

Risk maps and risk-based surveillance for early detection of *Xylella fastidiosa* in continental France



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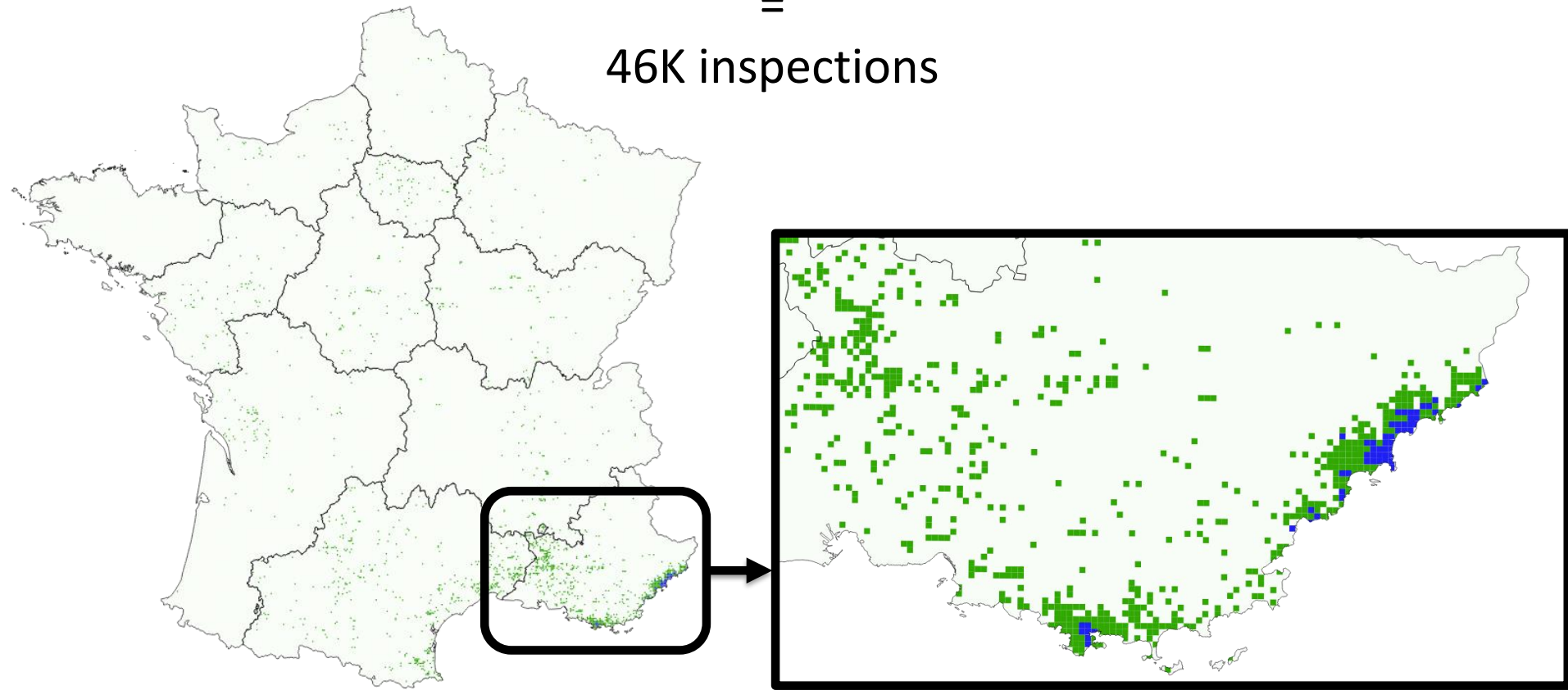
Objectives

Surveillance and early detection

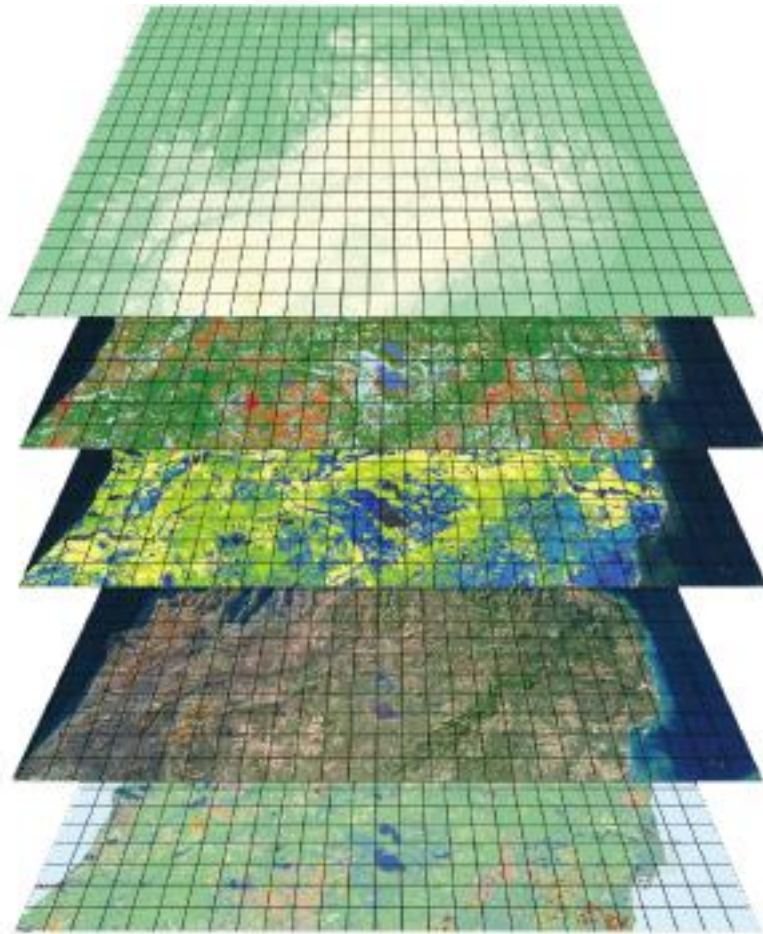
- Production of **risk maps** for likely appearance of Xf in France
- Design of **surveillance and early detection strategies** based on risk maps
- **Cost-benefit** of random surveillance vs. risk-based
- Draw containment and buffer zone as for Apulia, Italy

Surveillance and sampling in France since July 2015

10K in free zone +
36K in delimited zone
=
46K inspections



Data acquisition (on 8-km grid)



