

# Case study reproducibility in a convection-permitting WRF multi-physics ensemble: the role of internal variability

**Álvaro Lavín Gullón**

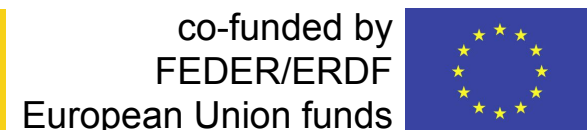
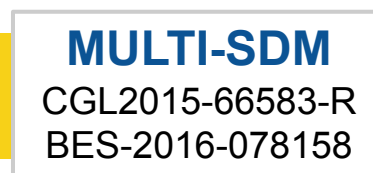
[alvaro.lavin@unican.es](mailto:alvaro.lavin@unican.es)

Institute of Physics of Cantabria

CSIC-University of Cantabria

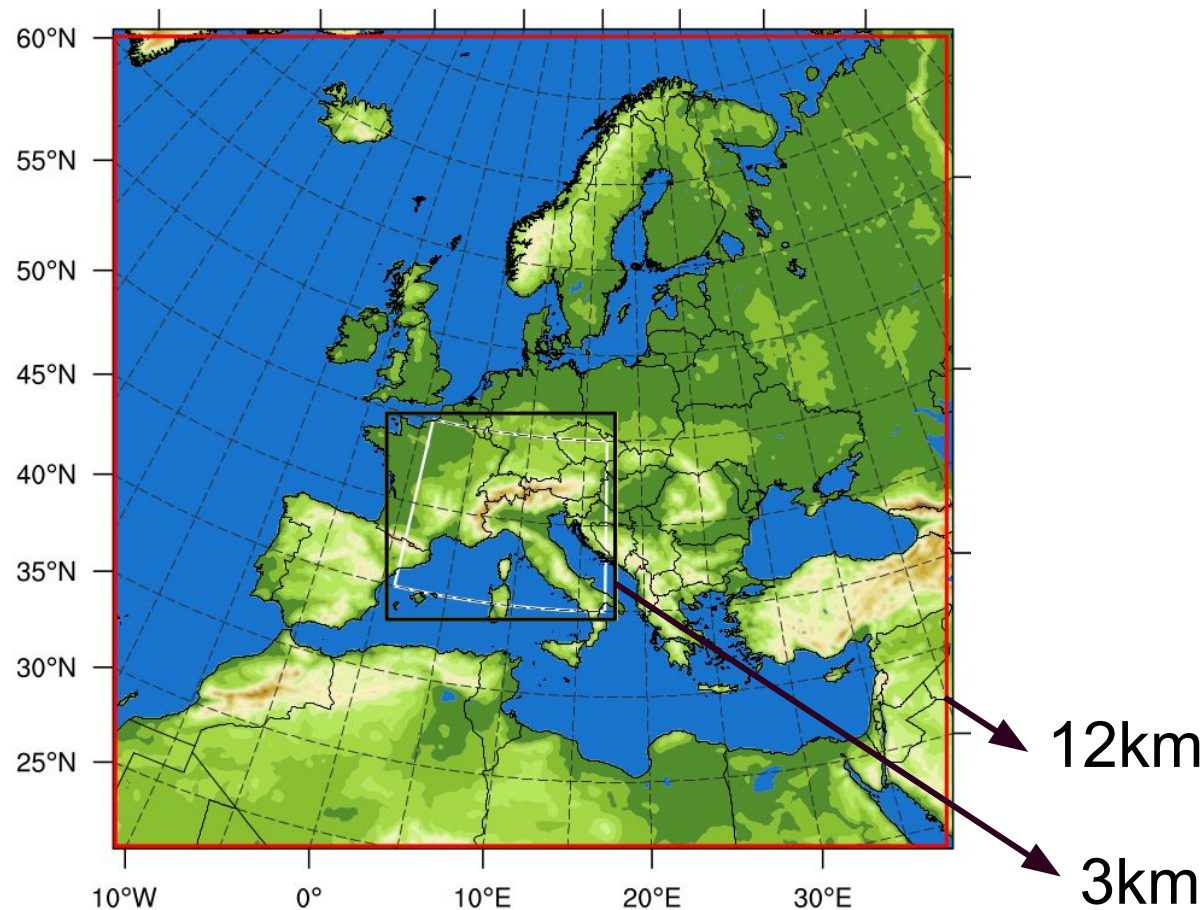


Fernandez J., Bastin, S., Cardoso R. M., Fita L., Giannaros, T. M., Goergen K., Gutierrez J.M, Kartsios, S., Katragkou, E., Lorenz, T., Milovac J., Soares, P. M. M., Sobolowski, S., Warrach-Sagi, K.



## Origin of the study

### CORDEX FPS on “Convective phenomena at high resolution over Europe and the Mediterranean”



**Coppola et al. (2018)** “A first-of-its-kind multi-model convection permitting ensemble for investigating convective phenomena over Europe and the Mediterranean”. *Climate Dynamics*.

## Origin of the study

# CORDEX FPS on “Convective phenomena at high resolution over Europe and the Mediterranean”

## Preliminary experiment.

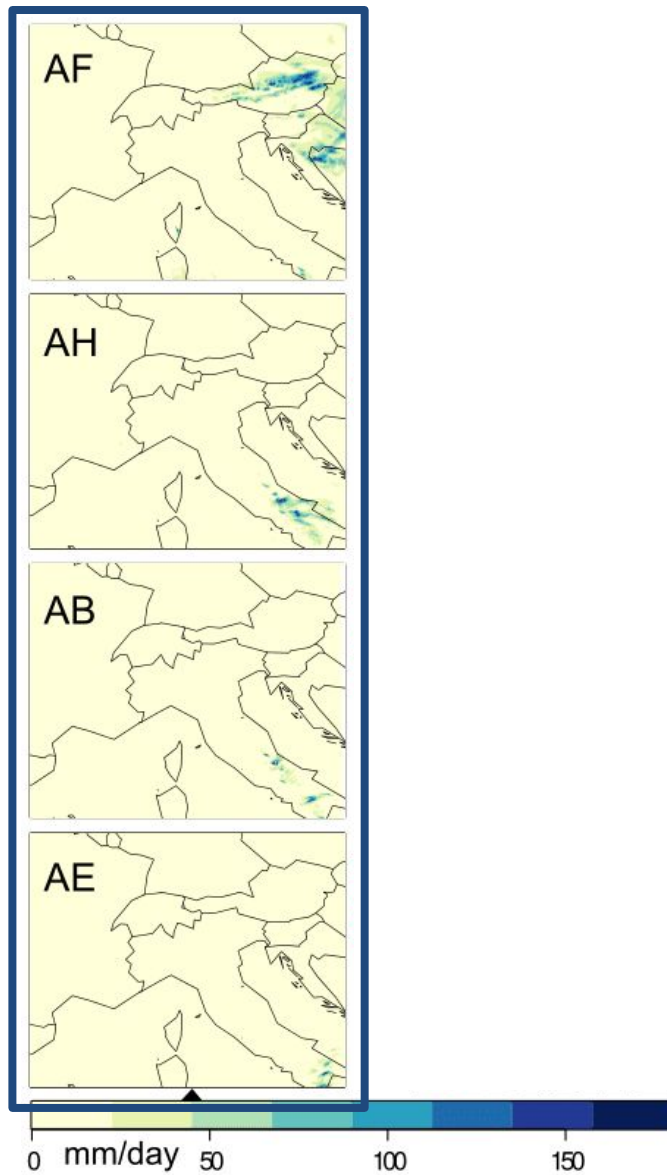
Weather-like vs Climate mode. Assessing three heavy precipitation events:

- “Foehn”: 2-7 November 2014
- “IOP 16”: 23-28 October 2012
- “Austria”: 20-27 June 2009

**Coppola et al. (2018)** “A first-of-its-kind multi-model convection permitting ensemble for investigating convective phenomena over Europe and the Mediterranean”. *Climate Dynamics*.

