

ARBOCARTO(R): AN OPERATIONAL SPATIAL MODELLING TOOL TO PREDICT THE DYNAMICS OF AEDES MOSQUITO SPECIES FROM WEATHER AND ENVIRONMENTAL VARIABLE

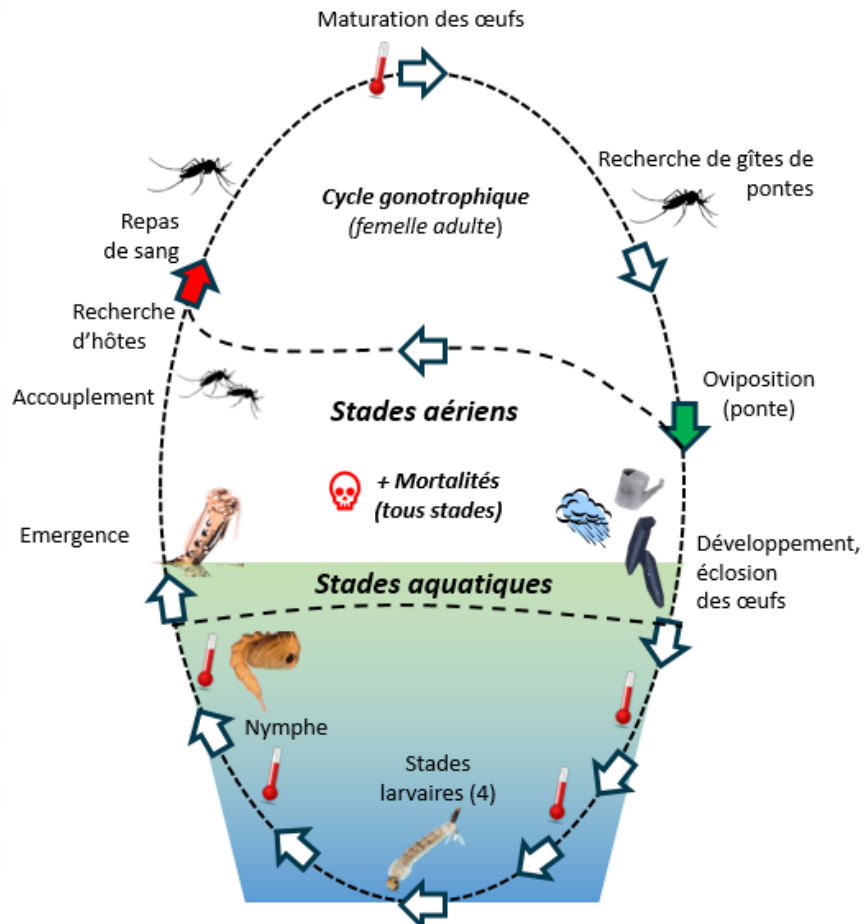
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Climate-Sensitive Vector Dynamics Modelling Workshop
 19-20 September 2024, Palazzo Regione Emilia Romagna
 Bologna, Italia

ARBOCARTO project

1. Observe and describe the biological processes and mechanisms of the species (*Ae. albopictus* and *aegypti*)
2. Identify dependence on the environment (temperature, rain, vegetation, human habitats, breeding sites, etc.)
3. Select the knowledge of interest, and formalise a mechanistic model (diagrams, "boxes", equations, code)



- Differentiate between the "states" of the mosquito life cycle:
 - aquatic (eggs, larvae, nymphs)
 - aerial (emergent, nulliparous, parous)
- Order the sequences of important "actions" carried out:
 - Emerge (males and females)
 - Reproduce (males and females)
 - Search for hosts for the blood meal (females)
 - Produce eggs (females)
 - Search for places to lay eggs (females)

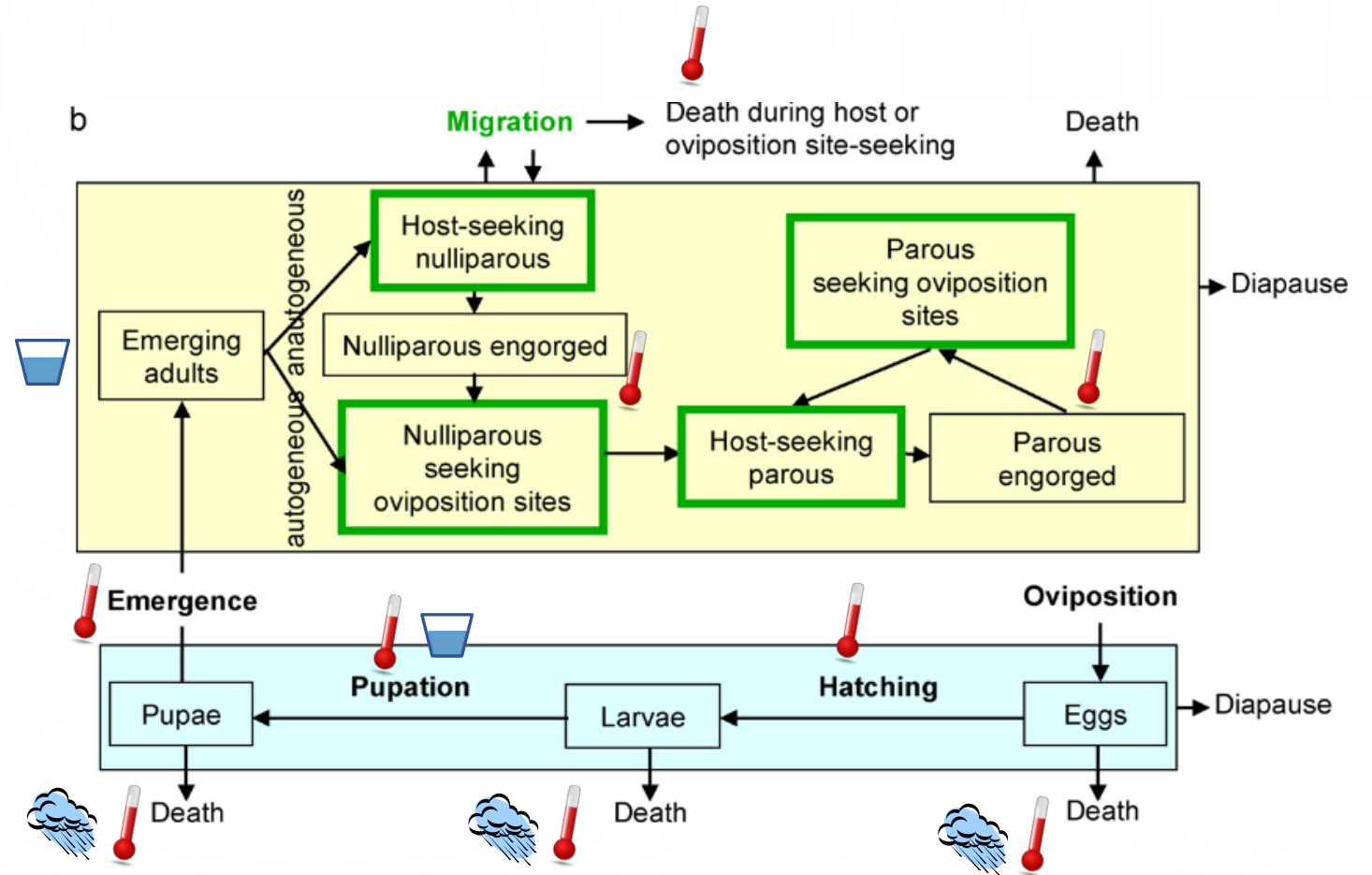
Mosquito population dynamics: compartmental model

