



# A PRACTICAL APPROACH FOR SYNDROMIC SURVEILLANCE ON MORTALITY DATA OF RENDERED ANIMALS

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## Motivation

The search for an implementation method of rendered animal data from rendering company Rendac as part of a bigger syndromic surveillance on animal disease events, led to a method that is quite straightforward. Starting point were the aggregated data on date, animal category per animal species and farm ID. Analyzing the years 2015 and 2016, that are seen as outbreak-free years, showed very low counts of rendered animals on one particular day and farm, making it possible to detect abnormalities in a easy and practical manner, when mortality would increase due to a – at that time – not further specified reason.

## Data set

365625 collections of animals by Rendac in 2015-2016 (bovine)

Variables:

- Herd ID
- Animal category
- Collection date
- Postal code
- City
- Quantity: animal count

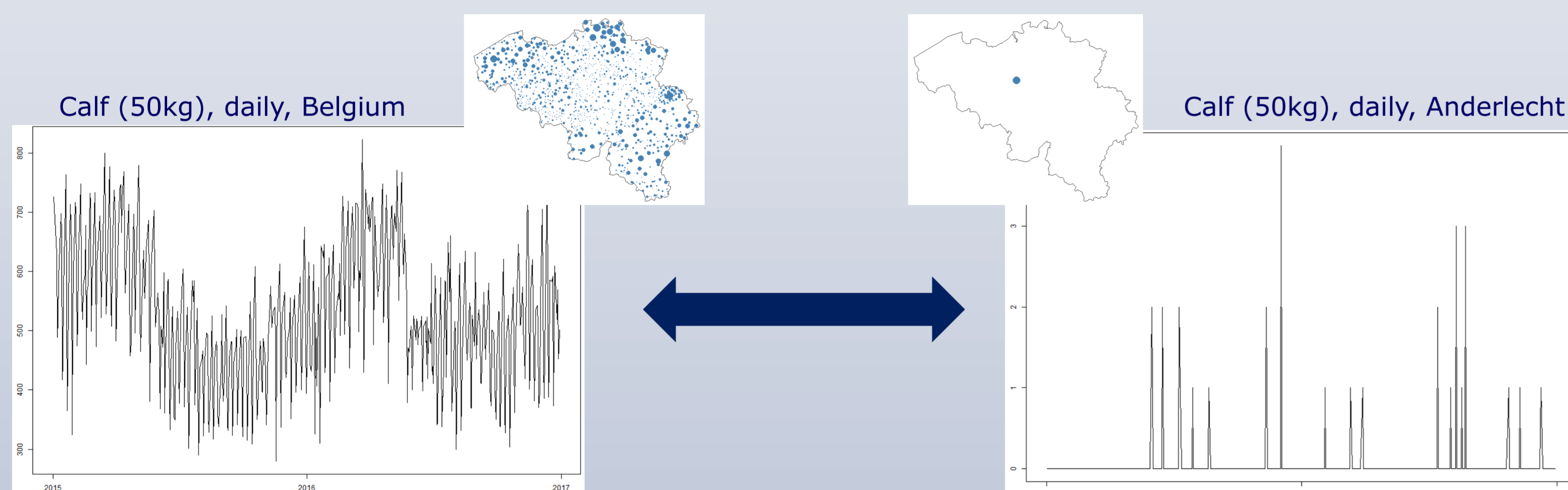
Herd	AniDesc	ColDate	PCode	City	Quant
1060060	CALF (50 KG)	2015-01-02	3770	RIEMST	2
1060102	CALF (50 KG)	2015-01-02	2440	GEEL	1
1060121	CALF (50 KG)	2015-01-02	9140	TEMSE	2
1060185	CALF (50 KG)	2015-01-02	2990	WUJSTWEZEL	1
1060185	REJECTED CALF (10 KG)	2015-01-02	2990	WUJSTWEZEL	1
1060193	CALF (50 KG)	2015-01-02	2300	TURNHOUT	1
1060232	BOVINE (550 KG)	2015-01-02	2920	KALMTHOUT	1
1060236	CALF (50 KG)	2015-01-02	2490	BALEN	1
1060369	CALF (50 KG)	2015-01-02	2382	POPPEL	1

Aggregation:

- Temporal: daily or weekly
- Spatial: by postal code or province

## Which time series?

What level of spatial aggregation is best suited for SyS?