## WRF Multi-physics ensemble

Convection-permitting  
domain

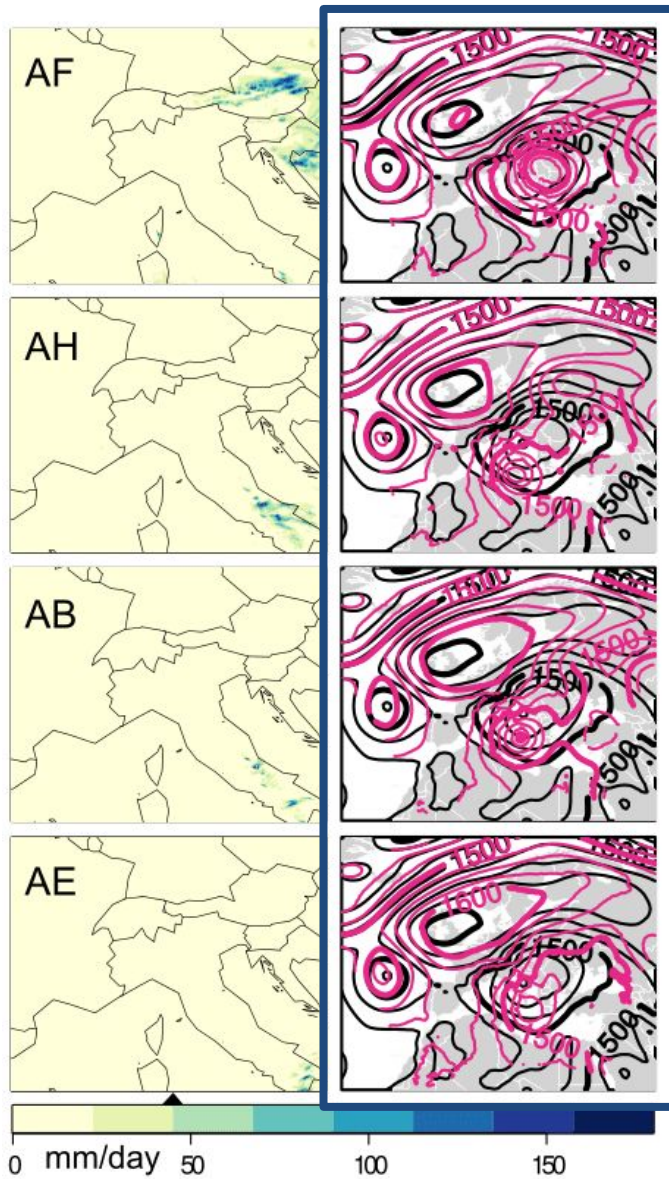


Large discrepancies between individual ensemble members



# WRF Multi-physics ensemble

Parameterized domain



Large discrepancies between individual ensemble members



Differences on the simulated synoptic situation:

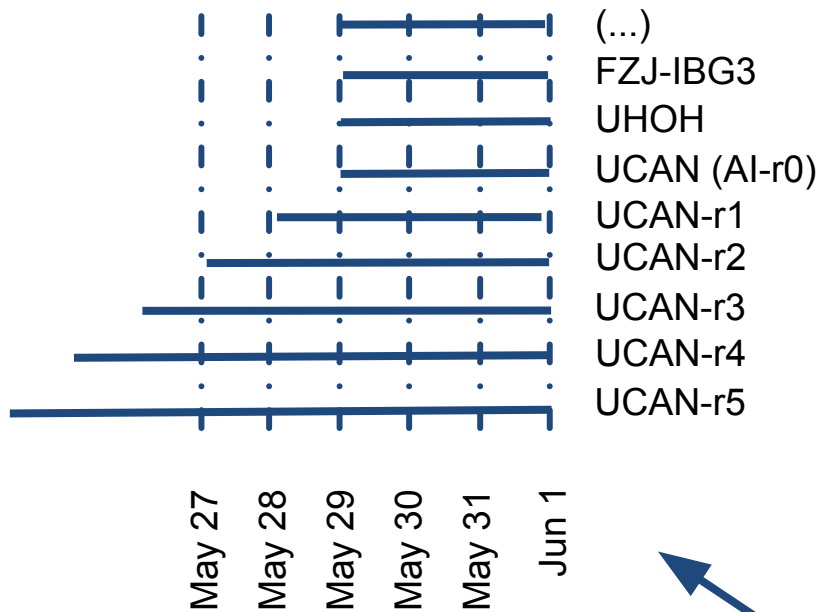
Some members reproducing as observed, others simulating an isolated low-pressure system

## Multi-Initial conditions ensemble

### WRF3.8.1

-AUTH  
-BCCR  
-FZJ-IBG3  
-IDL  
-IPSL  
-NOA  
-UHOH  
**-UCAN**

-r0  
-r1  
-r2  
-r3  
-r4  
-r5



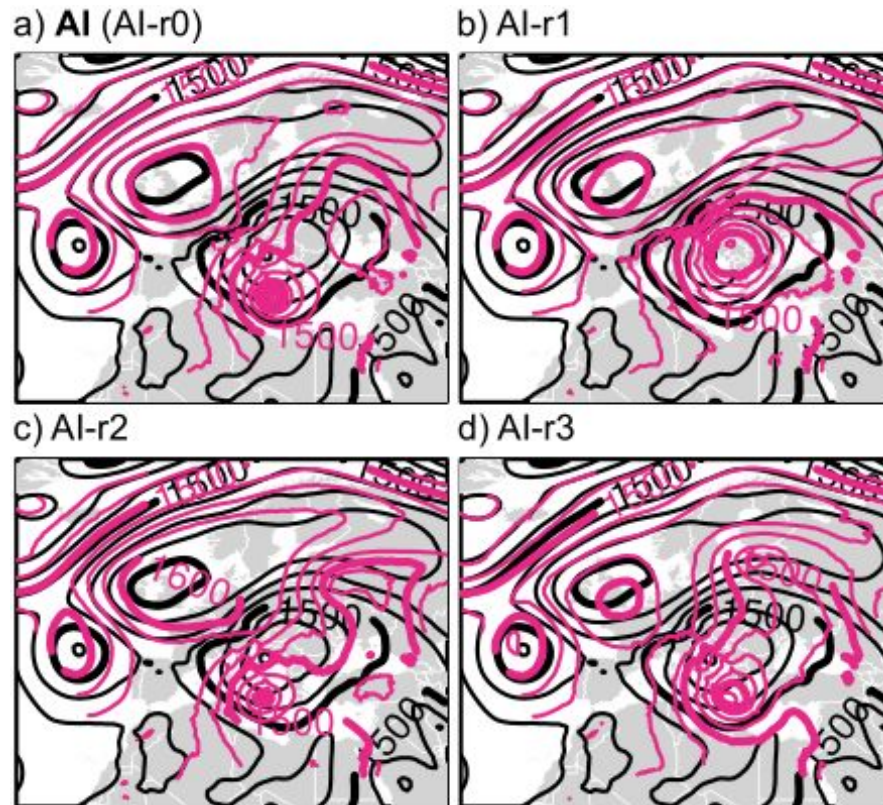
Internal variability uncertainty.  
**Lagged method.**

## Multi-Initial conditions ensemble

### WRF3.8.1

- AUTH
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Again, by only perturbing initial conditions, some members reproduce the circulation as observed, others develop an isolated low pressure system

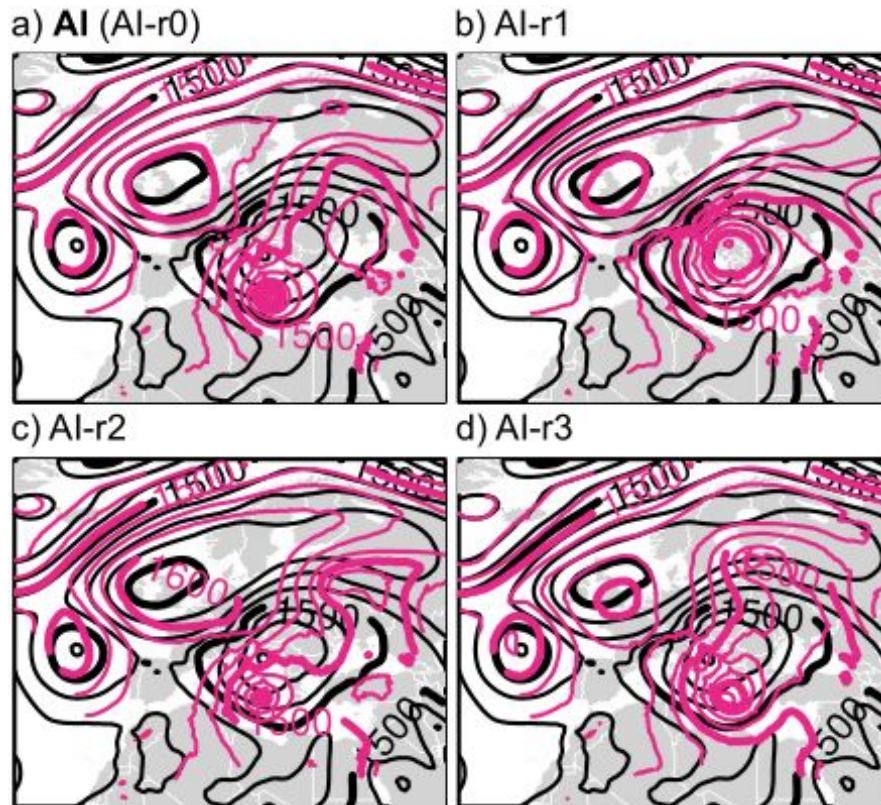


## Multi-Initial conditions ensemble

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Again, by only perturbing initial conditions, some members reproduce the circulation as observed, others develop an isolated low pressure system



