

# A system for monitoring egg counts of the dengue disease mosquito (*Aedes aegypti*)

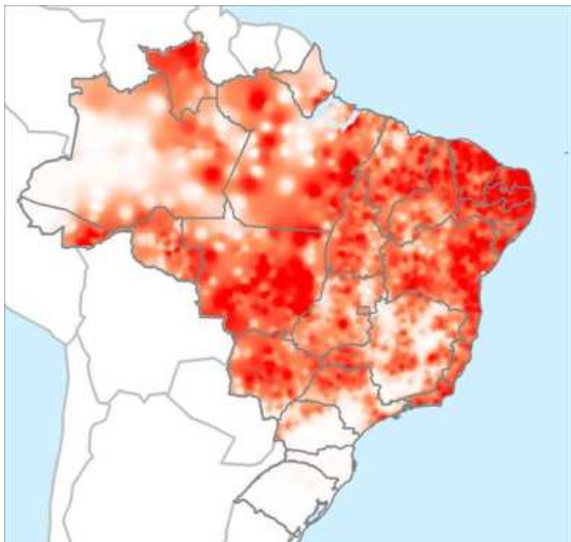
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# Introduction - the context

- Epidemiological scenario: socio, cultural and environmental aspects
- Some important tropical diseases: dengue, leptospirose, tuberculose, etc.
- The **SAUDAVEL** project
- identification and modelling of risk factors: protection for endemic and epidemic periods
- developing resources for the practice of epidemiological and entomological surveillance
- Purpose here: illustrate a general framework covering biological, epidemiological, statistical, social and decision dimensions for surveillance and control

# Dengue in Brazil

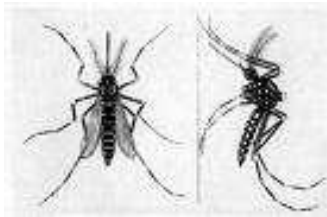


# Dengue in Brasil

- currently is one of the most important diseases
- first serotype detected in 1980
- explosive epidemics
- 500.000 cases/yr and 40 deaths/yr
- highly affected by demographic density and entomological control
- virus transmitted (only) by *Aedes* mosquitos.

# *Aedes aegypti*

- suitable environmental conditions at tropical countries
- transmissions by adult mosquito females, daily habits
- transmission after 8 to 10 days after first contact and vertical transmission



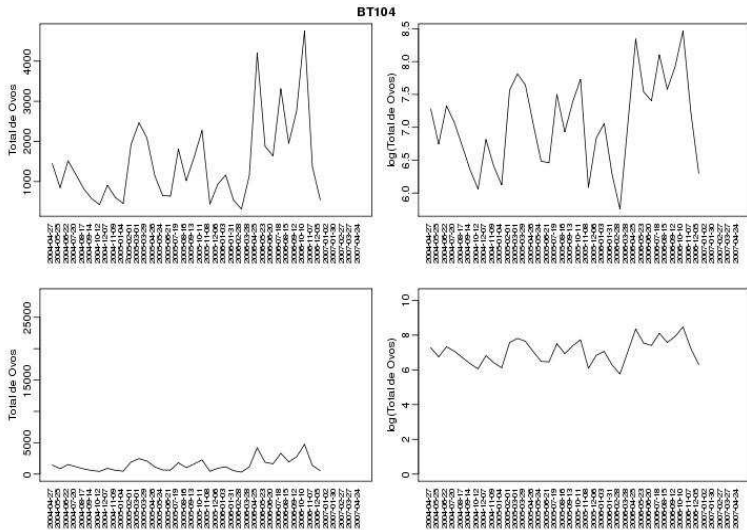
# Entomologic surveillance

- monitoring of eggs instead of adults and/or larvae (ovitrap)
- density at urban area, spatial-temporal risk maps, infestation indexes
- monitoring of water deposits.
- domestic habits, short range
- *risk* = exposure X vulnerability
  - exposure: nature, environment, extent of events
  - vulnerability: social factors, adaptation, social inequalities

# The Recife-SAUDAVEL experiment

- Desenvolvido em Recife/PE.
- start in 2004: 564 ovitraps at 6 neighbourhoods
- 7 days cycle for data collection with 25% at each week
- May 2007: 19.068 data collections, 14.829.557 eggs counted.
- **local**: place type, backyard, water supply (type, quality, frequency), recipients (size and lid)
- environmental: temperature(s), umidity, rainfall
- weekly grouped, up to 12 weeks lag
  
- movie and slides

# Her majesty, the data





# Some issues

- relate egg counts with local and environmental covariates
- effects:
  - $Y \sim Amb + Loc$
  - $Y \sim Loc + Amb$
- spatial and/or temporal
- relations within and between neighborhoods
- relations at city level
- prediction, surveillance, alarm system, intervention

