



**Universitat**  
de les Illes Balears



# Future extremes of temperature and precipitation in Europe based on the combination of dynamical and statistical approaches

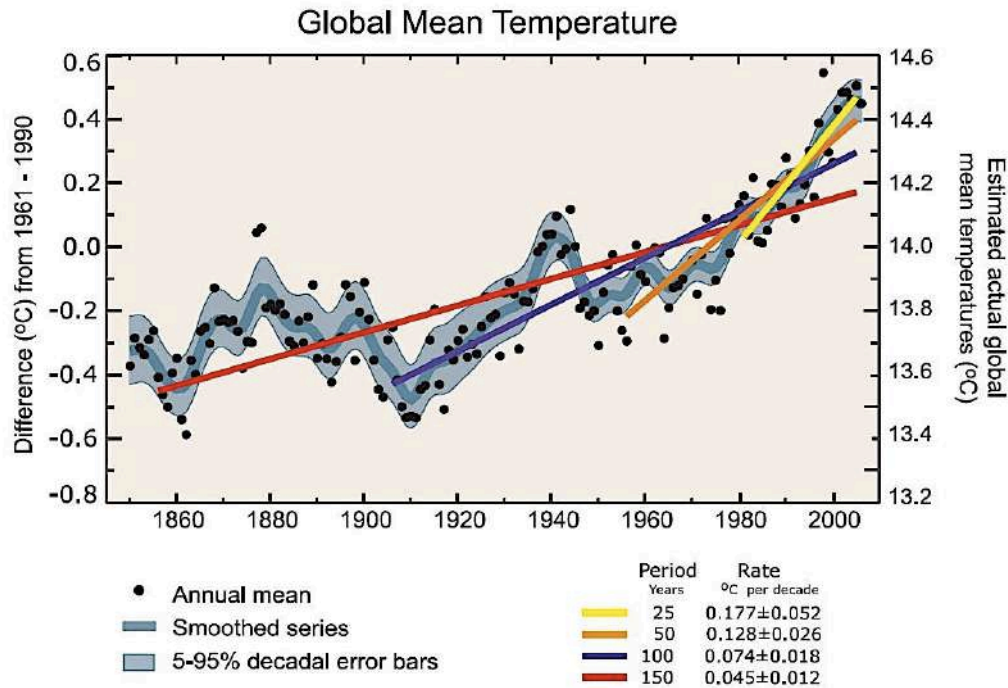
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Palma, Mallorca, Spain

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# 1. Motivations and objectives

## Climate change: current evidences



- The average global temperature increased by about 0.85 °C from 1880 to 2012
- 1983-2012 was likely the warmest 30-year period of the last 1400 years in the Northern Hemisphere (Stocker et al., 2013).
- Important regional variations
- Redistribution of rainfall and other variables