Internal variability



### Analysis of the uncertainties (Alexandru et al., 2007)

Inter-member variance:

$$\sigma_X^2(i, j, k, t) = \frac{1}{M - 1} \sum_{m=1}^M (X(i, j, k, t, m) - \langle X \rangle(i, j, k, t))^2$$

$X$ : variable

$i, j, k$ : spatial coordinates

$M$ : total number of ensemble members

$t$ : time

$m$ : ensemble member

## Methodology

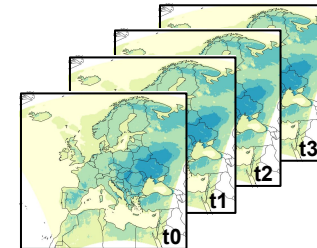
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Ensemble mean

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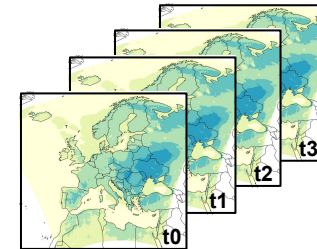
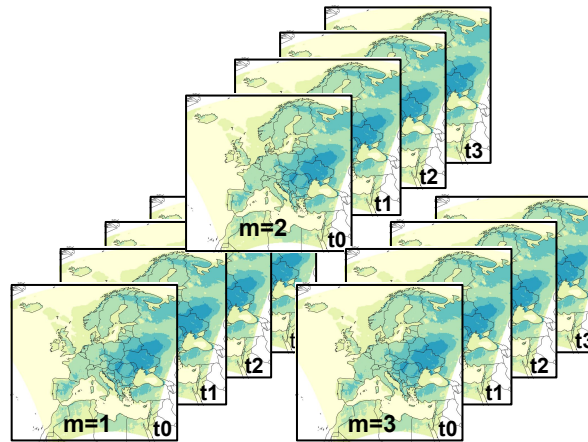
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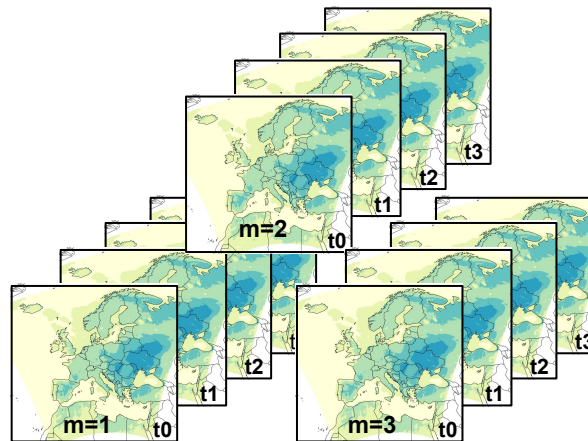
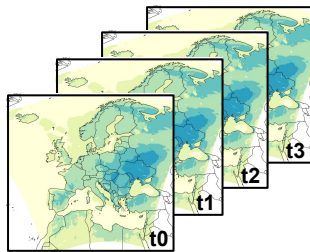


# Methodology

## Analysis of the uncertainties (Alexandru et al., 2007)

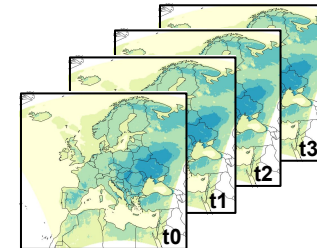
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Ensemble mean

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## Methodology

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$X$ : variable  
 $m$ : ensemble member  
 $M$ : total number of ens. members  
 $I, J$ : number of grid cells  
 $t$ : time  
 $i, j, k$ : spatial coordinates  
 $N$ : number of time steps

Spatial distribution of the uncertainty  
(Time average)

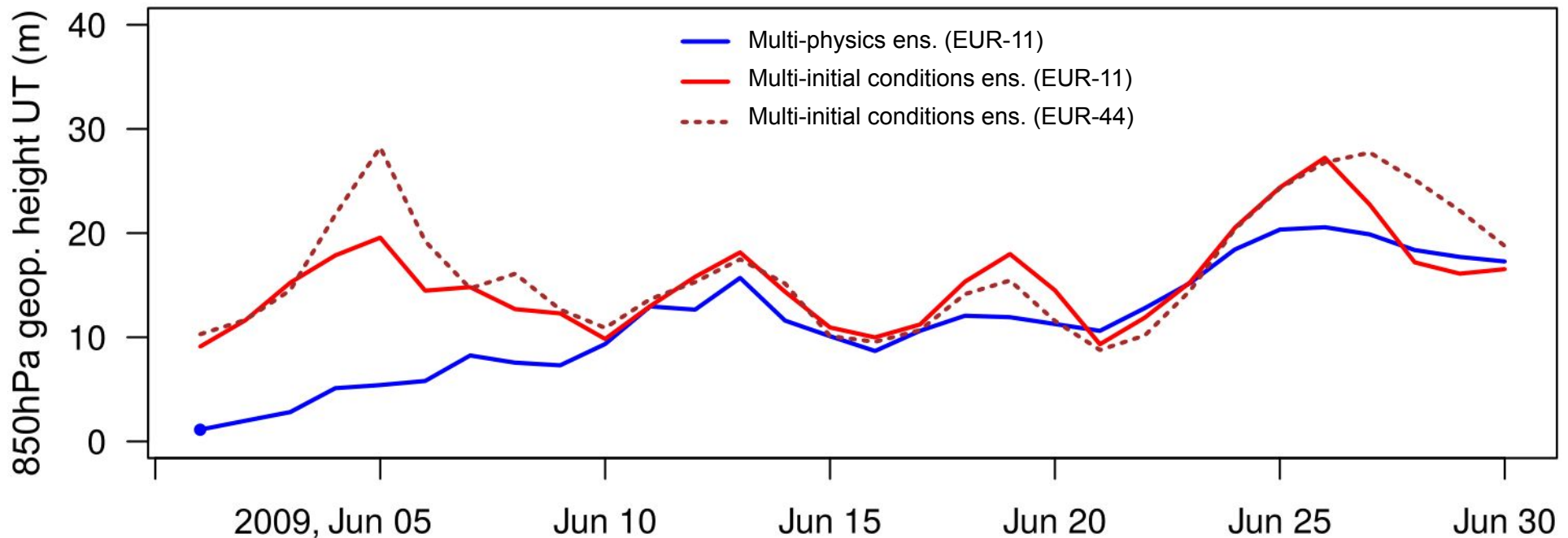
$$\overline{\sigma_X^2}^t(i, j, k) = \frac{1}{N} \sum_{t=1}^N \sigma_X^2(i, j, k, t)$$

Time evolution of the uncertainty  
(Domain average)

$$\overline{\sigma_X^2}^{xy}(k, t) = \frac{1}{I \times J} \sum_{i=1}^I \sum_{j=1}^J \sigma_X^2(i, j, k, t)$$

# Time evolution of the uncertainties

## One-month uncertainties Geopotential height at 850hPa

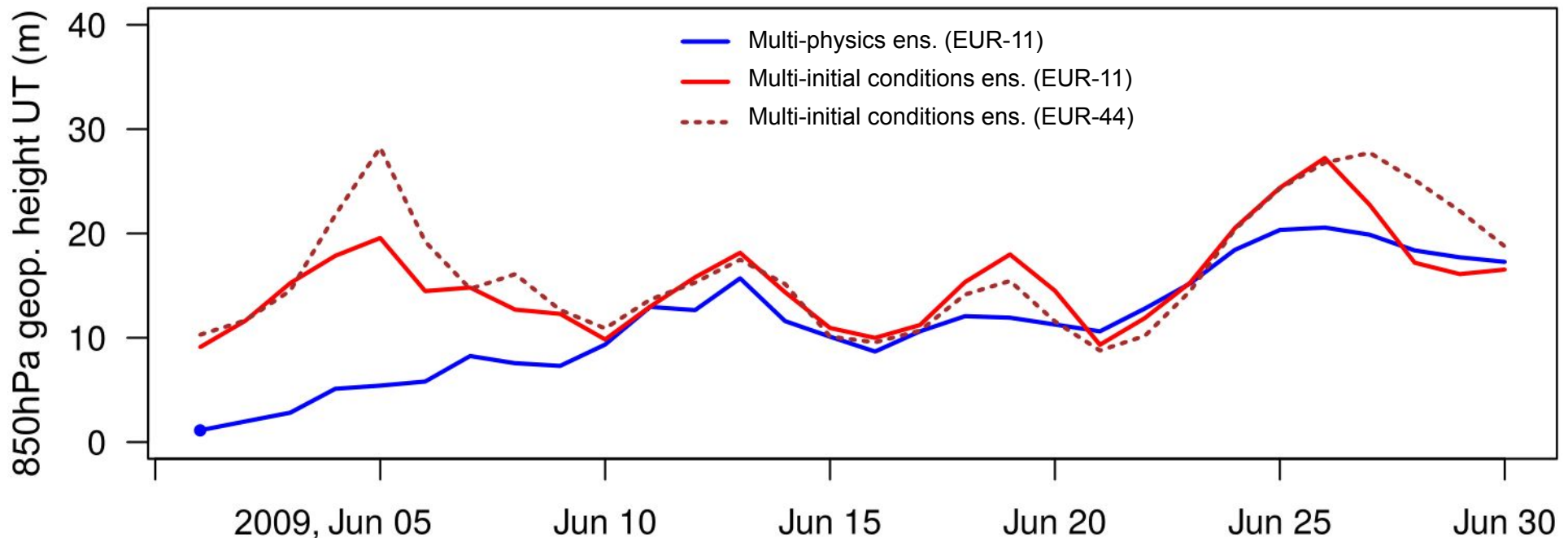


$$\overline{\sigma_X^{2xy}}(k, t) = \frac{1}{I \times J} \sum_{i=1}^I \sum_{j=1}^J \sigma_X^2(i, j, k, t)$$