# Modelo 1: No eggs $\sim$ Environment

- $\sim \beta_0 + \beta_1 X_t + \beta_2 X_{t-1} + \beta_2 X_{t-2} + \dots$
- alternatives to non/semi-parametrics, transfer functions, RW, CAR, etc
- factorial analysis
- negative binomial

Tabela: Model 1

| Effects    | Estimates | Std. errors |
|------------|-----------|-------------|
| Intercepto | 1.818     | 1.174       |
| TEMP.1     | -0.150    | 0.049       |
| TEMP.3     | 0.257     | 0.038       |
| UMI.2      | 0.0382    | 0.008       |

# Fators - max. temp.

| loads     | Factor 1      | Factor 2      | Factor 3      |
|-----------|---------------|---------------|---------------|
| Semana 1  | <b>0.9808</b> | -0.1799       | 0.0117        |
| Semana 2  | <b>0.9152</b> | -0.1335       | 0.1008        |
| Semana 3  | <b>0.7789</b> | -0.0726       | 0.2388        |
| Semana 4  | <b>0.6652</b> | -0.0263       | 0.3462        |
| Semana 5  | 0.4625        | 0.0197        | <b>0.5299</b> |
| Semana 6  | 0.3216        | 0.1194        | <b>0.5867</b> |
| Semana 7  | 0.2220        | 0.2333        | <b>0.5752</b> |
| Semana 8  | 0.1359        | 0.4048        | <b>0.4842</b> |
| Semana 9  | 0.0795        | <b>0.6043</b> | 0.3287        |
| Semana 10 | 0.0559        | <b>0.7245</b> | 0.2030        |
| Semana 11 | 0.0098        | <b>0.8607</b> | 0.0706        |
| Semana 12 | -0.0950       | <b>0.8775</b> | 0.0837        |

## Model 2: No eggs $\sim$ Environment + Local

| effects     | Estimates | Std. erros |
|-------------|-----------|------------|
| Intercepto  | 1.55      | 1.099      |
| TEMP.1      | -0.160    | 0.046      |
| TEMP.3      | 0.268     | 0.036      |
| UMI.2       | 0.0395    | 0.007      |
| RES.PEQ.SEM | 0.574     | 0.103      |
| RES.PEQ.COM | 0.178     | 0.06       |
| FREQ ABAST  | 0.420     | 0.088      |
| AGUA REDE   | -0.292    | 0.098      |

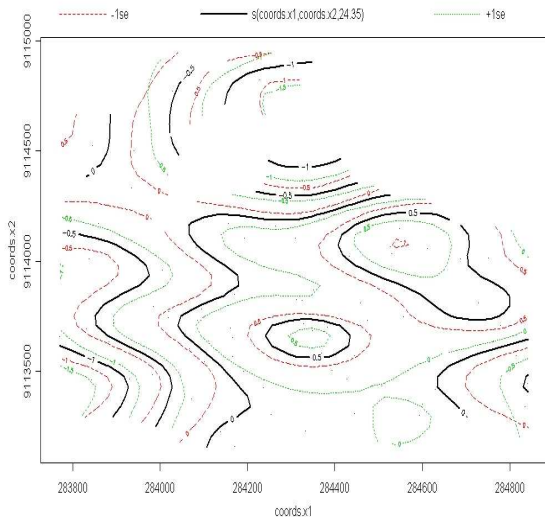
# Model 3: No eggs $\sim$ Env. + Local + Space + Time

| Effects          | Estimates | Std Errors |
|------------------|-----------|------------|
| Intercepto       | 1.209     | 0.980      |
| TEMP.1           | -0.161    | 0.041      |
| TEMP.3           | 0.284     | 0.032      |
| UMI.2            | 0.0378    | 0.006      |
| RES.PEQ.SEM      | 0.426     | 0.104      |
| Smooth functions | EDF       | F          |
| Coordinates      | 24.346    | 10.61      |
| Time             | 6.71      | 3.39       |

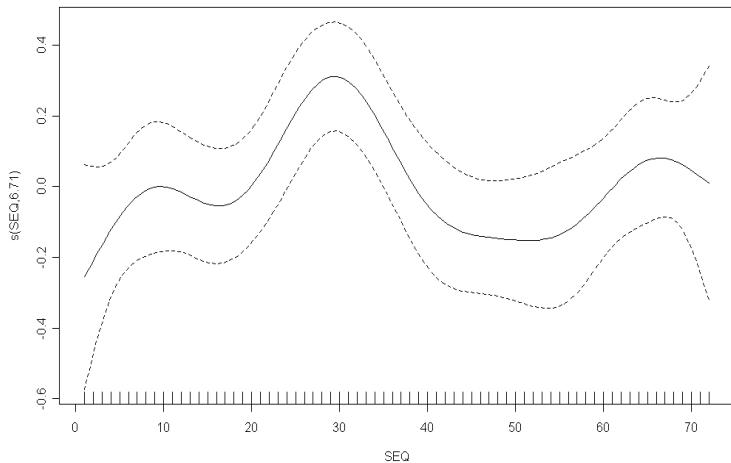
- $Y \sim$  Negative Binomial
- GAM model

$$g(E(Y)) = \beta_0 + \sum_a \beta_a x_a + \sum_l \beta_l z_l + s(c_x, c_y) + s(t)$$

