

# The French National Forest Inventory survey

## Covering space and time at country level

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6th june 2019



- 
- ITACOSM 2019**  
 10-12 June 2019 | The International Trade Centre

## Context



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- European forests in expansion (~40% of land area)
  - ▶ Forest transition after a minimum (19-20th century)
  - ▶ Abandonment of the poorest cultivated lands
  - ▶ Intensification of agriculture
  - ▶ Switching to fossil energies

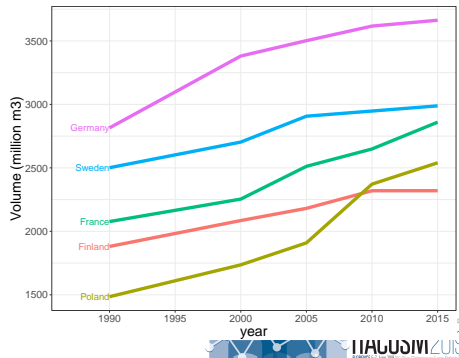
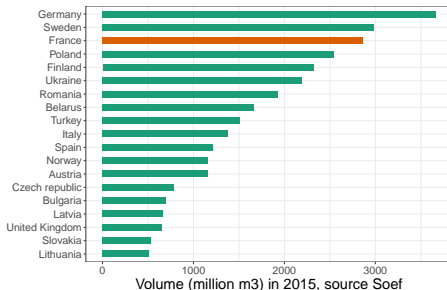




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## French forests

- Almost 17 millions of ha
  - ▶ 30% of the country
- **Area doubled in one century** (still ~100.000 ha/year)
- **Volume doubled in the last 60 years**
- Third stock of Europe
  - ▶ First broadleaved stock
- Highly diverse
  - ▶ compared to other European forests
  - ▶ many macroclimates
- One of the most exposed to climate change (CC)

## New challenges

- (European) forests at the heart of new challenges
  - ▶ Bioeconomic transition (Wood = renewable material)
    - Direct effect (carbon sequestration)
    - Substitution effect (avoidance of energy-intensive material *eg* concrete, steel)
  - ▶ Climate change mitigation (carbon stock)
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  - ▶ Climate change itself (temperature, precipitations)
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Forests are dynamics ecosystems

How to tackle the challenge to follow and measure the forest ecosystems ?

→ Some highlights from the French National Forest Inventory (NFI)

# The French National Forest Inventory

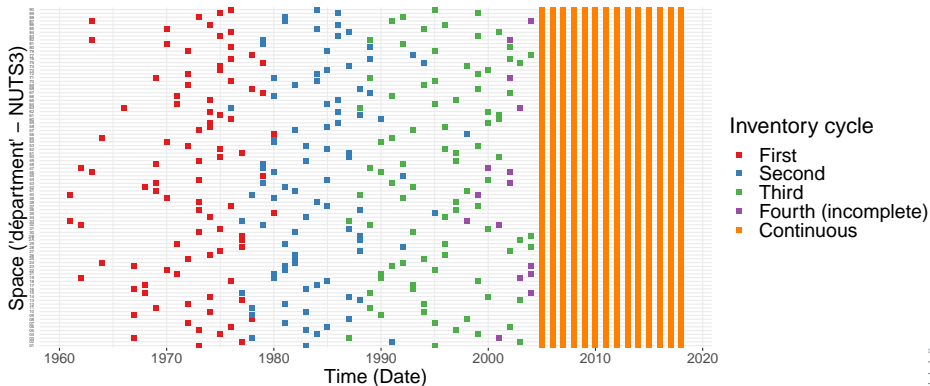


## Countrywide continuous inventory

- After the 1999 storms (Lothar and Martin : ~ 180 millions de m<sup>3</sup>)
  - ▶ NFI was not able to give quick and accurate estimate of the damages
  - ▶ Need for a new type of inventory
  - ▶ In 2005 from discontinuous to continuous inventory in **space and time**