## Extreme weather events

### Summary for Policymakers (IPCC)

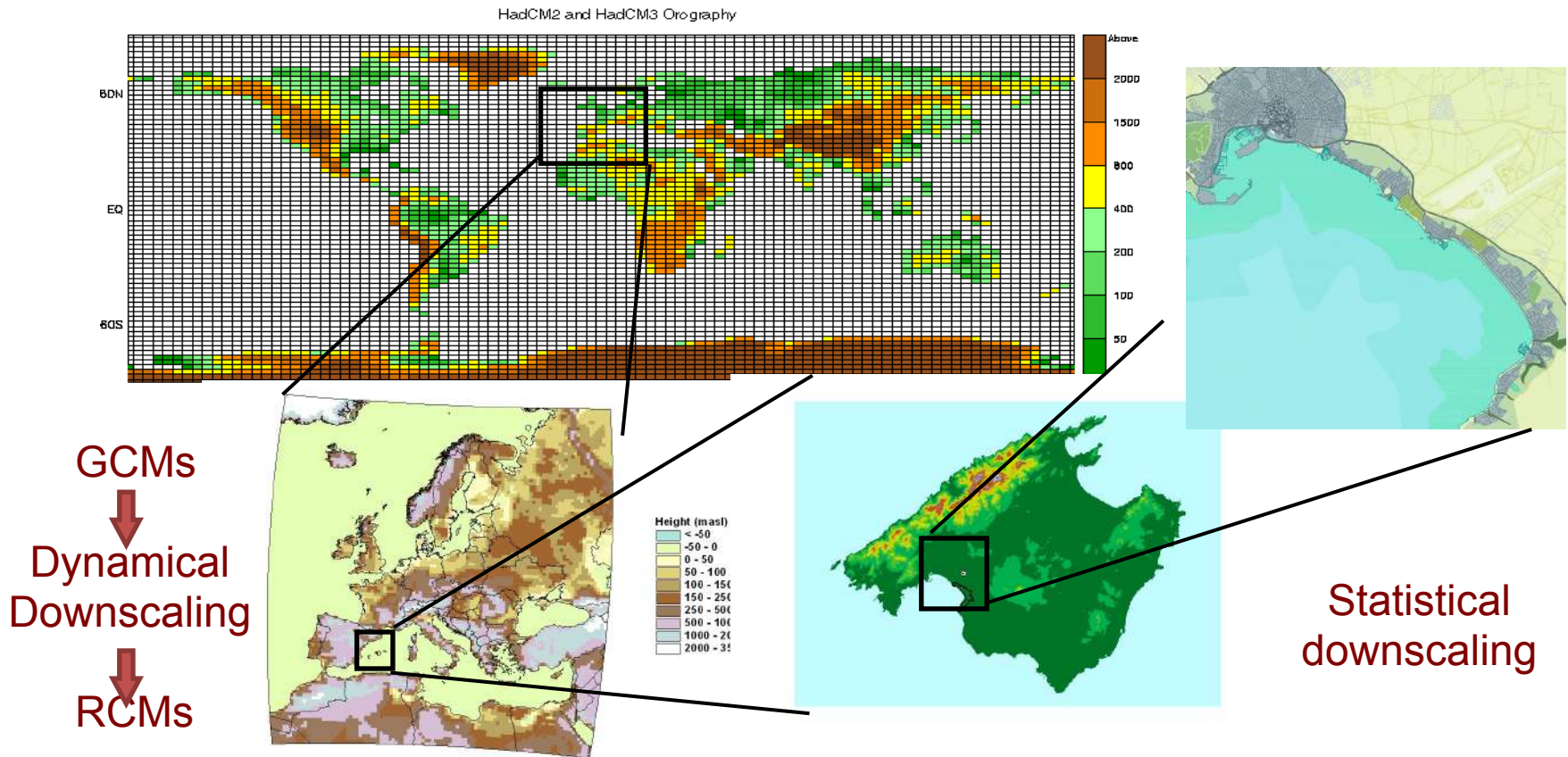
- ↓ cold days and nights (99%)
- ↑ hot days and nights (99%)
- ↑ frequent and/or intense heavy rainfall events (90%)
- ↑ Longer and/or more intense droughts (66%)
- ↑ hurricane activity (50%)  
(western north pacific and north atlantic)

# Tools for exploring climate change impacts

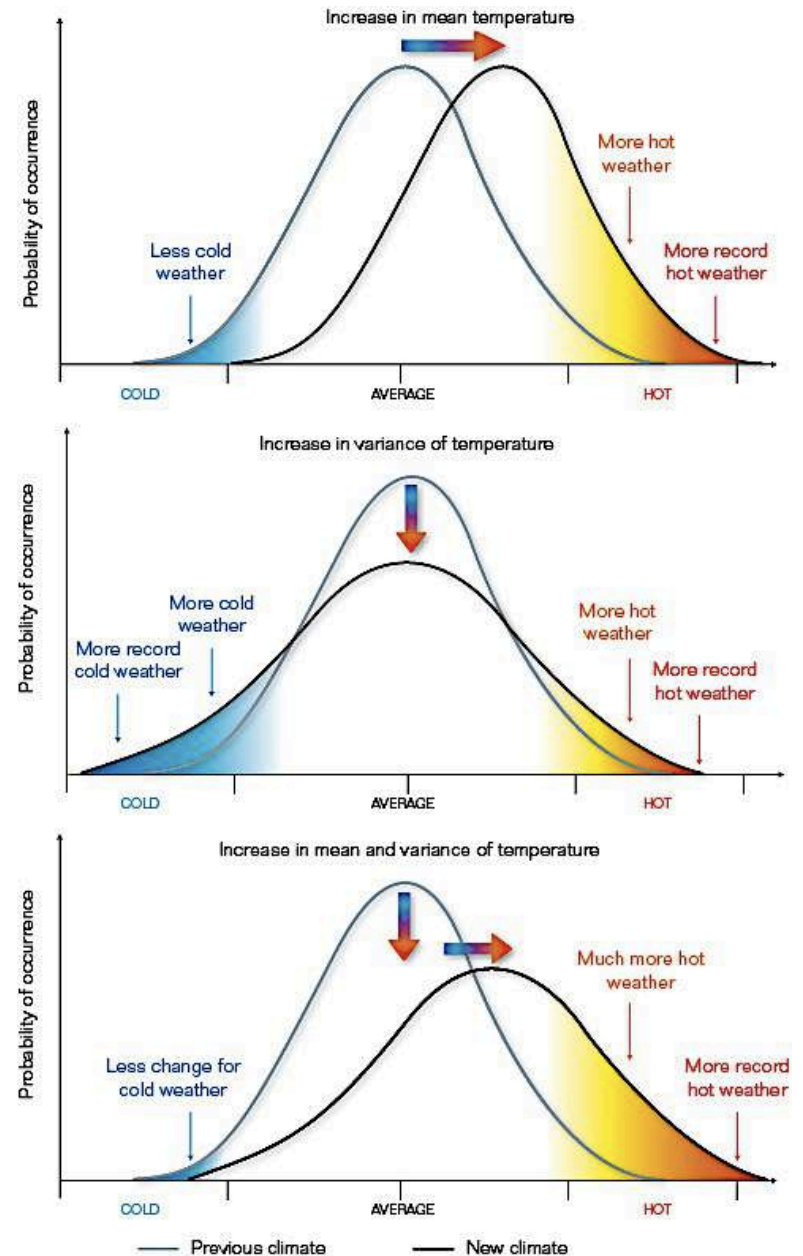
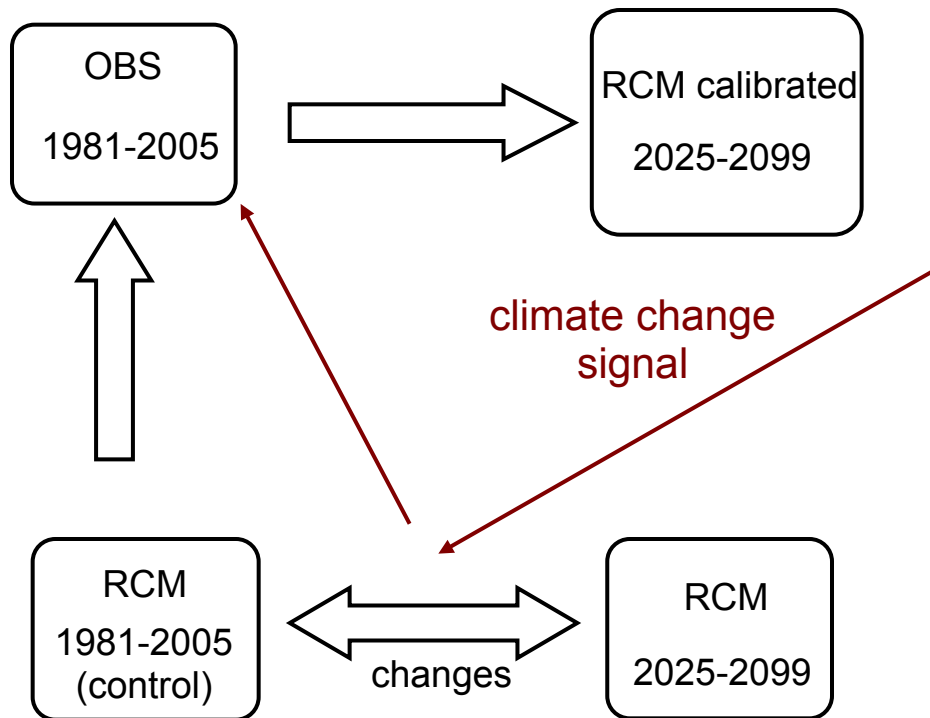
- GCMs → RCMs

