



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



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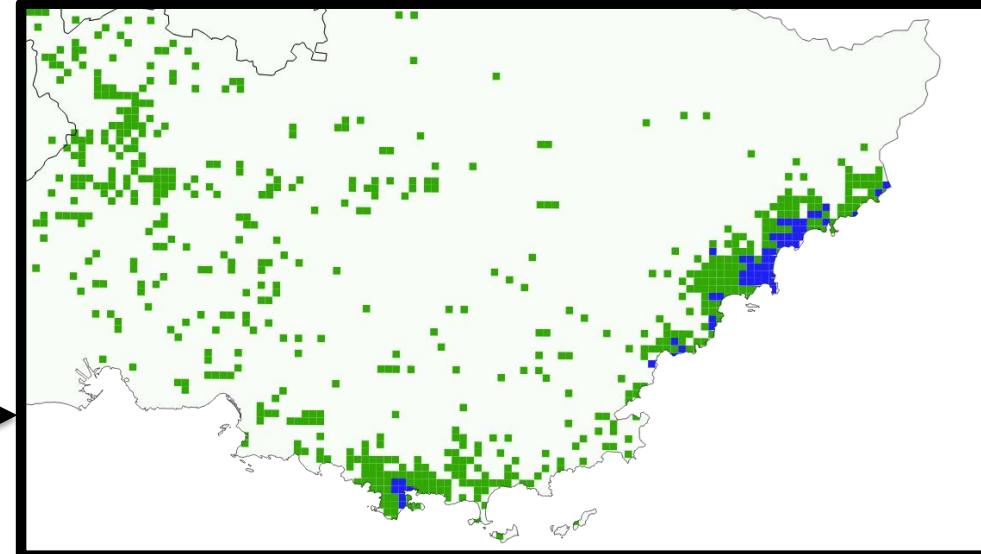
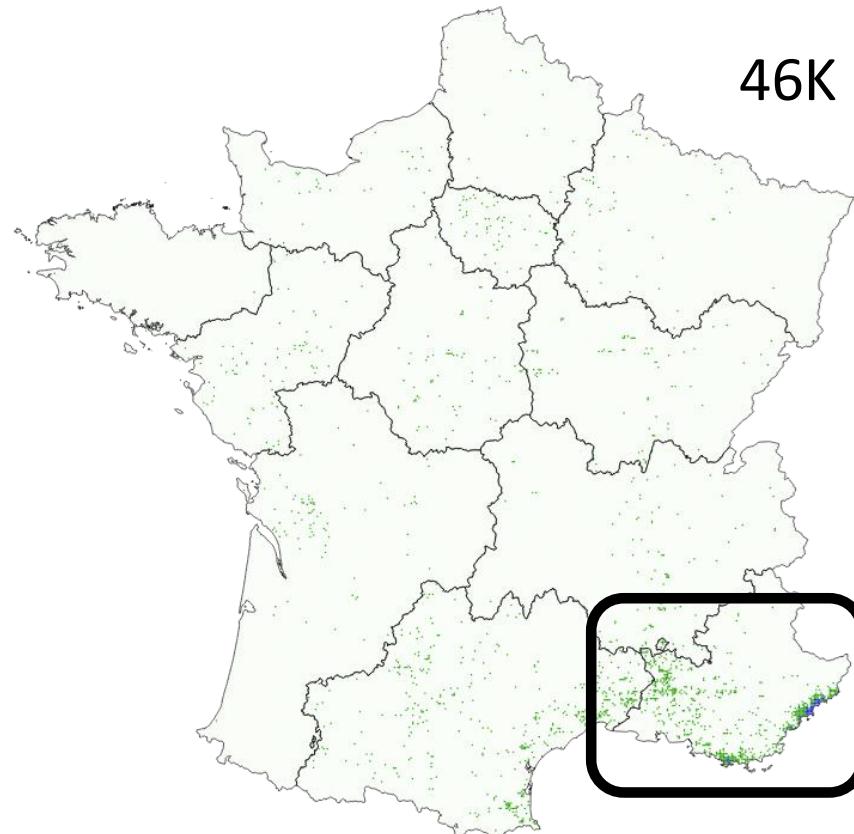
# Objectives

## Surveillance and early detection

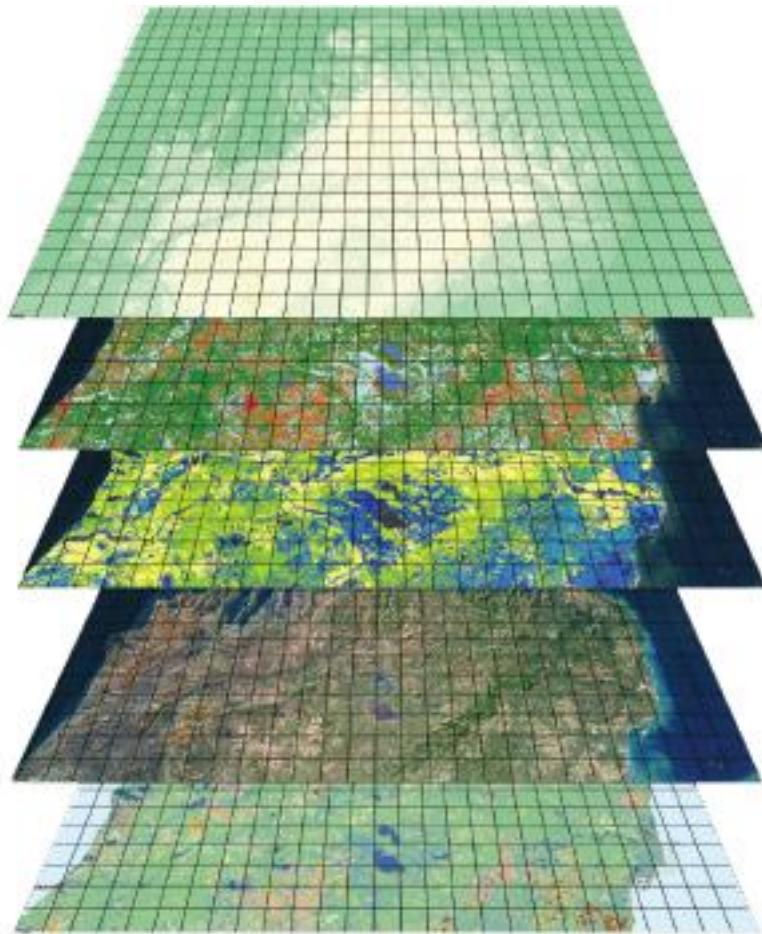
- Production of **risk maps** for likely appearance of Xf in France
- Design of **surveillance and early detection strategies** based on risk maps
- **Cost-benefit** of random surveillance vs. risk-based
- Draw containment and buffer zone as for Apulia, Italy