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## A two phase inventory

- Annual sampling
- Two (main) interest (populations) :
  - ▶ The territory (point)
  - ▶ The ressources (trees)
- A “systematic” first phase :
  - ▶ Photo-interpretation (80 000 to 100 000 plots/year)
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  - ▶ Sub-sample of all the plots likely to contain forests (5.000 to 7.000 new plots per year)
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  - ▶ And phase 1 plots for all other categories (inland water, infrastructure, agriculture, ...)
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  - ▶ Less constraints on the sampling design → **More flexibility**
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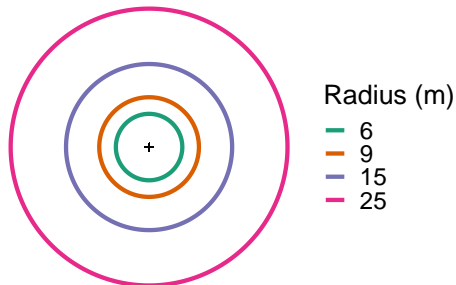
Not really, trees have no choice. . . and do not lie !

## Inventory plots

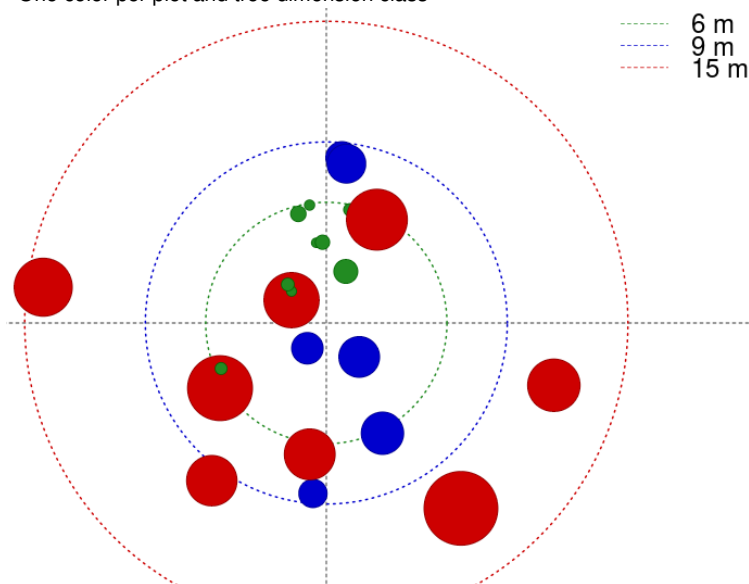
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## Inventory plots

- More than 200 observations per (forest) plot
- Plots "regularized" the spatial micro structure of the forest variables (ex : V/ha)
- A system of circular concentric plots
- Plot of 25 m radius
  - ▶ Stand description
  - ▶ Common between phase 1 and 2
- 15 m plot
  - ▶ Ecology and bigger trees ( $d \geq 37,5 \text{ cm}$ )
- 9 m plot
  - ▶ Intermediate trees ( $22,5 \text{ cm} \leq d < 37,5 \text{ cm}$ )
- 6 m plot
  - ▶ Small trees ( $7,5 \text{ cm} \leq d < 22,5 \text{ cm}$ )



- An example of a real plot :
  - ▶ One color per plot and tree dimension class



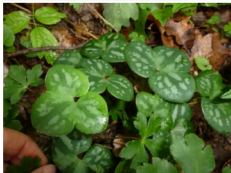
## Dendrometric (tree) measurements on 6, 9 and 15 m

- More than 150 tree species in (metropolitan) France
- Measure of tree circumference, height, growth, *etc.*
- Initially for all trees
- Now :
  - ▶ Simplification (less trees measured)  
→ Imputations
  - ▶ Lightening of the field tools





## Ecology (15 m plot)



- Ecological data since the 80's
  - ▶ Flora (> 3000 plant species)
  - ▶ Geology
  - ▶ Pedology (soils)
  - ▶ *etc*



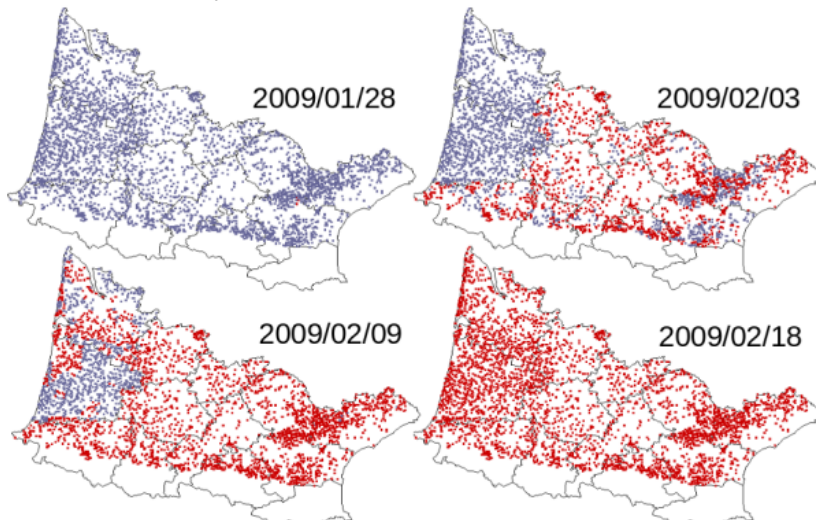
## A responsive tool : example of the Klaus storm (2009/01/24)