-Regional scales: Dynamical downscaling. Regional Climate Model (RCMs)

-Local scales: Statistical downscaling and model calibration from RCMs



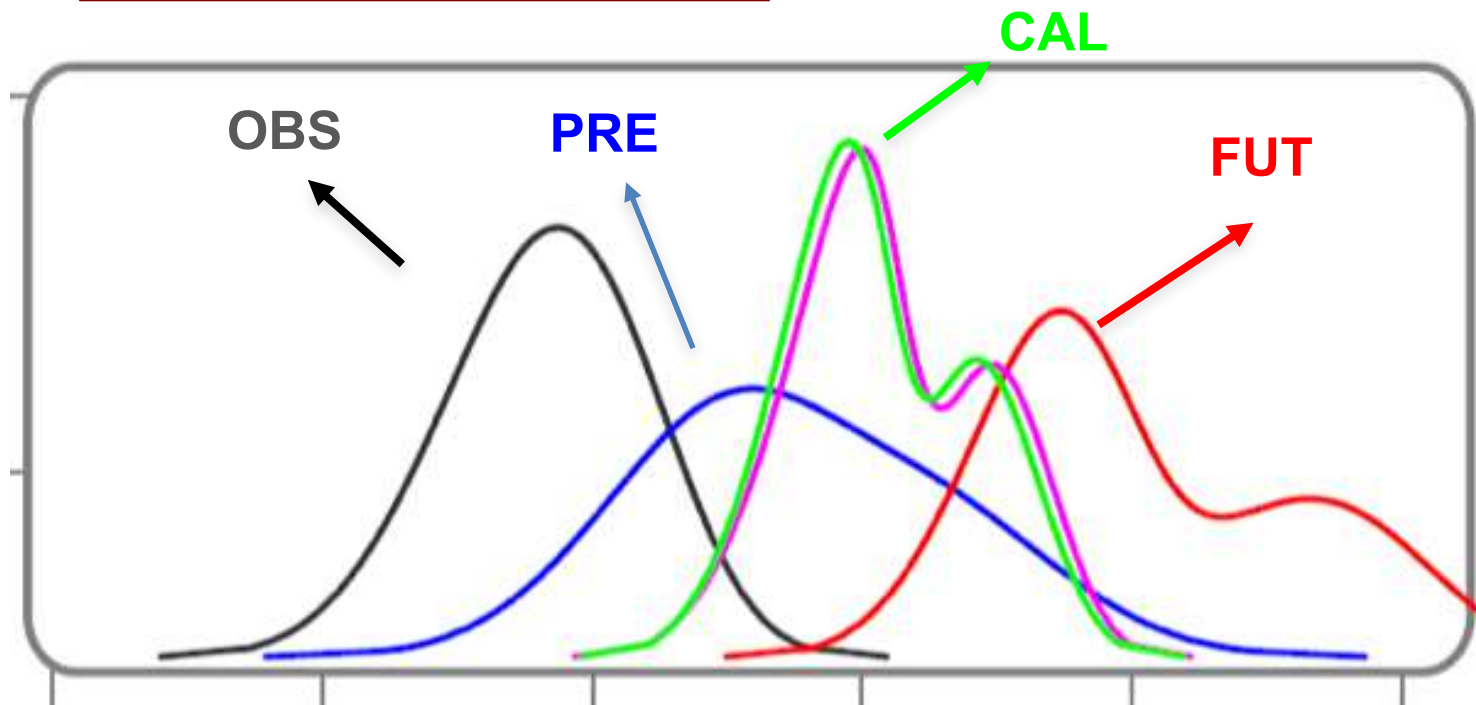
# Statistical downscaling of RCM outputs