- high counts
- seasonality, periodicity, correlations
- complex detection algorithms: regression adjustments, SPC algos, Farrington, ETS, ...
- variable UCL required

- (very) low counts, many zeroes
- no discernable seasonality or correlation
- easy models: (zero-inflated) Poisson
- constant UCL possible!

Aggregating data of rendered animals on date, category and postal code, show 99,5% of entries are < 5 animals. This result can be used as a 99,5 percentile cut off for the detection of excessive mortality.

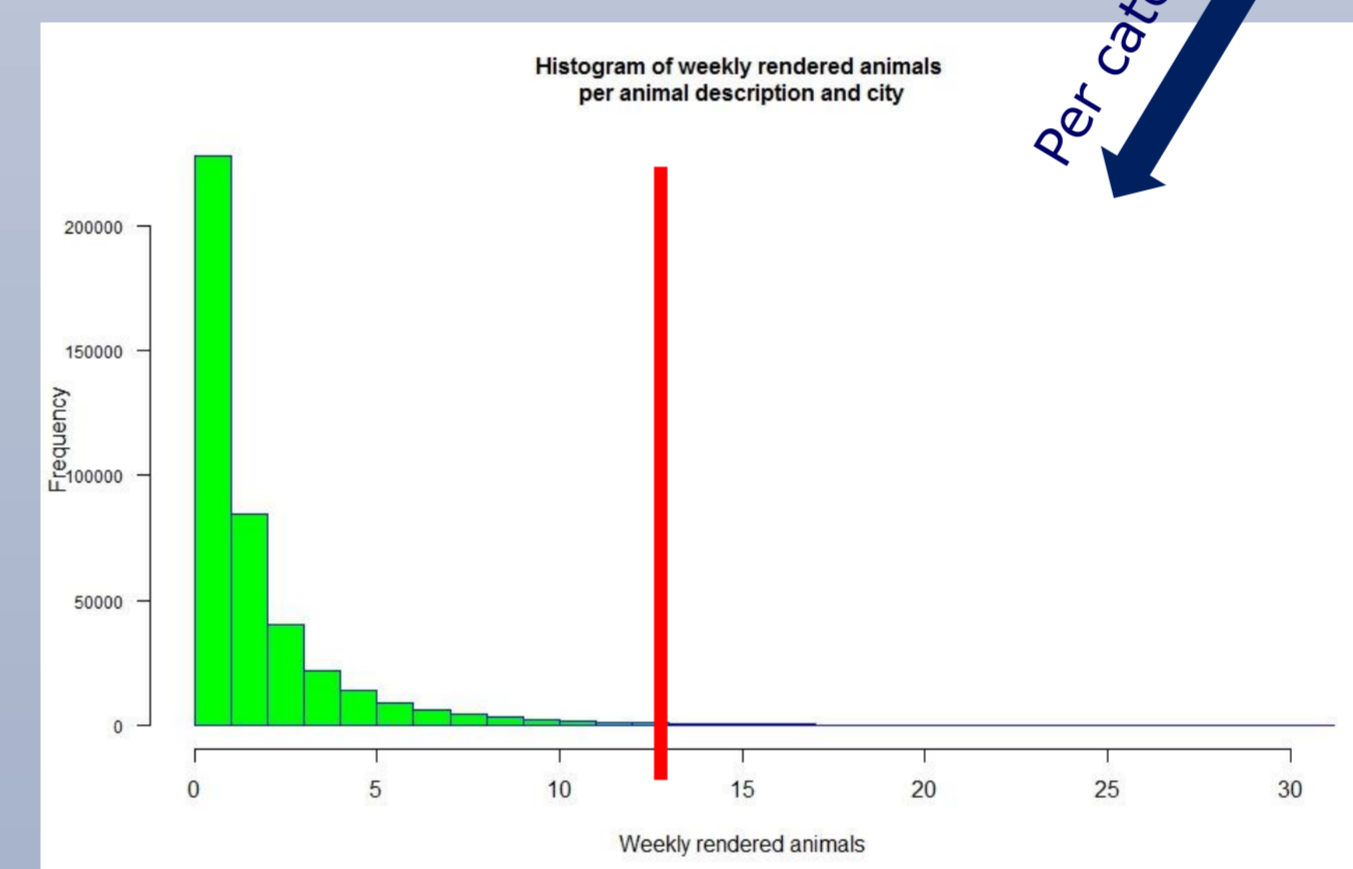
## Aspects of syndromic surveillance (SyS)

