

# CLUSTERING OF ATMOSPHERIC AND EMISSION CONDITIONS THAT LEAD TO MODELLED PEAK OZONE CONCENTRATIONS

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## MOTIVATION AND OBJECTIVES

An application of a simple urban air quality model (DAUMOD-GRS, [1]) shows that summer maximum O<sub>3</sub> hourly concentrations (C<sub>max</sub>) above 40 ppb [one of the accepted thresholds to protect vegetation] occur outside the Metropolitan Area of Buenos Aires (MABA) where the absence of observations impedes model testing [2]. In addition, those relatively high values present the greatest model uncertainty caused by possible errors in model input variables [3]. In this context, a probability assessment of such exceedances may provide a more robust estimate than a deterministic one.

This work presents a Monte Carlo (MC) evaluation of the probability of occurrence of peak O<sub>3</sub> hourly concentrations greater than 40 ppb in the MABA during a typical summer season, using the DAUMOD-GRS model. In order to overcome the limitations due to the size of the MC outcomes, a clustering analysis is performed aiming to identify the environmental conditions under which C<sub>max</sub> occurs and to gain insight on the model performance outside the MABA, where the highest values are obtained.



## METHODOLOGY

### The DAUMOD-GRS model

DAUMOD-GRS is an urban-scale atmospheric dispersion model which allows estimation of ground-level urban background concentrations of NO<sub>2</sub> and O<sub>3</sub> resulting from area source emissions of NO<sub>x</sub> and VOCs. Its performance evaluation in the MABA is discussed in [1] and [2].

### Base case conditions

- Surface hourly and sounding meteorological data from a typical summer (2007)
- MABA area source emissions of NO<sub>x</sub> and VOCs
- Clean air regional background concentrations

### Probabilistic evaluation of C<sub>max</sub> > 40 ppb

Probability density functions (N: normal, LN: lognormal) and uncertainty ranges of the model input variables [4]

Input variable	PDF	2σ / E(%)
WS (%)	LN	30
DIR (°)	N	30
T (°C)	N	3
SC (okta)	N	1
KST	N	1
TSR (%)	LN	12.5
QNO <sub>x</sub> (%)	LN	40
QVOC (%)	LN	80
[O <sub>3</sub> ] <sub>r</sub> (%)	LN	30