## 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

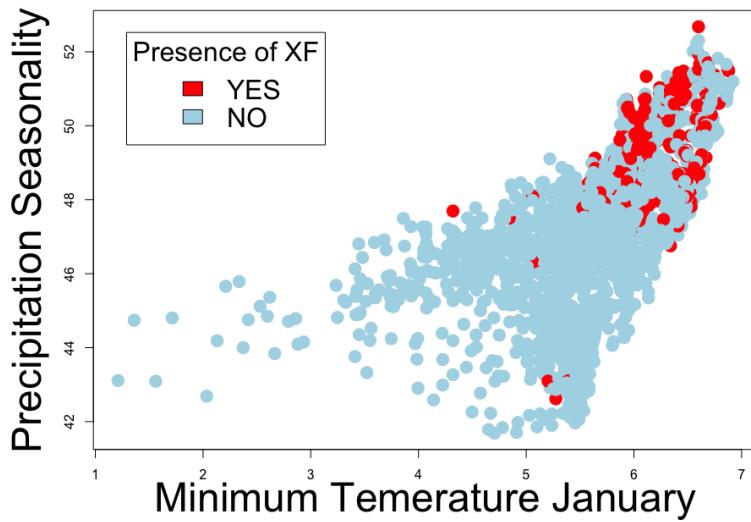
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100 variables