- Retrospective / prospective
- An alarm is generated for days with suspiciously high counts  $count > UCL$  (Upper Control Limit)
- Is there an assignable cause for the alarm? Onset of disease?

Detailed action plan is required:

- How do we act on an alarm? True positive or false positive? flow-chart, protocols, ...
- Gather information on possible causes as quickly as possible. Timeliness is crucial

Several ways of determining the UCL are possible. For example as 99,5%-quantile



BOVINE DATA 2015-2016			
# rendered	# entries	%	sum
1	317731	86,9008	
2	36919	10,0975	96,9983
3	7201	1,9695	98,9678
4	2044	0,559	99,5268
<b>CUT OFF</b>			
5	741	0,202667	99,7295
6	360	0,0984615	99,828
7	171	0,0467692	99,8747
8	111	0,030359	99,9051
9	60	0,0164103	99,9215
10	62	0,0169573	99,9385
11	33	0,0090256	99,9475
12	27	0,0073846	99,9549
13	21	0,0057436	99,9606
14	7	0,0019145	99,9625
> 14	116	0,0317265	99,9666

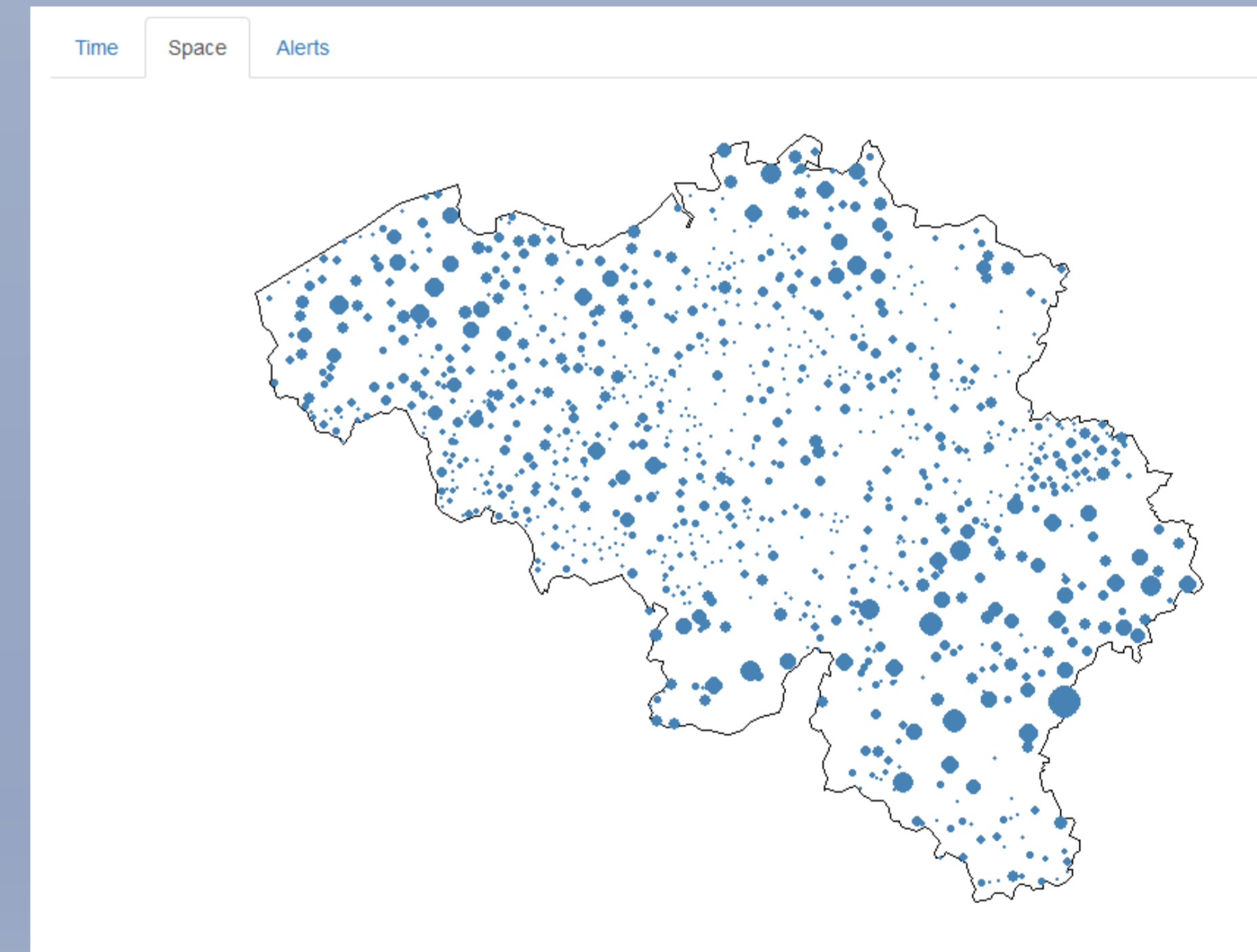
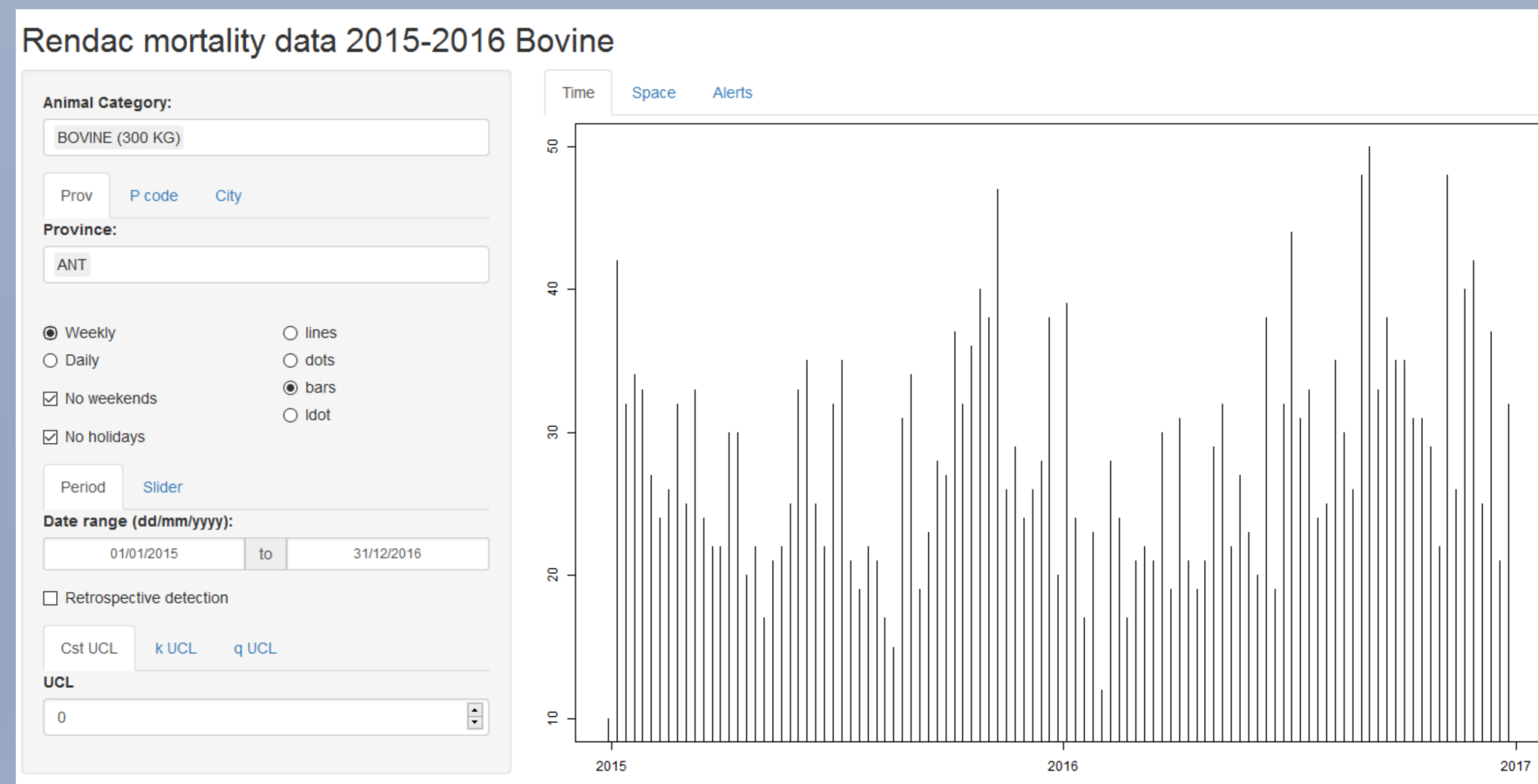
## Visualisation and exploration tool