# Quantile-Quantile adjustment

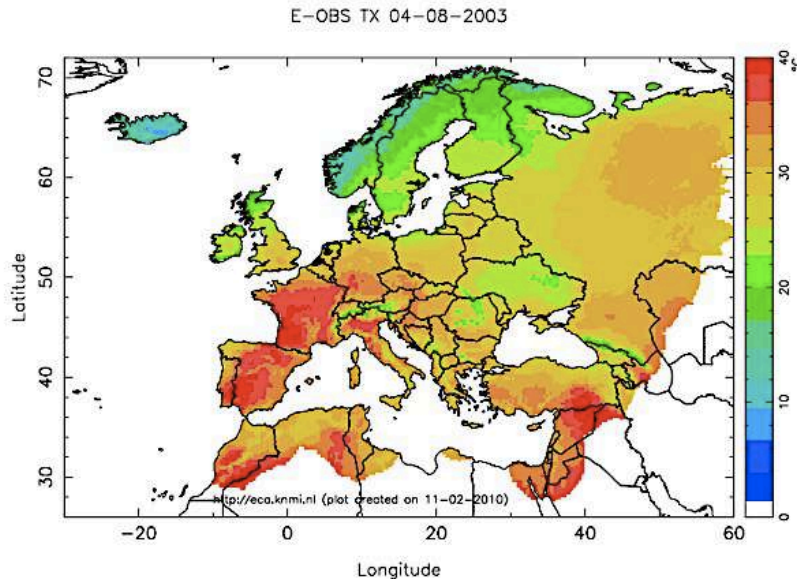
(Cardell et al., 2019a)

$$p_i = o_i + g\bar{\Delta} + f\Delta'_i,$$

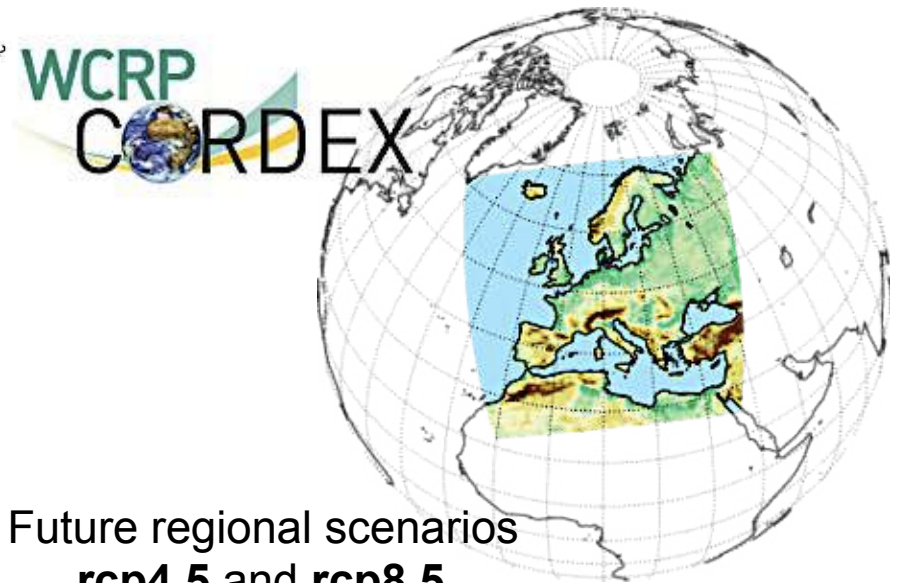


## 2. Database and methodology

E-OBS gridded dataset (25 km)