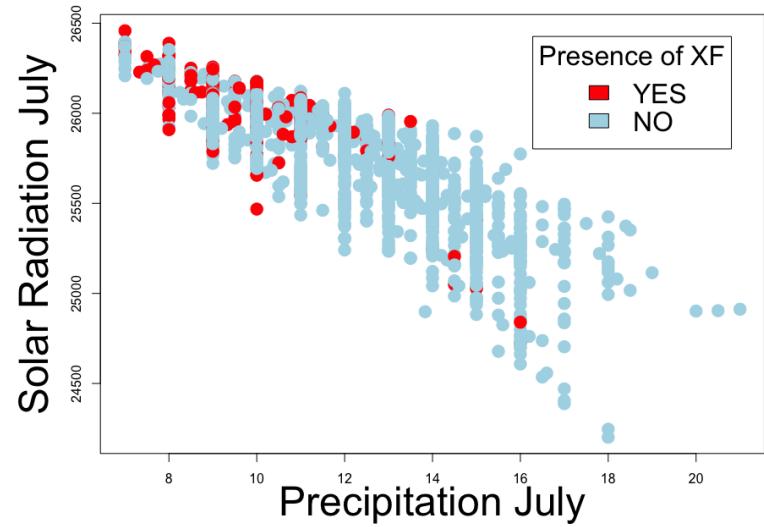
# Feature Selection

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

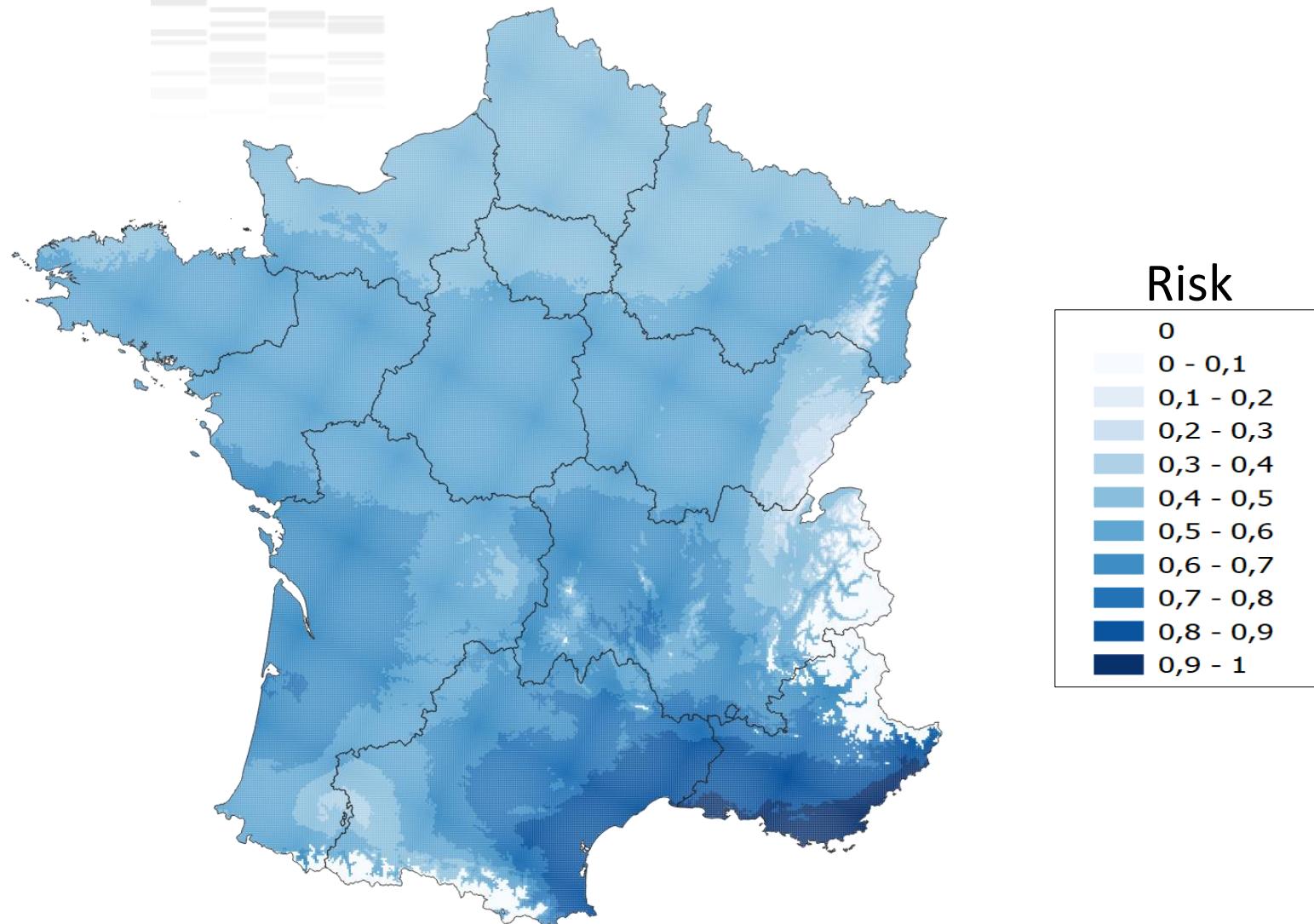
**Bioclimatic envelope**



**Bioclimatic envelope**



# Multivariate Environmental Similarity Surface (MESS)



# Designing surveillance strategies

## Spatial Coverage

Health status  
of all France

Multiple  
introductions

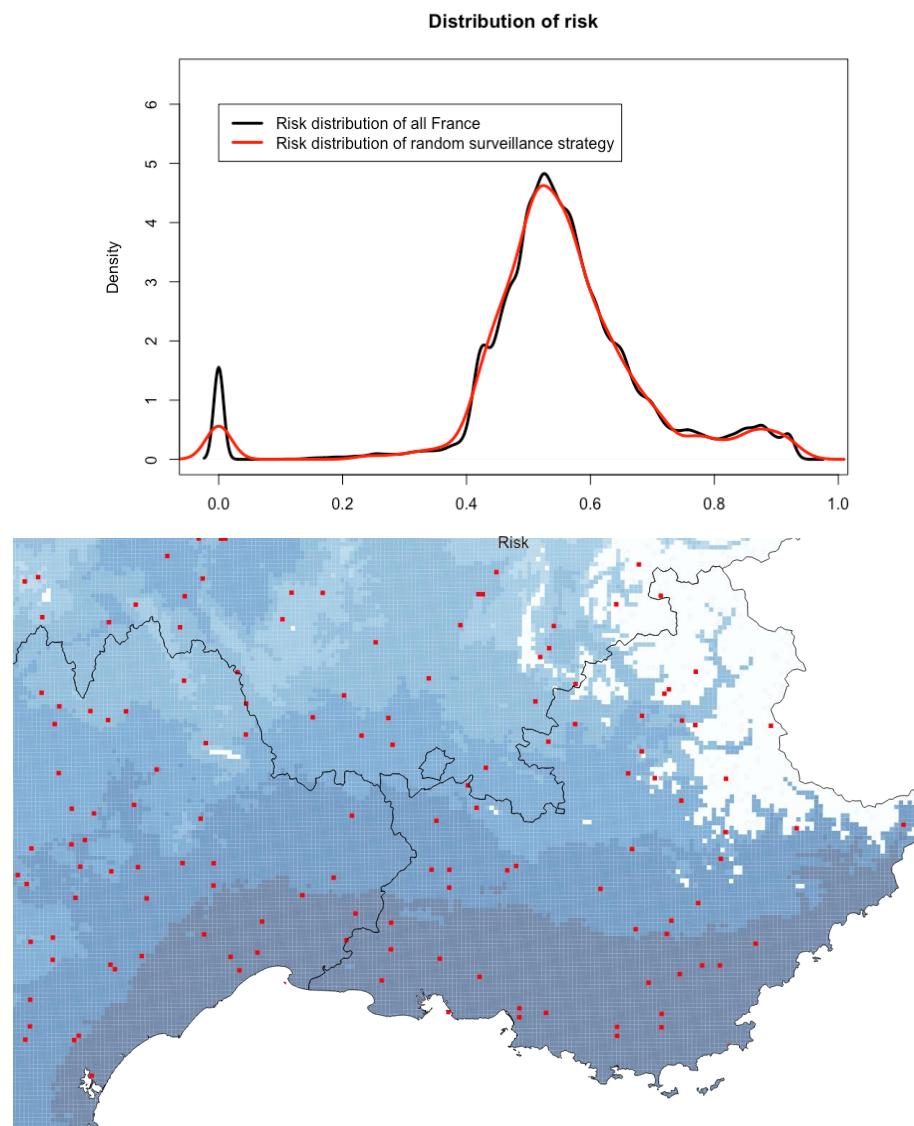
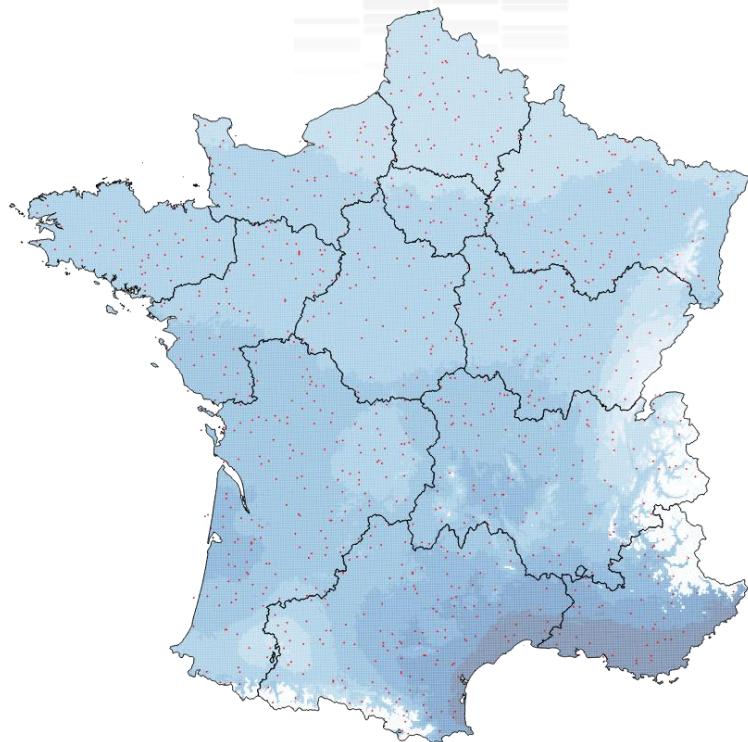
## Focus on high risk

