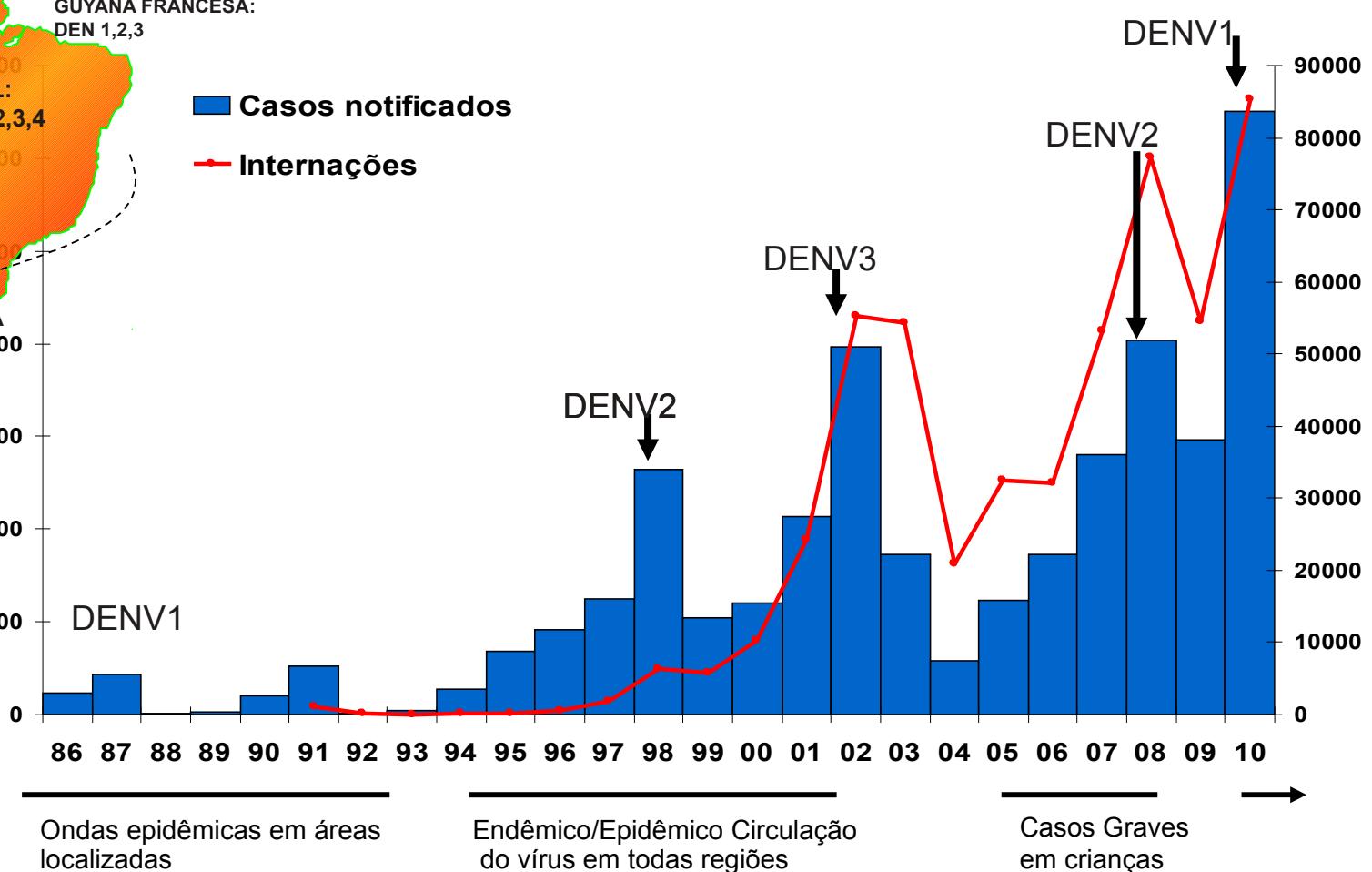


# Evolución del dengue en las Américas 1980-2010





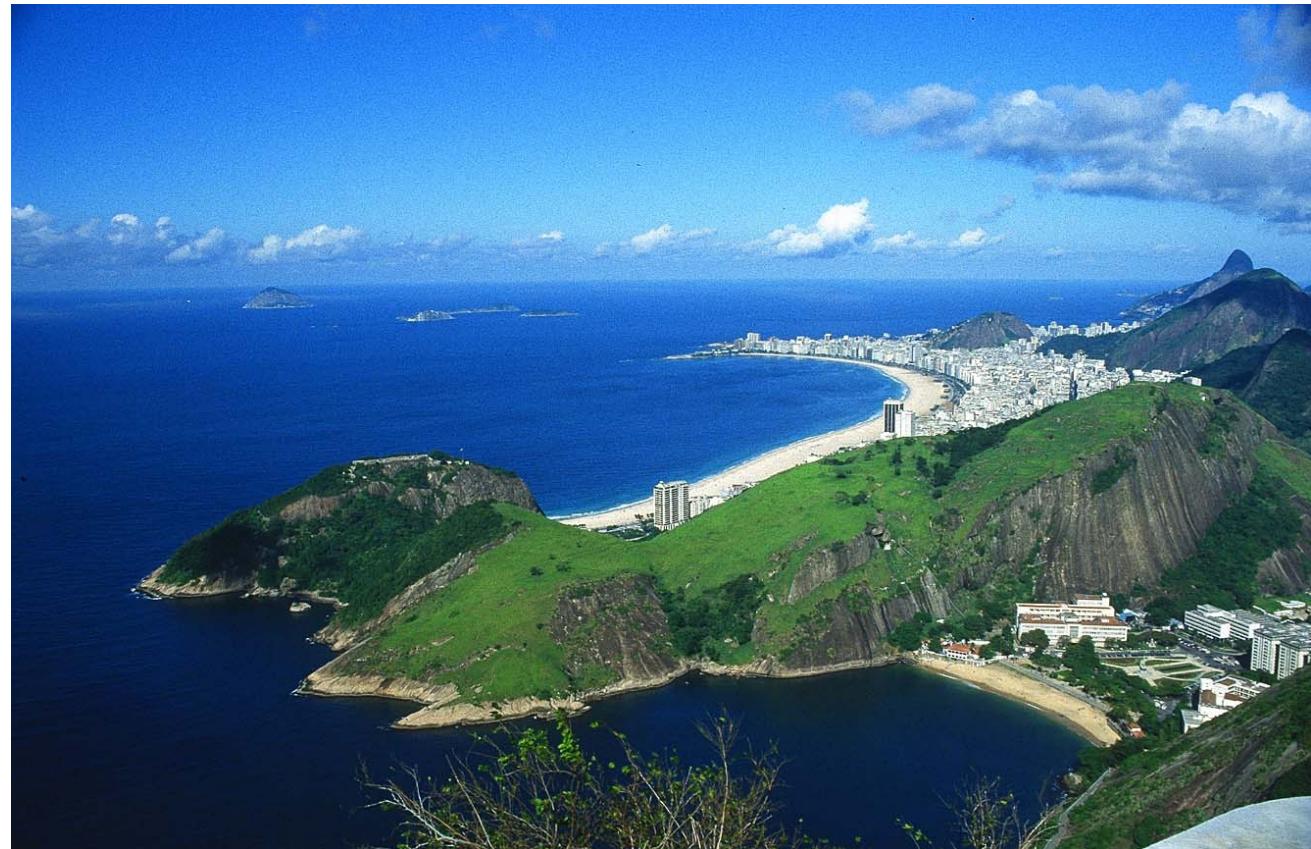
## In Brazil



# Rio de Janeiro

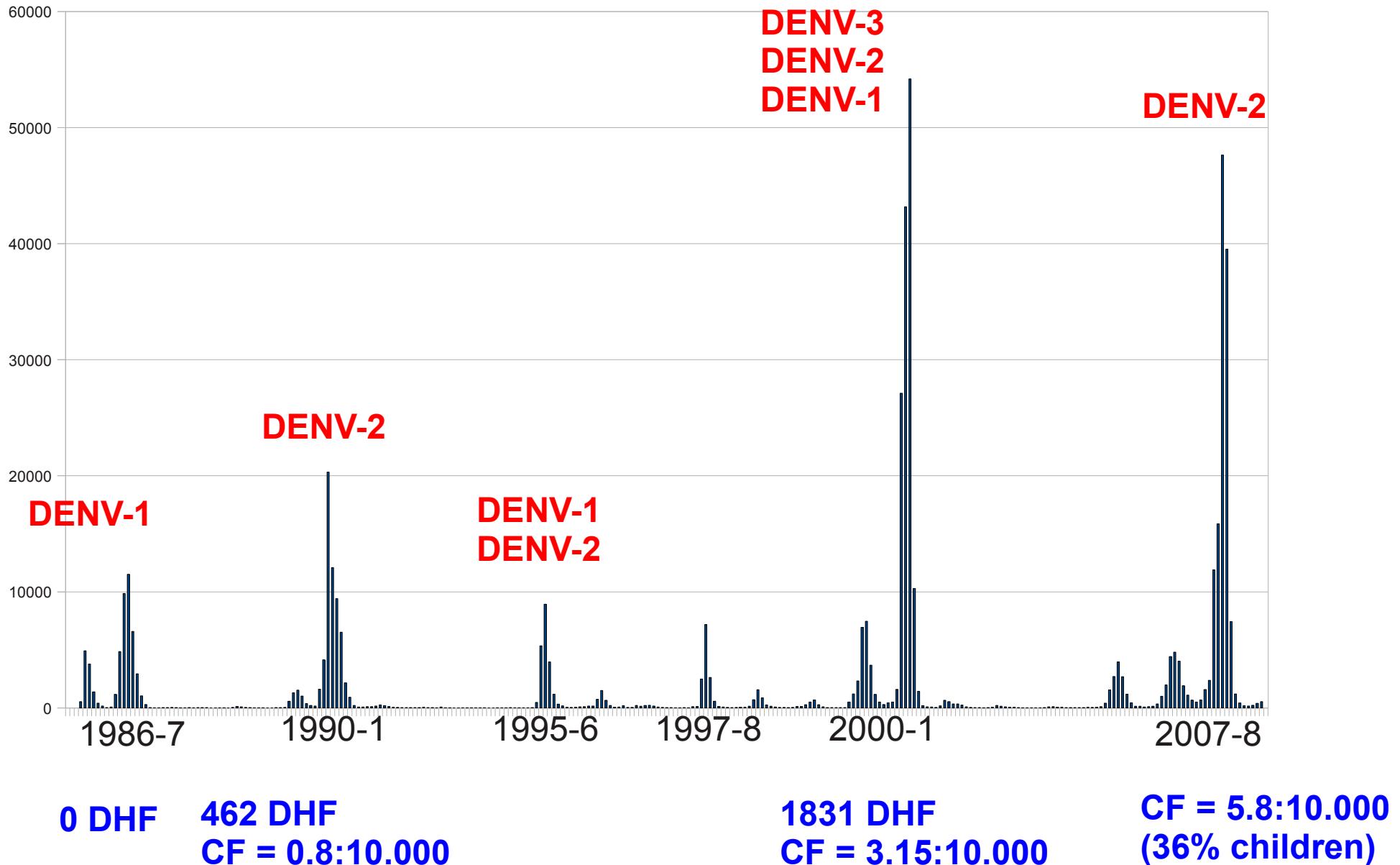