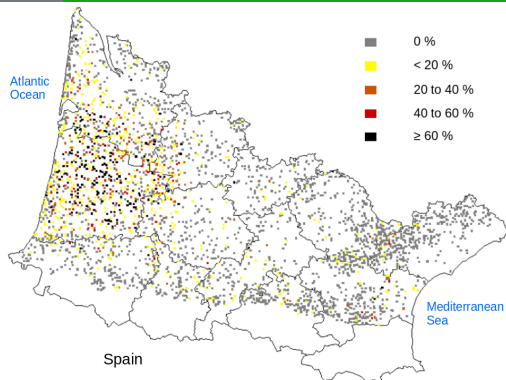


Klaus impact on south-west pine forests

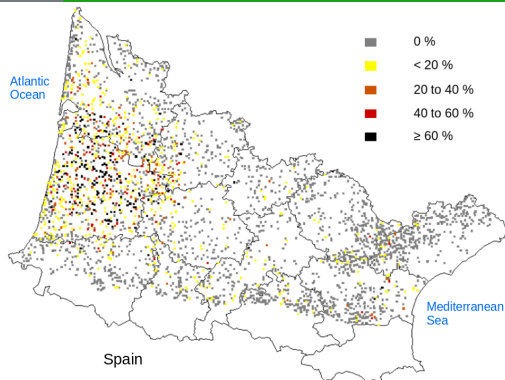
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- In red, the revisited plots





- Post-storm update of all plots
- Less than a month after the event to produce the final estimates



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## Damages

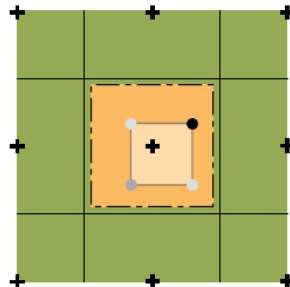
42.5 millions  $m^3$

37 millions  $m^3$  for the sole maritime pine

## The sampling grid

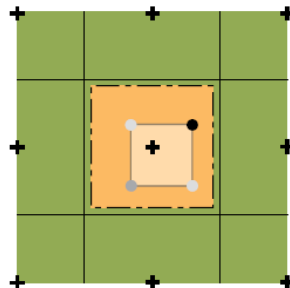
## A kilometric grid

- Defined since 2005
- Regular organization of annual sample
  - ▶ Optimization of spatial distribution (5-year moving averages)
  - ▶ Logistic optimization
- Random drawing of the plots in the kilometric cell
  - ▶ Spatial stratification / Tessellation stratified sampling
- Eventually densification ( $\leq 4$  points per cell)



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- 
- Each cell of the grid belongs to a level that allows regular subsampling
  - Division by 2 of the number of points each time a level is raised