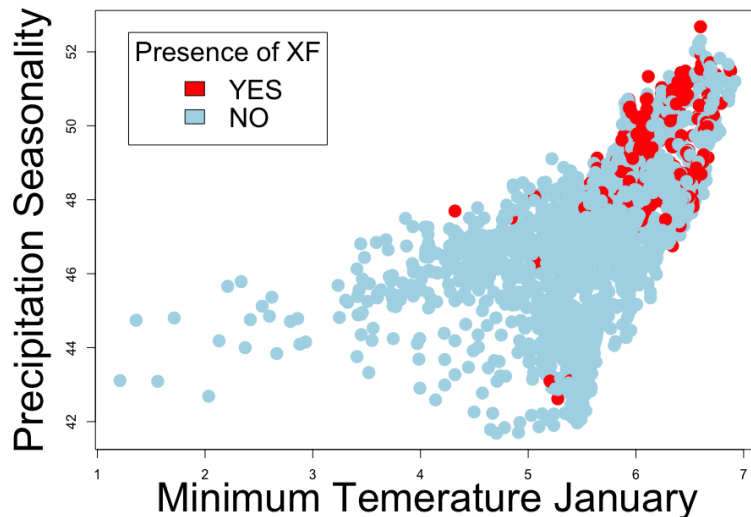
12 monthly min temperatures
+
12 monthly max temperatures
+
12 monthly solar radiation
+
12 monthly water vapor pressure
+
19 bioclimatic variable
+
17 land uses
+
4 min, mean, median, max altitudes

100 variables

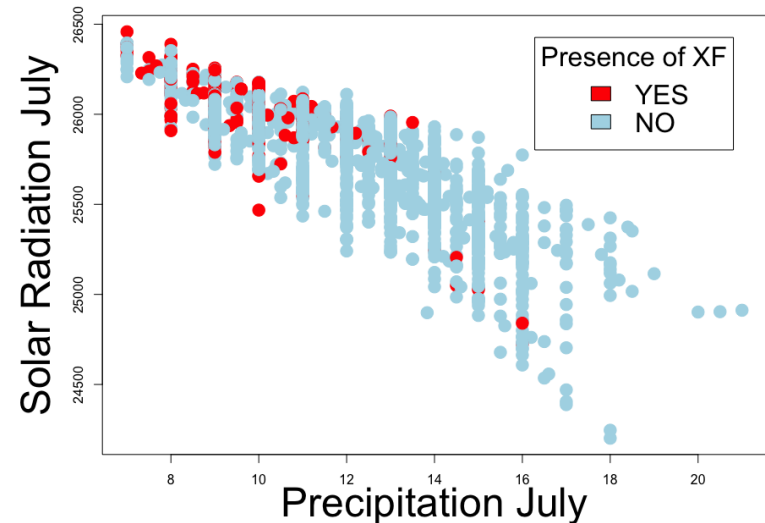
Feature Selection

1. **Water stress** correlates positively with presence of XF
2. **Mild winters** correlate positively with presence of XF
3. **Precipitations in summer** corr. positively with XF
4. **Strong solar radiation** corr. positively with XF

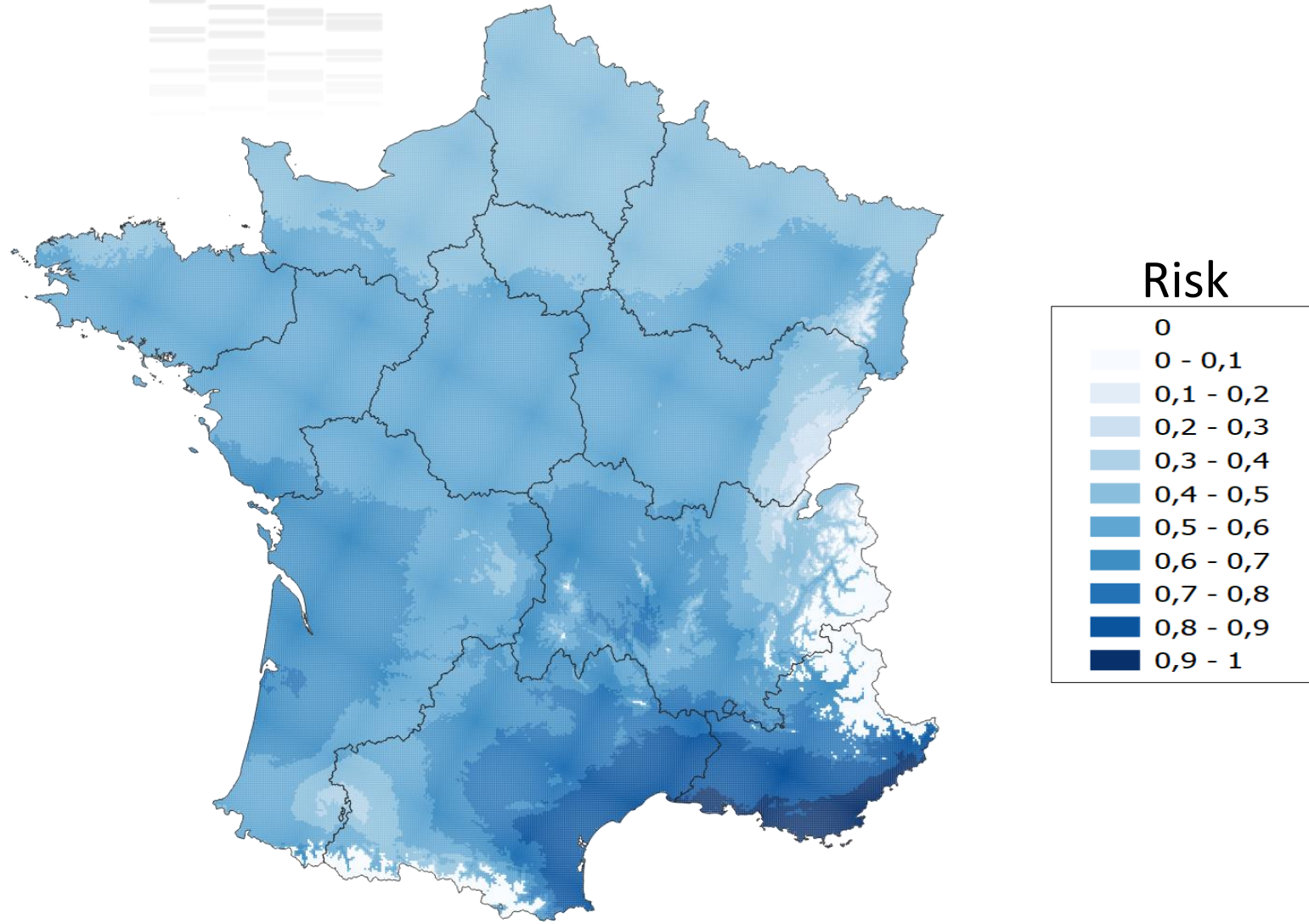
Bioclimatic envelope



Bioclimatic envelope



Multivariate Environmental Similarity Surface (MESS)