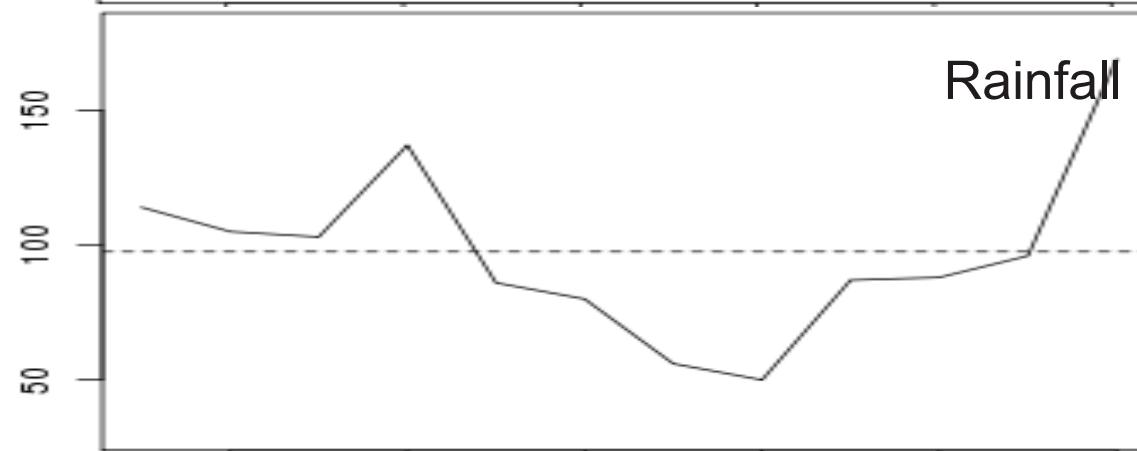
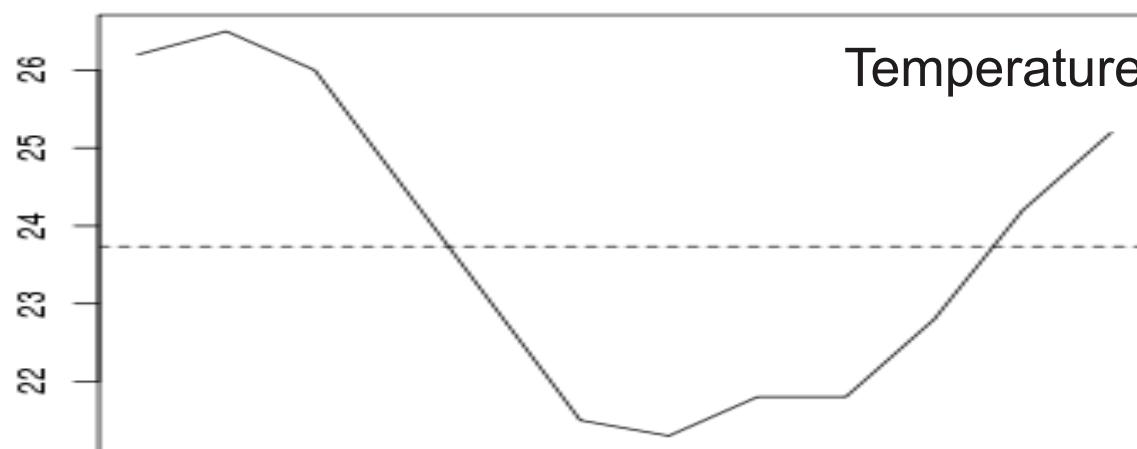
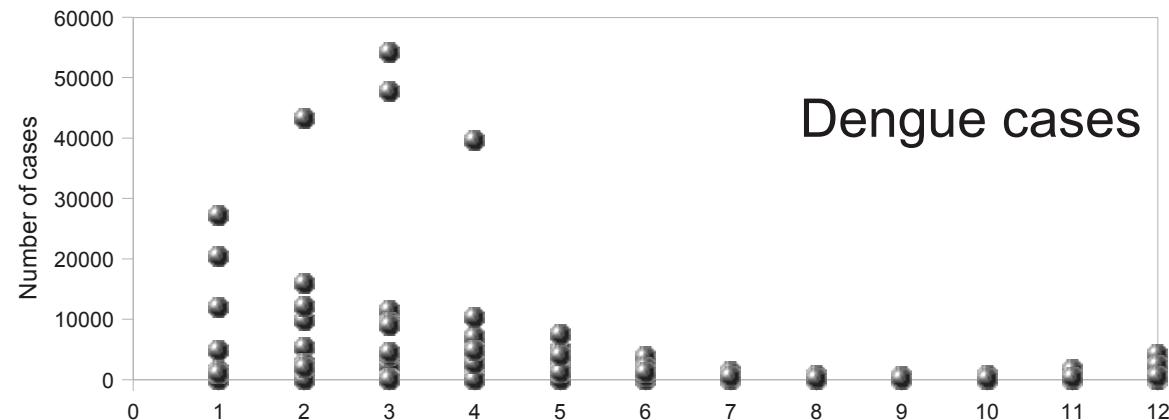
Population: 6.000.000  
Neighborhoods: 160  
Favelas: 749  
Premises: 2.000.000  
Population  
in Favelas: 1.000.000