$$\rightarrow P(C_{\max} > 40 \text{ ppb}) = \text{No. of exceedances} / N$$

### Clustering analysis of the Monte Carlo outcomes

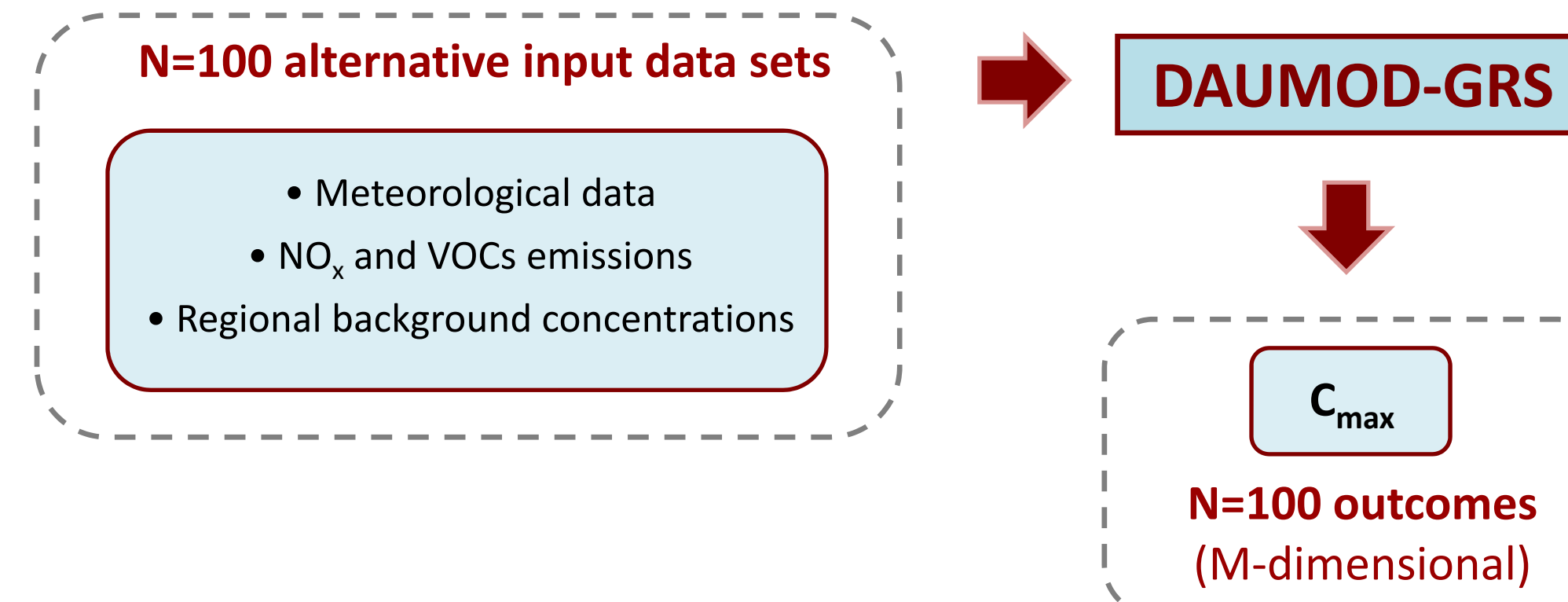
➤ An object is a set of conditions in which C<sub>max</sub> occurs: its hour of occurrence and nine perturbed model input variables (M=10)

➤ Each variable is scaled subtracting its mean and dividing by its standard deviation across the whole modelling domain:

$$x' = \frac{x - \bar{x}}{\sigma_x}$$

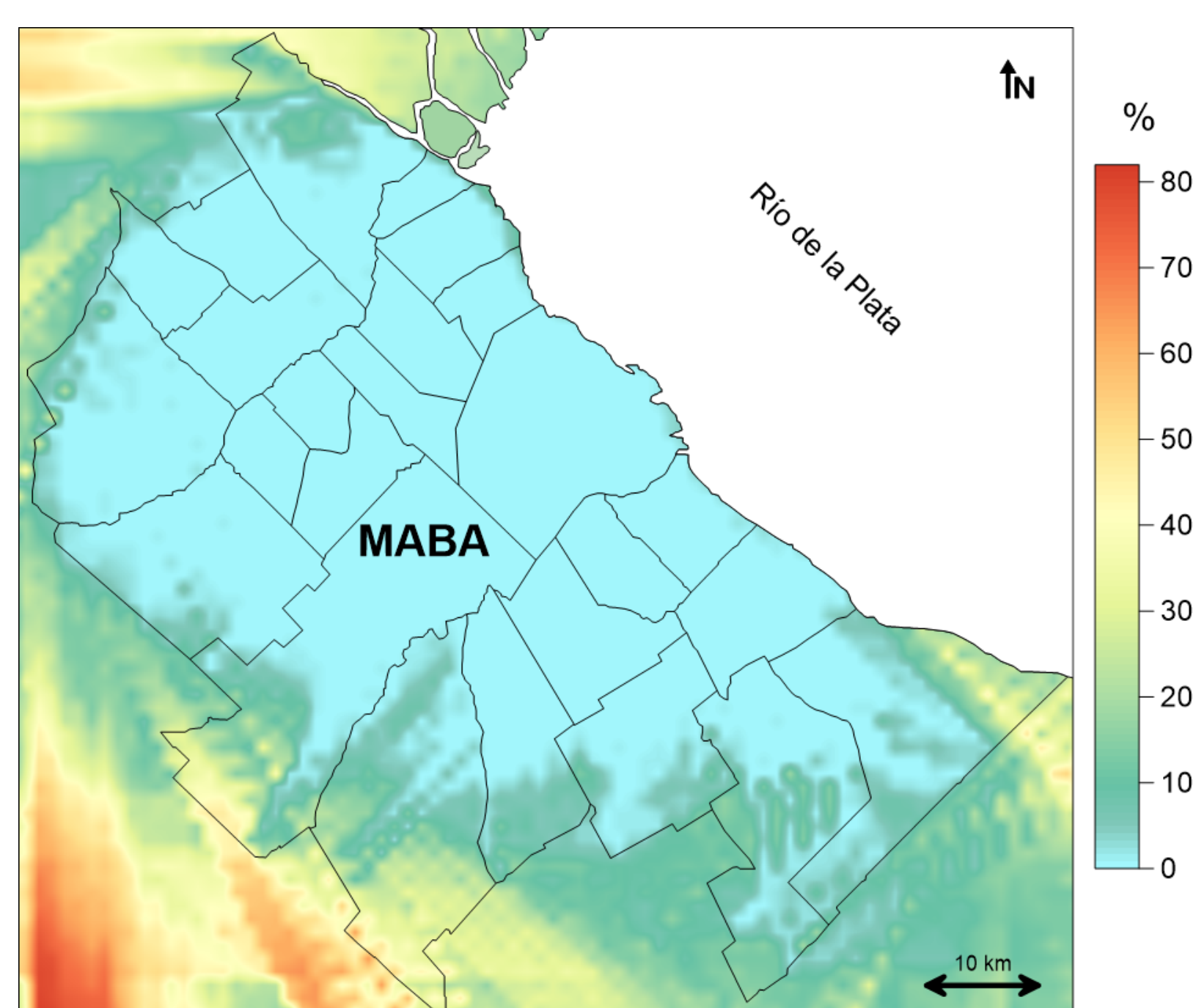
➤ The Matlab function kmeans is used with k=4, and 100 random initializations are performed to avoid suboptimal solutions