Delimitate the  
infected area

EU  
Quarantine

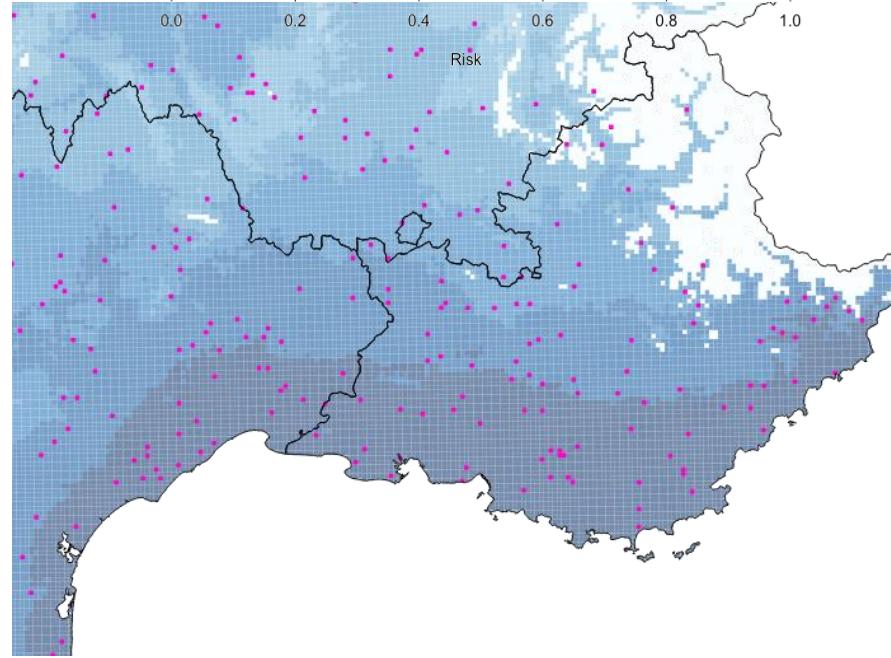
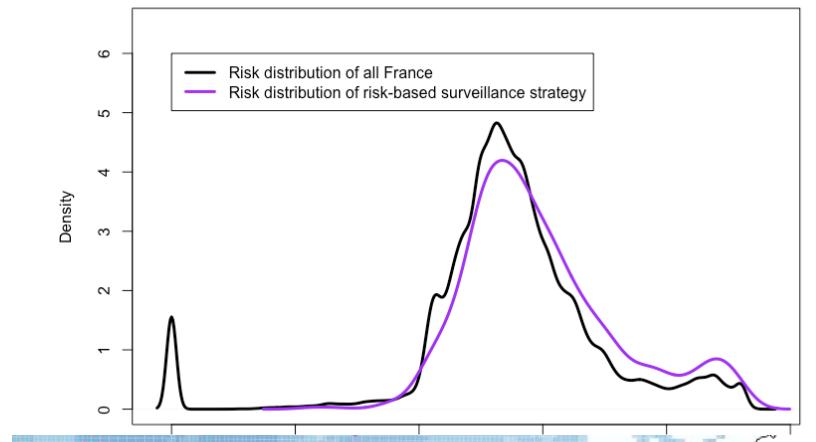
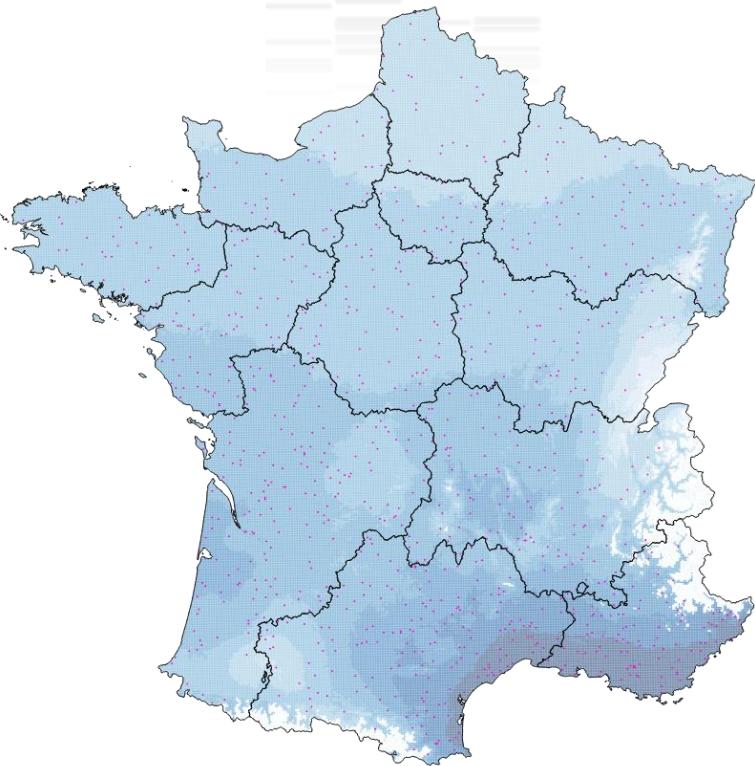
Early  
detection