# Time evolution of the uncertainties

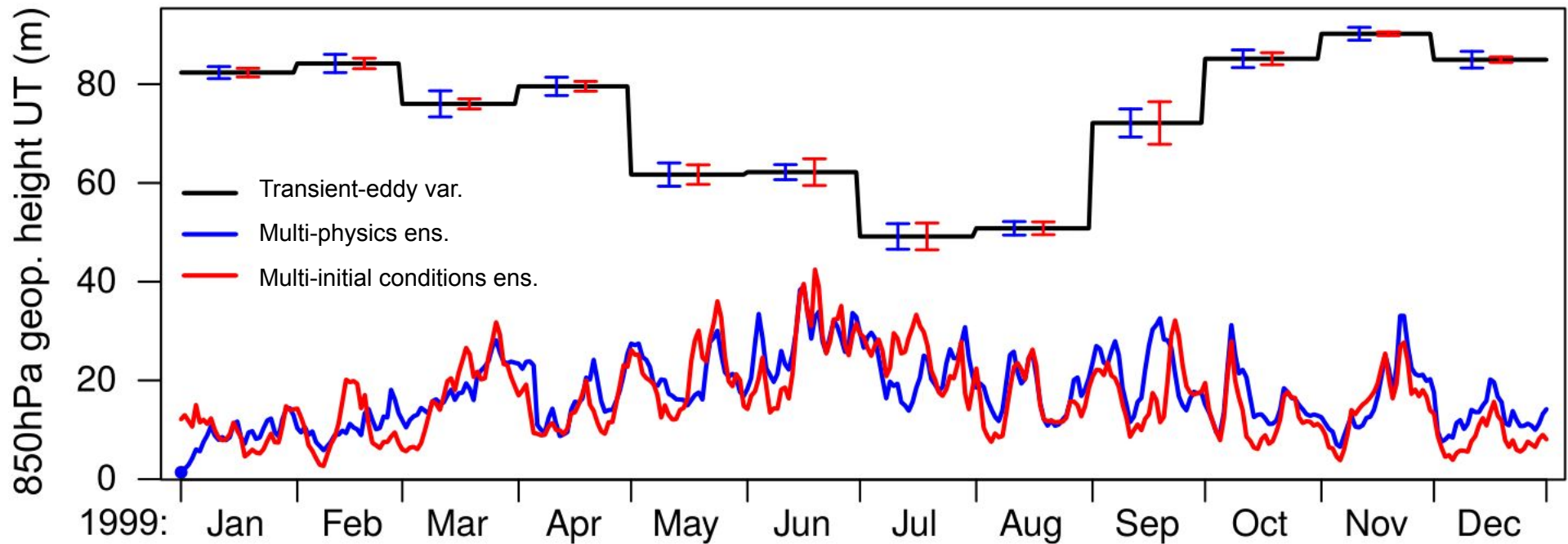
## One-month uncertainties Geopotential height at 850hPa



Physical parameterizations (**multi-physics ensemble**) introduce smaller differences among members than those from the Internal variability (**multi-initial conditions ensemble**)

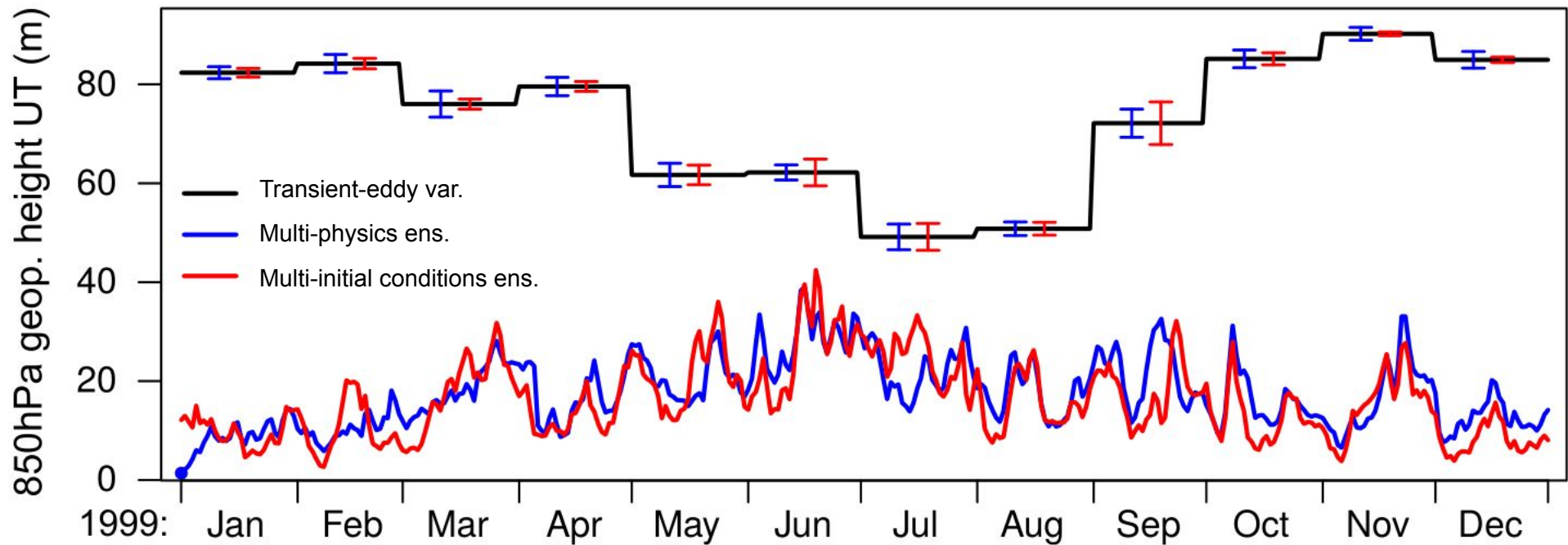
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## Time evolution of the uncertainties

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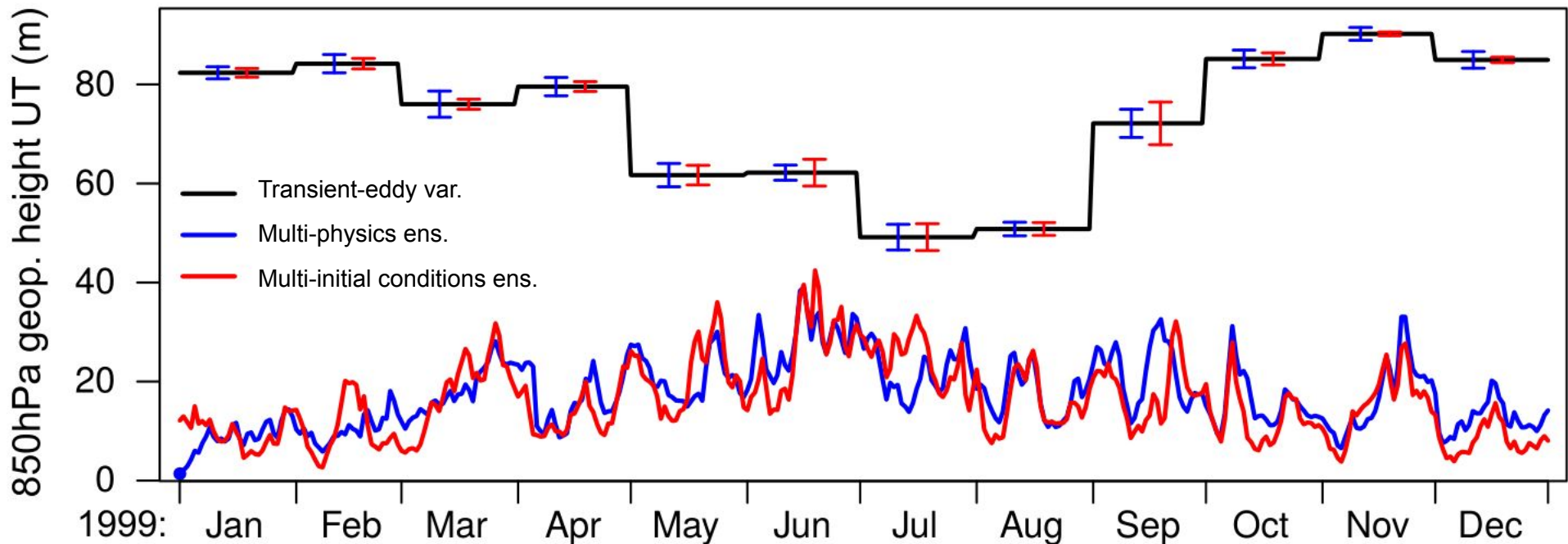