Designing surveillance strategies

Spatial Coverage

Health status
of all France

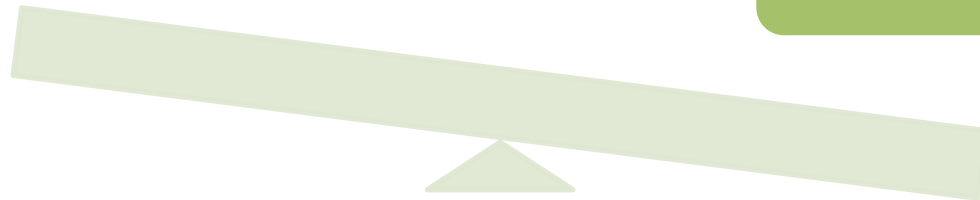
Multiple
introductions

Focus on high risk

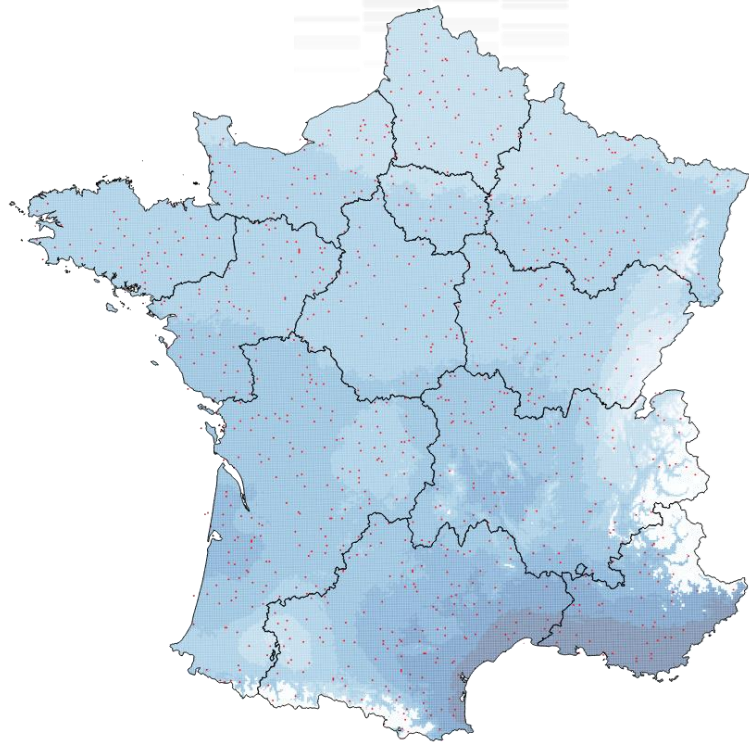
Delimitate the
infected area

EU
Quarantine

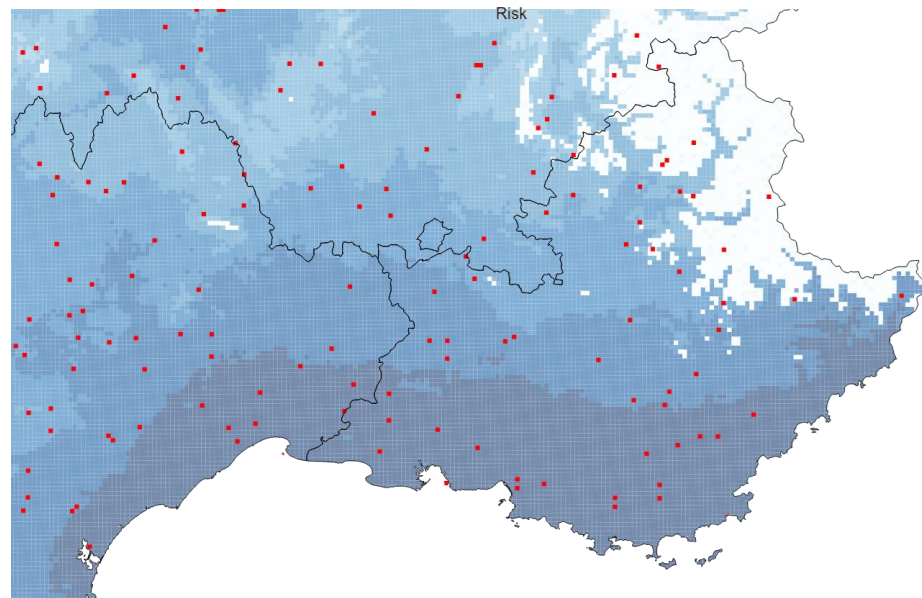
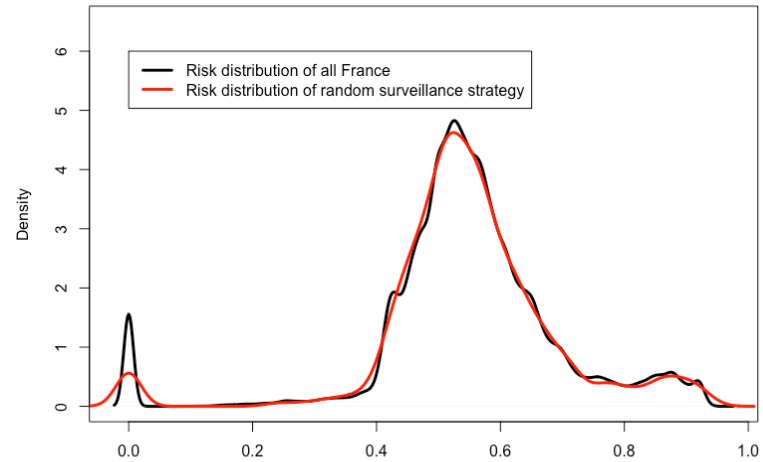
Early
detection



