

# A cold-health watch and warning system, application to the province of Quebec

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## Background & Objective

- Extreme cold weather has serious impacts on human life and health.
- Almost no studies focused on cold warning systems to prevent those health effects.
- In Nordic regions, winter mortality is generally higher than the rest of the year such as in the province of Quebec in Canada.
- **Objective:** establish a watch and warning system specifically for health impacts of cold, applied to different climatic regions of the province of Quebec.

## Data

- **Location:** 16 heal regions (denoted RSS) of Québec.
- **Period:** December to March, 1994-2015
- **Weather variables:** daily temperatures (max, min, mean), wind speed (max, min, mean) and vapor pressure.
- **Health variables:** daily all-cause mortality and the daily all-cause hospitalization data for each RSSs.

## Considered methods

**RSS clustering:** use a hierarchical agglomerative clustering (HAC) on the daily climatic variables of the 16 RSSs of Quebec.

### Cold warning system

The objective is to estimate temperature indicators and thresholds for each class of RSS. The considered method contains four main steps:

1. Choose appropriate lags for cold indicators, by a distributed lag non-linear model (DLNM). The cold indicators are define as  $S_t = \sum_{l=0}^L \alpha_l X_{t-l}$ , where  $X_t$  are the forecast temperatures of  $T_{max}$  and  $T_{min}$  at day  $t$ , and  $\alpha_l$  are the weightings such that:

$$\begin{cases} \alpha_i \geq \alpha_j, \text{ for } i < j < L \\ \sum_{l=0}^L \alpha_l = 1 \end{cases}$$

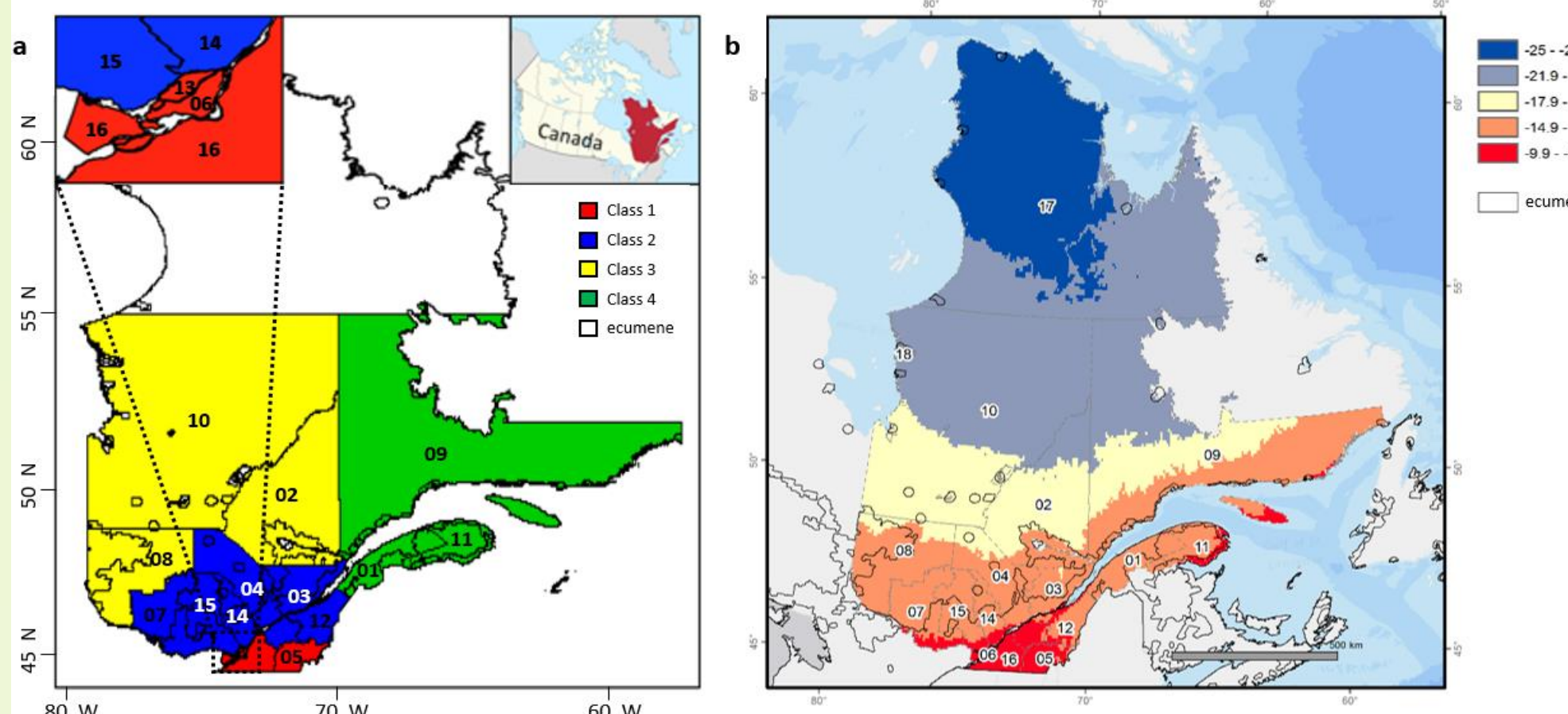
2. Compute the over-health (OH, includes over-mortality and over-hospitalization) series from the daily mortality and hospitalization:  $OH_t = \frac{OD_t - ExpD_t}{ExpD_t} * 100$  (%). Determine the threshold of OH (OHT).