Differences introduced by physical parameterizations are amplified and assimilated into the system as perturbations of initial conditions



# Time evolution of the uncertainties

## One-year uncertainties Geopotential height at 850hPa



Differences introduced by physical parameterizations are amplified and assimilated into the system as perturbations of initial conditions



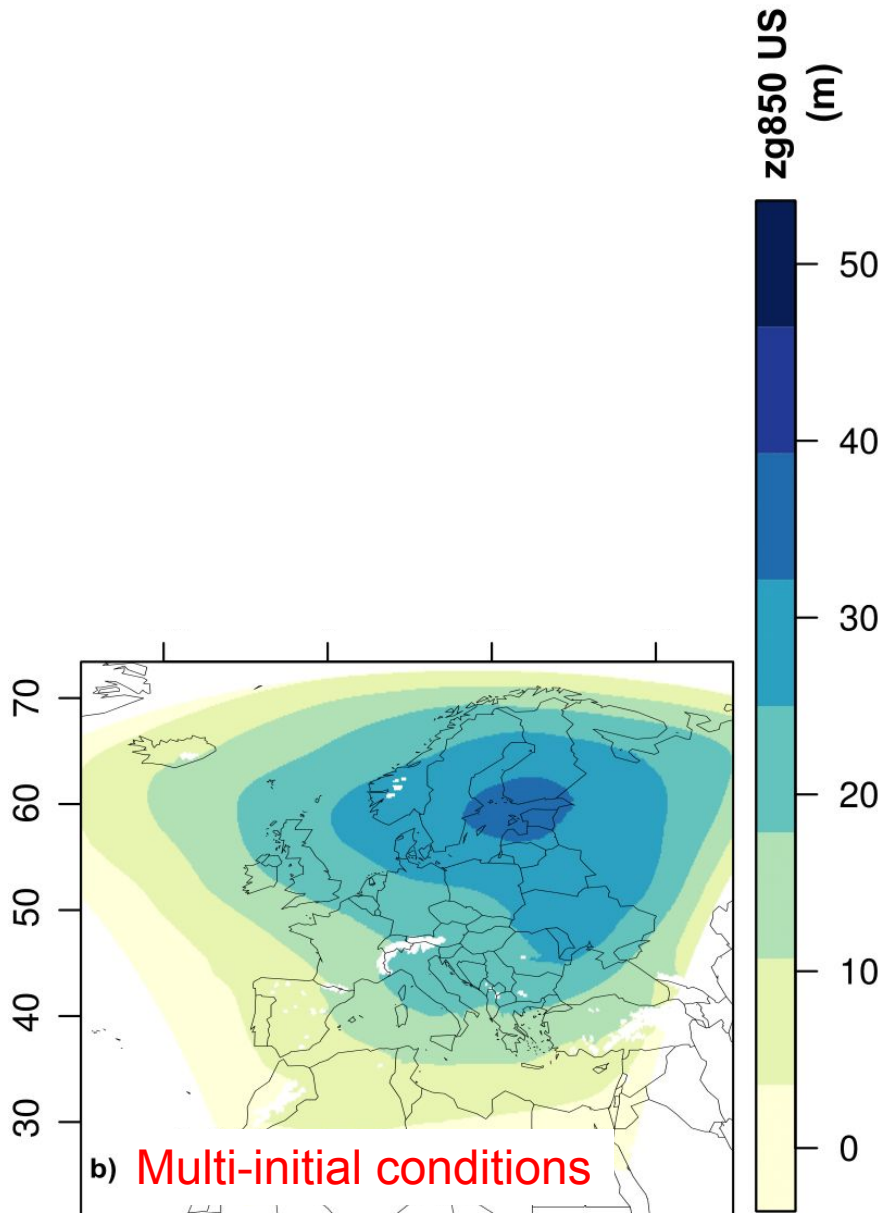
**Multi-physics uncertainty** could be explained by the **Internal Variability**

## Spatial distribution of the uncertainties

One-year uncertainties  
**Geopotential height at 850hPa**

$$\overline{\sigma_X^2}^t(i, j, k) = \frac{1}{N} \sum_{t=1}^N \sigma_X^2(i, j, k, t)$$

In space, similar patterns. Only **multi-physics uncertainty** slightly larger than **Internal variability**