Random strategy: maximum spatial coverage

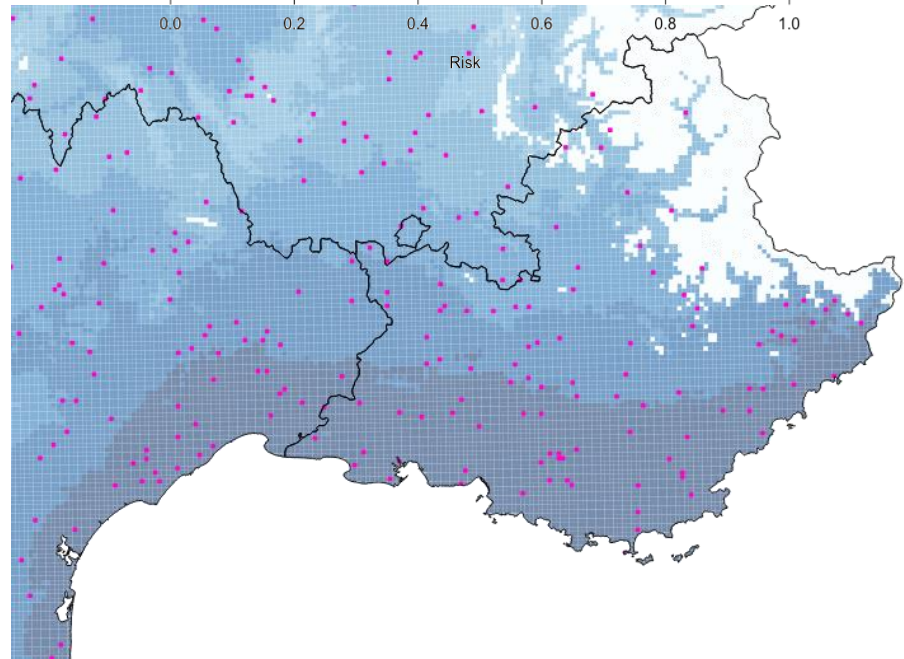
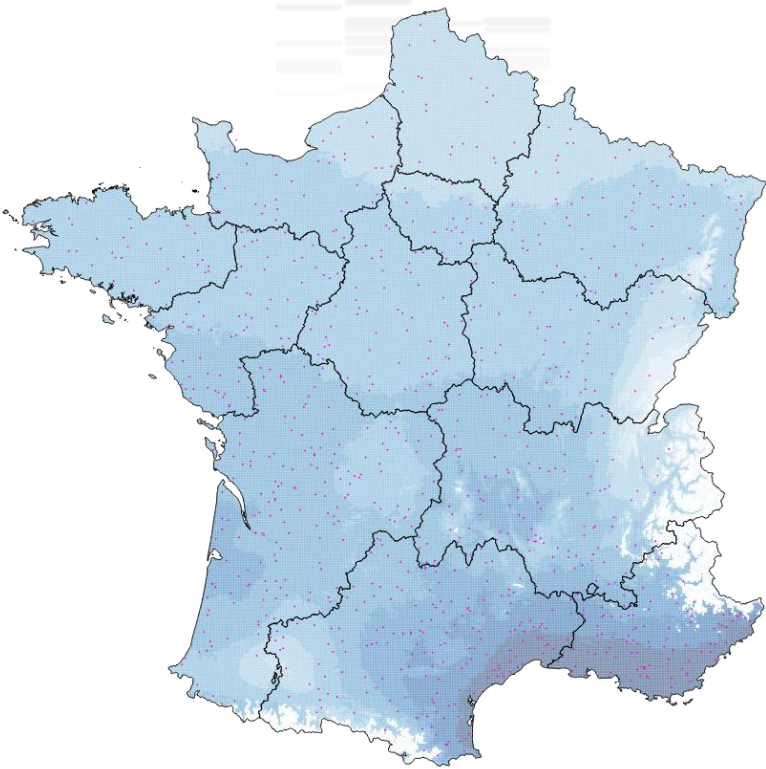
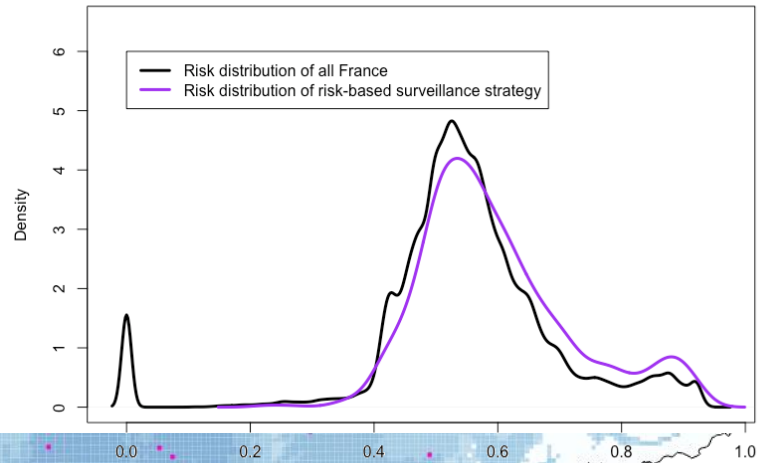


Distribution of risk



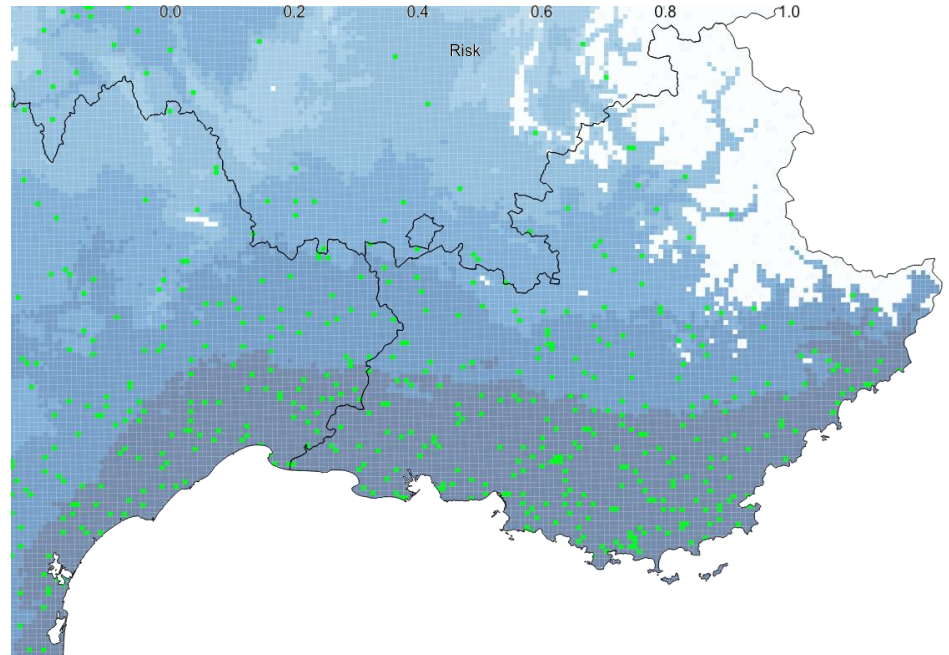
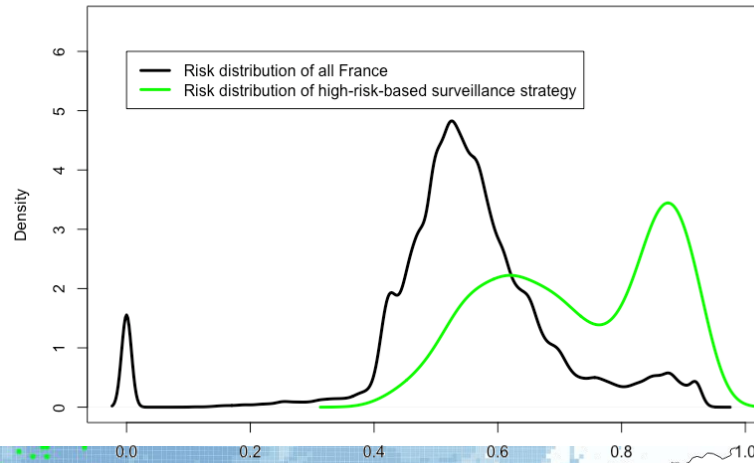
Risk-based strategy