EURO-CORDEX (12,5 km)



Future regional scenarios  
**rcp4.5 and rcp8.5**

Daily series of:

- **2-m minimum and maximum temperatures**
- **Accumulated precipitation**

# Climate change projections

Compute changes in calibrated CDFs between a 25-year past (i.e. control/observed; 1981-2005) and successive 25-year RCM time-slices (2021-2045; 2046-2070; **2071-2095**)

Future regional scenario  
rcp4.5 and **rcp8.5**



Driving GCM	RCM	Institute
CNRM-CM5-LR	CCLM4-8-17	CLMcom
EC-EARTH	CCLM4-8-17	CLMcom
HadGEM2-ES	CCLM4-8-17	CLMcom
MPI-ESM-LR	CCLM4-8-17	CLMcom
EC-EARTH	RACMO22E	KNMI
HadGEM2-ES	RACMO22E	KNMI
EC-EARTH	HIRHAM5	DMI
NorESM1-M	HIRHAM5	DMI
CNRM-CM5	ALADIN53	CNRM
CNRM-CM5	RCA4	SMHI
EC-EARTH	RCA4	SMHI
HadGEM2-ES	RCA4	SMHI
MPI-ESM-LR	RCA4	SMHI
IPSL-CM5A-MR	RCA4	SMHI

## Extreme weather events

### 1. Temperature extremes

1.1 Warm days

**1.2 Heat waves**

1.3 Cold nights

**1.4 Cold spells**

### 2. Precipitation extremes

2.1 Heavy precipitation days

**2.2 Heavy precipitation episodes**

2.3 Dry days

2.4 Droughts

We characterize their attributes with the following parameters:

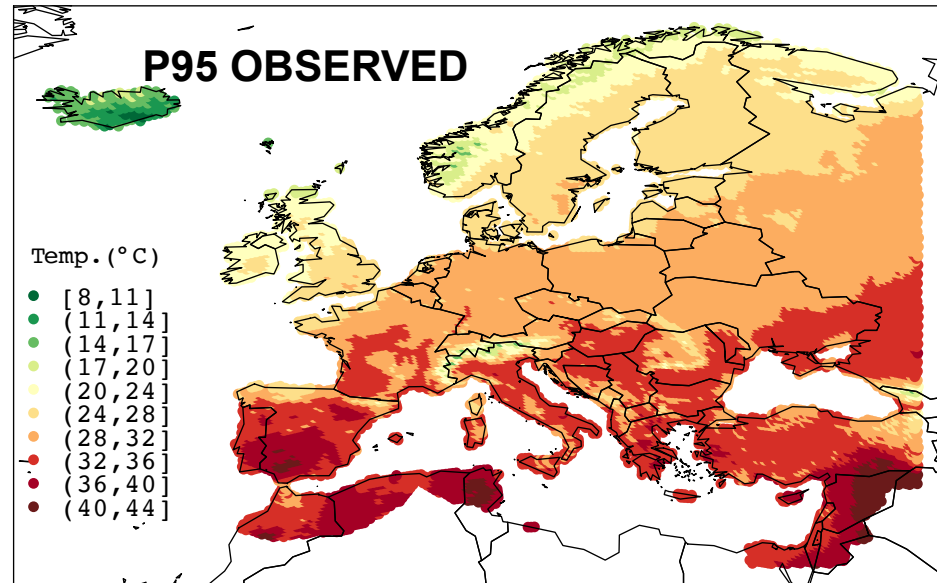
- Number of extreme events that occur in a given time interval
- Frequency: number of days under extreme conditions in a given time interval
- Duration exceedance: total number of consecutive days exceeding the duration threshold for all events in a given time interval. It accounts for the whole amount of excess days.
- Amplitude exceedance: the accumulated stress exceedance for all the days under extreme conditions in a given time interval.