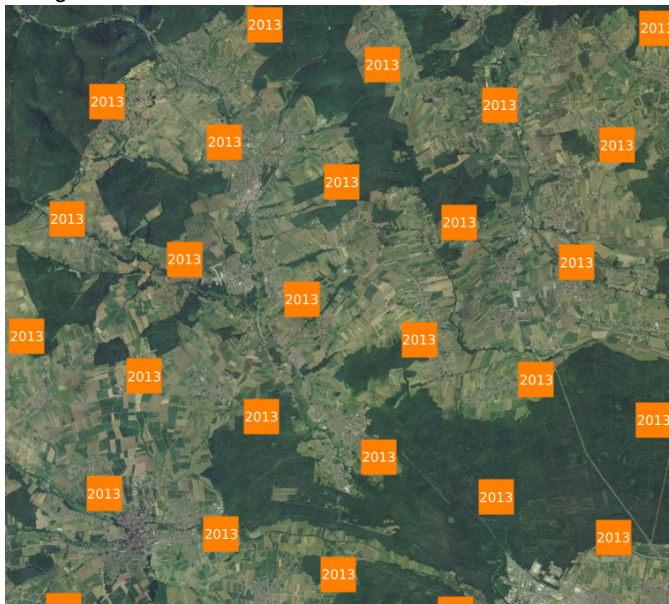


Essentially

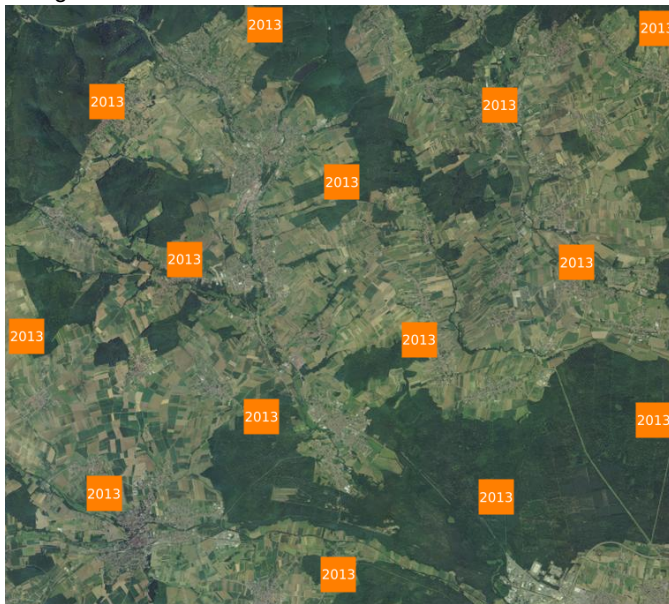
**The grid is a support for systematically distributing samples in space and time**



## Level 1 : annual grid of 10 km<sup>2</sup>



## Level 2 : annual grid of 20 km<sup>2</sup>



## Niveau 3 : annual grid of 40 km<sup>2</sup>



## Niveau 4 : annual grid of 80 km<sup>2</sup>



## Annual splitting

- Annual sample grid are square
- Valid property for a subset of grid dividers  $d$  which verify :

$$d = a^2 + b^2, \{a, b, d\} \in \mathbb{N}$$

where  $a$  and  $b$  are coordinates of the sub-sample

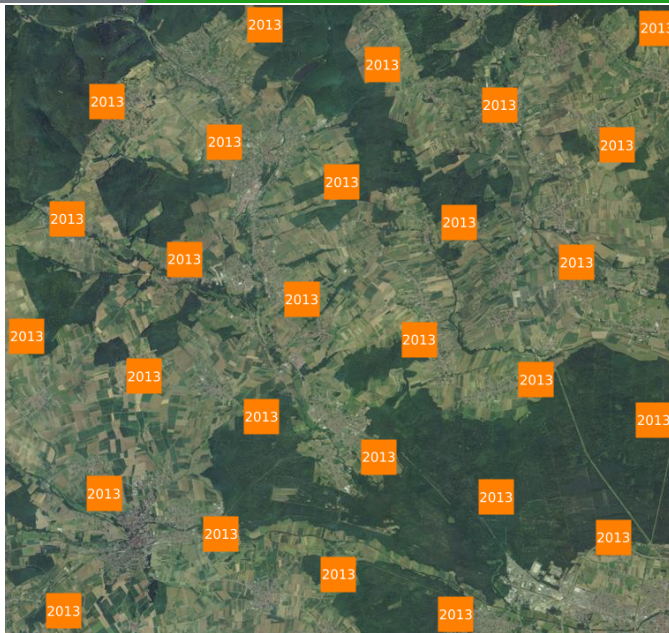
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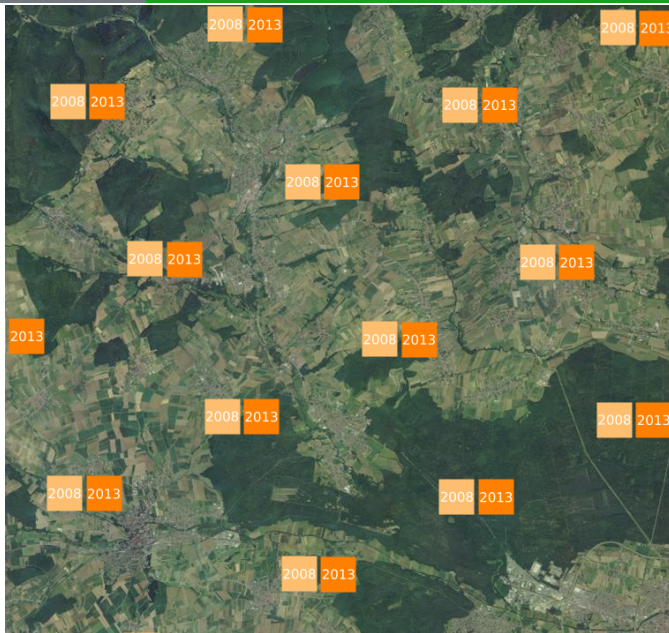
- Initial choice of  $d = 10$  ( $3^2 + 1^2$ )
- Five first annual fractions positionned
- Next five years shifted by 1km to the east
  - ▶ Remeasurments of 5 years old plots *rigtharrow* “rectangular” sampling grid !
  - ▶ But (still ?) no **permanent plots**