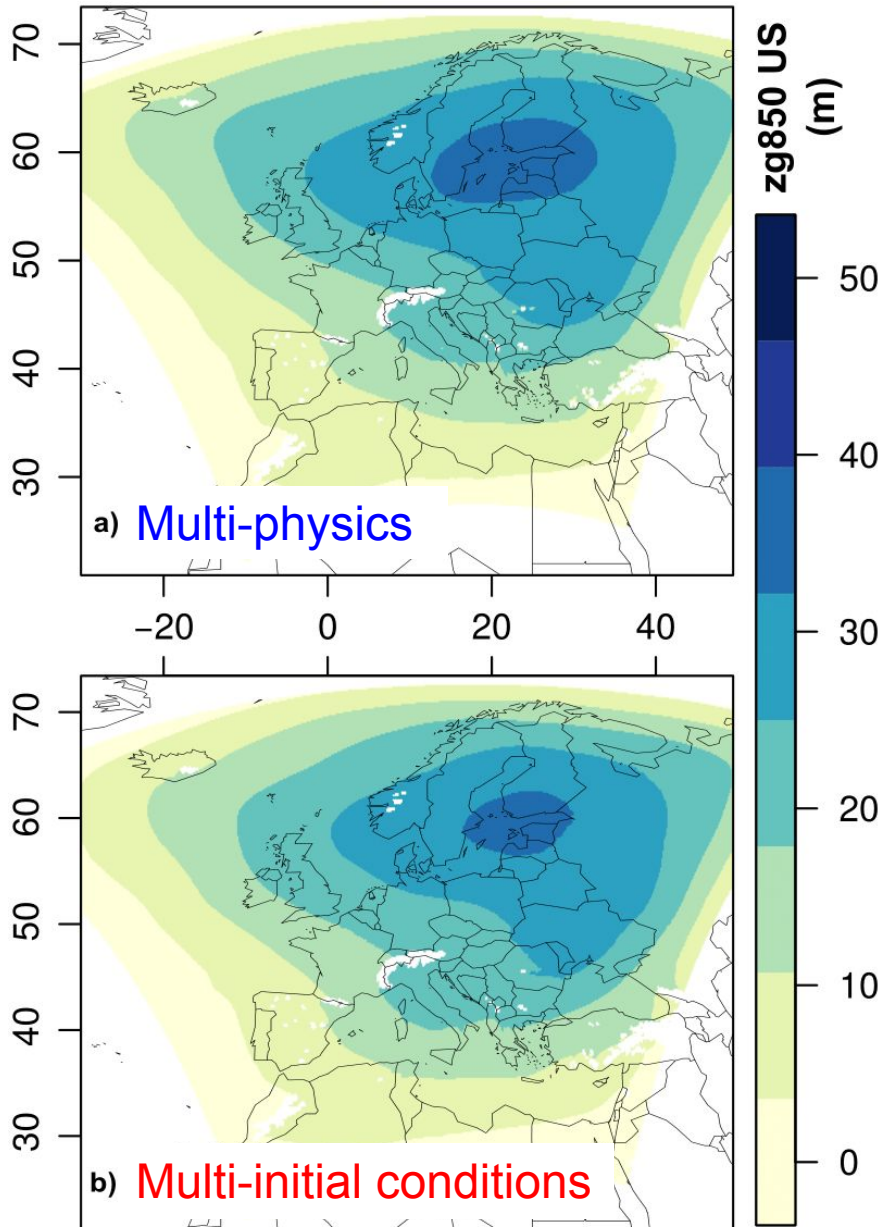


## Spatial distribution of the uncertainties

One-year uncertainties  
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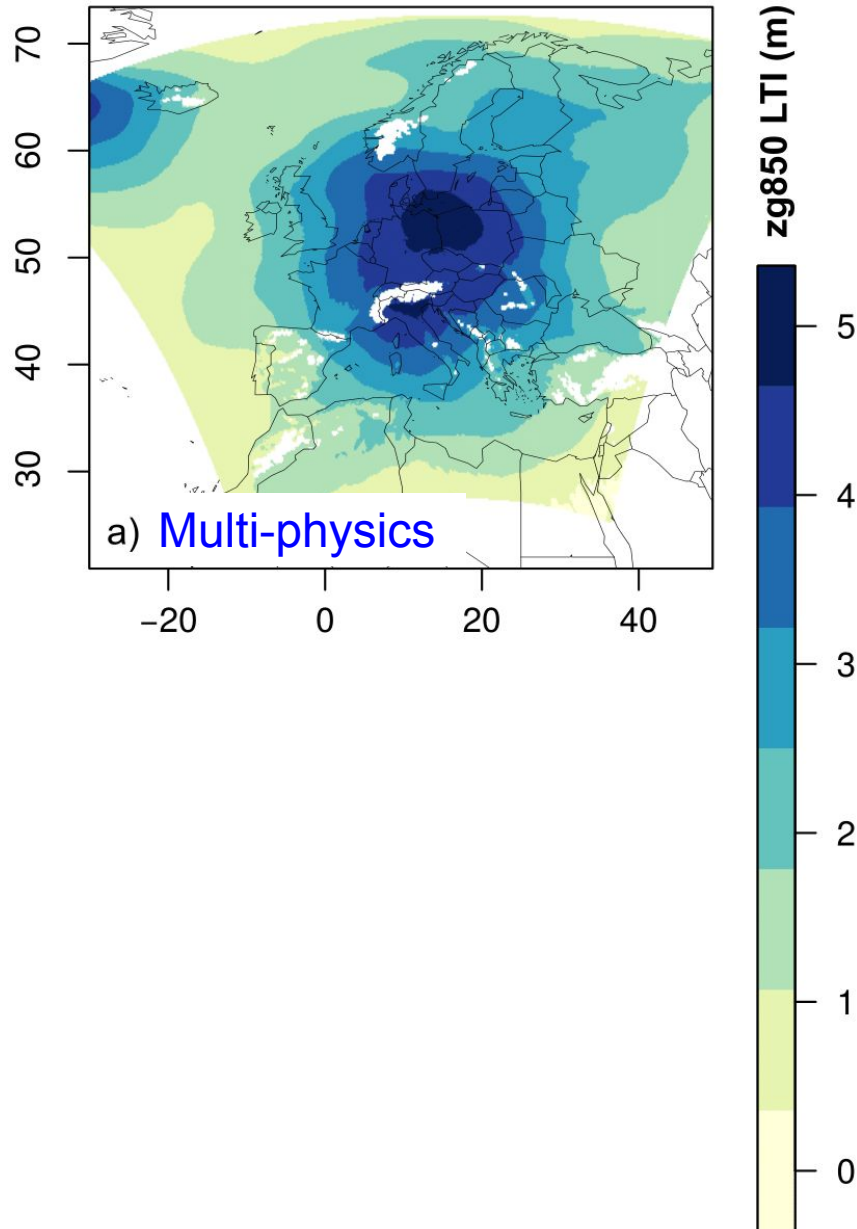
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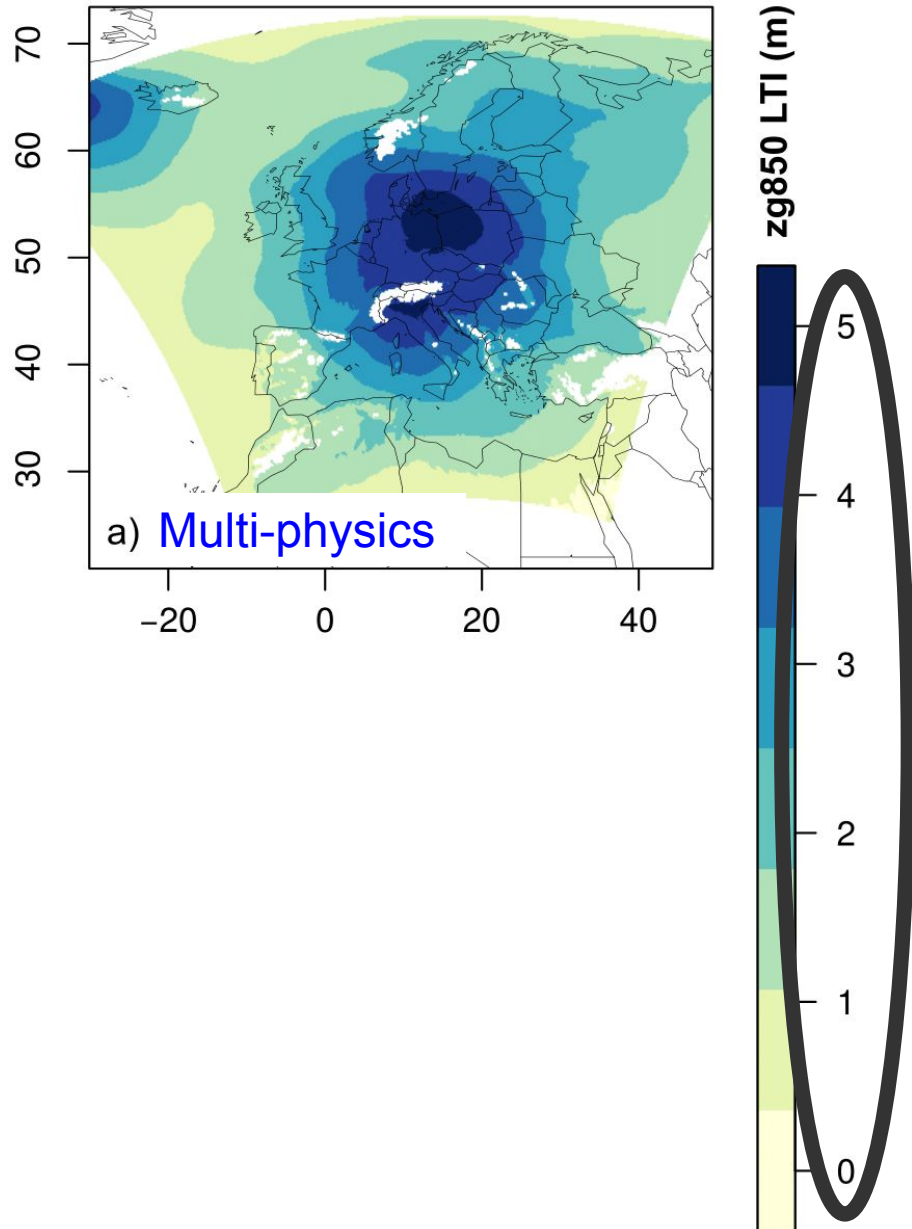


## Long-term impact (Climatologies)



**Geopotential height at 850hPa**  
Long-term systematic effect of  
physical parameterizations

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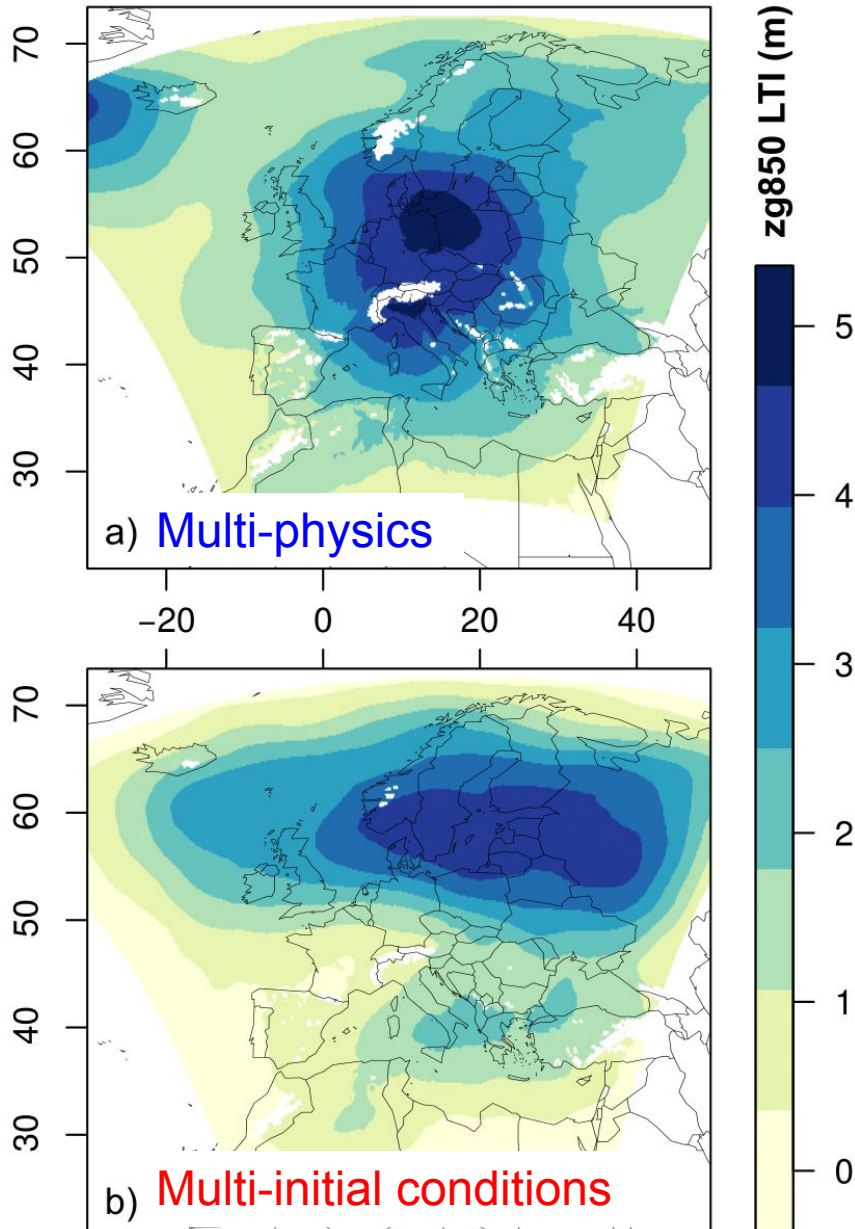