# Spatial effect

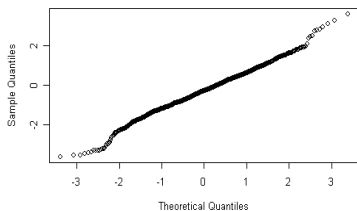


# Temporal effect

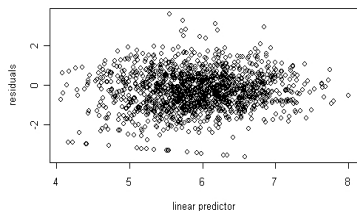


# Residuals

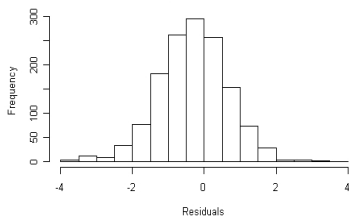
### Normal Q-Q Plot



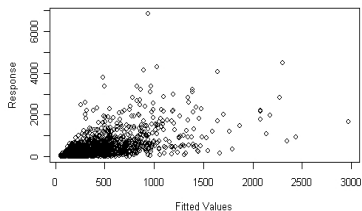
### Resids vs. linear pred.



### Histogram of residuals

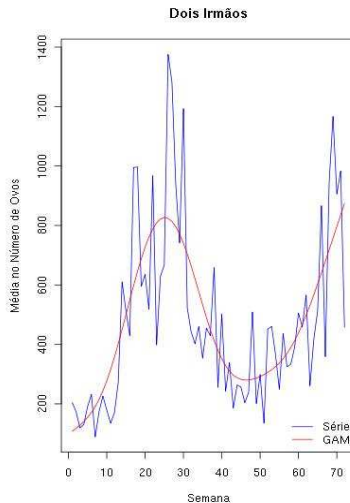
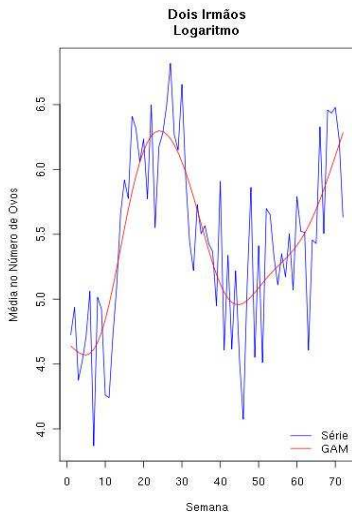