Port-of-entry of DENV 1, 2, and 3

# Dengue in Rio de Janeiro



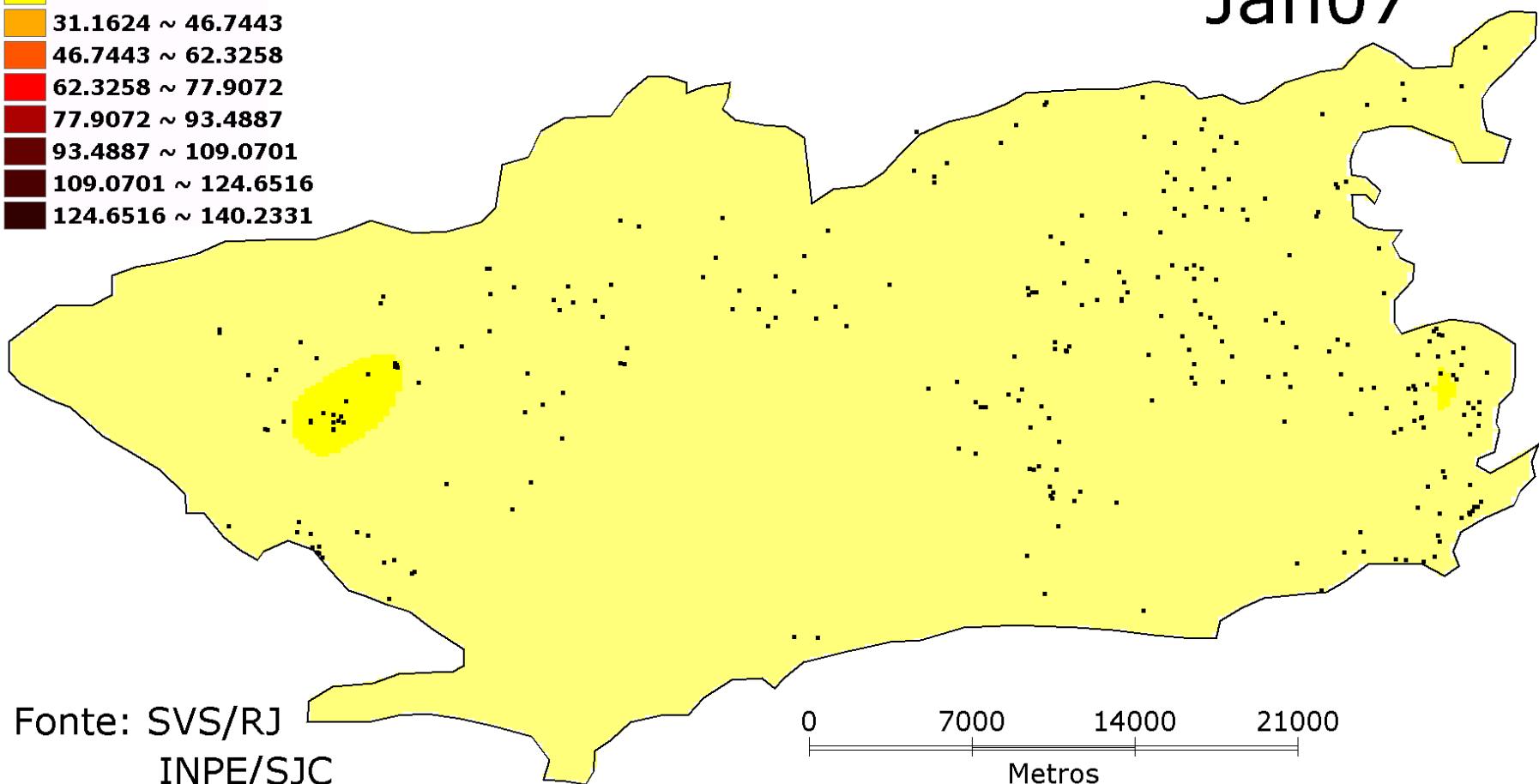


# Município do Rio de Janeiro - Casos de dengue 2007

## Legenda

- 0.0001 ~ 15.5814
- 15.5814 ~ 31.1624
- 31.1624 ~ 46.7443
- 46.7443 ~ 62.3258
- 62.3258 ~ 77.9072
- 77.9072 ~ 93.4887
- 93.4887 ~ 109.0701
- 109.0701 ~ 124.6516
- 124.6516 ~ 140.2331

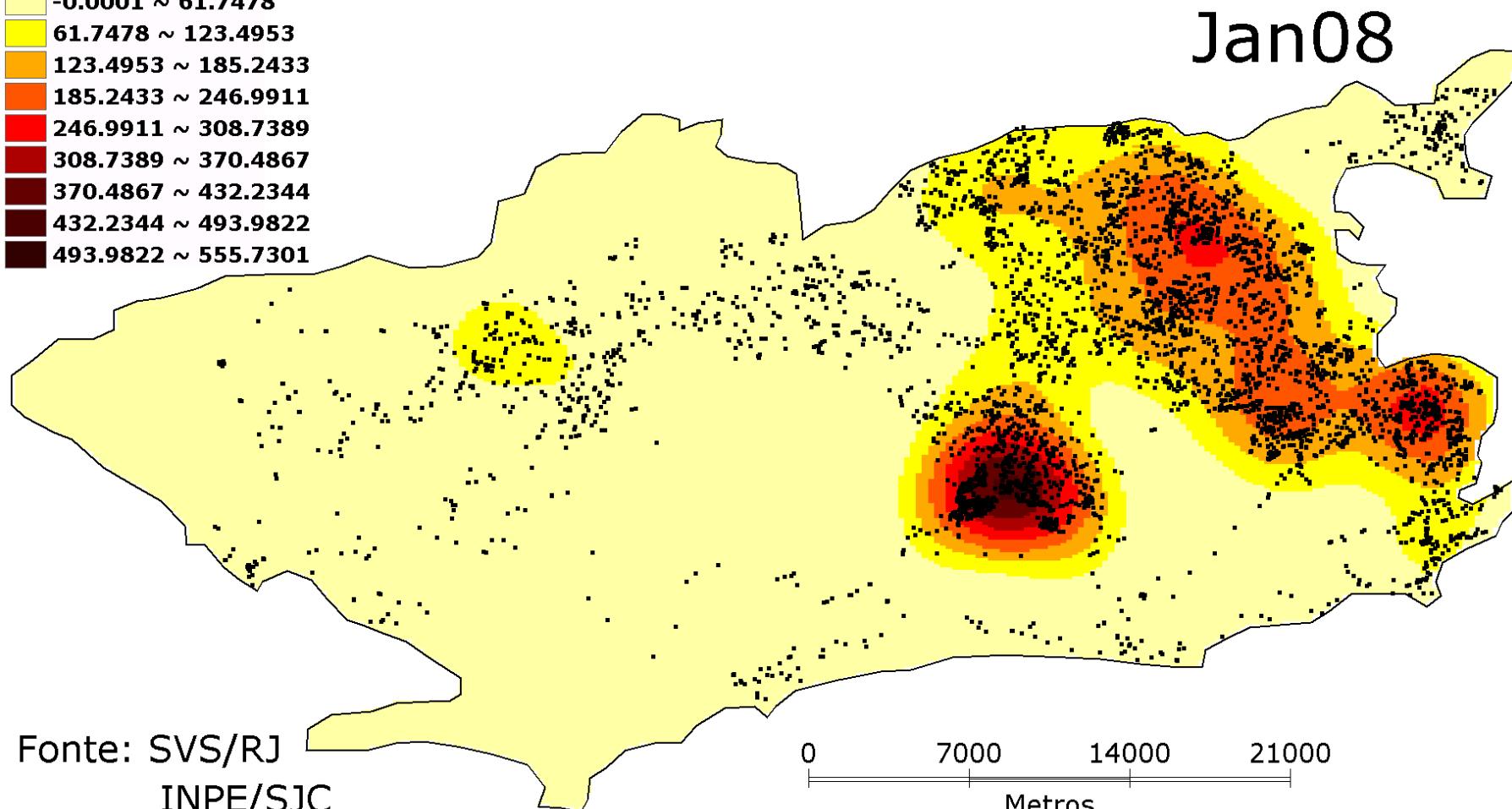
Jan07



# Município do Rio de Janeiro - Casos de dengue 2008

## Legenda

-0.0001 ~ 61.7478
61.7478 ~ 123.4953
123.4953 ~ 185.2433
185.2433 ~ 246.9911
246.9911 ~ 308.7389
308.7389 ~ 370.4867
370.4867 ~ 432.2344
432.2344 ~ 493.9822
493.9822 ~ 555.7301



# Study goals:

- To understand and model quantitatively the seasonal dynamics of dengue:
  - Early warning
  - Climate change
  - Best timing for control strategies
- To understand spatial heterogeneity

# 82 week entomological survey with ovitrap and adultrap (september 2006 to march 2008)



**Legend**  
**Neighborhoods**  
1 Tubiacanga  
2 Higienópolis  
3 Palmares  
□ Study area



Font:

Ortophoto: PortalGeo - IPP- Rio de Janeiro

Digital map: Geoprocessing Laboratory - ICICT/ Fiocruz

## TARGET



## TRAP



Ovitraps

## INDEX

Eggs/trap

% Positive traps

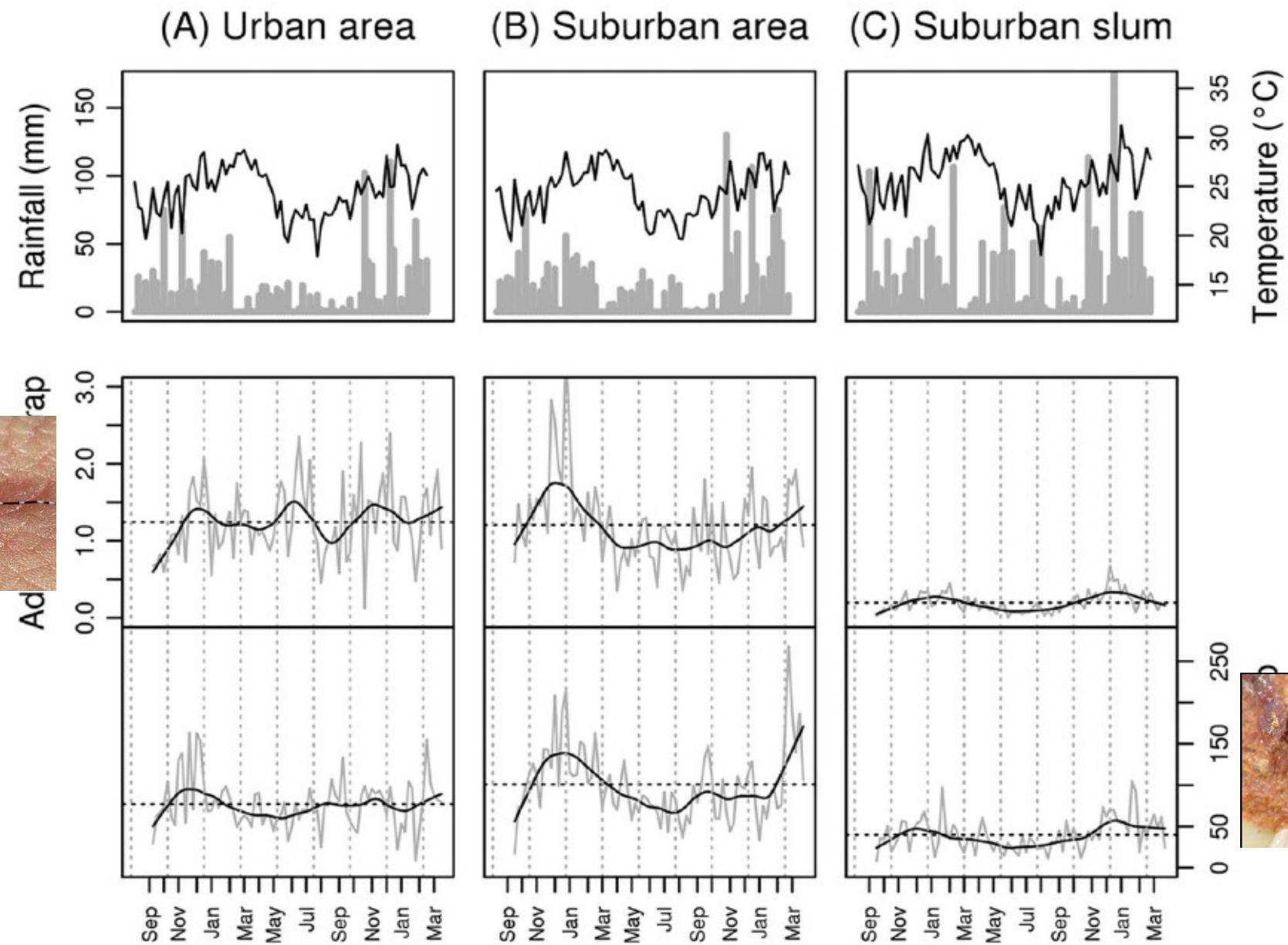


Mosquitraps

Adults/trap

% Positive traps

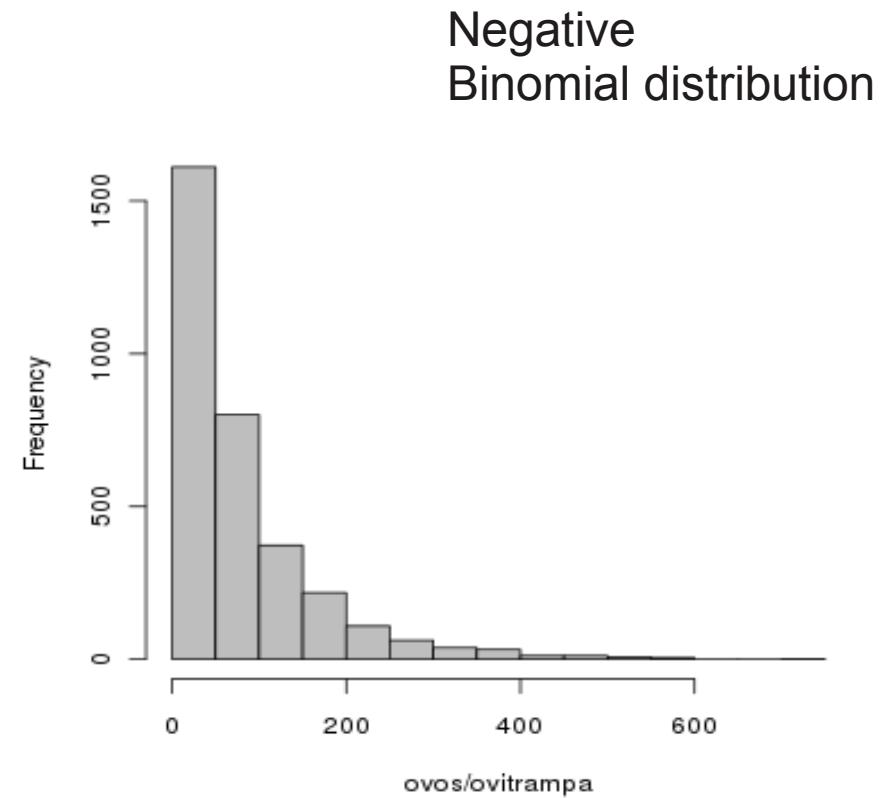
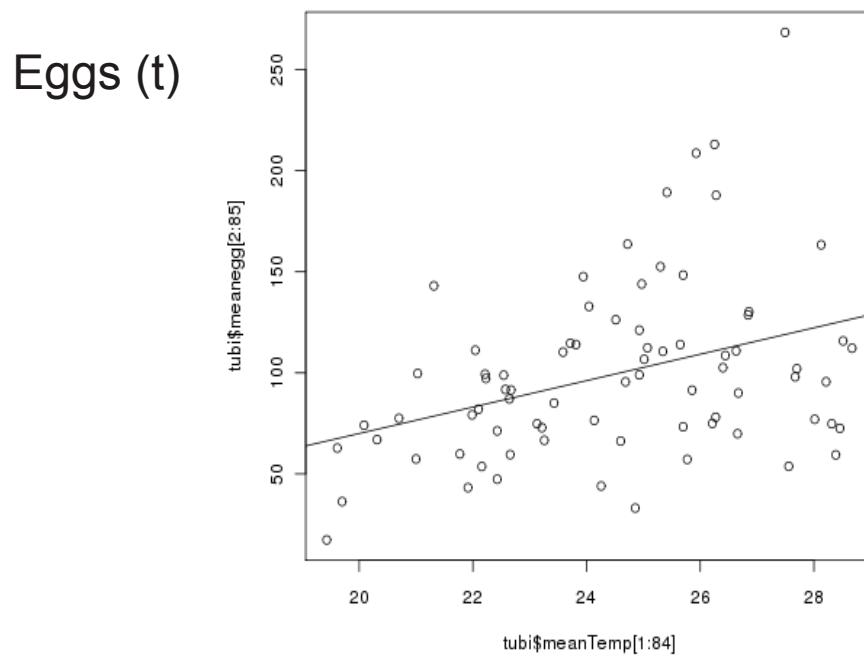
## Time series of captured adults and eggs: seasonality?



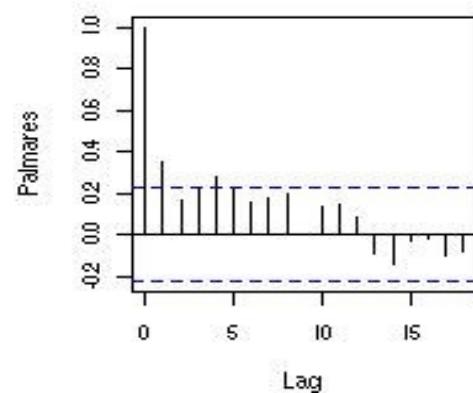
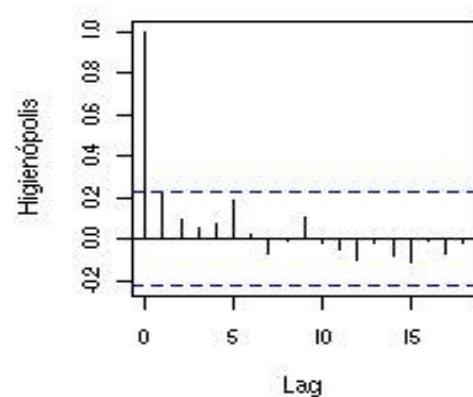
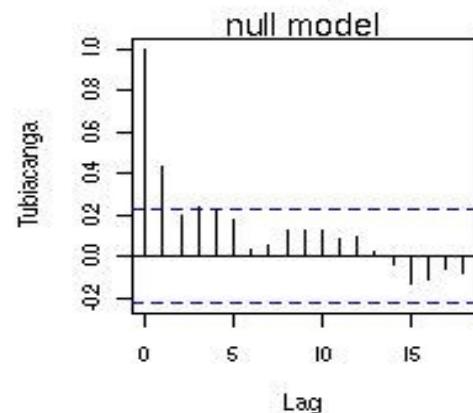
# General linear modeling: quantitative predictions of the effect of climate on mosquito abundance

Hypotheses:

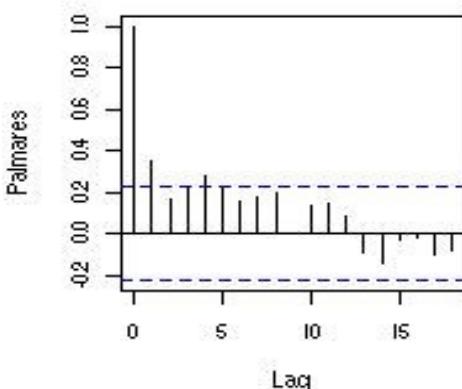
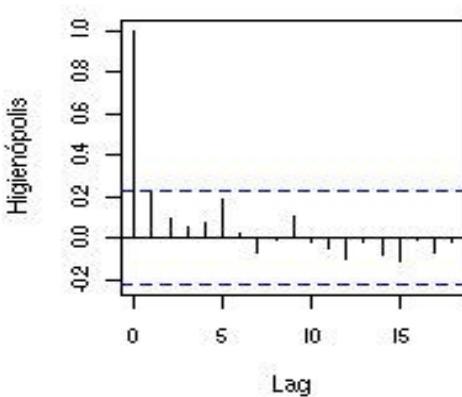
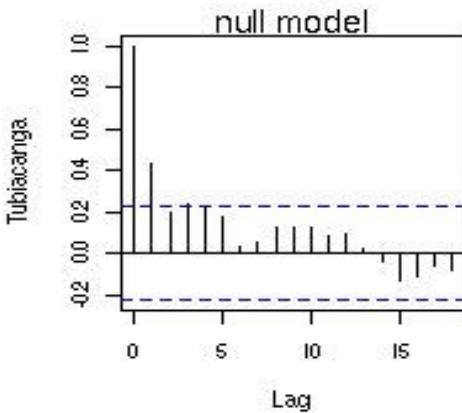
- Higher temperatures imply more mosquitos with a certain delay
- More rainfall imply more mosquitos with a certain delay



## Auto-correlation structure



## Auto correlation structure



### Models:

$$Y_t \sim NegBin$$

$$E[Y_t] = a_0 \quad \text{null}$$

$$E[Y_t] = a_0 + a_1 Y_{t-1} \quad \text{AR1}$$

$$E[Y_t] = a_0 + a_1 Y_{t-1} + a_2 Temp_{t-m} \quad \text{+ temperature}$$

$$E[Y_t] = a_0 + a_1 Y_{t-1} + a_2 Temp_{t-m} + a_3 Chuva_{t-n} \quad \text{+ rain}$$

### Model comparison

- Likelihood based criterion (AIC)
- Pearson's correlation
- Residuals

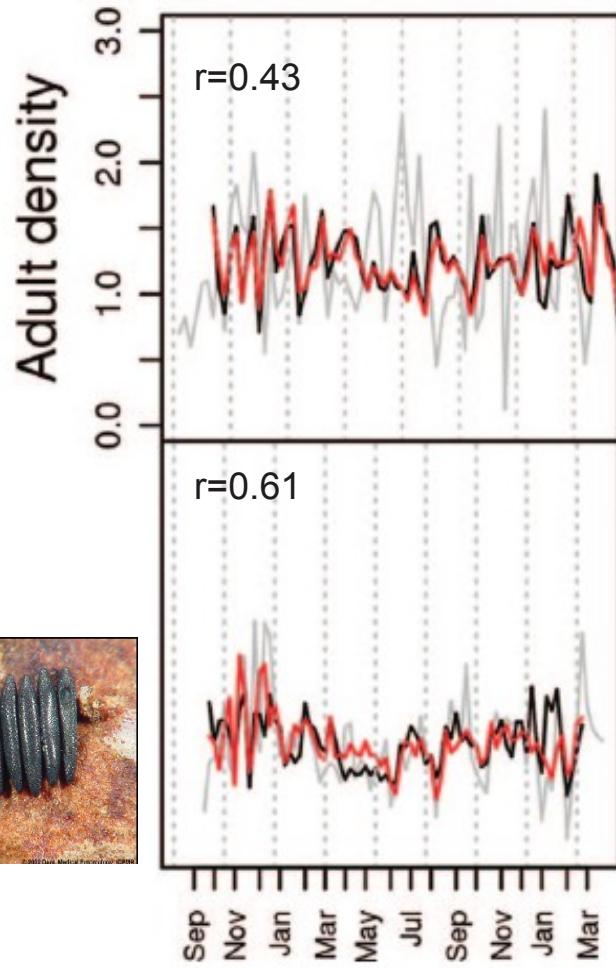
**GAM model was required:**

*Smooth* temperature term (non linear)



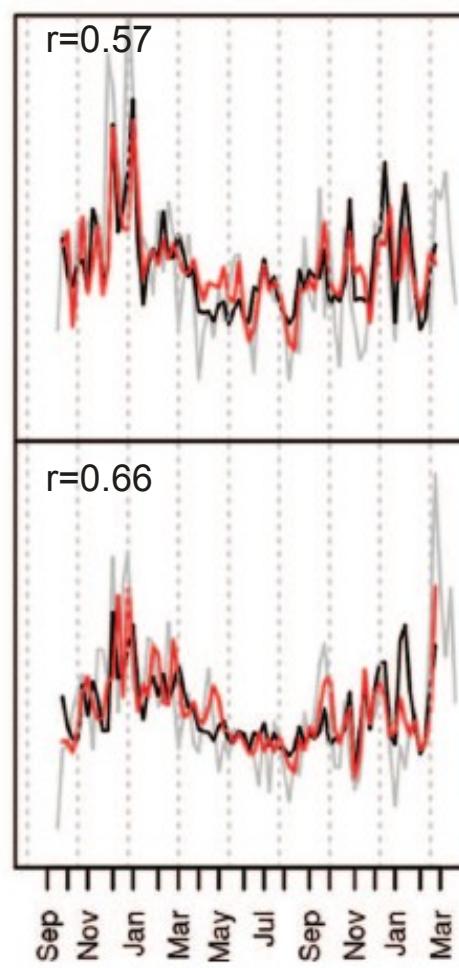
AR(1)+TEMP(1)+CHUVA(4)

(A) Urban area



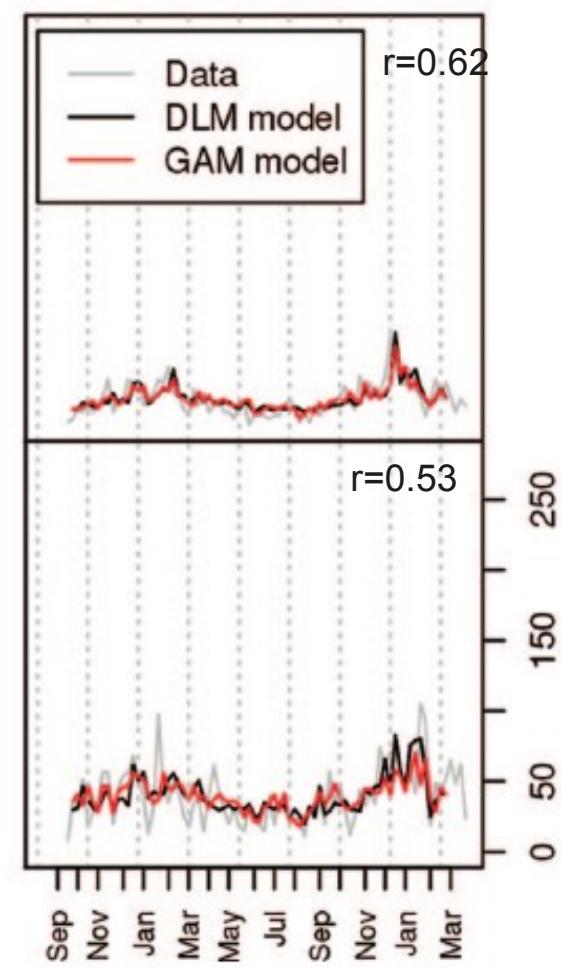
AR(1)+TEMP(1)

(B) Suburban area



AR(1)+TEMP(1)