 **Temperature-controlled processes**

 **Rain-driven processes**

 **Environmental carrying capacity**

- A way to limit the maximum number of larvae in the larval sites and the number of successful pupae emergences, depending on their respective densities

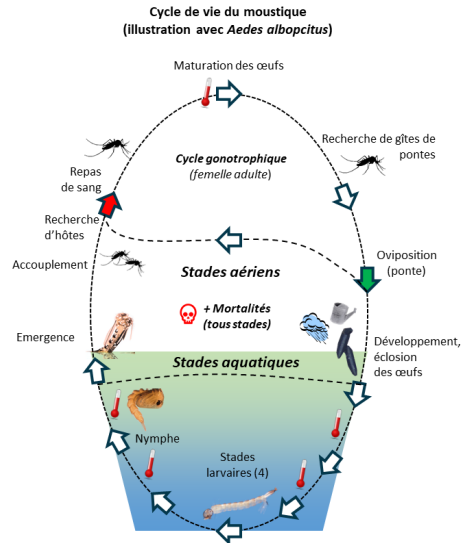


Tran A et al. ; Int J Environ Res Public Health. 2013;10: 1698–1719. doi:[10.3390/ijerph10051698](https://doi.org/10.3390/ijerph10051698)

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Cailly P. ; These de doctorat, Nantes, Ecole nationale vétérinaire. 2011. <https://www.theses.fr/2011ONIR002F>

Mosquito population dynamics: compartmental model, described by a system of ordinary differential equations (ODE)



$$z = \begin{cases} 0 & \text{during diapause} \\ 1 & \text{otherwise} \end{cases}$$

$$\dot{E} = \gamma_{A_{o \rightarrow h}} (\beta_1 A_{1o} + \beta_2 A_{2o}) - (\mu_E + z * f_{E \rightarrow L}) E$$

$$\dot{L} = z * f_{E \rightarrow L} E - \left[m_L \left(1 + \frac{L}{k_L} \right) + f_{L \rightarrow P} \right] L$$

$$\dot{P} = f_{L \rightarrow P} L - (m_P + f_{P \rightarrow Em}) P$$

$$\dot{A}_{em} = f_{P \rightarrow Em} P * \sigma * e^{-\mu_m \left(1 + \frac{P}{k_P} \right)} - (m_A + \gamma_{A_{em}}) A_{em}$$

$$\dot{A}_{1h} = \gamma_{A_{em}} A_{em} - (m_A + \mu_r + \gamma_{A_{h \rightarrow g}}) A_{1h}$$

$$\dot{A}_{1g} = \gamma_{A_{h \rightarrow g}} A_{1h} - (m_A + f_{A_{g \rightarrow o}}) A_{1g}$$

$$\dot{A}_{1o} = f_{A_{g \rightarrow o}} A_{1g} - (m_A + \mu_r + \gamma_{A_{o \rightarrow h}}) A_{1o}$$

$$\dot{A}_{2h} = \gamma_{A_{o \rightarrow h}} (A_{1o} + A_{2o}) - (m_A + \mu_r + \gamma_{A_{h \rightarrow g}}) A_{2h}$$

$$\dot{A}_{2g} = \gamma_{A_{h \rightarrow g}} A_{2h} - (m_A + f_{A_{g \rightarrow o}}) A_{2g}$$

$$\dot{A}_{2o} = f_{A_{g \rightarrow o}} A_{2g} - (m_A + \mu_r + \gamma_{A_{o \rightarrow h}}) A_{2o}$$

$$f_{E \rightarrow L} = \begin{cases} \frac{T(t) - T_E}{TDD_E} & \text{if } T(t) > T_E \\ 0 & \text{otherwise} \end{cases}$$

$$m_L(t) = e^{-\left(\frac{T(t)}{2}\right)} + \mu_L$$

$$f_{L \rightarrow P} = \begin{cases} q_1 T^2 + q_2 T + q_3 & q_1 = -0.0007 \\ & q_2 = 0.0392 \\ & q_3 = -0.3911 \end{cases}$$

$$m_P(t) = e^{-\left(\frac{T(t)}{2}\right)} + \mu_P$$

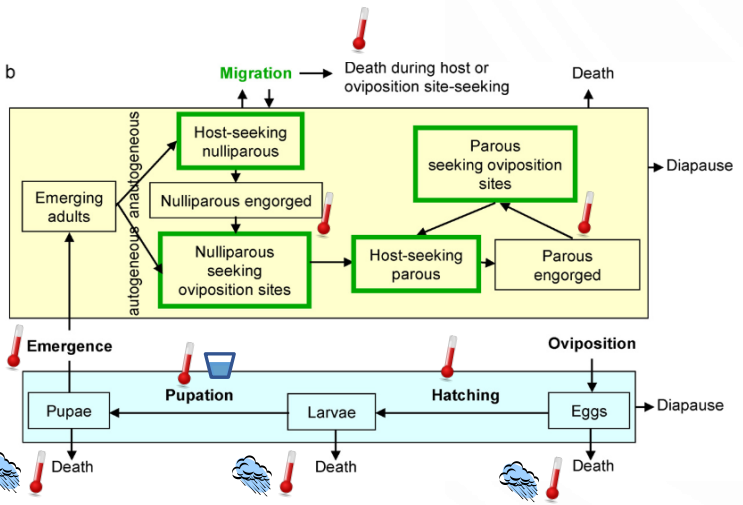
$$f_{P \rightarrow Em} = \begin{cases} q_1 T^2 + q_2 T + q_3 & q_1 = 0.0008 \\ & q_2 = -0.0051 \\ & q_3 = 0.0319 \end{cases}$$

$$k_X(t) = \kappa_{X_{Fix}} + \kappa_{X_{var}} * P_{norm}(t) \quad X \text{ in } \{L; P\}$$

$$f_{A_{g \rightarrow o}} = \begin{cases} \frac{T(t) - T_{Ag}}{TDD_{Ag}} & \text{if } T(t) > T_{Ag} \\ 0 & \text{otherwise} \end{cases}$$

$$m_A(t) = \max_t \{ \mu_A, 0.04417 + 0.00217 * T(t) \}$$

- Temperature-driven processes
- Rain-driven processes
- Carrying capacity of the environment (larval stage)



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Aedes albopictus (temperate/tropical environment)

Tiger mosquito eggs and larval sites



E



Aedes albopictus (temperate/tropical environment)

$$\dot{E} = -(\mu_E + z * f_{E \rightarrow L}) E$$

$$z = \begin{cases} 0 & \text{during diapause} \\ 1 & \text{otherwise} \end{cases}$$

$$f_{E \rightarrow L} = \begin{cases} \frac{T(t) - T_E}{TDD_E} & \text{if } T(t) > T_E \\ 0 & \text{otherwise} \end{cases}$$

Tiger mosquito eggs and larval sites



- - - Temperature-driven process
- - - Precipitation-driven process
- - - Environment-driven process

Aedes albopictus (temperate/tropical environment)

$$\dot{E} = -(\mu_E + z \cdot f_{E \rightarrow L}) E$$

$$\dot{L} = z \cdot f_{E \rightarrow L} E$$

$$z = \begin{cases} 0 & \text{during diapause} \\ 1 & \text{otherwise} \end{cases}$$

$$f_{E \rightarrow L} = \begin{cases} \frac{T(t) - T_E}{TDD_E} & \text{if } T(t) > T_E \\ 0 & \text{otherwise} \end{cases}$$

Aquatic stage



- - - Temperature-driven process
- - - Precipitation-driven process
- - - Environment-driven process