3. Determine the cold-related historical episodes of OH

4. Choose the appropriate indicators and corresponding thresholds, sensitivity and false alarms (FA) are used to evaluate the performance of results.

## Results

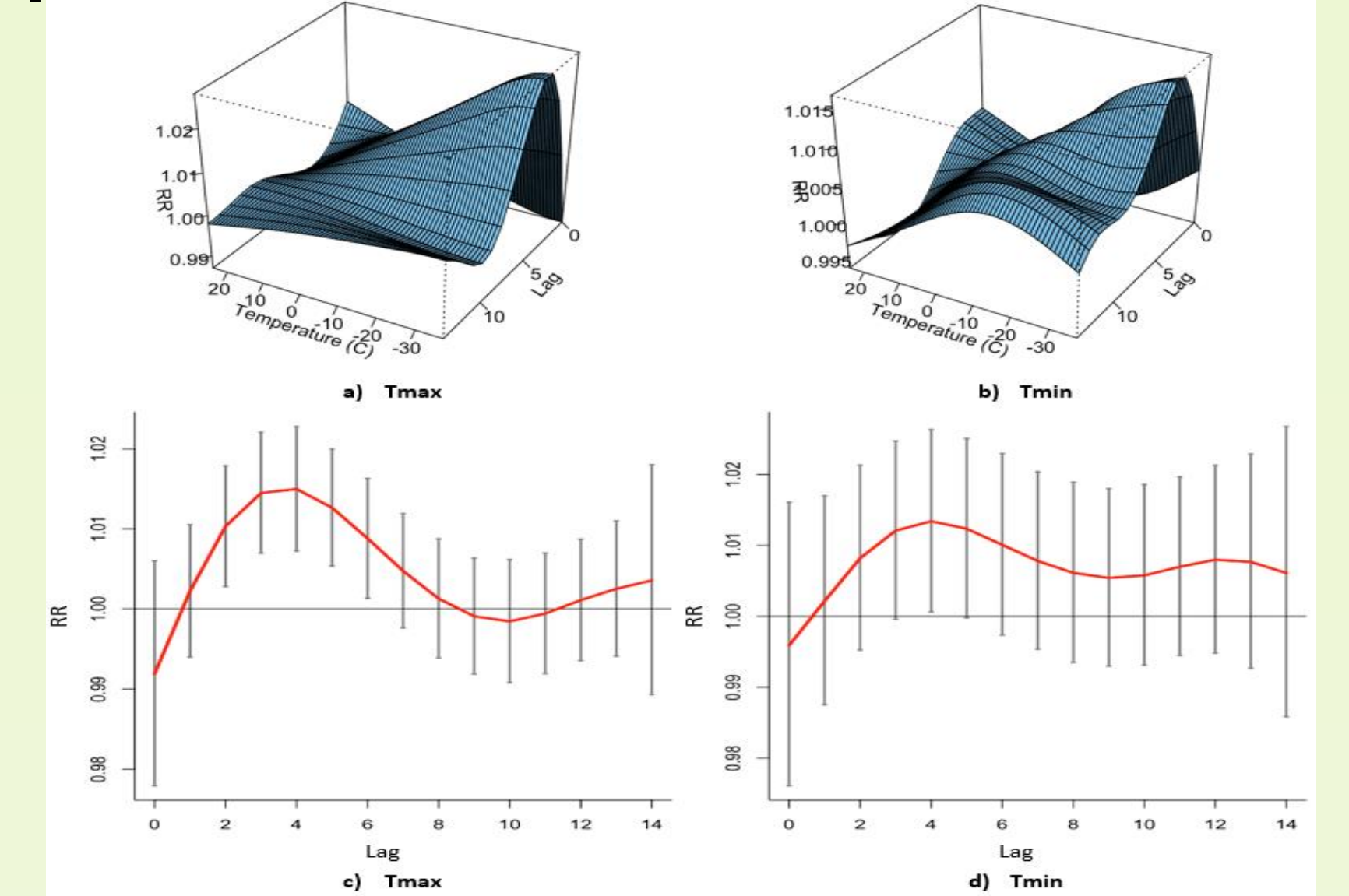
### RSS clustering :