Distribution of risk



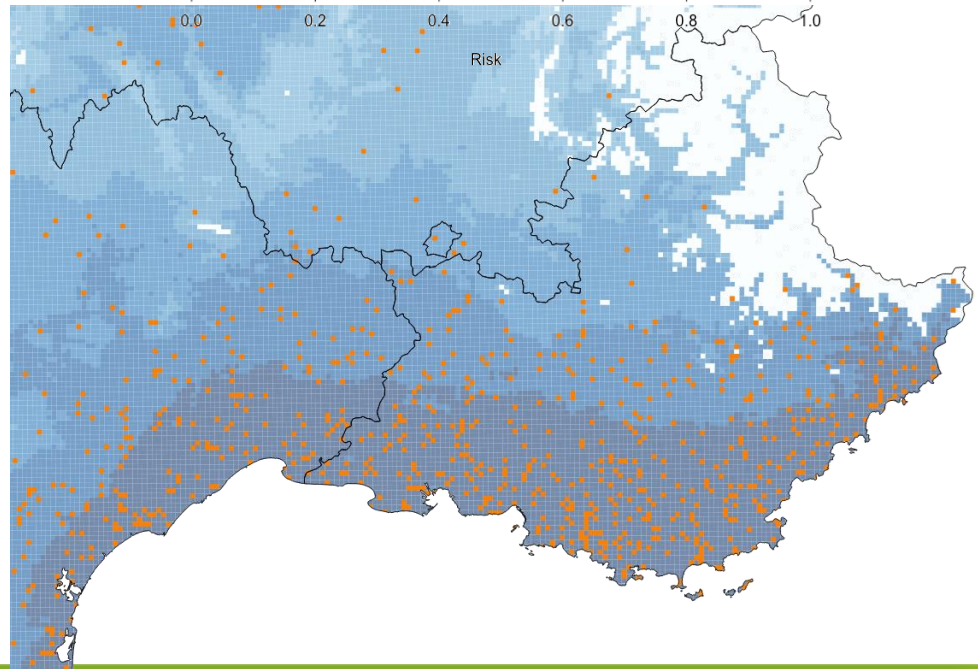
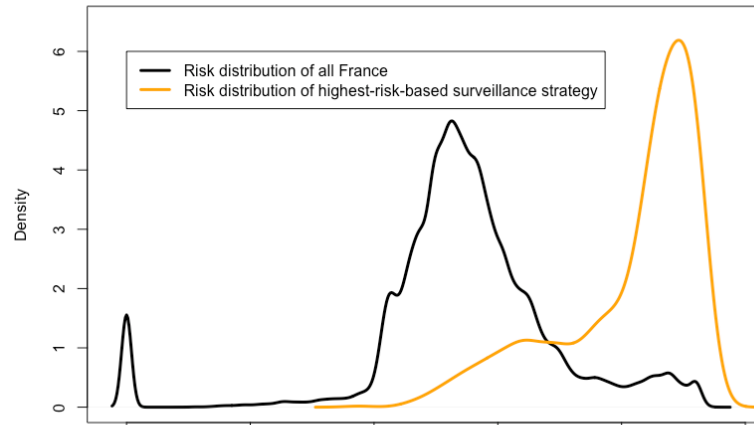
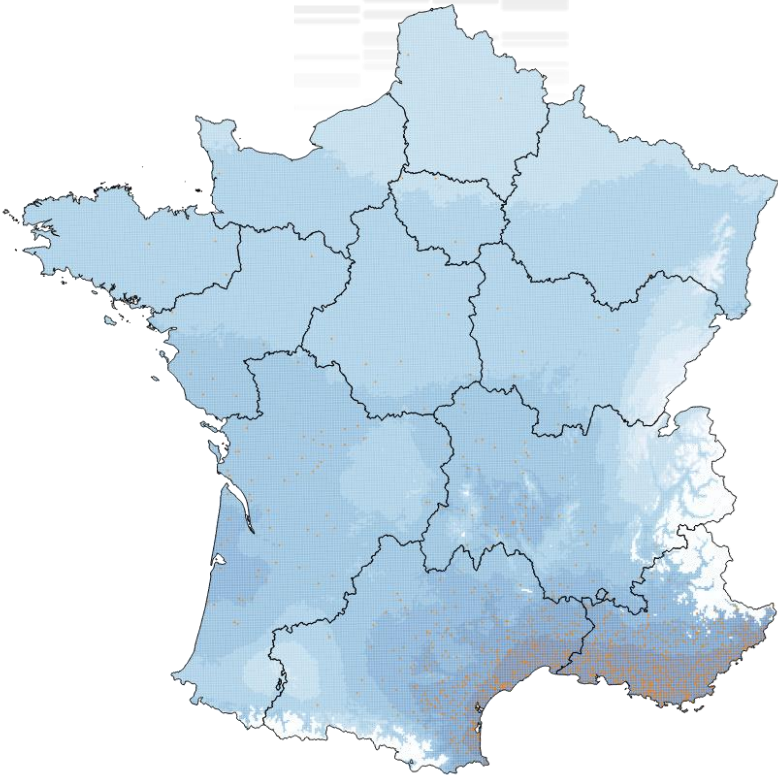
Moderate-risk-based strategy