### MC simulations:

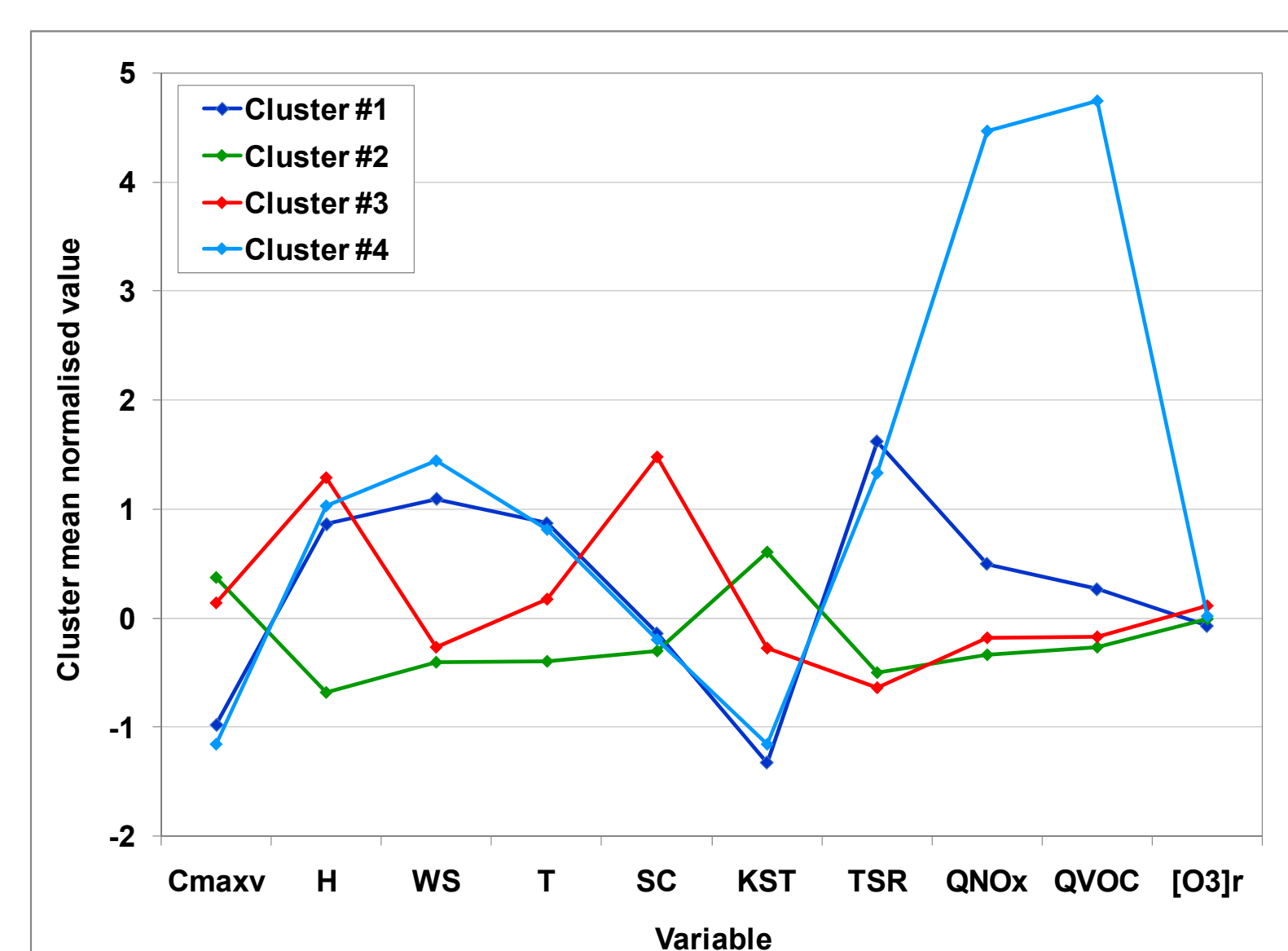


## RESULTS AND CONCLUSIONS

### Probability of occurrence of values of C<sub>max</sub> ≥ 40 ppb



### Normalised variables (z-score) averaged for each cluster

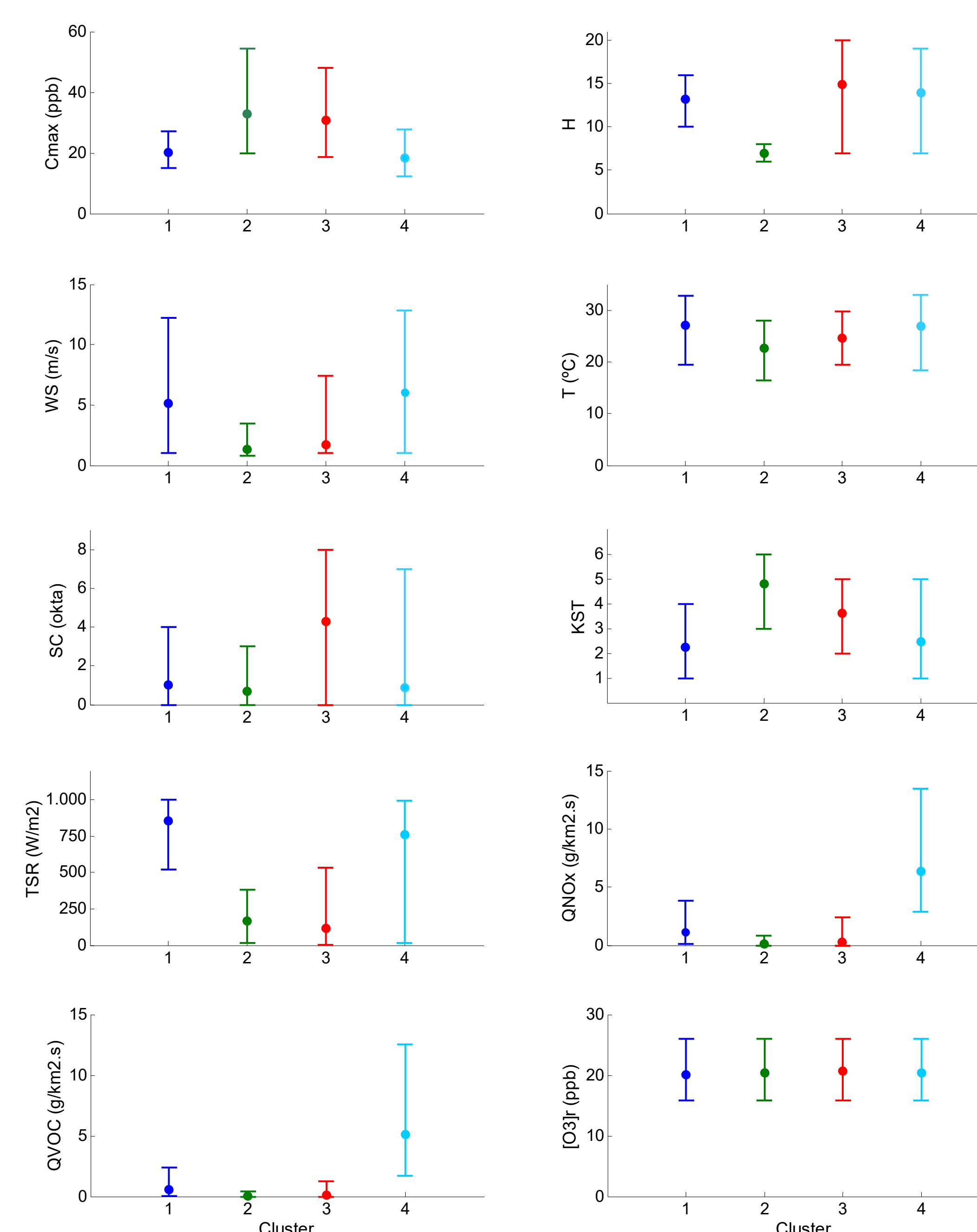


### Variables averaged for each cluster

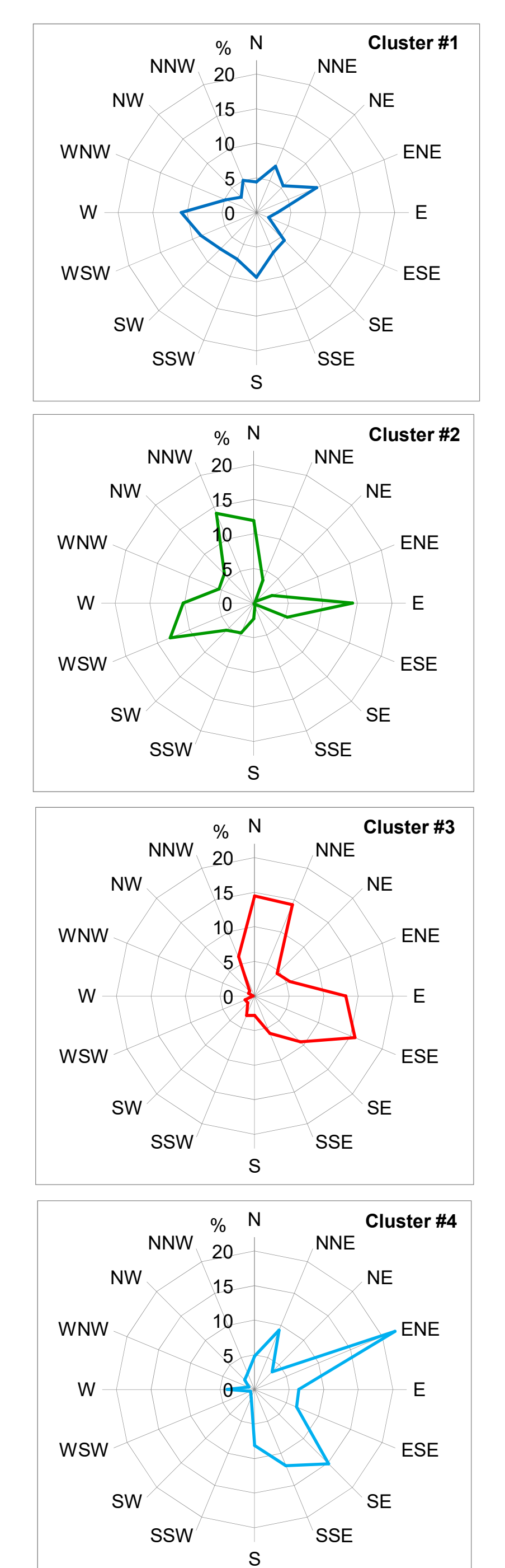
cluster #	C <sub>max</sub> (ppb)	H	WS (m/s)	T (°C)	SC (okta)	KST	TSR (W/m <sup>2</sup> )	QNO <sub>x</sub> (g/km <sup>2</sup> s)	QVOC (g/km <sup>2</sup> s)
1	20.2	13	5.1	27.0	1	2	854.9	1.2	0.6
2	32.9	7	1.3	22.4	1	5	166.5	0.1	0.0
3	30.8	15	1.7	24.5	4	4	119.8	0.3	0.1
4	18.5	14	6.0	26.8	1	2	762.3	6.3	5.1

C<sub>max</sub>: summer maximum O<sub>3</sub> hourly concentration  
H: hour of occurrence of C<sub>max</sub>  
WS: wind speed  
T: air temperature  
SC: sky cover  
KST: atmospheric stability class  
TSR: total solar radiation  
QNO<sub>x</sub>: local emission rate of NO<sub>x</sub>  
QVOC: local emission rate of VOCs  
[O<sub>3</sub>]<sub>r</sub>: regional background O<sub>3</sub> concentration