Aedes albopictus (temperate/tropical environment)

$$\begin{aligned}
 \dot{E} &= -(\mu_E + z) f_{E \rightarrow L} E \\
 \dot{L} &= z f_{E \rightarrow L} E - \left[m_L \left(1 + \frac{L}{k_L} \right) + f_{L \rightarrow P} \right] L \\
 \dot{P} &= f_{L \rightarrow P} L \\
 m_L(t) &= e^{-\left(\frac{T(t)}{2}\right)} + \mu_L \\
 f_{E \rightarrow L} &= \begin{cases} \frac{T(t) - T_E}{TDD_E} & \text{if } T(t) > T_E \\ 0 & \text{otherwise} \end{cases} \\
 f_{L \rightarrow P} &= \begin{cases} q_1 T^2 + q_2 T + q_3 & q_1 = -0.0007 \\ & q_2 = 0.0392 \\ & q_3 = -0.3911 \end{cases} \\
 k_X(t) &= \kappa_{X_{Fix}} + \kappa_{X_{var}} * P_{norm}(t), \quad X \text{ in } \{L; P\}
 \end{aligned}$$

$z = \begin{cases} 0 & \text{during diapause} \\ 1 & \text{otherwise} \end{cases}$

Aquatic stage



- Temperature-driven process
- Precipitation-driven process
- Environment-driven process

Aedes albopictus (temperate/tropical environment)

$$\begin{aligned}
 \dot{E} &= -(\mu_E + z) f_{E \rightarrow L} E \\
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Aquatic stage



- Temperature-driven process
- Precipitation-driven process
- Environment-driven process

Aedes albopictus (temperate/tropical environment)

Aquatic stage

$$\begin{aligned}
 \dot{E} &= -(\mu_E + z) * f_{E \rightarrow L} E & z &= \begin{cases} 0 & \text{during diapause} \\ 1 & \text{otherwise} \end{cases} \\
 \dot{L} &= z * f_{E \rightarrow L} E - [m_L(1 + \frac{L}{k_L}) + f_{L \rightarrow P}] L & f_{E \rightarrow L} &= \begin{cases} \frac{T(t) - T_E}{TDD_E} & \text{if } T(t) > T_E \\ 0 & \text{otherwise} \end{cases} \\
 \dot{P} &= f_{L \rightarrow P} L - (m_P + f_{P \rightarrow Em}) P & m_L(t) &= e^{-\frac{T(t)}{2}} + \mu_L \\
 \dot{Em} &= f_{P \rightarrow Em} P * \sigma * e^{-\mu_m(1 + \frac{P}{k_P})} & f_{L \rightarrow P} &= \begin{cases} q_1 T^2 + q_2 T + q_3 & q_1 = -0.0007 \\ & q_2 = 0.0392 \\ & q_3 = -0.3911 \end{cases} \\
 & & f_{P \rightarrow Em} &= \begin{cases} q_1 T^2 + q_2 T + q_3 & q_1 = 0.0008 \\ & q_2 = -0.0051 \\ & q_3 = 0.0319 \end{cases} \\
 & & k_X(t) &= \kappa_{X_{Fix}} + \kappa_{X_{var}} * P_{norm}(t) \quad X \text{ in } \{L; P\}
 \end{aligned}$$



- Temperature-driven process
- Precipitation-driven process
- Environment-driven process

Aedes albopictus (temperate/tropical environment)

$$\begin{aligned}
 \dot{E} &= -(\mu_E + z * f_{E \rightarrow L}) E \\
 \dot{L} &= z * f_{E \rightarrow L} E - [m_L(1 + \frac{L}{k_L}) + f_{L \rightarrow P}] L \\
 \dot{P} &= f_{L \rightarrow P} L - (m_P + f_{P \rightarrow Em}) P \\
 \dot{Em} &= f_{P \rightarrow Em} P * \sigma * e^{-\mu_m(1 + \frac{P}{k_P})}
 \end{aligned}$$

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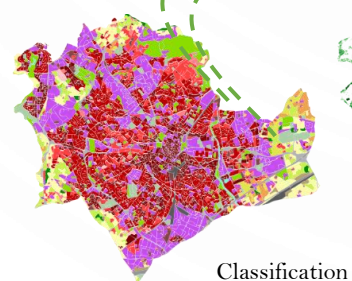
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$$k_X(t) = \kappa_{X_{Fix}} + \kappa_{X_{var}} * P_{norm}(t) \quad X \text{ in } \{L; P\}$$

- Temperature-driven process
- Precipitation-driven process
- Environment-driven process

Impoundment of egg-laying sites due to anthropogenic or meteorological actions
 K_{FIX}, K_{VAR}



Classification of the urban typology (Urban Atlas)



Additional index (végétation urbaine)

+ Hotspots identified by vector control agents
 (abandoned houses, individual gardens, etc.)



Aedes albopictus (temperate/tropical environment)

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 \dot{L} &= z * f_{E \rightarrow L} E - [m_L(1 + \frac{L}{k_L}) + f_{L \rightarrow P}] L & m_L(t) &= e^{-\frac{T(t)}{2}} + \mu_L \\
 \dot{P} &= f_{L \rightarrow P} L - (m_P + f_{P \rightarrow Em}) P & m_P(t) &= e^{-\frac{T(t)}{2}} + \mu_P \\
 \dot{A}_{em} &= f_{P \rightarrow Em} P * \sigma * e^{-\mu_m(1 + \frac{P}{k_P})} \\
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$$f_{P \rightarrow Em} = \begin{cases} q_1 T^2 + q_2 T + q_3 & q_1 = 0.0008 \\ & q_2 = -0.0051 \\ & q_3 = 0.0319 \end{cases}$$

Aerial stage: emergence of the adult



- Temperature-driven process
- Precipitation-driven process
- Environment-driven process

Aedes albopictus (temperate/tropical environment)

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$$\dot{E} = -(\mu_E + z * f_{E \rightarrow L}) E$$

$$\dot{L} = z * f_{E \rightarrow L} E - \left[m_L \left(1 + \frac{L}{k_L} \right) + f_{L \rightarrow P} \right] L$$

$$\dot{P} = f_{L \rightarrow P} L - (m_P + f_{P \rightarrow Em}) P$$

$$\dot{A}_{em} = f_{P \rightarrow Em} P * \sigma * e^{-\mu_m \left(1 + \frac{P}{k_P} \right)} - (m_A + \gamma_{A_{em}}) A_{em}$$

$$k_X(t) = \kappa_{X_{Fix}} + \kappa_{X_{var}} * P_{norm}(t), X \text{ in } \{L; P\}$$

$$f_{E \rightarrow L} = \begin{cases} \frac{(T(t) - T_E)}{TDD_E} & \text{if } T(t) > T_E \\ 0 & \text{otherwise} \end{cases}$$

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$$m_P(t) = e^{-\left(\frac{T(t)}{2}\right)} + \mu_P$$

$$f_{P \rightarrow Em} = \begin{cases} q_1 T^2 + q_2 T + q_3 & q_1 = 0.0008 \\ & q_2 = -0.0051 \\ & q_3 = 0.0319 \end{cases}$$

Adult stage



- Temperature-driven process
- Precipitation-driven process
- Environment-driven process