Distribution of risk



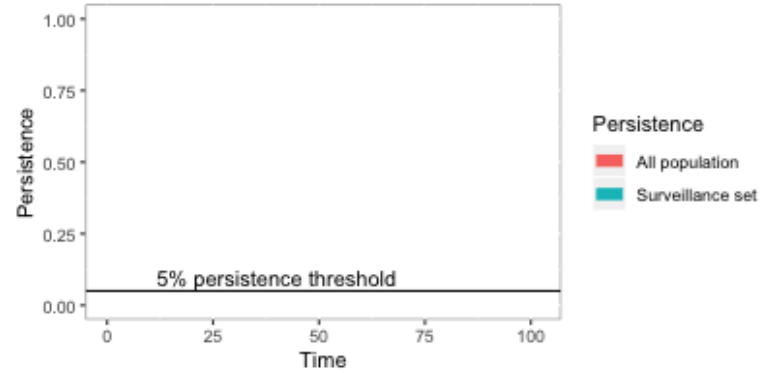
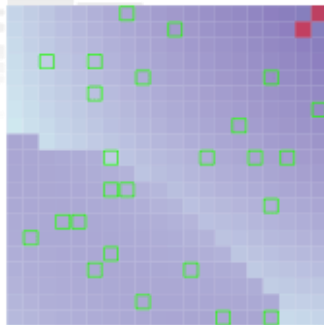
High-risk-based strategy

Distribution of risk

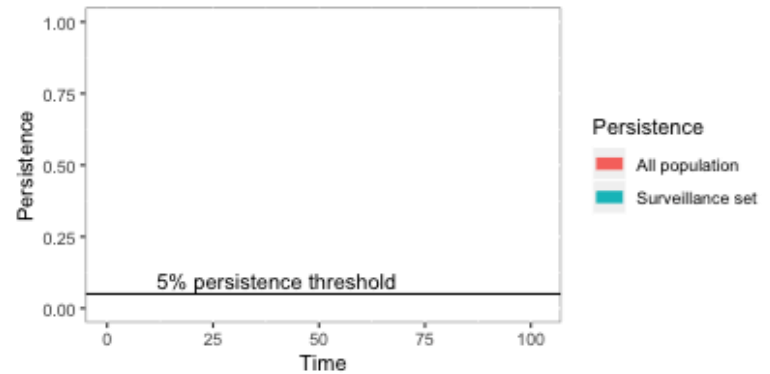
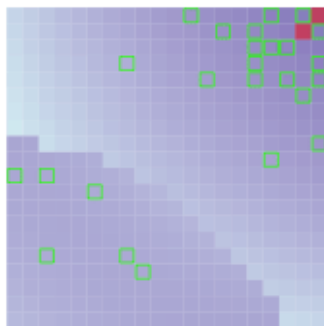


Evaluating surveillance strategies

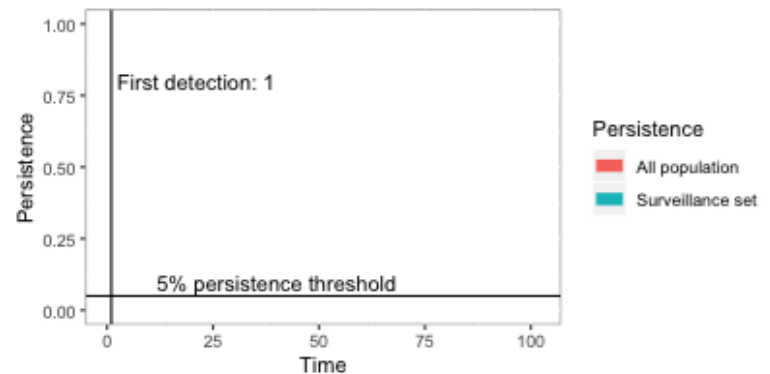
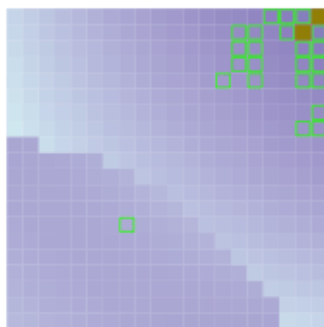
Random strategy