# Random strategy: maximum spatial coverage



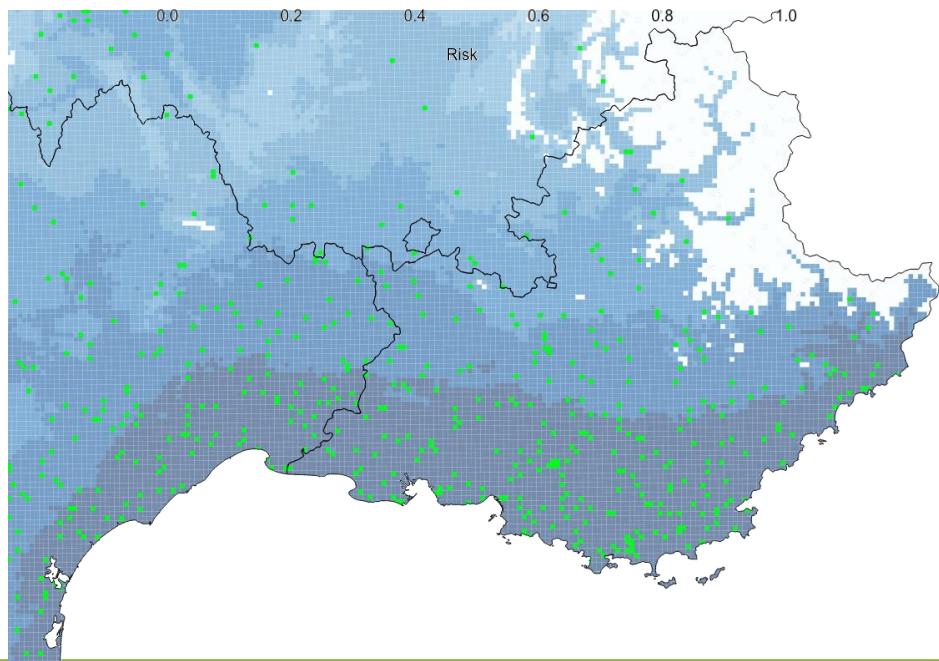
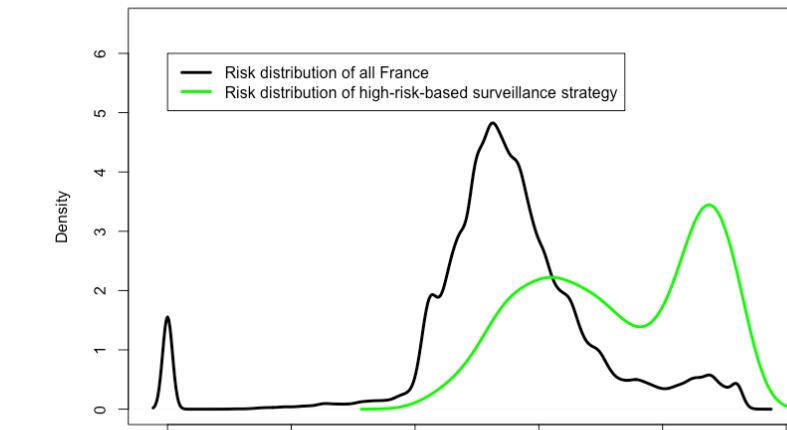
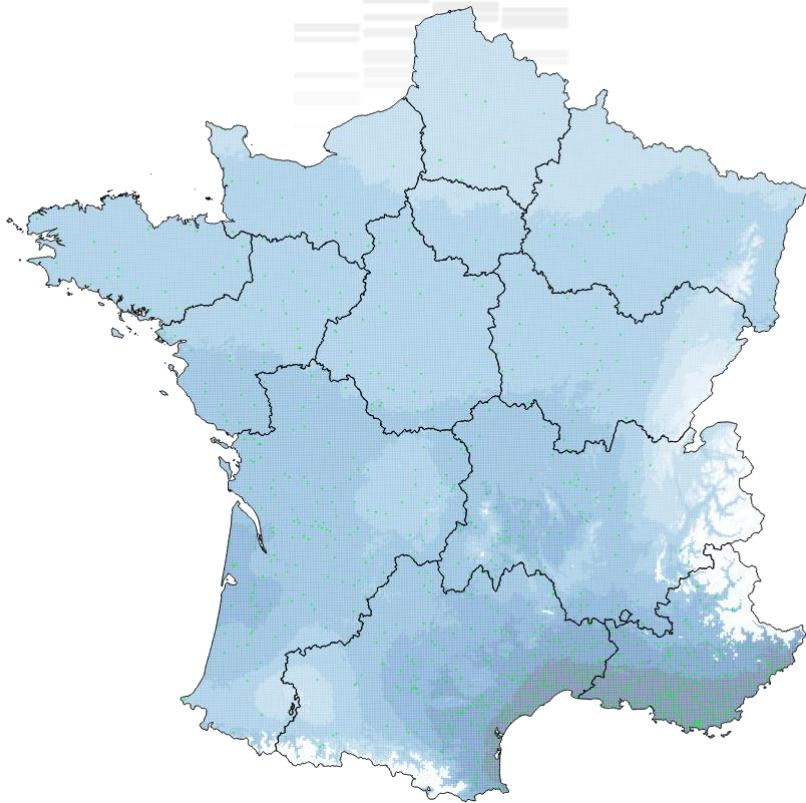
# Risk-based strategy

Distribution of risk



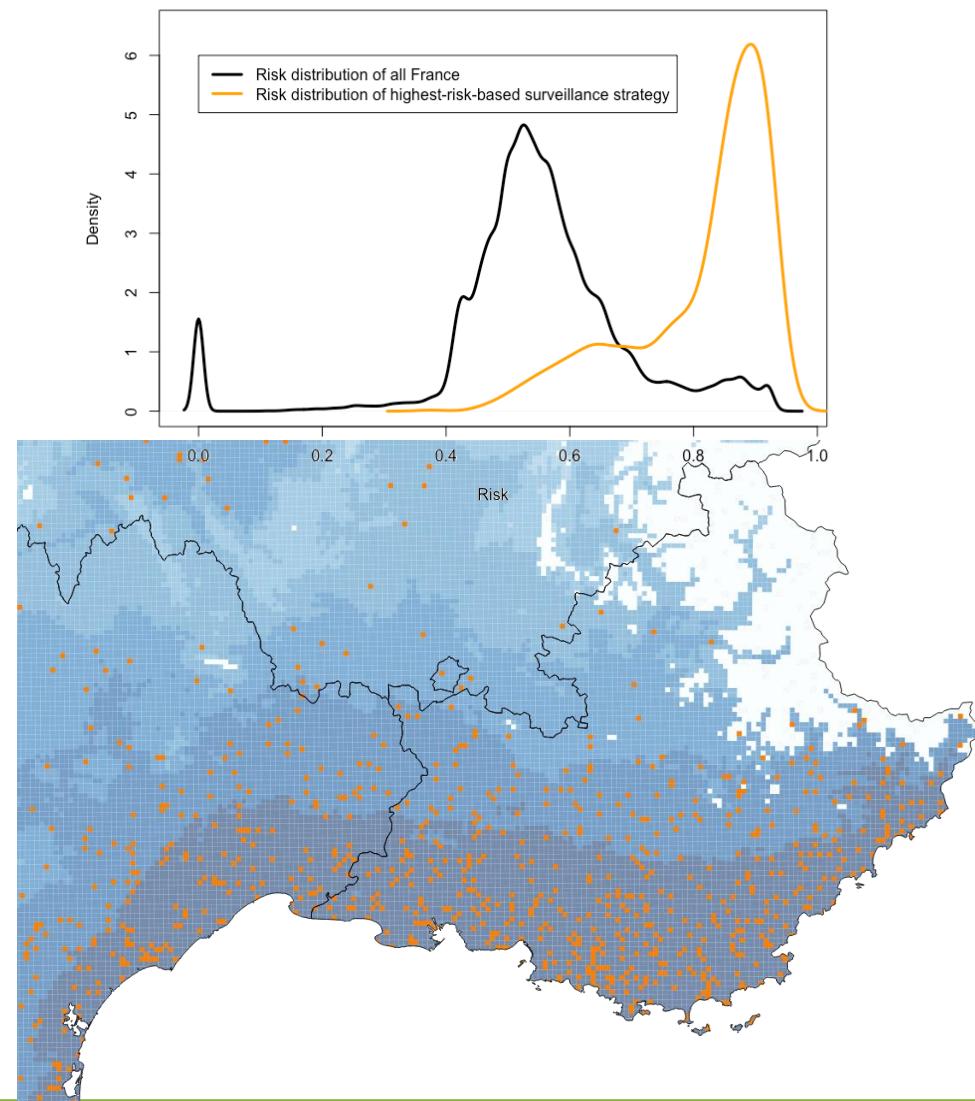
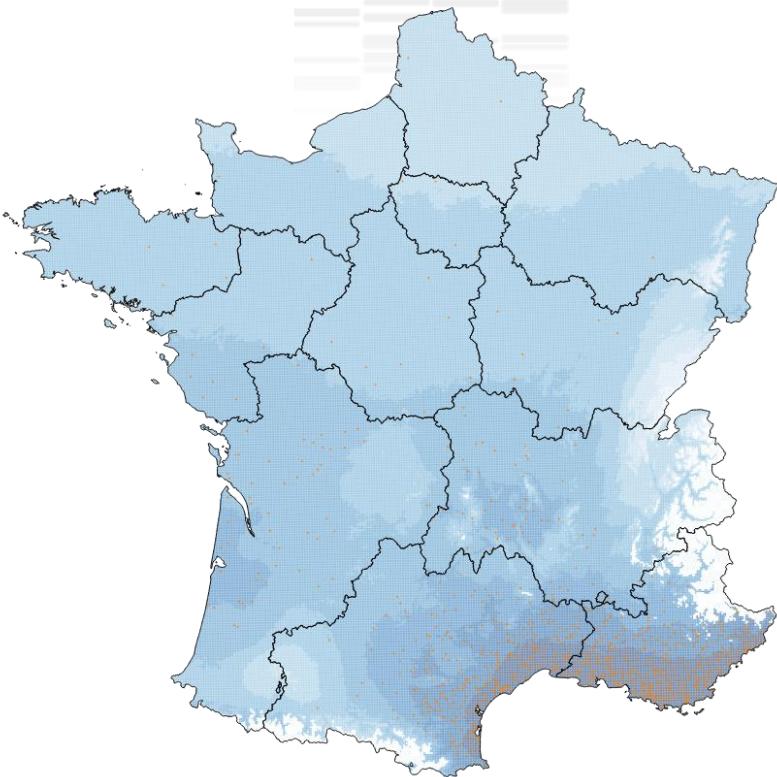
# Moderate-risk-based strategy