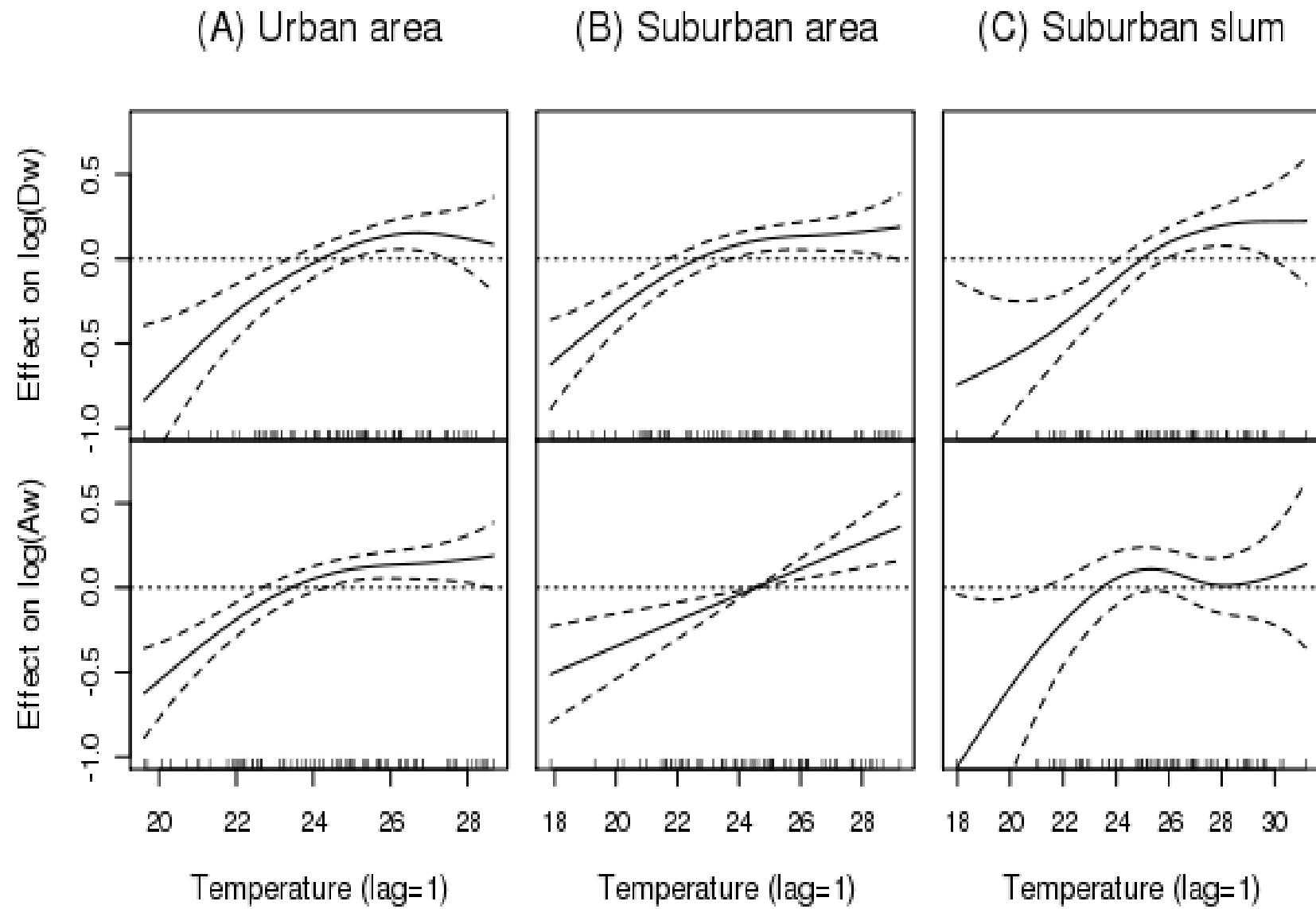
(C) Suburban slum

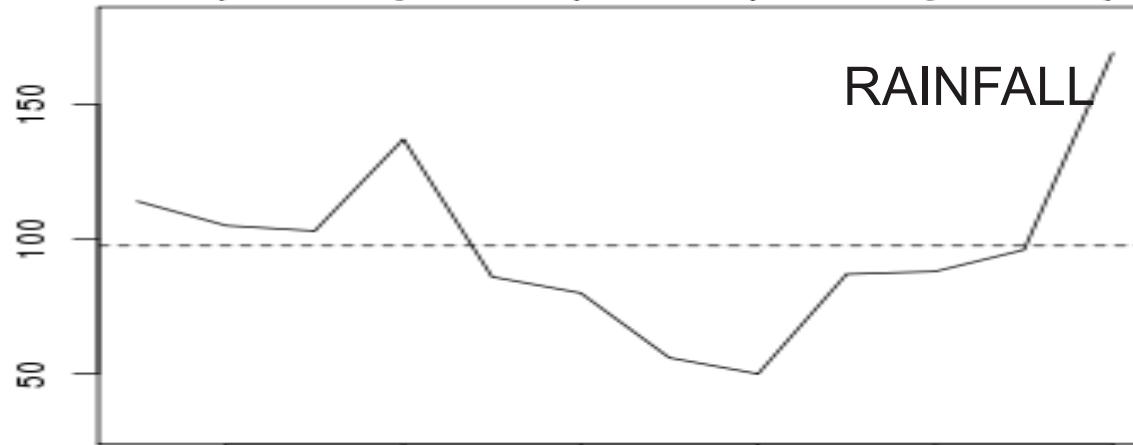
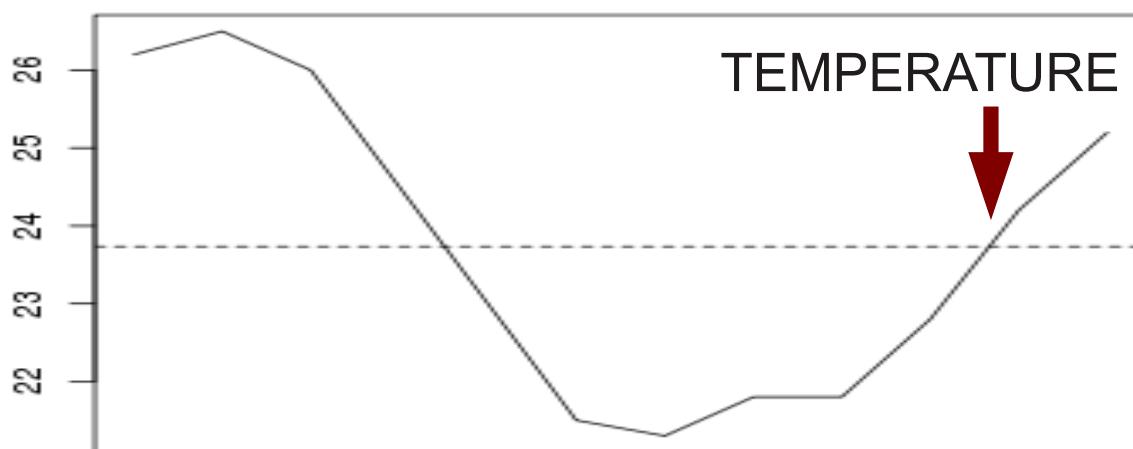
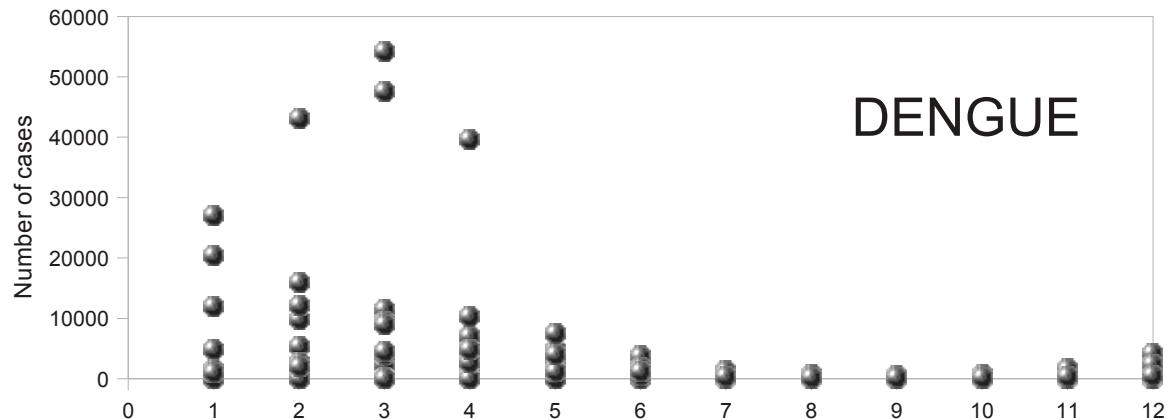


AR(1)+TEMP(1)

AR(1)+TEMP(1)+CHUVA(1)