**Fig. 1** a Grouping of the 16 RSSs of the province of Quebec for the winter period. b Quebec climatic map based on the average temperature of 1981-2010 (winter period only)

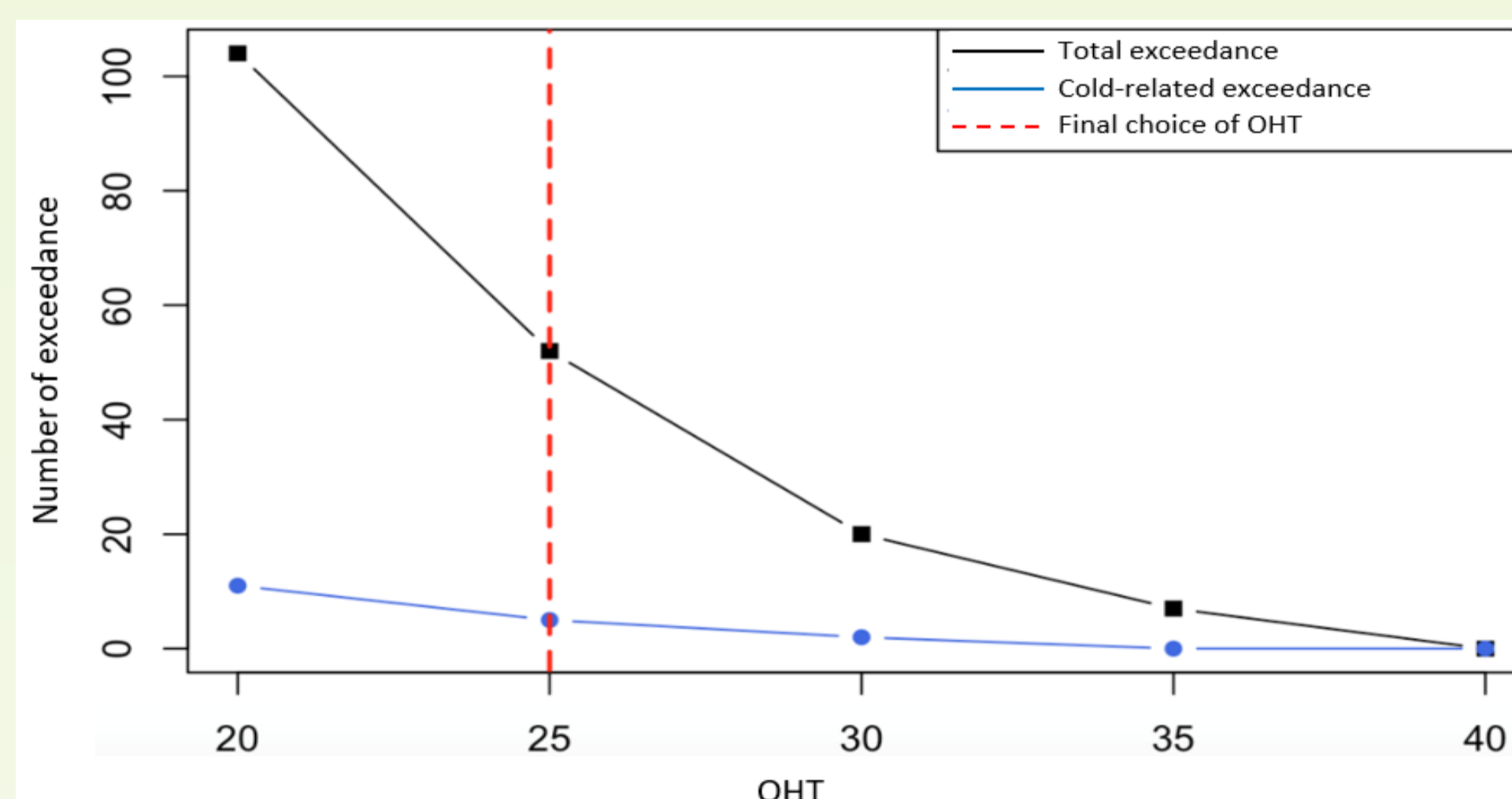
The final clustering (Fig. 1a) is geographically homogeneous and shows good agreement with the climatic map (Figure 1b)