Distribution of risk

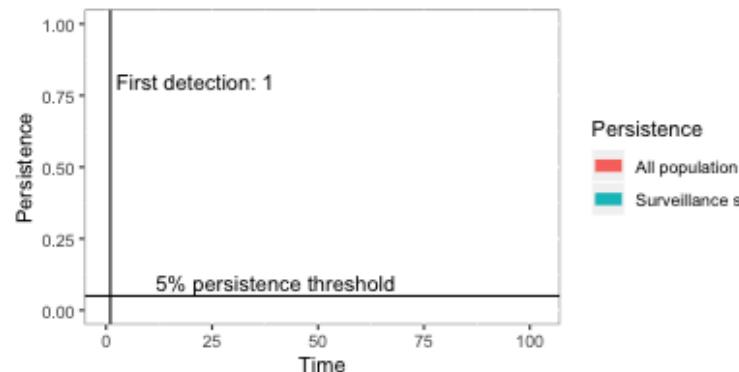
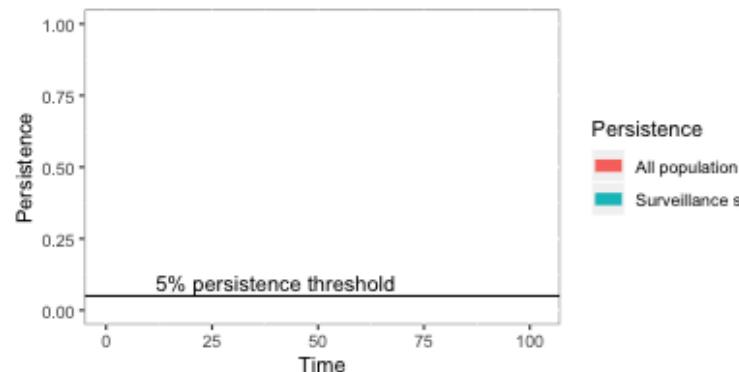
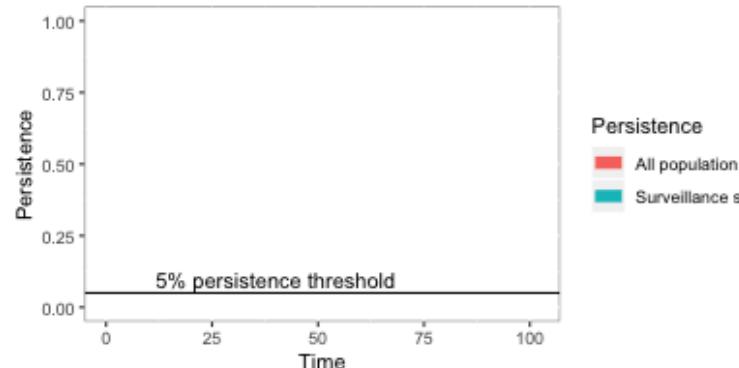
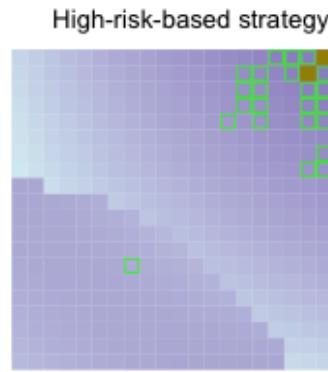
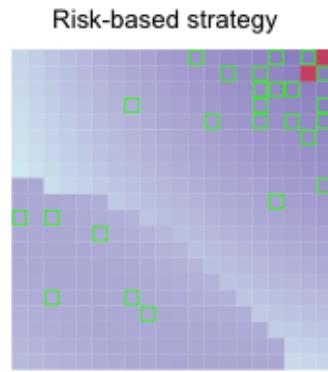
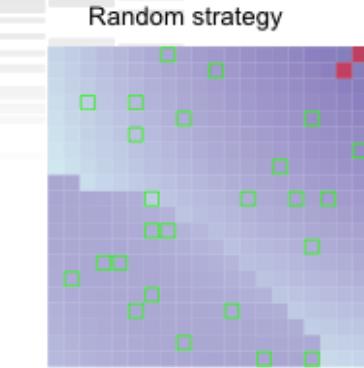