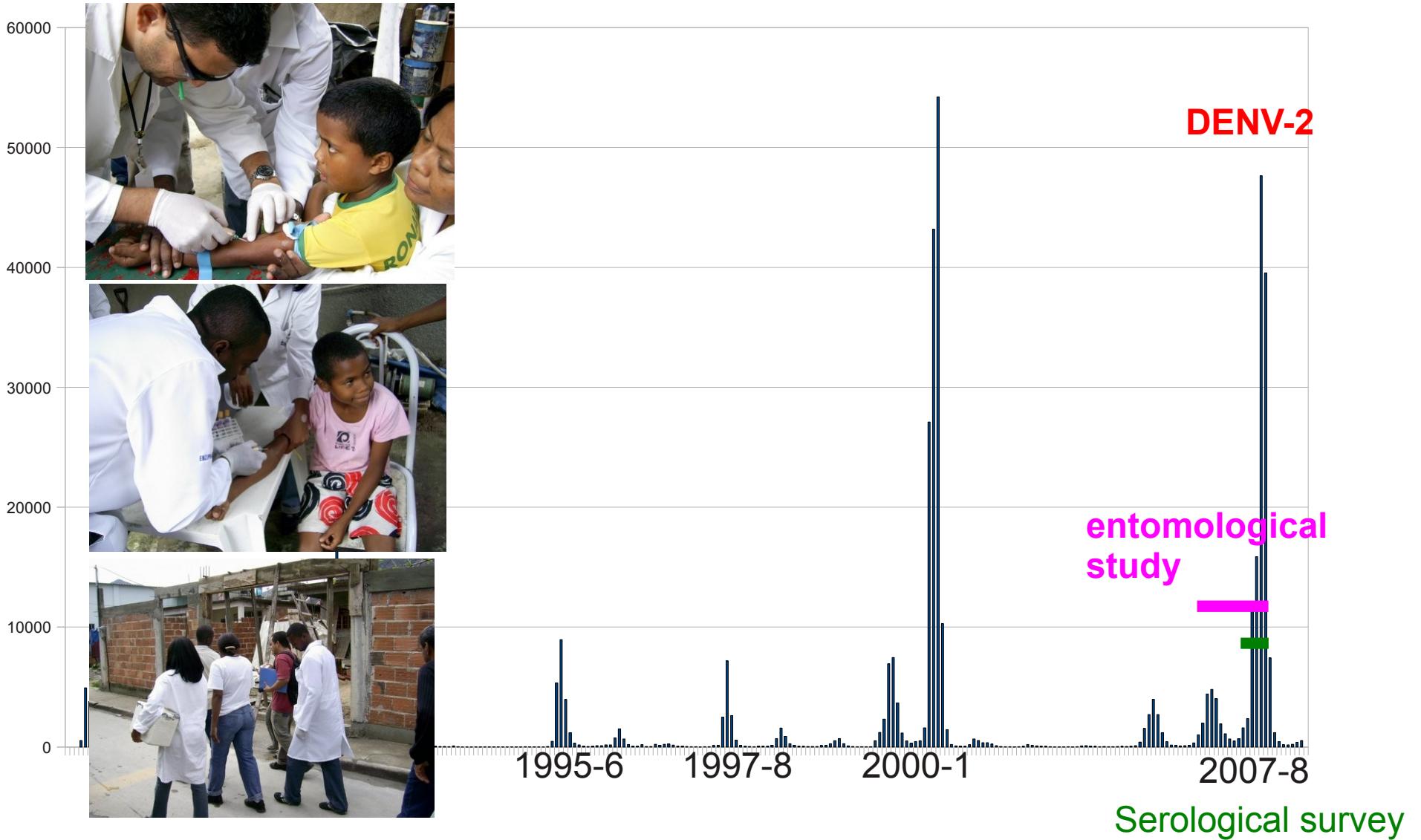
AR(1)+TEMP(1)+CHUVA(4)





Mosquito growth

# Serological survey

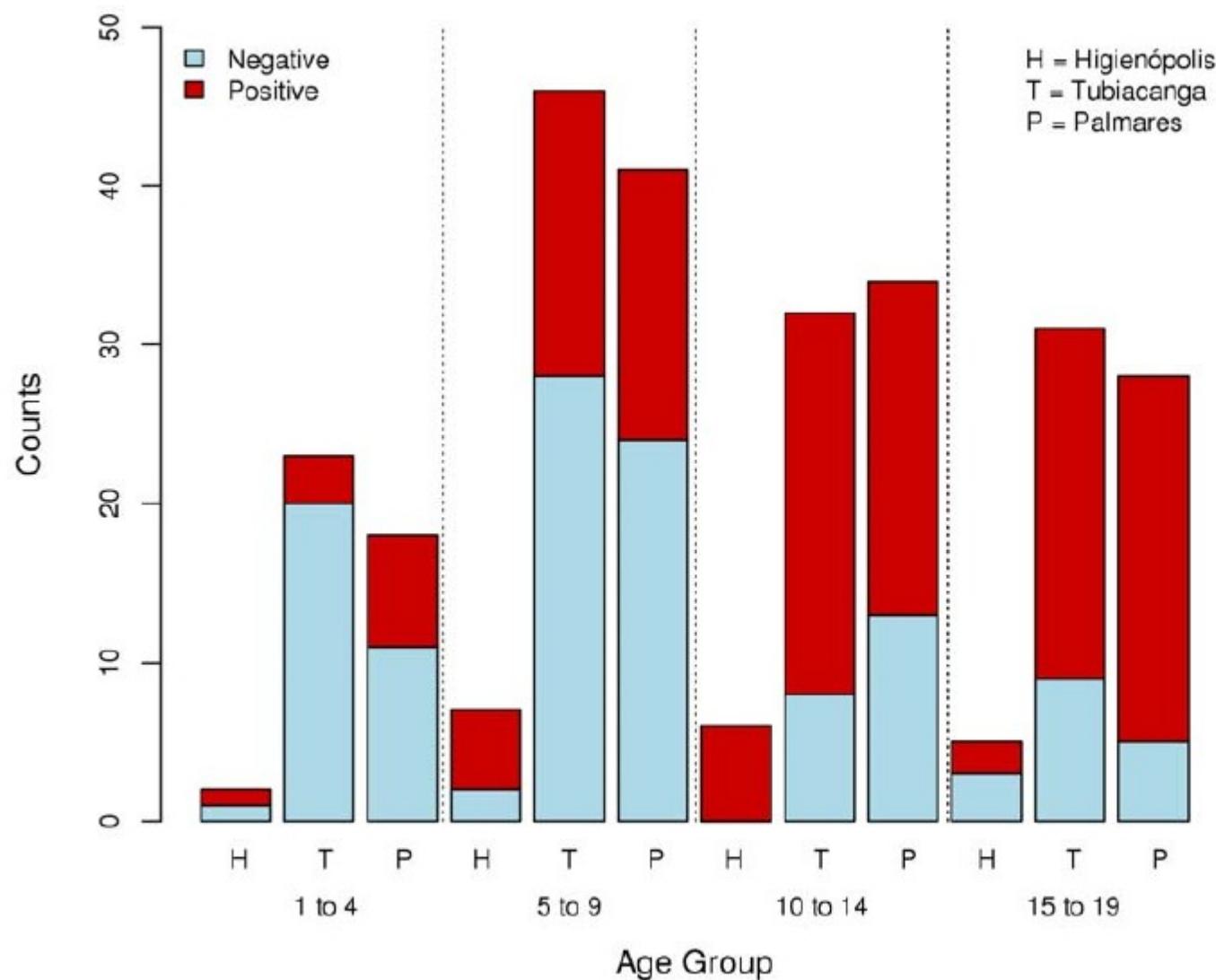


**Table 1.** Serological surveys, July-November 2007 and February-April 2008 in three areas, Rio de Janeiro, Brazil.

Area (type)	Serum sample (IgM) - Surveys			Serum sample (IgG) - Surveys		
	1 <sup>st</sup>	2 <sup>nd</sup>	Seroconversion paired sample (IgM)	1 <sup>st</sup>	2 <sup>nd</sup>	Seroconversion paired sample (IgG)
Higienópolis (Urban)	n	43	29	28	43	29
	Positives	1*	4**	2	37	27
	Median Age (range)	28.5 (4-79)	42 (4-79)	40.50 (4-79)	28.5 (4-79)	42 (4-79)
Tubiacanga (Suburban)	n	157	122	117	157	122
	positives	2 <sup>+</sup>	5 <sup>++</sup>	4	90	75
	Median Age (range)	11 (4-74)	12 (4-74)	12 (4-74)	11 (4-74)	12 (4-74)
Palmares (Suburban slum)	n	126	107	102	126	107
	positives	6 <sup>†</sup>	15 <sup>††</sup>	11	72	73
	Median Age (range)	11 (1-52)	11 (1-52)	10 (1-52)	11 (1-52)	11 (1-52)
<b>Total</b>	<b>positives/total</b>	<b>9/326</b>	<b>24/258</b>	<b>17/247</b>	<b>199/326</b>	<b>175/258</b>
						<b>13/247</b>

Number of asymptomatic individuals: \*1; \*\*2; <sup>+</sup> 2; <sup>++</sup> 4; <sup>†</sup> 4; <sup>††</sup> 10.

Recent dengue infection was defined by the detection of DENV IgM antibodies in any sample (first or second sample) within the last 6

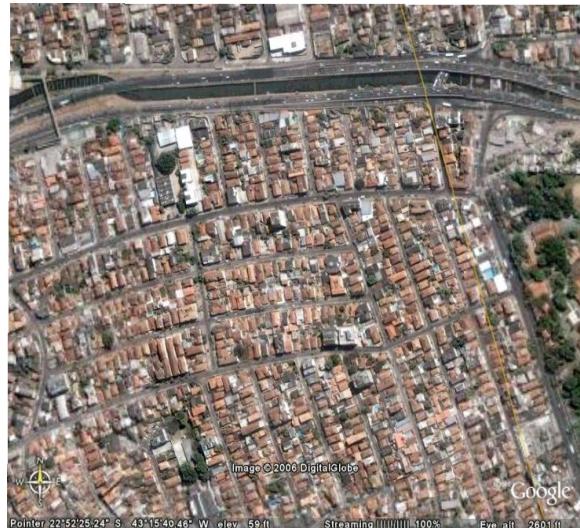


**Figure 4. Dengue seroprevalence per age group.** Dengue seroprevalence per age group (1 to 4, 5 to 9, 10 to 14, 15 to 19), red are positive and blue indicate negative cases in Higienópolis (urban), Tubiacanga (suburban) and Palmares (suburban slum) neighborhoods in Rio de Janeiro, Brazil.