Risk-based strategy

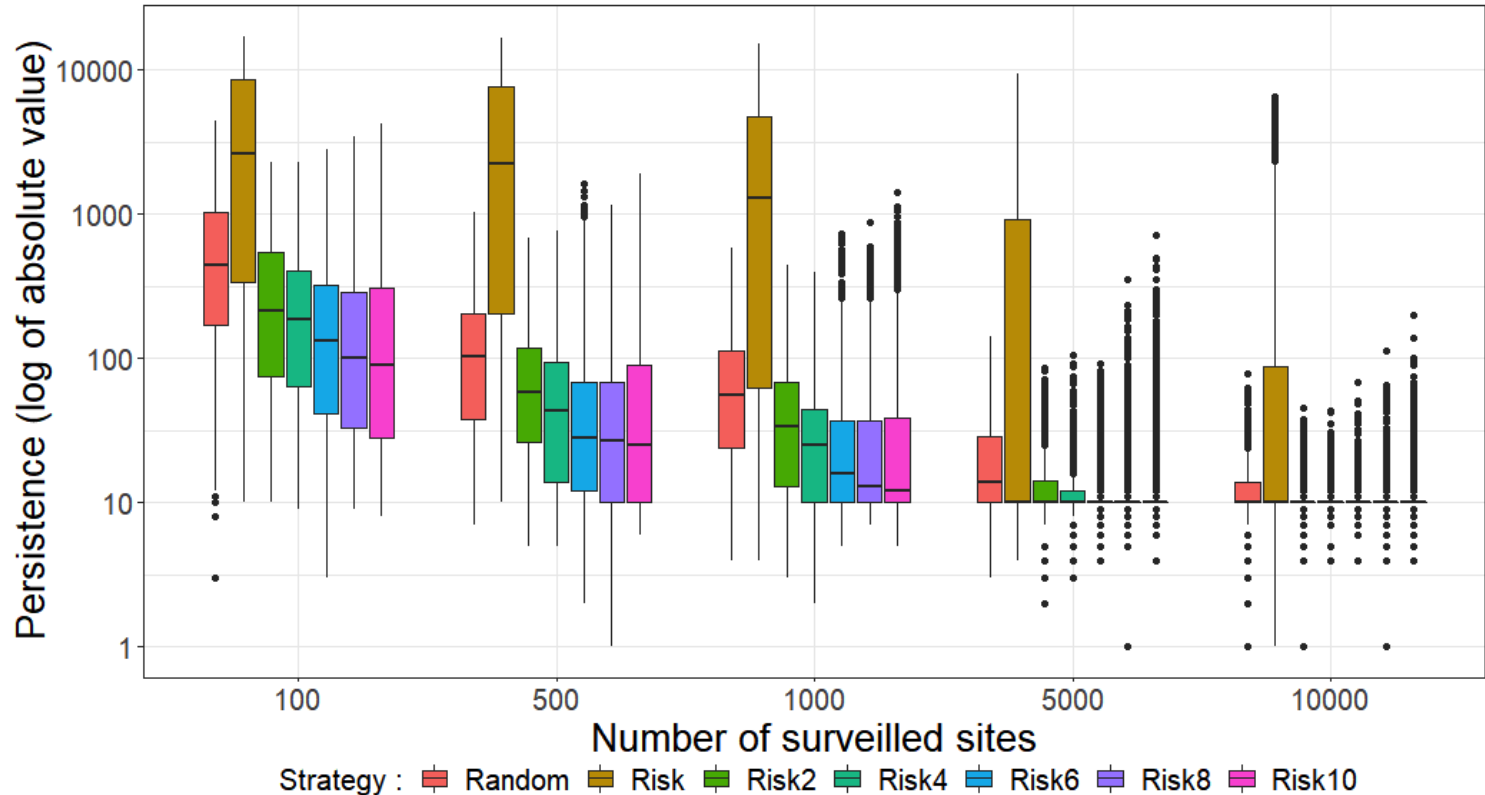


High-risk-based strategy



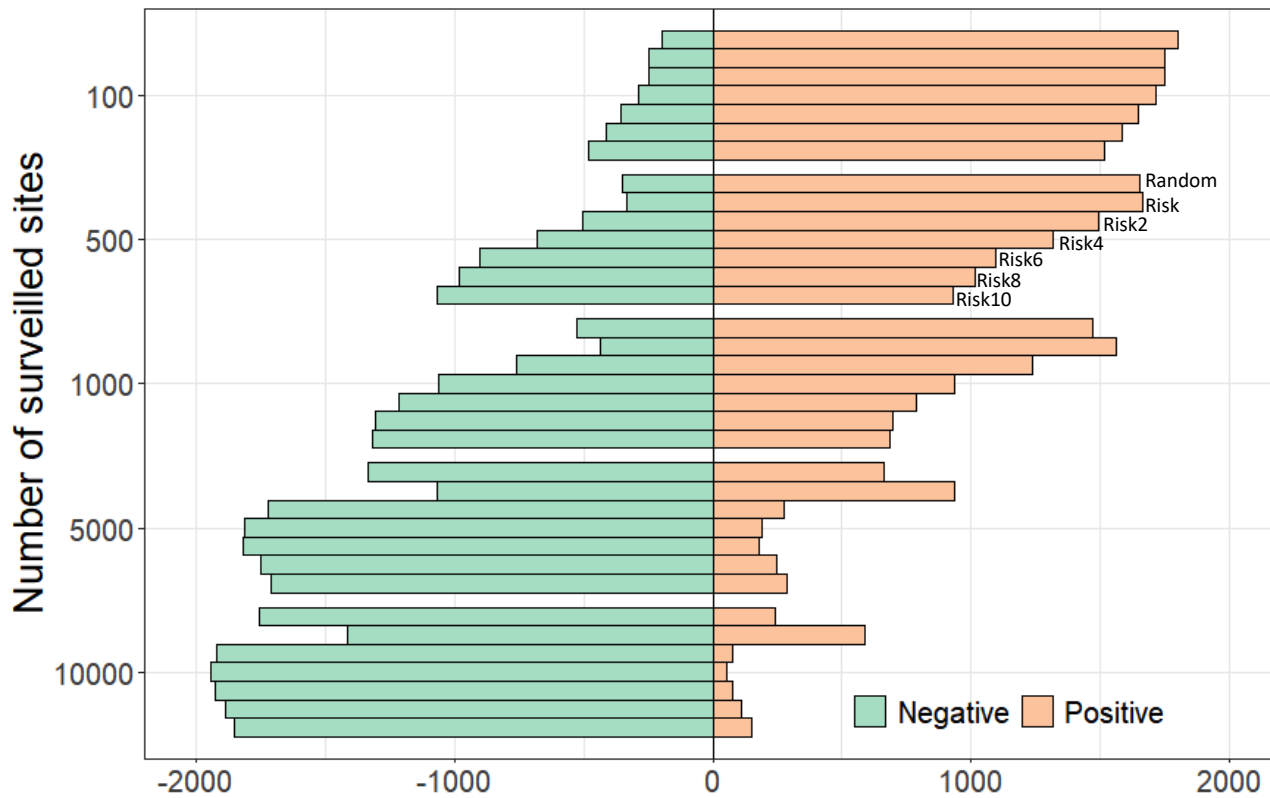
Results: Time of first detection

Number of infected nodes when the epidemic is firstly detected



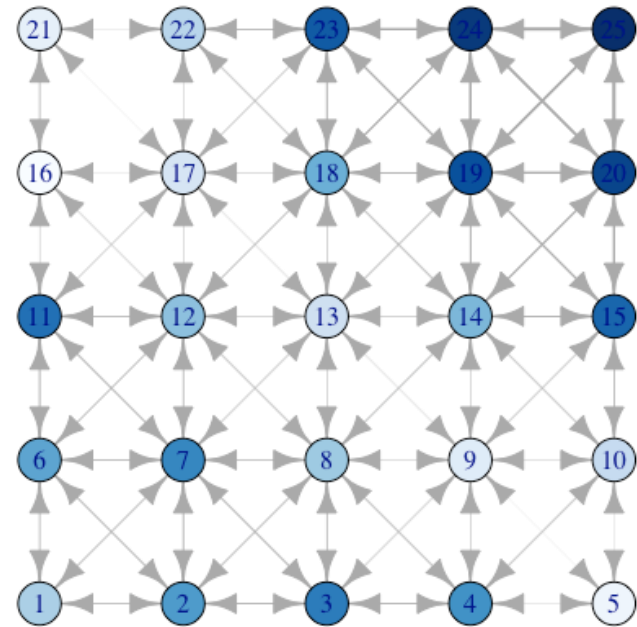
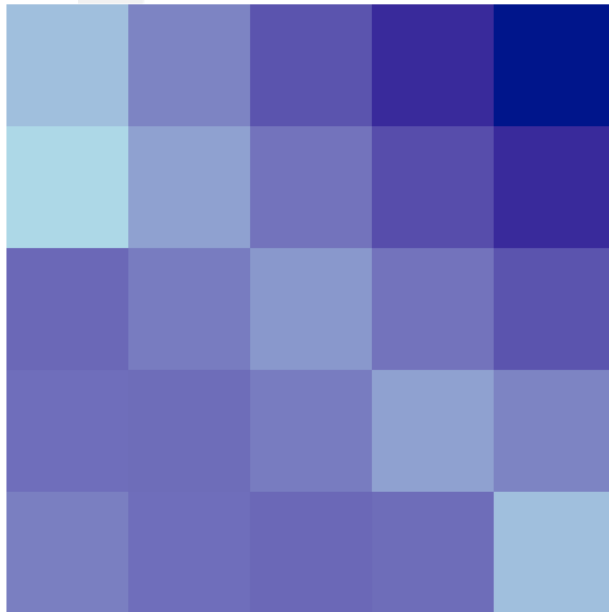
Boxplots represent the average persistence of the epidemic on the whole population at the time of first detection