Aedes albopictus (temperate/tropical environment)

$$\begin{aligned}
 \dot{E} &= -(\mu_E + z) * f_{E \rightarrow L} E \\
 \dot{L} &= z * f_{E \rightarrow L} E - \left[m_L \left(1 + \frac{L}{k_L} \right) + f_{L \rightarrow P} \right] L \\
 \dot{P} &= f_{L \rightarrow P} L - (m_P + f_{P \rightarrow Em}) P \\
 \dot{A}_{em} &= f_{P \rightarrow Em} P * \sigma * e^{-\mu_m \left(1 + \frac{P}{k_P} \right)} - (m_A + \gamma_{A_{em}}) A_{em} \\
 \dot{A}_{1h} &= \gamma_{A_{em}} A_{em}
 \end{aligned}$$

$$z = \begin{cases} 0 & \text{during diapause} \\ 1 & \text{otherwise} \end{cases}$$

$$f_{E \rightarrow L} = \begin{cases} \frac{(T(t) - T_E)}{TDD_E} & \text{if } T(t) > T_E \\ 0 & \text{otherwise} \end{cases}$$

$$m_L(t) = e^{-\left(\frac{T(t)}{2}\right)} + \mu_L$$

$$f_{L \rightarrow P} = \begin{cases} q_1 T^2 + q_2 T + q_3 & q_1 = -0.0007 \\ & q_2 = 0.0392 \\ & q_3 = -0.3911 \end{cases}$$

$$m_P(t) = e^{-\left(\frac{T(t)}{2}\right)} + \mu_P$$

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$$k_X(t) = \kappa_{X_{Fix}} + \kappa_{X_{var}} * P_{norm}(t), \quad X \text{ in } \{L; P\}$$

Adult stage - host-seeking



- Temperature-driven process
- Precipitation-driven process
- Environment-driven process

Aedes albopictus (temperate/tropical environment)

$$\begin{aligned}
 \dot{E} &= z * f_{E \rightarrow L} E - (\mu_E + z * f_{E \rightarrow L}) E \\
 \dot{L} &= z * f_{E \rightarrow L} E - \left(m_L \left(1 + \frac{L}{k_L} \right) + f_{L \rightarrow P} \right) L \\
 \dot{P} &= f_{L \rightarrow P} L - (m_P + f_{P \rightarrow Em}) P \\
 \dot{A}_{em} &= f_{P \rightarrow Em} P * \sigma * e^{-\mu_m \left(1 + \frac{P}{k_P} \right)} - (m_A + \gamma_{A_{em}}) A_{em} \\
 \dot{A}_{1h} &= \gamma_{A_{em}} A_{em} - (m_A + \mu_r + \gamma_{A_{h \rightarrow g}}) A_{1h}
 \end{aligned}$$

$$z = \begin{cases} 0 & \text{during diapause} \\ 1 & \text{otherwise} \end{cases}$$

$$f_{E \rightarrow L} = \begin{cases} \frac{(T(t) - T_E)}{T_{DDE}} & \text{if } T(t) > T_E \\ 0 & \text{otherwise} \end{cases}$$

$$m_L(t) = e^{-\left(\frac{T(t)}{2}\right)} + \mu_L$$

$$f_{L \rightarrow P} = \begin{cases} q_1 T^2 + q_2 T + q_3 & q_1 = -0.0007 \\ & q_2 = 0.0392 \\ & q_3 = -0.3911 \end{cases}$$

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$$k_X(t) = \kappa_{X_{Fix}} + \kappa_{X_{var}} * P_{norm}(t), \quad X \text{ in } \{L; P\}$$

- Temperature-driven process
- Precipitation-driven process
- Environment-driven process

**Adult stage - host-seeking
(success blood feeding)**



Aedes albopictus (temperate/tropical environment)

Adult stage-search for egg-laying sites



$$z = \begin{cases} 0 & \text{during diapause} \\ 1 & \text{otherwise} \end{cases}$$

$$\dot{E} = -(\mu_E + z * f_{E \rightarrow L})E$$

$$f_{E \rightarrow L} = \begin{cases} \frac{T(t) - T_E}{TDD_E} & \text{if } T(t) > T_E \\ 0 & \text{otherwise} \end{cases}$$

$$\dot{L} = z * f_{E \rightarrow L}E - \left[m_L \left(1 + \frac{L}{k_L} \right) + f_{L \rightarrow P} \right] L$$

$$m_L(t) = e^{-\left(\frac{T(t)}{2}\right)} + \mu_L$$

$$f_{L \rightarrow P} = \begin{cases} q_1 T^2 + q_2 T + q_3 & q_1 = -0.0007 \\ & q_2 = 0.0392 \\ & q_3 = -0.3911 \end{cases}$$

$$\dot{P} = f_{L \rightarrow P}L - (m_P + f_{P \rightarrow Em})P$$

$$m_P(t) = e^{-\left(\frac{T(t)}{2}\right)} + \mu_P$$

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$$\dot{A}_{em} = f_{P \rightarrow Em}P * \sigma * e^{-\mu_m \left(1 + \frac{P}{k_P} \right)} - (m_A + \gamma_{A_{em}})A_{em}$$

$$k_X(t) = \kappa_{X_{Fix}} + \kappa_{X_{var}} * P_{norm}(t) \quad X \text{ in } \{L; P\}$$

$$\dot{A}_{1h} = \gamma_{A_{em}}A_{em} - (m_A + \mu_r + \gamma_{A_{h \rightarrow g}})A_{1h}$$

$$\dot{A}_{1g} = \gamma_{A_{h \rightarrow g}}A_{1h} - (m_A + f_{A_{g \rightarrow o}})A_{1g}$$

$$f_{A_{g \rightarrow o}} = \begin{cases} \frac{T(t) - T_{Ag}}{TDD_{Ag}} & \text{if } T(t) > T_{Ag} \\ 0 & \text{otherwise} \end{cases}$$

$$\dot{A}_{1o} = f_{A_{g \rightarrow o}}A_{1g} - (m_A + \mu_r + \gamma_{A_{o \rightarrow h}})A_{1o}$$

$$\dot{A}_{2h} = \gamma_{A_{o \rightarrow h}}(A_{1o} + A_{2o}) - (m_A + \mu_r + \gamma_{A_{h \rightarrow g}})A_{2h}$$

$$\dot{A}_{2g} = \gamma_{A_{h \rightarrow g}}A_{2h} - (m_A + f_{A_{g \rightarrow o}})A_{2g}$$

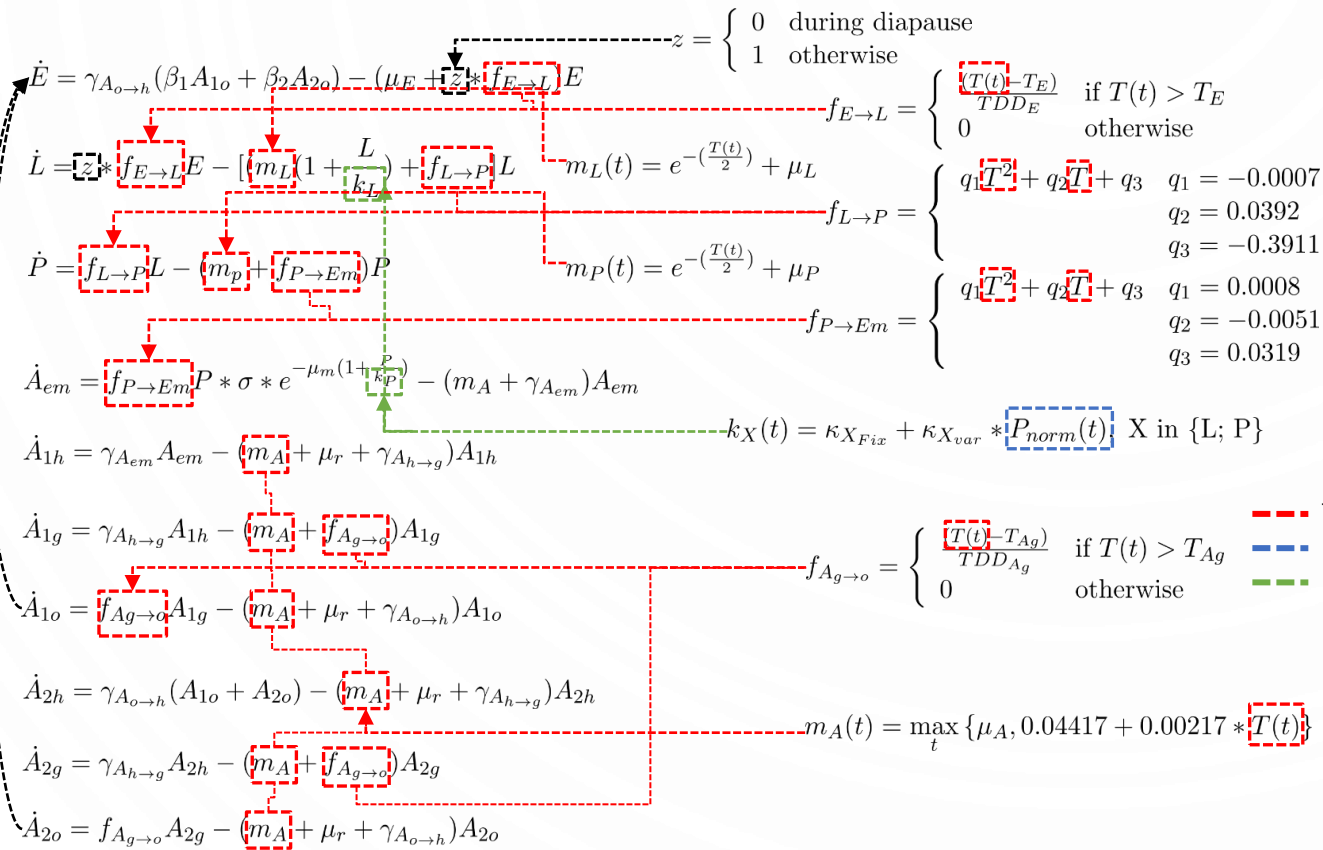
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$$m_A(t) = \max_t \{ \mu_A, 0.04417 + 0.00217 * T(t) \}$$