An R Shiny interface was created to visualize the amount of dead animals. Users can select:

- Daily/weekly counts
- Time interval
- Time series of counts
- Geographical distribution of counts
- Fixed/Shewhart/quantile UCL

Automatic ranking of alarms:

- Ranked by exceedance score. most suspicious exceedances are to be examined first



score	PCAD	ColDate	Quant
50	CALF (50 KG)-4890	2016-02-19	61
42	CALF (50 KG)-4890	2015-01-26	53
42	CALF (50 KG)-4890	2015-12-04	53
42	CALF (50 KG)-4890	2016-03-11	53
41	CALF (50 KG)-4890	2016-10-07	52
38	CALF (50 KG)-4890	2016-01-11	49
37	CALF (50 KG)-4890	2015-01-12	48
34	CALF (50 KG)-4890	2015-03-02	45

Date, location and animal category of the most suspicious alarm in the dataset

priority in action plan?

## Conclusions & further work

- Using straightforward techniques (constant UCL) on a low level of spatial aggregation can result in timely detection and high resolution, provided sufficient effort is spent on the action plan: putting in place detailed protocols that act on the alarms
- Development of a visual exploration tool. Retrospective or prospective analysis. Automatic ranking of alarms by exceedance score
- Major improvements are anticipated if herd sizes are known. Sanitel data?
- Ranking can be improved by using a zero-inflated Poisson models. Many zero counts

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References:

- Holt C.C., Modigliani F., Muth J.F. (1960) Planning production, inventories and work force, Prentice Hall.
- Fiore G., Hofherr J. et al. (2010) On-farm Mortality in Cattle - Analysis of on-farm mortality data for cattle for retrospective and prospective epidemiological surveillance, European Commission, JRC Scientific and Technical Reports.