# 3. Results. Temperature extremes

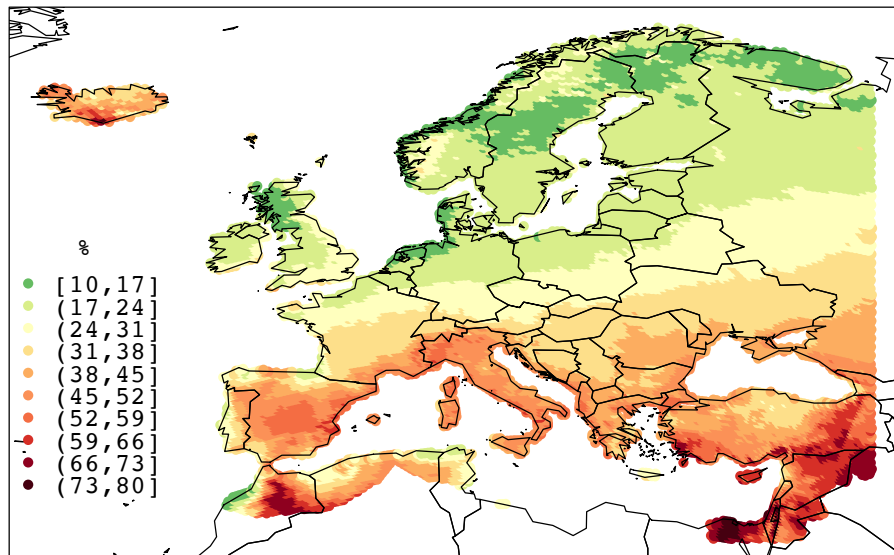
SUMMER

## 3.1.1 WARM DAYS

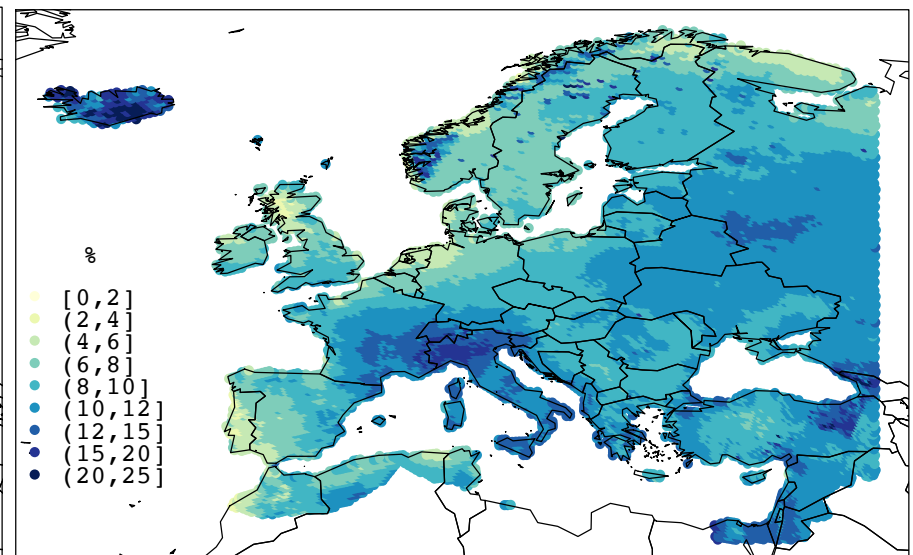
Day in which daily maximum temperature values are in EXCESS of the observed P95 of maximum temperature in summer