- Temperature-driven process
- Precipitation-driven process
- Environment-driven process

Aedes albopictus (temperate/tropical environment)

eggs laid
(back to the start of the cycle !)



Aedes albopictus (temperate/tropical environment)

eggs laid
(back to the start of the cycle !)

$$z = \begin{cases} 0 & \text{during diapause} \\ 1 & \text{otherwise} \end{cases}$$

$$\dot{E} = \gamma_{A_o \rightarrow h} (\beta_1 A_{1o} + \beta_2 A_{2o}) - (\mu_E + z * f_{E \rightarrow L}) E$$

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$$m_P(t) = e^{-\left(\frac{T(t)}{2}\right)} + \mu_P$$

$$f_{P \rightarrow Em} = \begin{cases} q_1 T^2 + q_2 T + q_3 & q_1 = 0.0008 \\ & q_2 = -0.0051 \\ & q_3 = 0.0319 \end{cases}$$

$$\dot{A}_{em} = f_{P \rightarrow Em} P * \sigma * e^{-\mu_m \left(1 + \frac{P}{k_P} \right)} - (m_A + \gamma_{A_{em}}) A_{em}$$

$$k_X(t) = \kappa_{X_{Fix}} + \kappa_{X_{var}} * P_{norm}(t) \quad X \text{ in } \{L; P\}$$

$$\dot{A}_{1h} = \gamma_{A_{em}} A_{em} - (m_A + \mu_r + \gamma_{A_{h \rightarrow g}}) A_{1h}$$

$$\dot{A}_{1g} = \gamma_{A_{h \rightarrow g}} A_{1h} - (m_A + f_{A_{g \rightarrow o}}) A_{1g}$$

$$f_{A_{g \rightarrow o}} = \begin{cases} \frac{T(t) - T_{Ag}}{TDD_{Ag}} & \text{if } T(t) > T_{Ag} \\ 0 & \text{otherwise} \end{cases}$$

$$\dot{A}_{1o} = f_{A_{g \rightarrow o}} A_{1g} - (m_A + \mu_r + \gamma_{A_{o \rightarrow h}}) A_{1o}$$

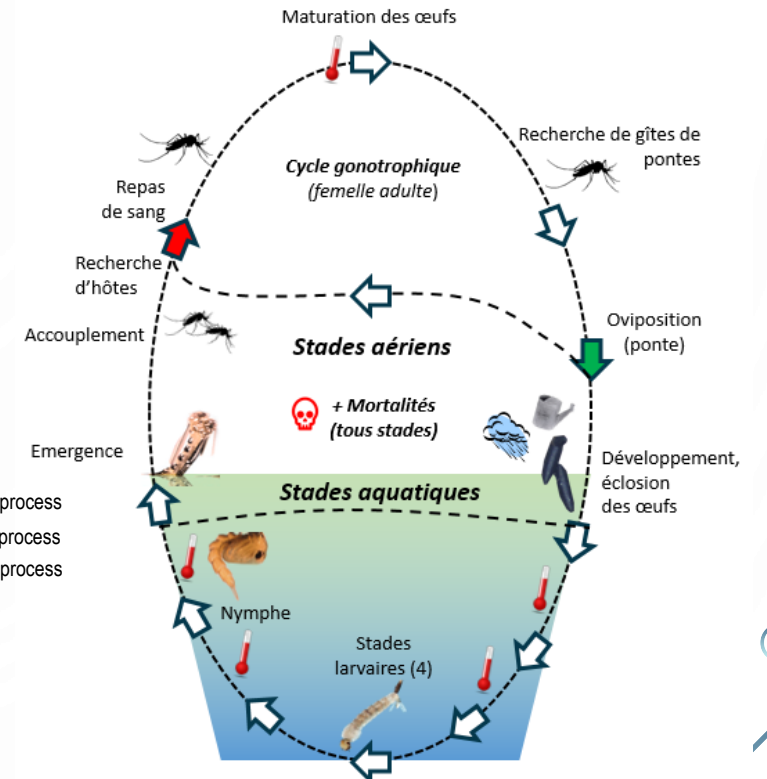
$$\dot{A}_{2h} = \gamma_{A_{o \rightarrow h}} (A_{1o} + A_{2o}) - (m_A + \mu_r + \gamma_{A_{h \rightarrow g}}) A_{2h}$$

$$\dot{A}_{2g} = \gamma_{A_{h \rightarrow g}} A_{2h} - (m_A + f_{A_{g \rightarrow o}}) A_{2g}$$

$$\dot{A}_{2o} = f_{A_{g \rightarrow o}} A_{2g} - (m_A + \mu_r + \gamma_{A_{o \rightarrow h}}) A_{2o}$$