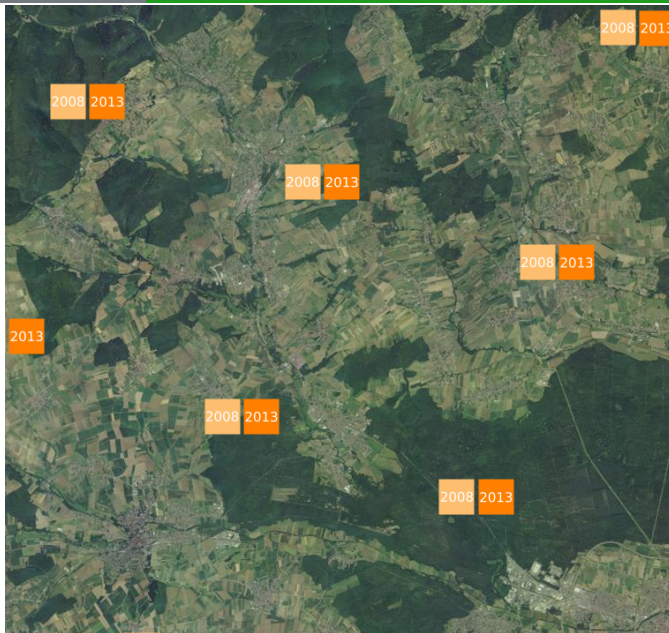








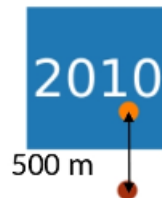




2005	2010	2006	2011	2007	2012	2008	2013
2013	2009	2014	2005	2010	2006	2011	2007
2007	2012	2008	2013	2009	2014	2005	2010
2010	2006	2011	2007	2012	2008	2013	2009
2009	2014	2005	2010	2006	2011	2007	2012
2012	2008	2013	2009	2014	2005	2010	2006
2006	2011	2007	2012	2008	2013	2009	2014
2014	2005	2010	2006	2011	2007	2012	2008

## From 2015 to 2019

- More measures on the five year old (return) plots
- Same grid as the previous one but :
  - ▶ New point positionned at 500 m to the north or the south
- Samples (too much) constrained by previous ones



## From 2020

- Based on the original grid
- The grid is shifted by 1km to the north
  - ▶ Year = year + 15
  - ▶ Same levels
- Thus "complete" coverage of the country
- Twice at level 1 (first phase)
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2013 1	2009 1	2014 1	2005 1	2010 1	2006 1	2011 1	2007 1
2007 3	2012 3	2008 2	2013 2	2009 3	2014 3	2005 2	2010 2
2010 1	2006 1	2011 1	2007 1	2012 1	2008 1	2013 1	2009 1
2009 2	2014 2	2005 8	2010 8	2006 2	2011 2	2007 4	2012 4
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- The same grid during 20 years !