Results: 0.01% persistence threshold



Boxplots represent the average persistence of the epidemic on the whole population at the time of first detection

From risk map to contact network



Cells of the grid become nodes of the network:

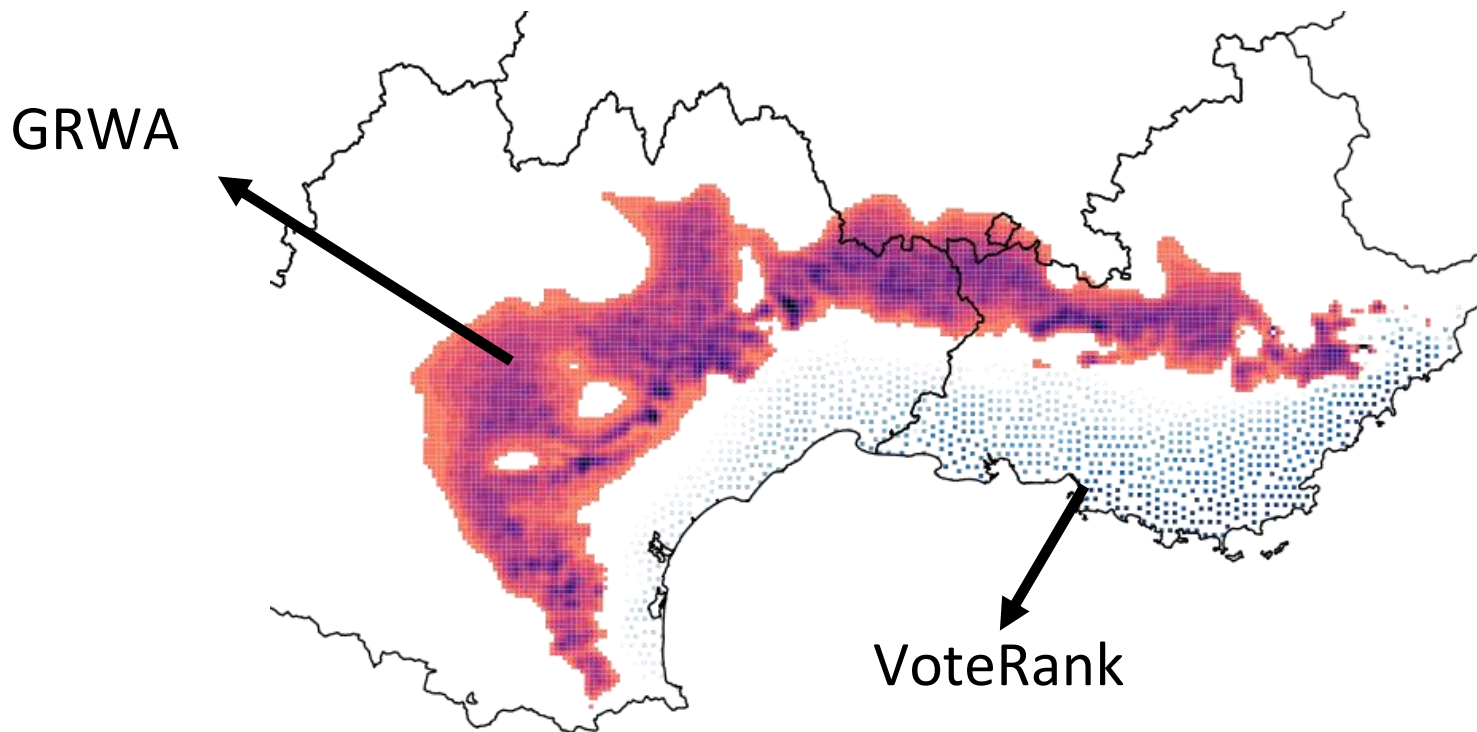
- 8 nearest neighbours
- Link between node weighted according to risk

$$W_{ij} = r_i * r_j$$

Use nodes metrics to define surveillance strategies

Generalized Random Walk Accessibility^a: accessibility of a node from all other nodes, weighted by the inverse of the factorial of the walk length

VoteRank^b: modified version of PageRank algorithm

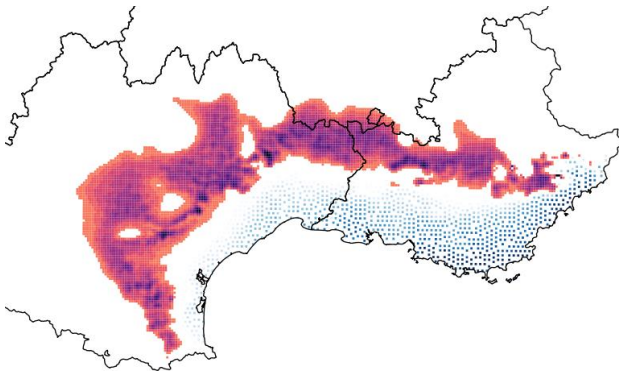


^ade Arruda et al. (2014). Physics Reviews E, 90.

^bZhang et al. (2016). Scientific Reports, 6.

Future works

1. **Network metrics** to design new surveillance strategies
2. **Simulate adaptive strategies** in order to account for the oversampling effort close to identified foci
3. Define **buffer and containment** zone as for the case of Apulia and test if different sampling strategies should be used in different zones



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