$$m_A(t) = \max_t \{ \mu_A, 0.04417 + 0.00217 * T(t) \}$$

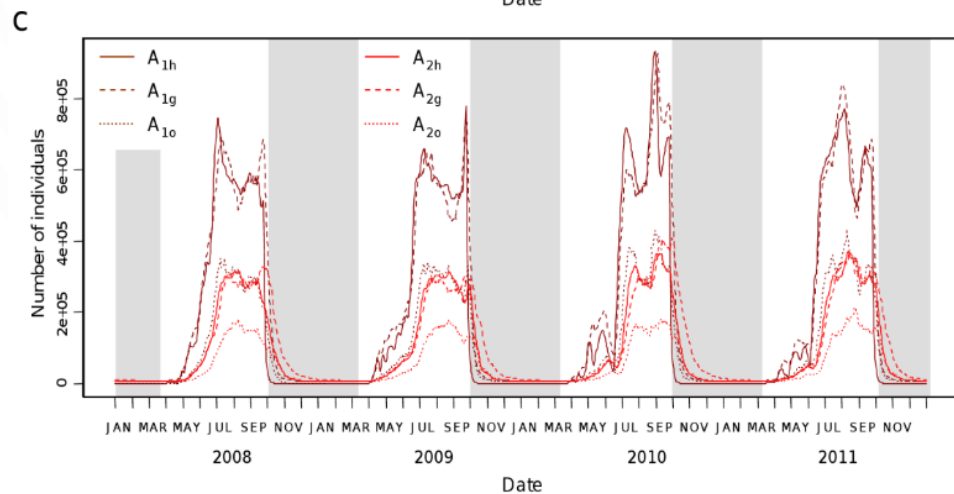
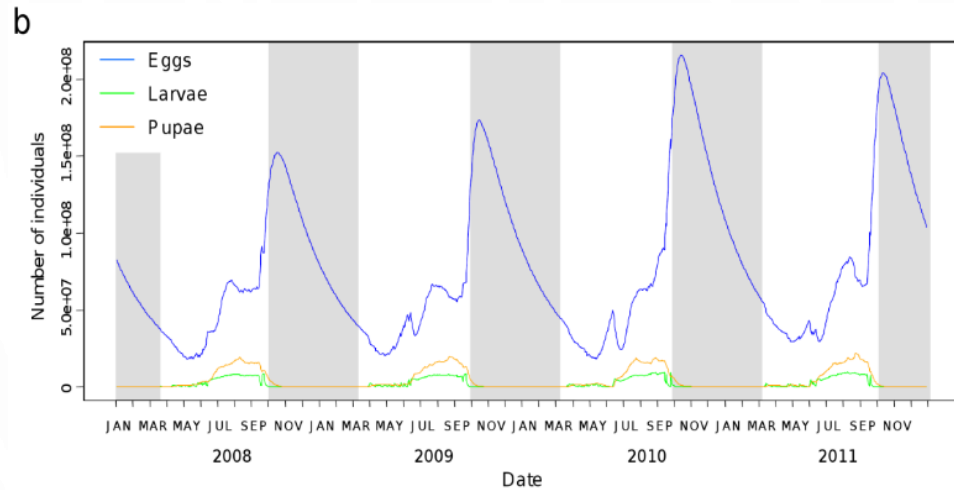
- Temperature-driven process
- Precipitation-driven process
- Environment-driven process



From the mosquito population dynamics to the epidemiological model



Mosquito population dynamics model



Epidemiological models

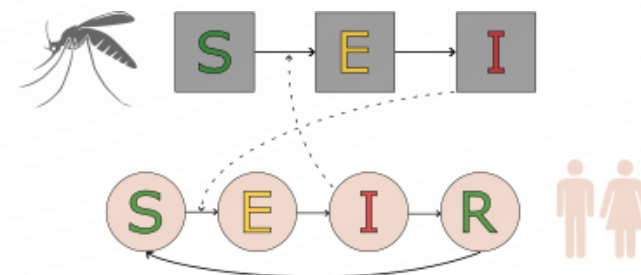


Deterministic R_0

(Benkimoun S et al ; Results in Physics. 2021;29: 104687. doi:[10.1016/j.rinp.2021.104687](https://doi.org/10.1016/j.rinp.2021.104687))



Stochastic epidemiological simulations



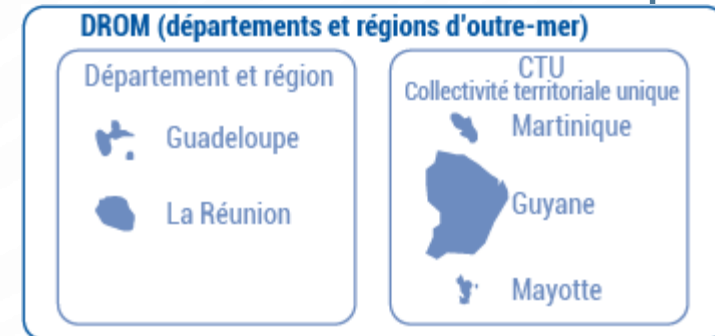
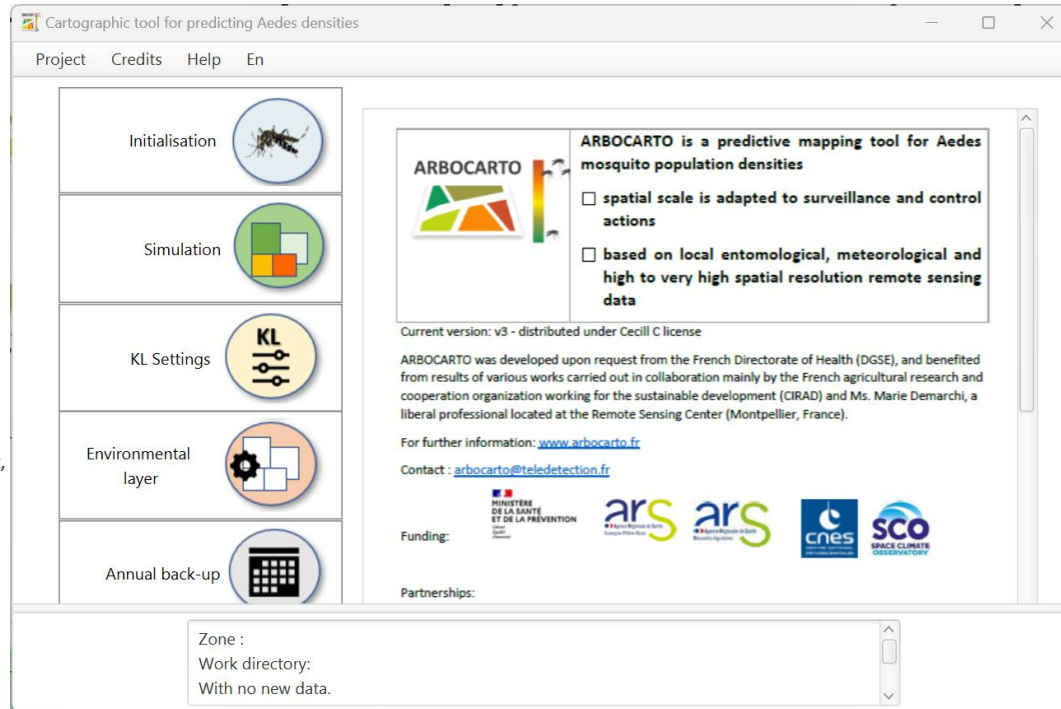
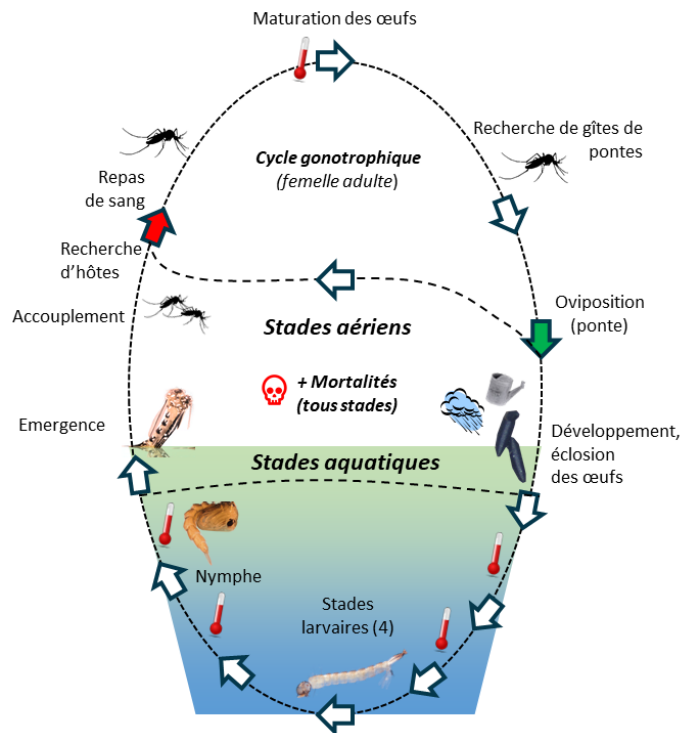
From research modeling to operational tool