**FUTURE MULTI-MODEL MEAN**



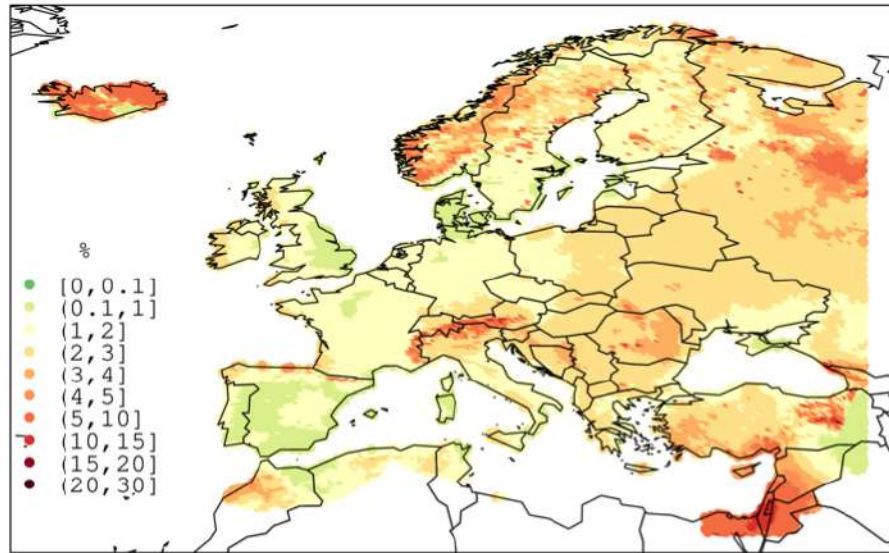
**SD (FUTURE MULTI-MODEL MEAN)**



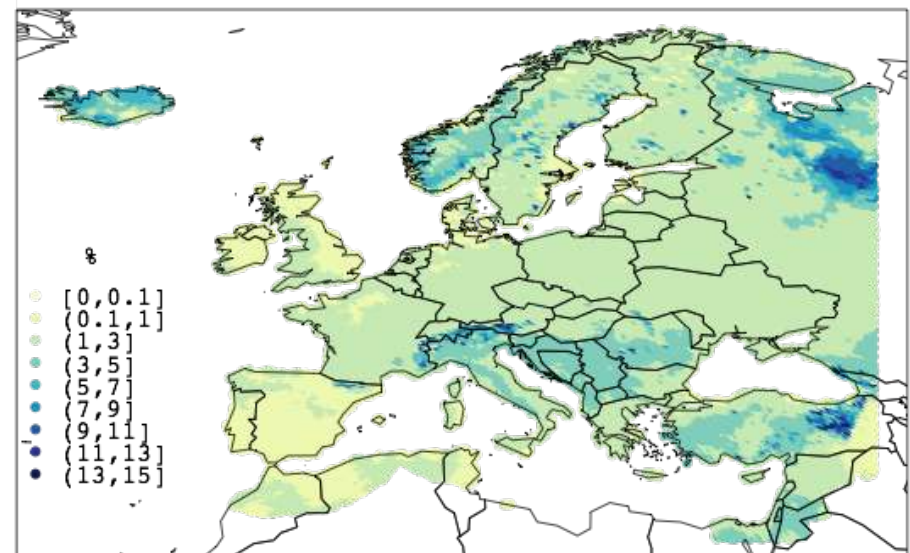
### 3.1.1 WARM DAYS

SPRING

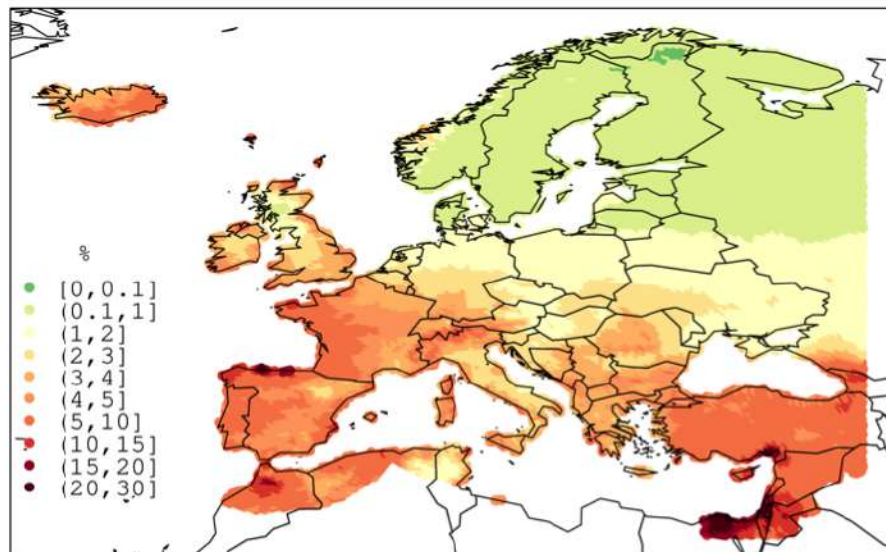
FUTURE MULTI-MODEL MEAN



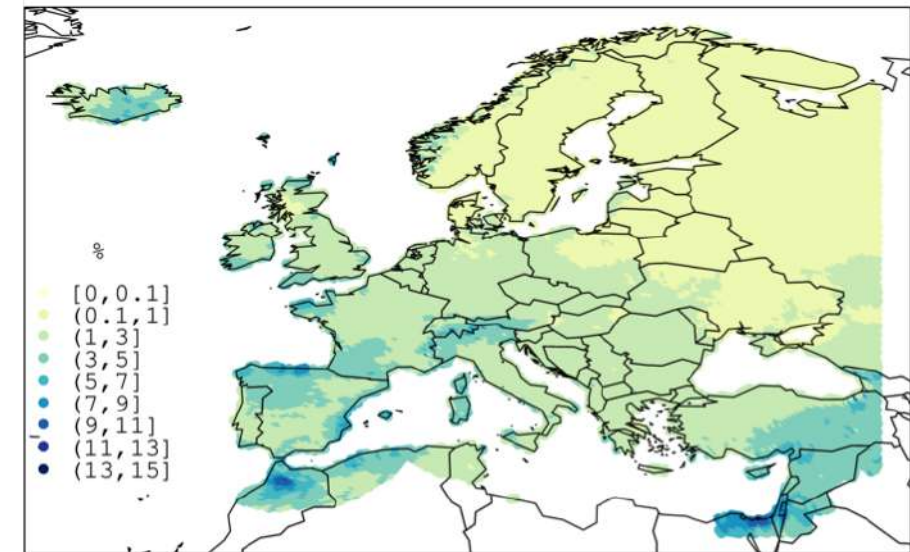
SD (FUTURE MULTI-MODEL MEAN)



FUTURE MULTI-MODEL MEAN AUTUMN



SD (FUTURE MULTI-MODEL MEAN)



### 3.1.2 HEAT WAVES

A spell lasting  $d_{th} = 3$  or more consecutive days with *daily mean temperature* above 90<sup>th</sup> percentile of observed daily mean temperature in summer.

#### HEAT WAVE AMPLITUDE (HWA)

The accumulated heat stress exceedance for all the days under extreme conditions in a given time interval.