### Response vs. Fitted Values





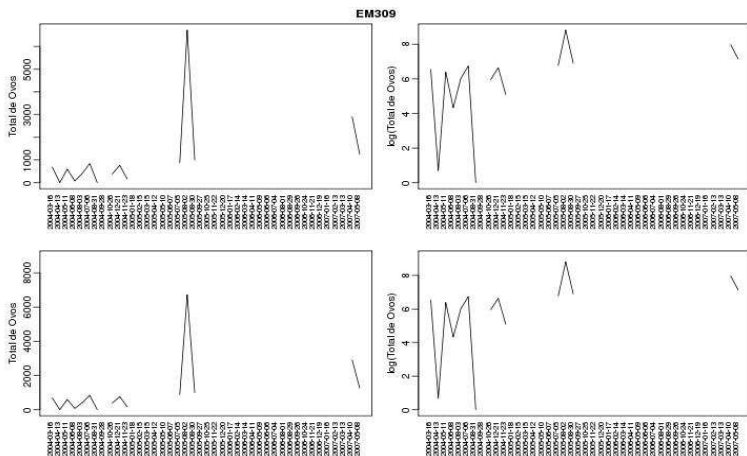
# Predicting from the model



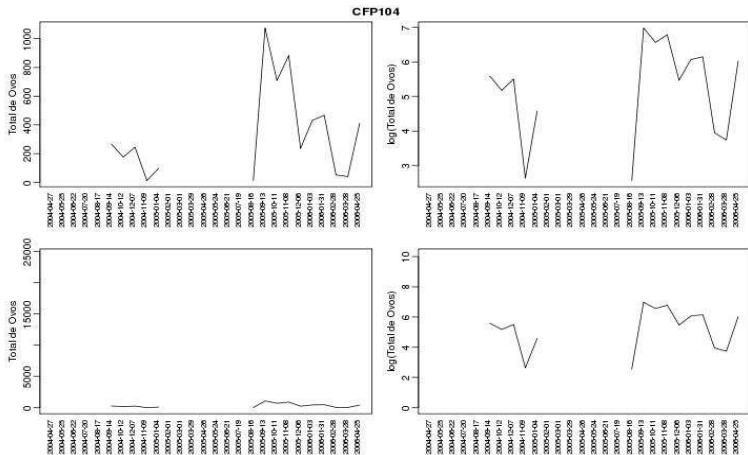
# Limitations

- Field conditions for the experiment, limited control of sources of variation
- *screening* / exploratory
- reliability of the data: missingness, peaks, outlines, local outliers

# A critical view of the data

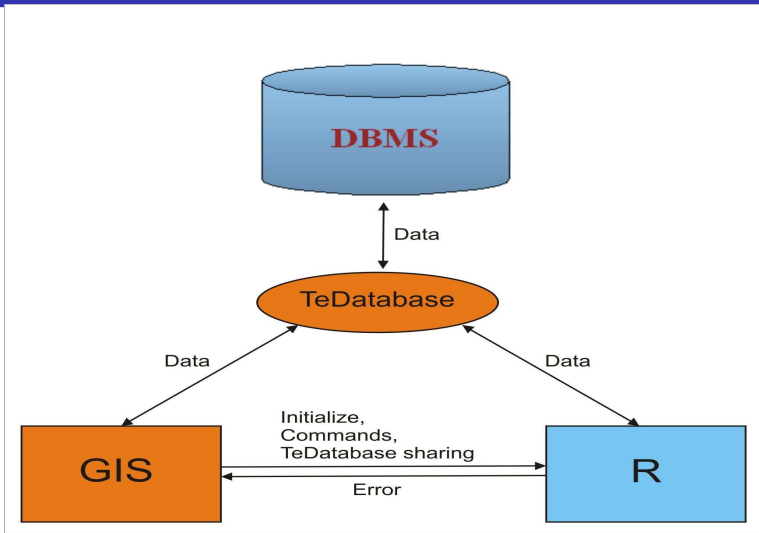


## critical view of the data



# Technology transfer

- Implementing methods:
  - environment for prototyping methods and analysis
  - R, packages and programming languages (fortran, C, C++, jags);
  - tailored/customised packages (RDengue, ...)
- Computational structure
  - Linux (cross-platform);
  - DBMS: (MySQL, postgres, etc);
  - GIS: Terralib e TerraView
  - **aRT project**: API R-Terralib;
  - automatic reports in various formats (Sweave/html): GIS, DBMS, WEB
- 100% **free software**, code and data will be made available
- rational usage of (scarce) human resources
- field implementation: SMCP project – live CD's



# Integrated environments

The screenshot displays an integrated GIS environment with three main windows:

- TerraView 3.2.0 - [Display]**: A GIS application window showing a map of a region with several pink-shaded areas. The left sidebar contains a 'Databases' panel with layers like 'BAIRROS', 'LAYER\_ARMADA', and 'newSaudavel'. Below it is a 'Views/Themes' panel with 'armas' and 'Coletas'. At the bottom, a data table is visible:

|   | COD_ARMADILHA | AUX | LOTE  | NUM_ARMADILHA | COD_SITO | COD_PESQ | PC    |
|---|---------------|-----|-------|---------------|----------|----------|-------|
| 1 | BT101         |     | BT101 | 1             | 01 BT    | 60292-0  | Gal   |
| 2 | BT102         |     | BT102 | 1             | 02 BT    | 459661   | Pr... |
| 3 | BT103         |     | BT103 | 1             | 03 BT    | 451518   | Qu... |

Number of Rows: 564, Pointed: 0, Queried: 0, Pointed and Queried: 0

- projotos:saudavel\_miguel [Wiki do LEG] - Mozilla Firefox**: A web browser window displaying a topographic map of the same region. A legend on the right shows elevation values ranging from 5.83 to 9.77. Below the map, there is a section titled 'Mapas animados (for...' with a list of items:

- Animação utilizando Supp...
- Animação utilizando regr...
- Suavizações com GAM
  - Brasília Teimosa
  - Casa Forte Pamamirín
  - Dois Irmãos
  - Funchão do Meio

At the bottom of the browser window, there is a video player for 'gamMCP.avi' with a 'Pausado 0:00 / 1:25' status and a 'Barra lateral' button.

# Acknowledgements

- Field and Lab teams at Health Secretary Recife/CVA and CPqAM/Fiocruz.
- The SAUDAVEL network.