A (java-based) Software interface between an *Aedes* mosquito population dynamics model and vector control operators in France



Cycle de vie du moustique (illustration avec *Aedes albopictus*)



From research modeling to operational tool

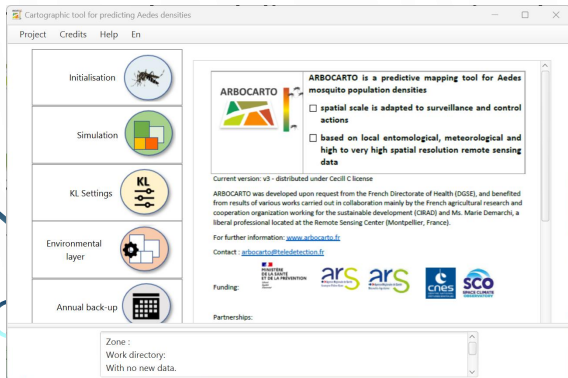


An **R package and associated Shiny application** to simulate the spatio-temporal dynamics of *Aedes (albopictus and aegypti)* mosquito populations **and the transmission dynamics of three arboviruses: dengue, zika and chikungunya.**

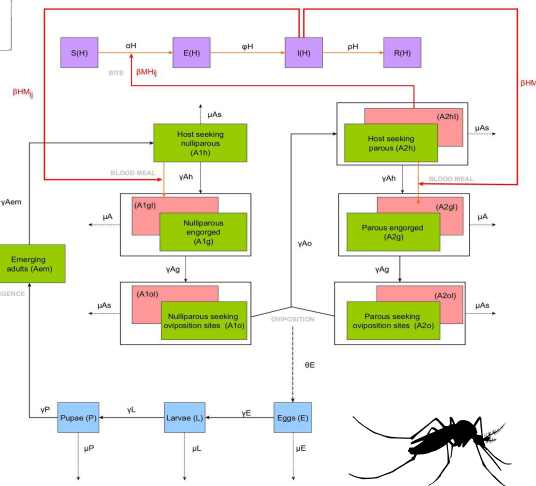
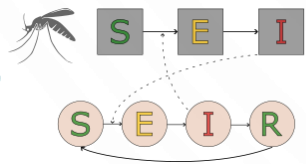
Application: <https://shiny.sk8.inrae.fr/app/sa-astre-arbocarto-r-app>
Reload if necessary

Sources

Package: <https://forgemia.inra.fr/umr-astre/arbocartoR>
 Application: <https://forgemia.inra.fr/sk8/sk8-apps/sa/astre/arbocarto-r-app>



users






arbocartoR application

Divers outputs

Epidemiological indicators (median [95% prediction interval])

With control

9/10

simulations had secondary cases



17 [1-466]

autochthonous infection(s)



14 [1-236]

infected patch(s)



Without control

10/10

simulations had secondary cases



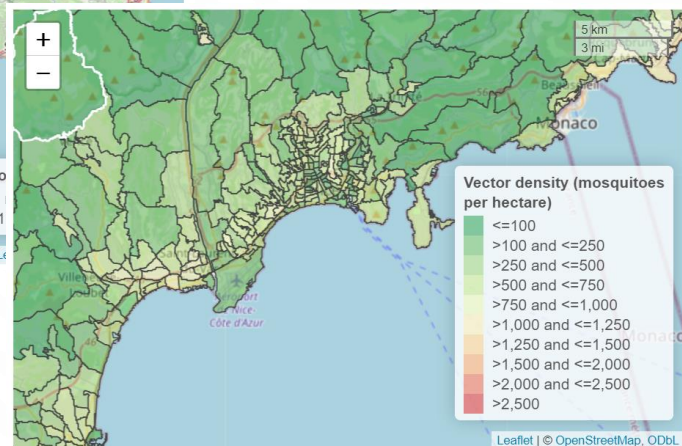
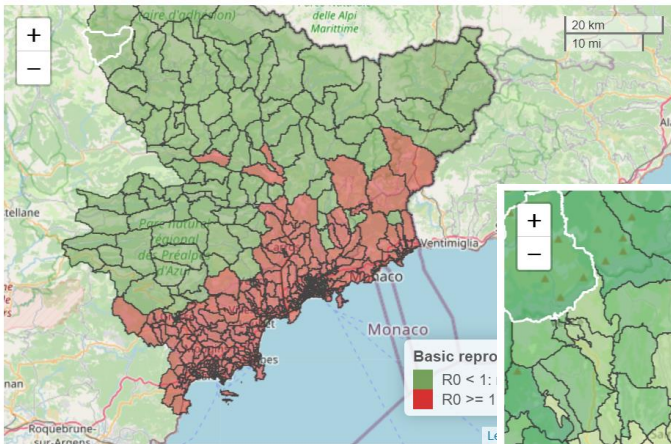
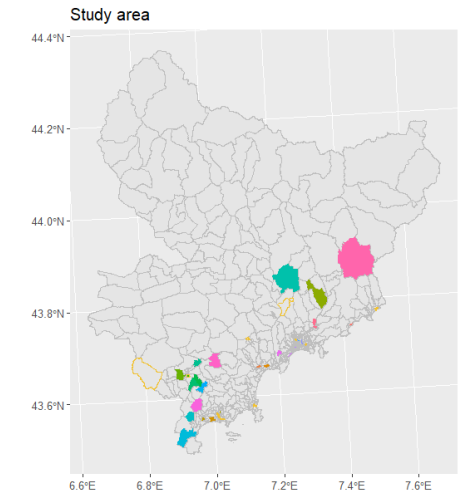
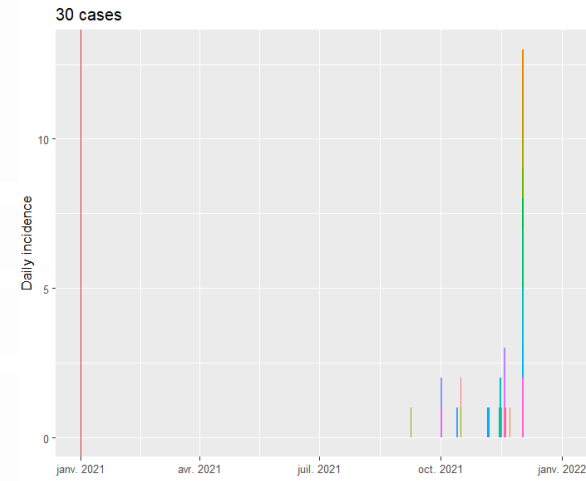
82 [2-595]

autochthonous infection(s) - without control

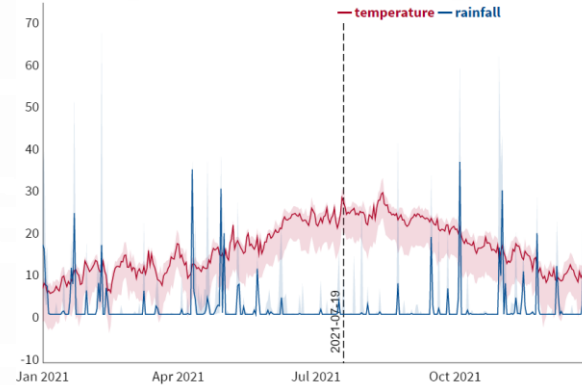


64 [2-279]

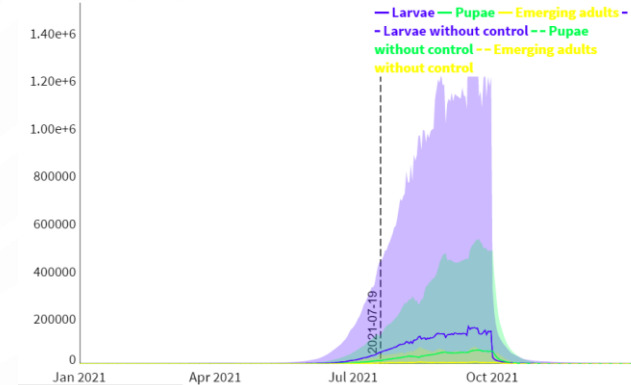
infected patch(s) - without control



Meteorological variations over time and among parcels



Demography over time over all parcels and simulations





Arbocarto(R) application

Limits & Perspectives



ERGONOMICS

- PDF reports / logs
- Facilitating the acquisition of meteorological data
- Facilitate load capacity estimation
- Facilitate comparison with field data
- ...