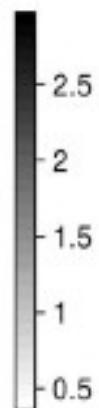
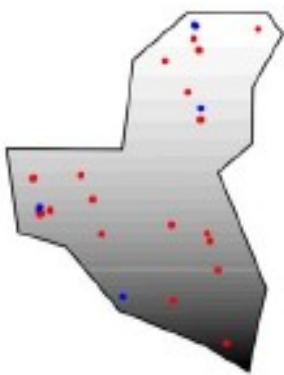
**Table 2.** Individual risk factors odds ratio for seroprevalence in three areas, Rio de Janeiro, Brazil.

Risk factor	Higienópolis			Tubiacanga			Palmares		
	N	OR	P	N	OR	P	N	OR	P
Sex	Male	22	1	73	1		61	1	
	Female	22	1.179e+08	0.99	89	1.93	0.05	70	0.66 0.26
Age	0–10 years	10	1	77	1		64	1	
	11–20 years	10	1.000e+00	1.00	55	7.91	0.001	60	3.42 0.01
	21–100 years	24	3.662e+08	0.99	30	25.39	0.001	7	4.15 0.22
Self-reported past history of dengue	No	34	1	143	1		106	1	
	Yes	10	2.478e+07	0.99	19	5.00	0.05	25	5.35 0.05
Yellow fever vaccination	No	40	1	147	1		129	1	
	Yes	4	7735420.4	0.99	15	1.96	0.27	2	1.634e+06 0.98

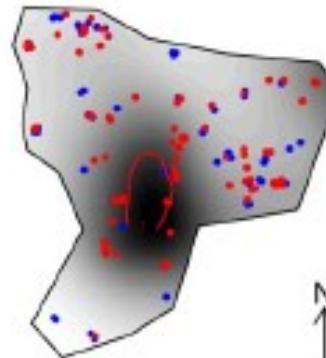
# Seropositivity odds ratio



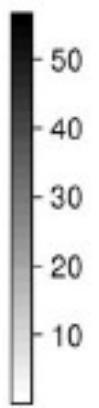
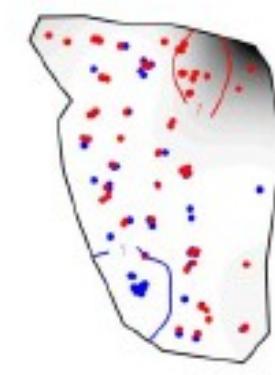
Higienópolis



Tubiacanga

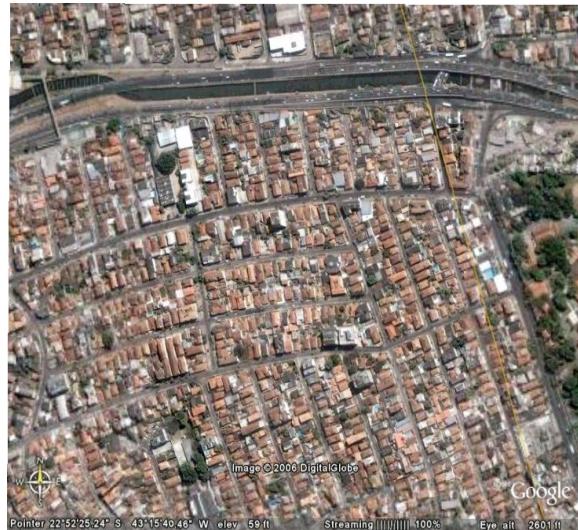


Palmares

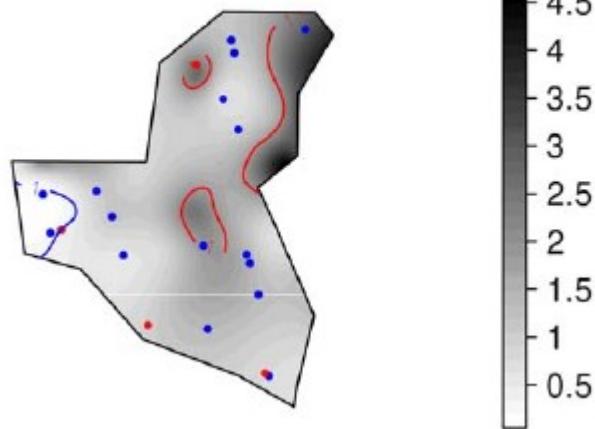


Seropositive cases

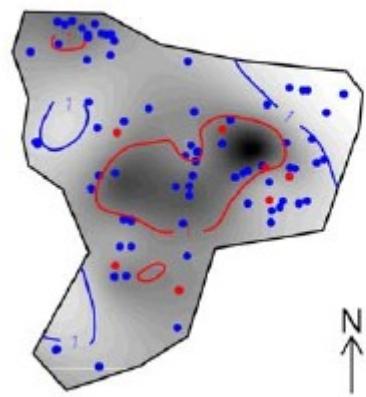
# Mosquito density x recent infections



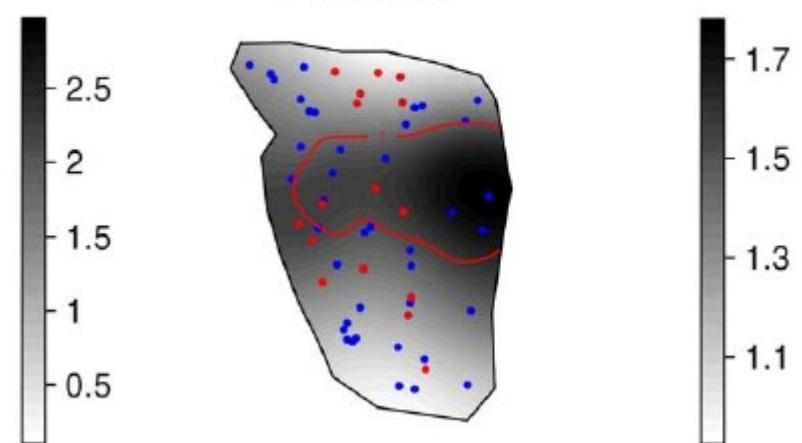
Higienópolis



Tubiacanga



Palmares



Recent cases

# Main results

- There is a threshold at 22-24 C above which *Aedes aegypti* is not constrained by temperature.
- Temperature at lag 1 and rainfall can account for 50-60% mosquito abundance variability
- There is a lag of ca. 2 months between mosquito increase and dengue cases increase
- No direct association between mosquito's hotspots and risk of infection
- Apparent association between risk of infection and closeness to high commutation areas.

# Temporal Distribution of *Aedes aegypti* in Different Districts of Rio De Janeiro, Brazil, Measured by Two Types of Traps

N. A. HONÓRIO,<sup>1,2</sup> C. T. CODEÇO,<sup>3</sup> F. C. ALVES,<sup>4</sup> M.A.F.M. MAGALHÃES,<sup>5</sup>  
AND R. LOURENÇO-DE-OLIVEIRA<sup>1</sup>

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J. Med. Entomol. 46(5): 1001–1014 (2009)

## Spatial Evaluation and Modeling of Dengue Seroprevalence and Vector Density in Rio de Janeiro, Brazil

**Nildimar Alves Honório<sup>1\*</sup>, Rita Maria Ribeiro Nogueira<sup>2</sup>, Cláudia Torres Codeço<sup>3</sup>, Marilia Sá Carvalho<sup>3</sup>, Oswaldo Gonçalves Cruz<sup>3</sup>, Mônica de Avelar Figueiredo Mafra Magalhães<sup>4</sup>, Josélio Maria Galvão de Araújo<sup>2</sup>, Eliane Saraiva Machado de Araújo<sup>2</sup>, Marcelo Quintela Gomes<sup>1</sup>, Luciane Silva Pinheiro<sup>1</sup>, Célio da Silva Pinel<sup>5</sup>, Ricardo Lourenço-de-Oliveira<sup>1</sup>**



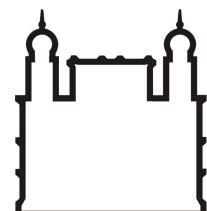
# Acknowledgements

## **Entomology, Fiocruz:**

- Nildimar Honório, Ricardo Lourenço

## **Modeling, Fiocruz:**

- Marilia Sá, Aline Nobre, Flavio Coelho
- **Rede Pronex Modelagem em Dengue CNPq**



Ministério da Saúde

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Fundação Oswaldo Cruz

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