### Step 1: lag for cold indicators

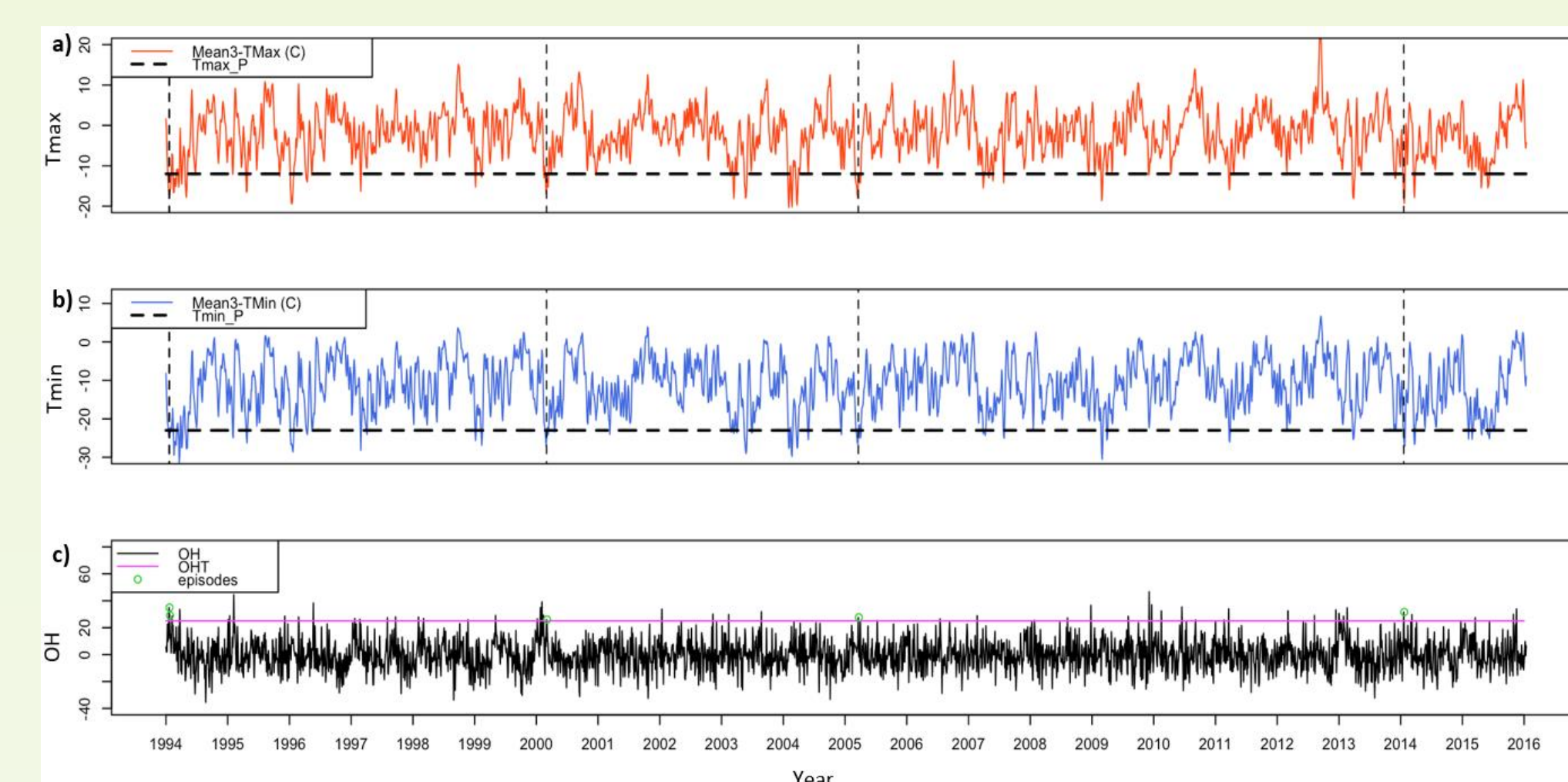


**Fig. 2** a) DLNM surfaces between  $T_{max}$  and mortality. b) DLNM surfaces between  $T_{min}$  and mortality. Lag-response relationships between daily mortality and  $T_{max}$  (c) and  $T_{min}$  (d) for winter period of class 1, at  $T_{max} = -12$  °C /  $T_{min} = -23$  °C, grey bars show 95% CI. A lag of  $L=4$  is chosen for  $T_{max}$  and  $T_{min}$

### Step 2-3: calculate OH series and determine cold related historical episodes



**Fig. 3** Total exceedance function and the cold-related exceedance function. For mortality data and for class 1.



**Fig. 4** : Temperature series and OH (mortality) series for class 1. a)  $T_{max}$  series and preliminary threshold. b)  $T_{min}$  series and preliminary threshold. c) OH series and the detected episodes with OHT=25%.

### Step 4: final indicators and corresponding thresholds

	RSS	Nom RSS	Episodes #	Optimal weight		Thresholds (°C)	Sensitivity (%)	FA (par year)
				a0	a1			
class 1	5	Estrie	4	0.5	0.5	(-15,-23)	100	0.68
	6	Montréal						
	13	Laval	5	1	0	(-14,-24)	100	0.75
class 2	3	Capitale-Nationale	4	0.5	0.5	(-16,-28)	100	0.68
	4	Mauricie						