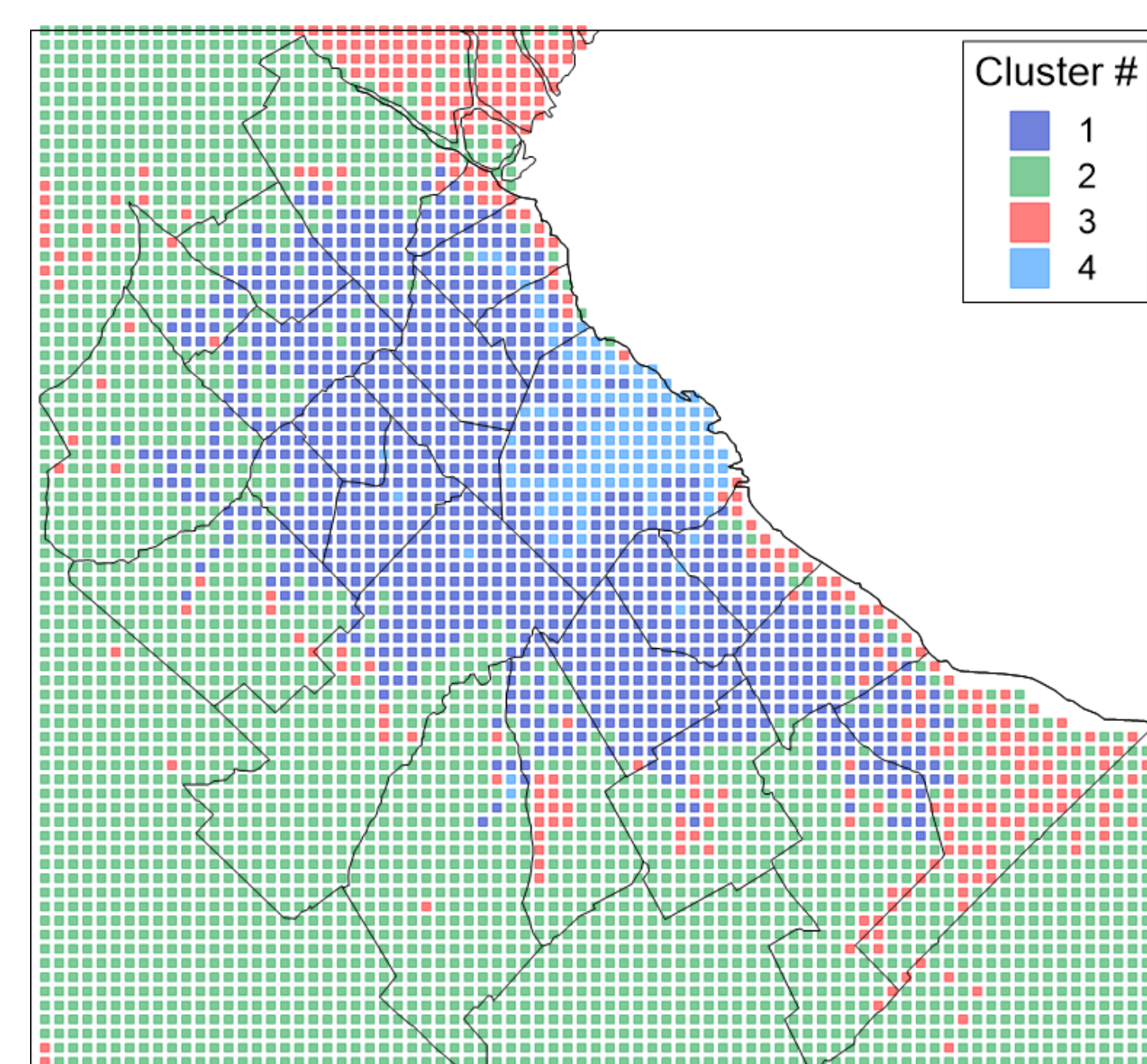
### Variables' mean and 95% confidence range vs cluster number



### Wind roses of each cluster



### Dominant cluster



## CONCLUSIONS

- ✓ The probability of occurrence of values of C<sub>max</sub> ≥ 40 ppb is very low in the urban area and greater than 70% outside the MABA
- ✓ From the clustering analysis, three main clusters with a marked spatial distribution resembling that of the O<sub>3</sub> precursor species emissions are obtained
- ✓ Differences in the mean variables of the clusters suggest different main drivers on ozone formation: photochemical (clusters 1, 3 and 4) vs dispersive (cluster 2)

### REFERENCES

- [1] Pineda Rojas, A.L.; Venegas, L.E. 2013a. Upgrade of the DAUMOD atmospheric dispersion model to estimate urban background NO<sub>2</sub> concentrations. *Atmos. Res.*, 120-121, 147-154.
- [2] Pineda Rojas, A.L.; Venegas, L.E. 2013b. Spatial distribution of ground-level urban background O<sub>3</sub> concentrations in the Metropolitan Area of Buenos Aires, Argentina. *Environ. Pollut.*, 183, 159-165.
- [3] Pineda Rojas, A.L., Venegas, L.E.; Mazzeo, N.A. 2016. Uncertainty of modelled urban peak O<sub>3</sub> concentrations and its sensitivity to input data perturbations based on the Monte Carlo analysis. *Atmos. Environ.*, 141, 422-429.
- [4] Hanna, S.R.; Chang, J.C.; Fernau, M.E. 1998. Monte Carlo estimates of uncertainties in predictions by a photochemical grid model (UAM-IV) due to uncertainties in input variables. *Atmos. Environ.*, 32, 21, 3619-3628.