RESEARCH & DEVELOPMENT

- Favourable period triggering
- SIT
- Developing the co-circulation of different strains
- Developing the co-circulation of different vector species
- Assessing the impact of climate change
- Integrating other vector/pathogen pairs
- ...



Take home message



- Powerful modelling approach – generic & adaptable
- Main limit: carrying capacity/breeding sites estimation

- Modelers community:

open source codes (Ocelet – arbocarto ; R package – arbocartoR)

- Non modelers community:

User friendly and dynamic interfaces developed upon request **of** the users, **for** the users and **with** the users (co-creation)



java-based software (arbocarto)

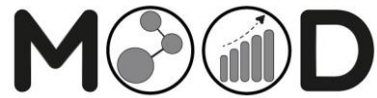


Rshiny interface (arbocartoR)

THANK YOU FOR YOU ATTENTION

Contact:

pachka.hammami@cirad.fr
arbocarto@teledetection.fr



<https://mood-h2020.eu/>



<https://www.arbocarto.fr/en>

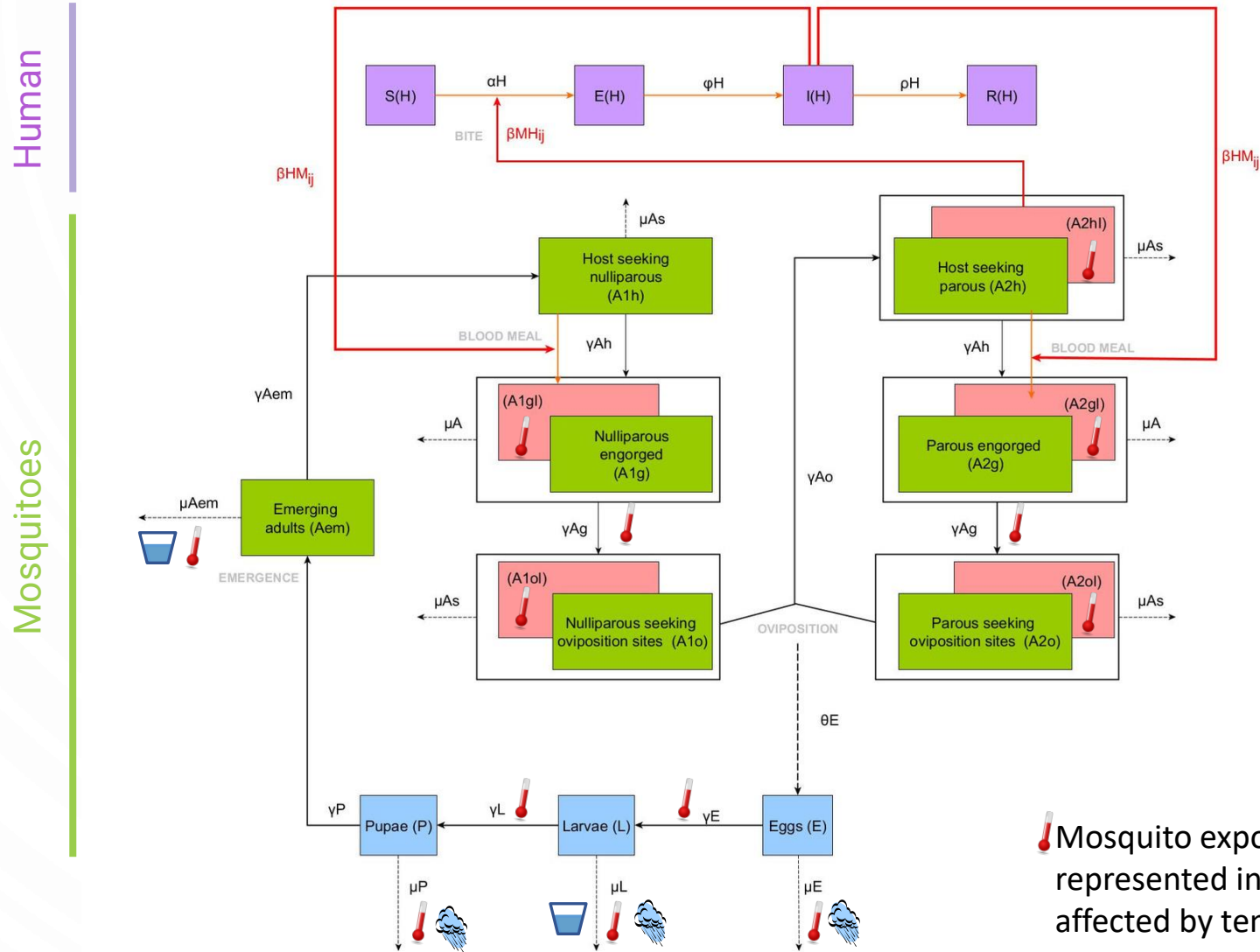


<https://shiny.sk8.inrae.fr/app/sa-astre-arbocarto-r-app>

REFERENCES

- Benkimoun S, Atyame C, Haramboure M, Degenne P, Thébault H, Dehecq J-S, et al. Dynamic mapping of dengue basic reproduction number. *Results in Physics*. 2021;29: 104687. doi:[10.1016/j.rinp.2021.104687](https://doi.org/10.1016/j.rinp.2021.104687)
- Cailly P, Tran A, Balenghien T, L'Ambert G, Toty C, Ezanno P. A climate-driven abundance model to assess mosquito control strategies. *Ecological Modelling*. 2012;227: 7–17. doi:[10.1016/j.ecolmodel.2011.10.027](https://doi.org/10.1016/j.ecolmodel.2011.10.027)
- Cailly P. Modélisation de la dynamique spatio-temporelle d'une population de moustiques, sources de nuisances vecteurs et d'agents pathogènes. These de doctorat, Nantes, Ecole nationale vétérinaire. 2011. Available: <https://www.theses.fr/2011ONIR002F>
- Soriano-Paños D, Arias-Castro JH, Reyna-Lara A, Martínez HJ, Meloni S, Gómez-Gardeñes J. Vector-borne epidemics driven by human mobility. *Phys Rev Research*. 2020;2: 013312. doi:[10.1103/PhysRevResearch.2.013312](https://doi.org/10.1103/PhysRevResearch.2.013312)
- Tran A, L'Ambert G, Lacour G, Benoît R, Demarchi M, Cros M, et al. A rainfall- and temperature-driven abundance model for *Aedes albopictus* populations. *Int J Environ Res Public Health*. 2013;10: 1698–1719. doi:[10.3390/ijerph10051698](https://doi.org/10.3390/ijerph10051698)

Updated compartmental model: deterministic and stochastic events



Mosquito exposed stages are not represented in this diagram (duration affected by temperature)

Diagram designed by Ewy Ortega