# High-risk-based strategy

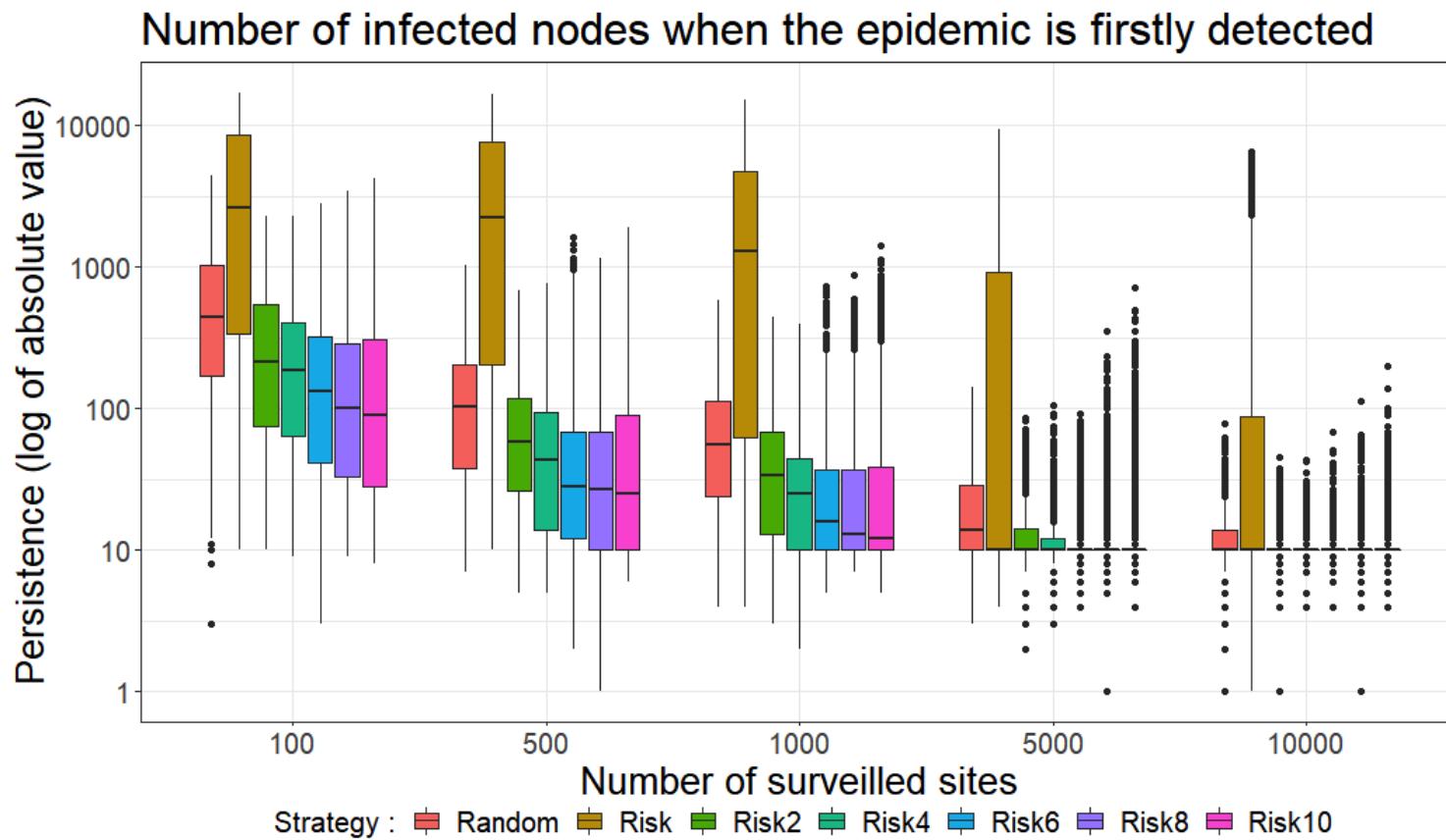
Distribution of risk



# Evaluating surveillance strategies

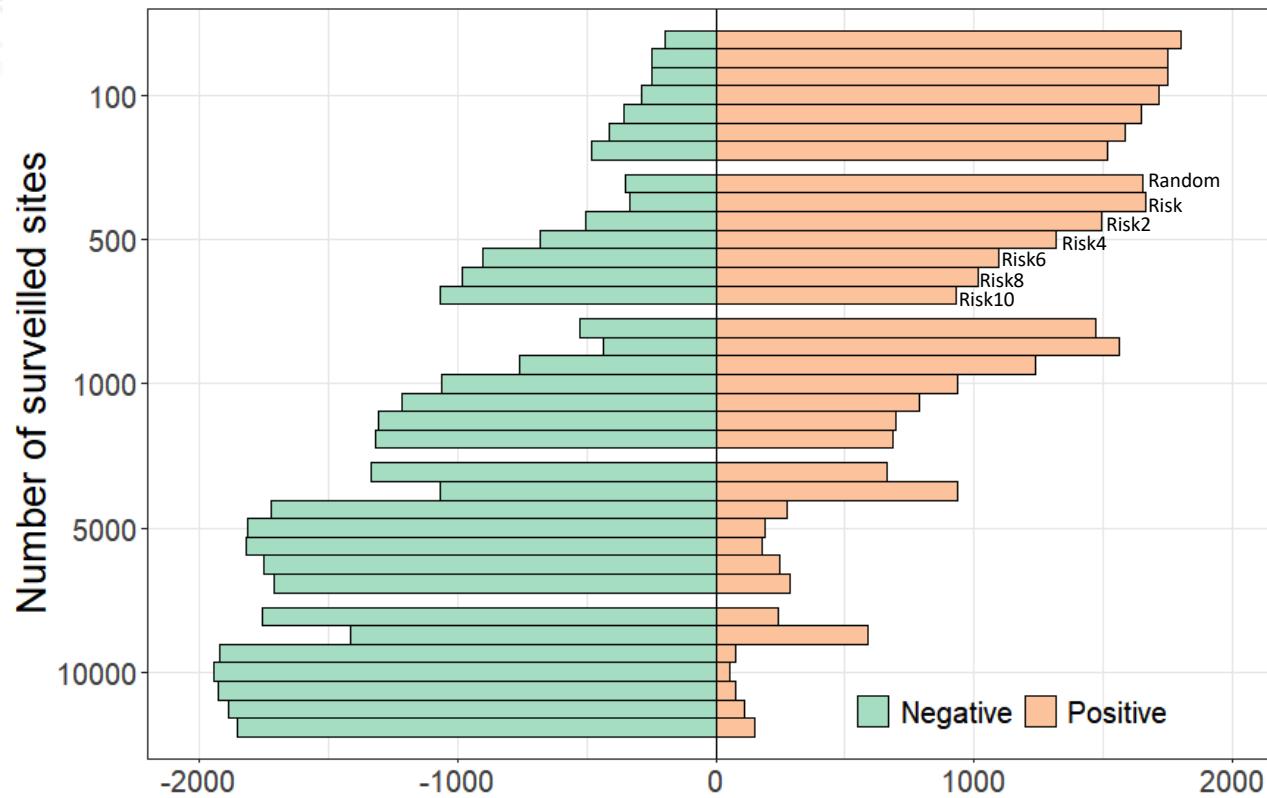


# Results: Time of first detection



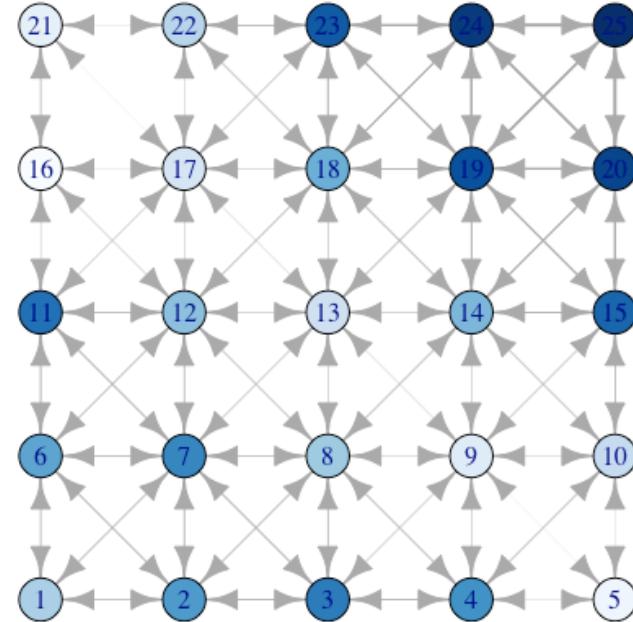
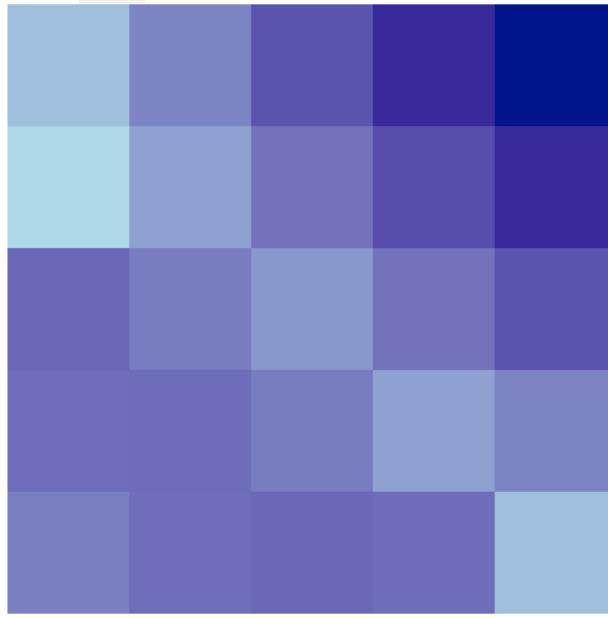
Boxplots represent the average persistence of the epidemic on the whole population at the time of first detection

# 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:

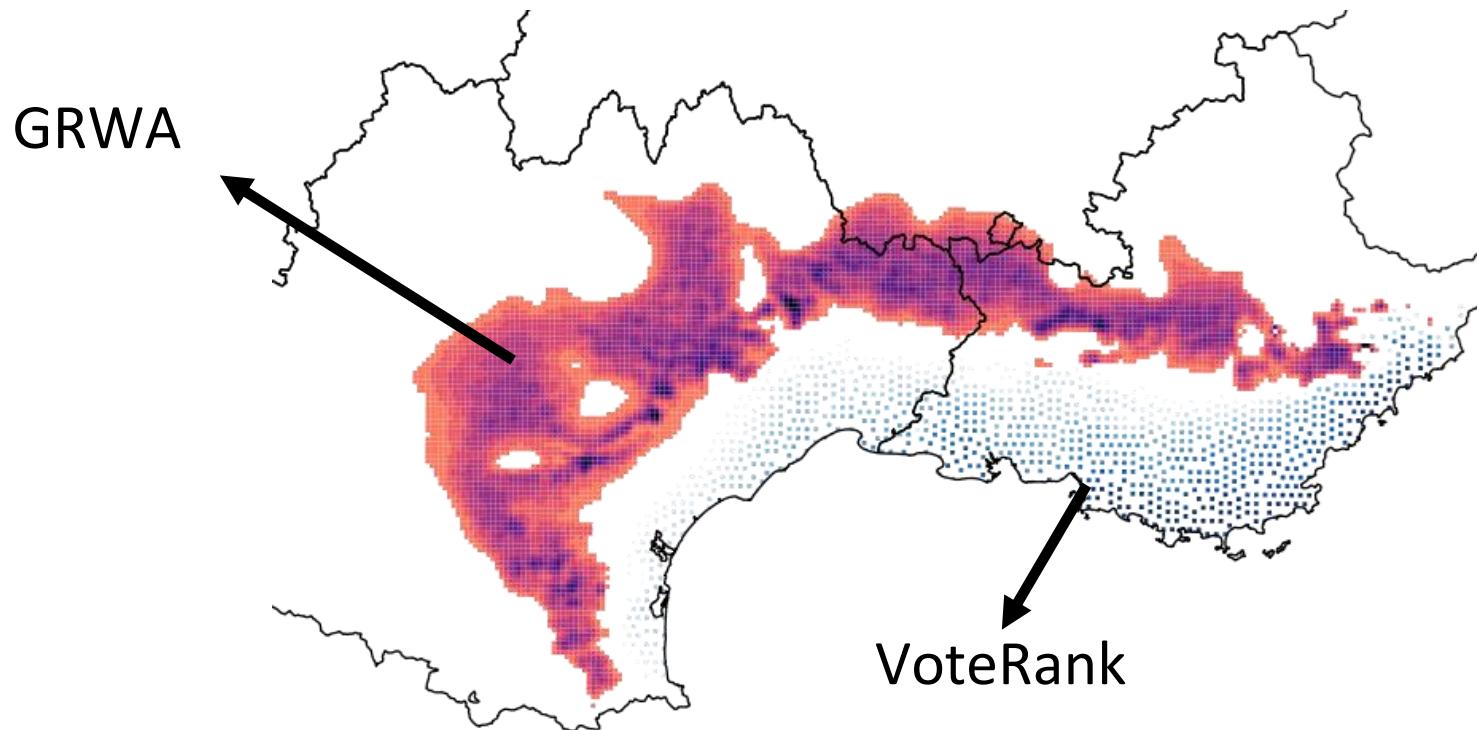
- 8 nearest neighbours
- Link between node weighted according to risk

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

# Use nodes metrics to define surveillance strategies

**Generalized Random Walk Accessibility**<sup>a</sup>: accessibility of a node from all other nodes, weighted by the inverse of the factorial of the walk length

**VoteRank**<sup>b</sup>: modified version of PageRank algorithm



<sup>a</sup>de Arruda et al. (2014). Physics Reviews E, 90.

<sup>b</sup>Zhang 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