	7	Outaouais	7	0.7	0.3	(-13,-26)	100	1.10
	12	Chaudière-Appalaches						
class 3	14	Lanaudière	5	0.7	0.3	(-20,-29)	67	1.05
	2	Saguenay						
	8	Abitibi	6	0.7	0.3	(-17,-30)	100	1.30
class 4	10	Nord-du-Québec	4	0.5	0.5	(-15,-23)	100	1.27
	1	Bas-Saint-Laurent						
	9	Côte-Nord	5	1	0	(-13,-23)	100	1.95
	11	Gaspésie						

**Tab. 1** Results of optimal indicator weightings and thresholds for classes 2-4. Results of mortality data showed in orange color.

## Conclusion

- For over-mortality, the final health-related thresholds proposed are between (-15 °C, -23 °C) and (-20 °C, -29 °C) according to the climatic region
- For over-hospitalisation, the fina thresholds proposed are between (-13 °C, -23 °C) and (-17 °C, -30 °C).
- The results suggest that the current system model has a high sensitivity and an acceptable number of false alarms.
- This could also help the public health authority to establish the cold-health watch and warning system with valid indicators and thresholds for each climatic region of Quebec.
- It can be seen as a complementary system to the existing one for heat warnings, in order to help the public health authorities to be well prepared during an extreme cold event.