**Geopotential height at 850hPa**  
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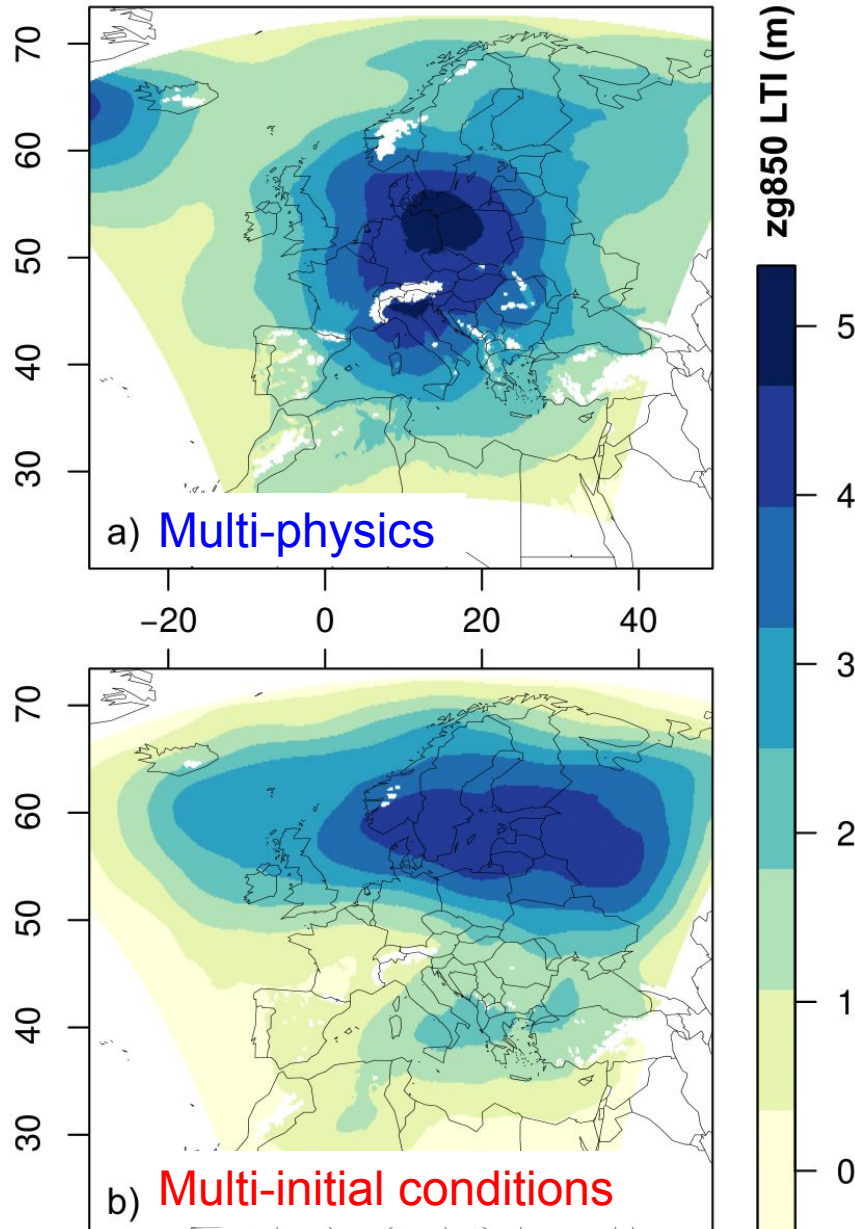
Careful: order of  
magnitude smaller

## Long-term impact (Climatologies)

**Geopotential height at 850hPa**  
Long-term systematic effect of  
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## Long-term impact (Climatologies)



### Geopotential height at 850hPa

Long-term systematic effect of physical parameterizations

Different patterns but comparable magnitude

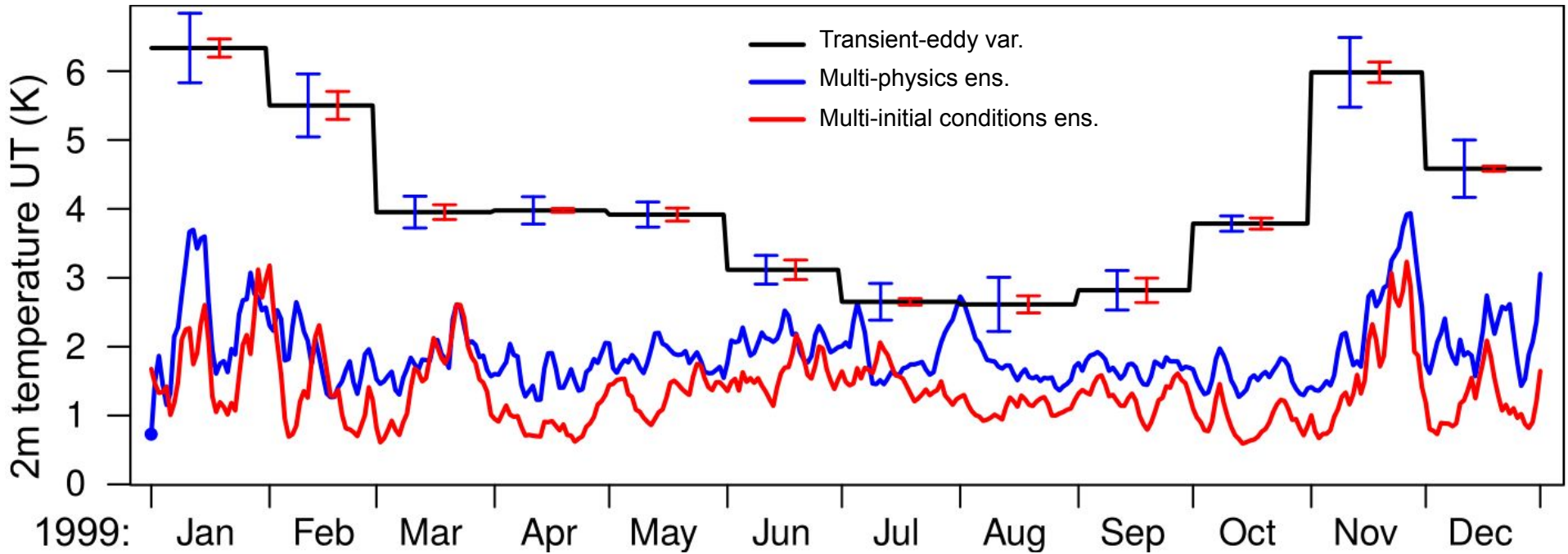


It seems that for circulation variables, one-year is not enough to distinguish the systematic effect of the physical parameterizations