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2013 1	2009 1	2014 1	2005 1	2010 1	2006 1	2020 2	2007 1
2007 3	2012 3	2008 2	2013 2	2009 3	2014 3	2005 2	2010 2
2010 1	2006 1	2020 8	2007 1	2012 1	2008 1	2013 1	2009 1
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## Some (statistical) perspectives





## New auxiliary data

- Use of auxiliary data is familiar through post-stratification
- But :
  - ▶ Limited to a small set of administrative and internally produced maps
  - ▶ Sometimes complex thus restricted to the scientific / technical team
- Auxiliary data need to be **RARE** :
  - ▶ **R**elvant : correlated with field attributs
  - ▶ **A**t marginal cost : budgetary constraints
  - ▶ **R**egularly updated : avoiding large time lag
  - ▶ **E**xhaustive over the territory : generalization

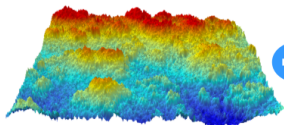
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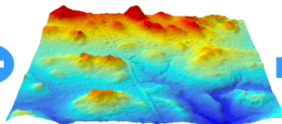
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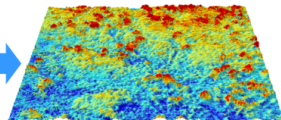
DSM (altitudes)



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CHM (heights)

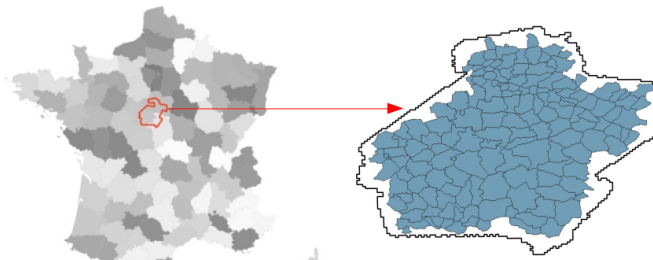


## New statistical approaches

- kNN imputation
- Method successfully developped in Nordic countries (Erkki Tomppo)
- Still at research level in France (complexity of the forests)
- A way to produce estimates at finer scale
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- The Sologne example (*cf. Irulappa-Pillai-Vijayakumar et al. 2019*)
  - ▶ 6500 km<sup>2</sup>, ~ 50% of forests
  - ▶ 75% of broadleaves (mainly oaks), 75% of private forests
  - ▶ 800 NFI forest plots over 5 years (2010-2014)



## The Sologne example

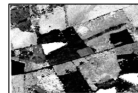
### ■ Auxiliary data



Forest type map



Landsat images (30 m)



Photogrammetric CHM

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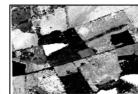
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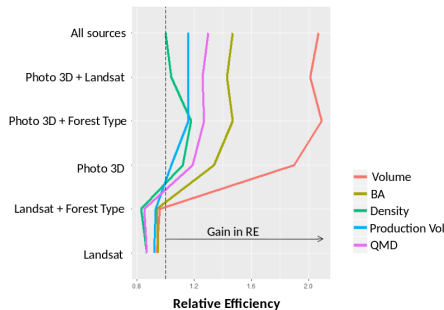
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### Results in terms of Relative Efficiency (RE)

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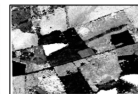
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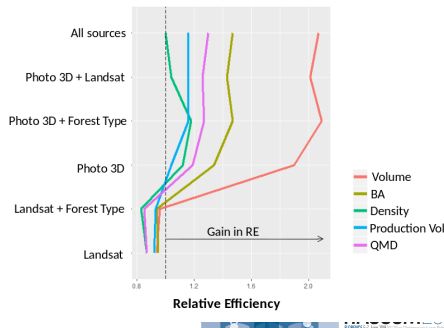
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### Perspectives

- ▶ Test in a more complex (mountainous) area
- ▶ Compare RE with post-stratification strategy





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- nFIESTA
  - ▶ Combination of different sampling design (one / country)
  - ▶ Horvitz-Thompson theorem for continuous populations (Cordy 1993)
  - ▶ Tested for 4 countries (to be published)

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### Future NFIs

Are ideally positionned to play a major role in **ecosystem monitoring** and adress the future challenges at many different scales

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- In order to built a **robust and flexible** tool

### Future NFIs

Are ideally positionned to play a major role in **ecosystem monitoring** and adress the future challenges at many different scales

### But

They need strong statistical effort in order to take the full advantages of the open possibilities !

## Questions ?

# Thank you !