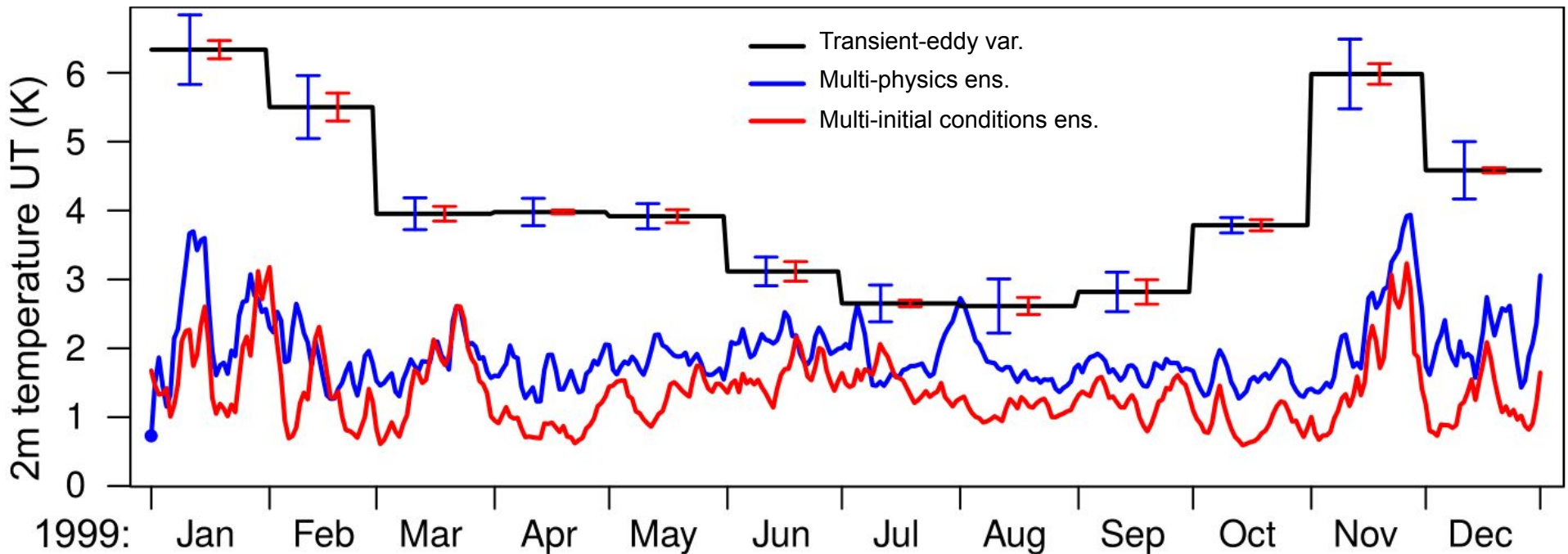
# Time evolution of the uncertainties

## One-year uncertainties Surface temperature



# Time evolution of the uncertainties

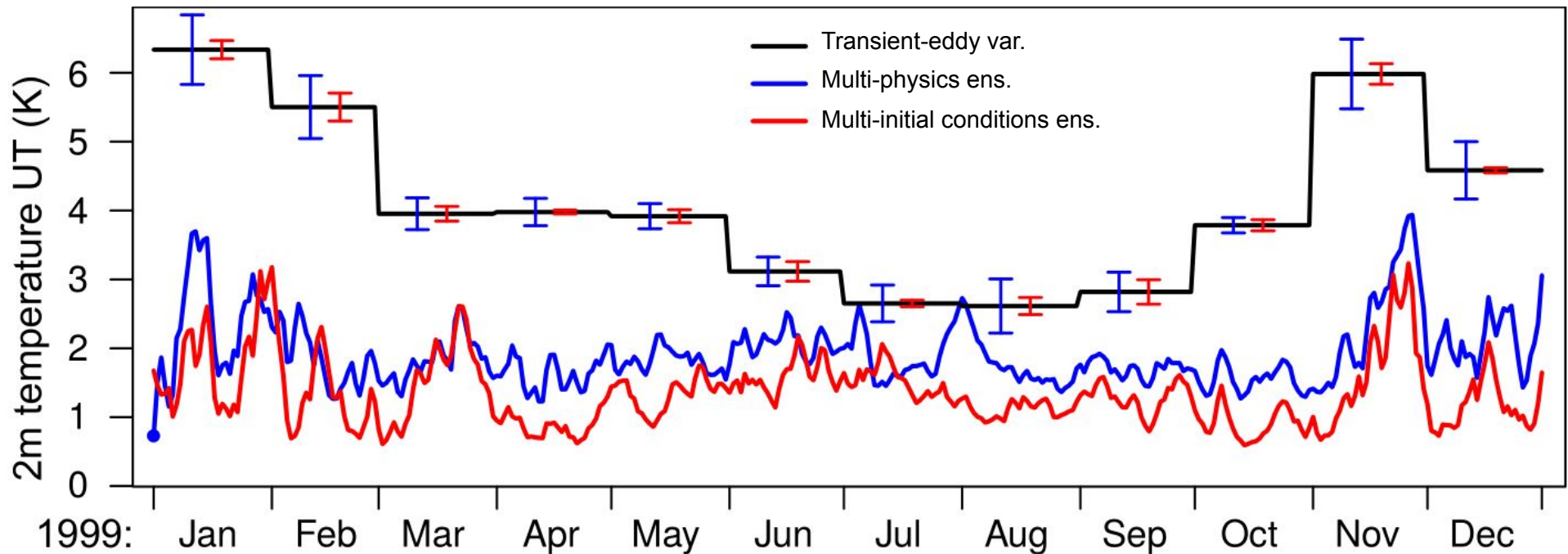
## One-year uncertainties Surface temperature



For surface temperature, **multi-physics uncertainty** is higher than **Internal variability**

# Time evolution of the uncertainties

## One-year uncertainties Surface temperature

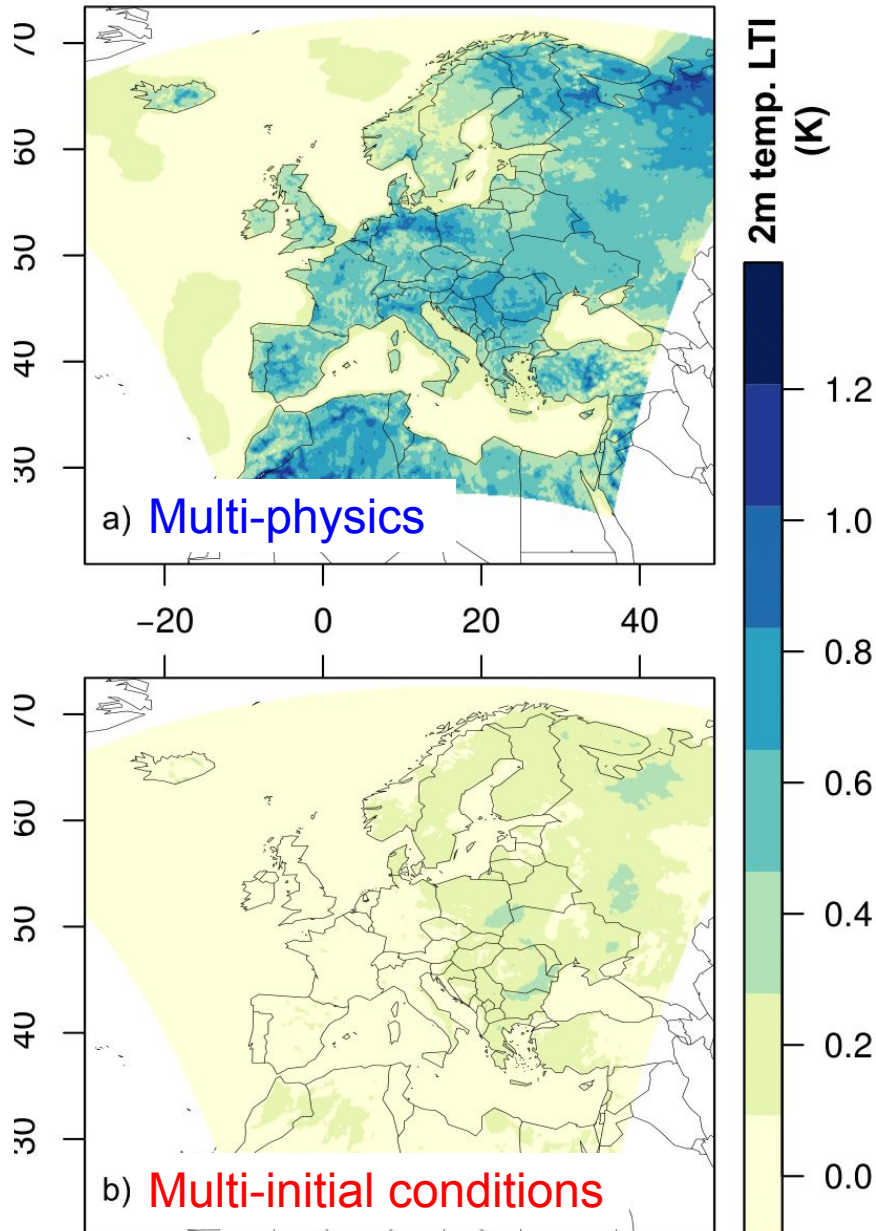


For surface temperature, **multi-physics uncertainty** is higher than **Internal variability**



It would be more feasible to discern both uncertainties in variables more controlled by parameterizations

## Long-term impact (Climatologies)



### Surface temperature

Long-term systematic effect of physical parameterizations

Magnitude in multi-physics is well above the magnitude of internal variability



For surface variables, one year could suffice to discern the systematic effect of the physical parameterizations



## Conclusions

- Internal variability is dependant on the area, domain, season, variable and model
- Differences between ensemble members could be explained by the Internal Variability
- It seems that it is more feasible to discern these uncertainties when studying surface variables, rather than circulation variables
- One-year would be not enough to distinguish the systematic effect from the physical configurations in circulation variables
- Physics sensitivity studies should take into account the role of the Internal Variability

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**Thank you**

# Spatial distribution of the uncertainties

## One-year uncertainties Surface temperature