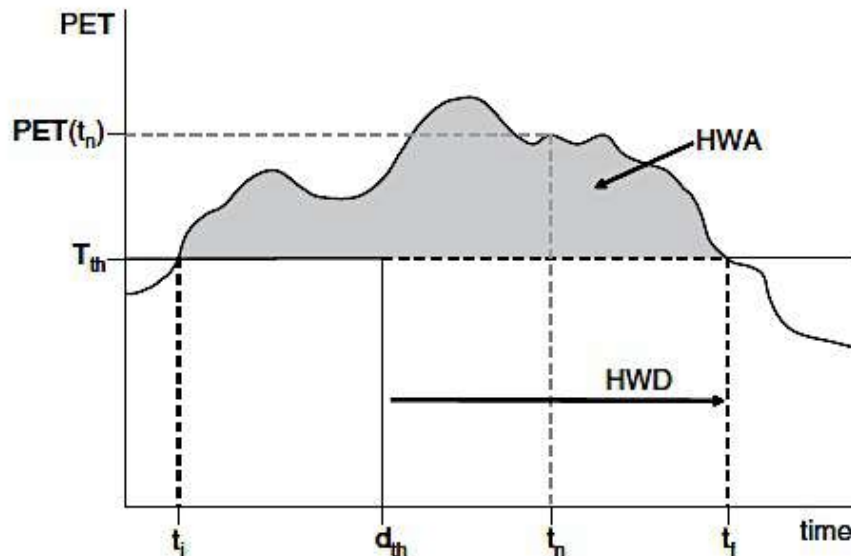


Fig. 1. Graphical sketch of heat wave duration (HWD) and amplitude (HWA, gray shading) exceedances.  $T_{th}$  and  $d_{th}$  denote the thermal stress and duration thresholds, respectively.

$$HWA = HWT - T_{th} \cdot HWF$$

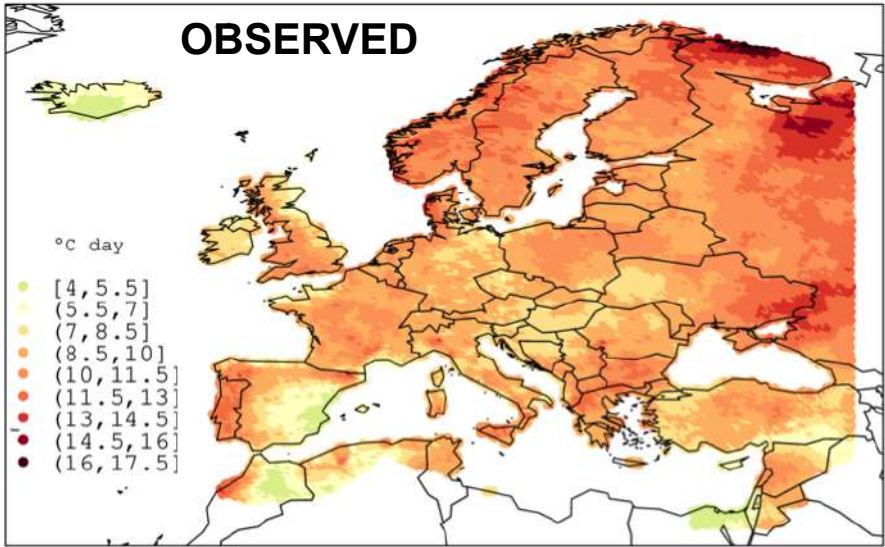
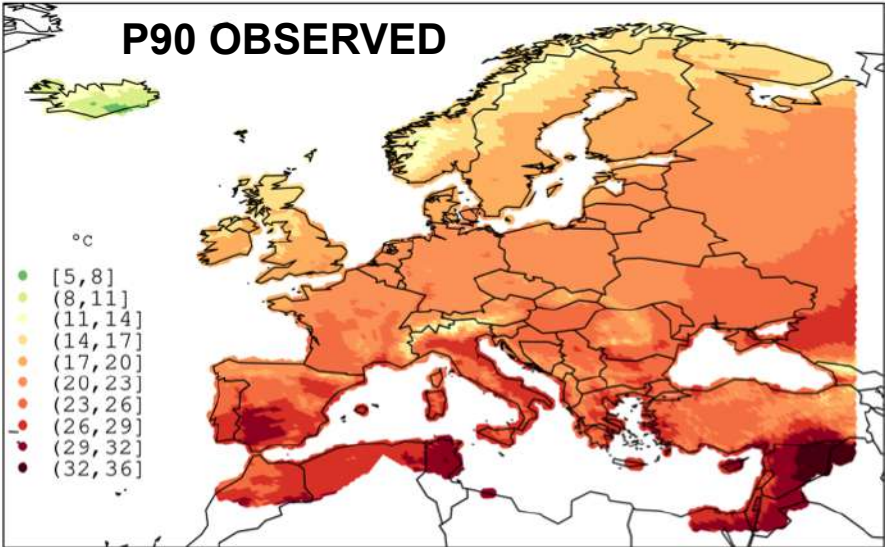
$T_{th}$ : thermal stress

HWF: heat wave day frequency

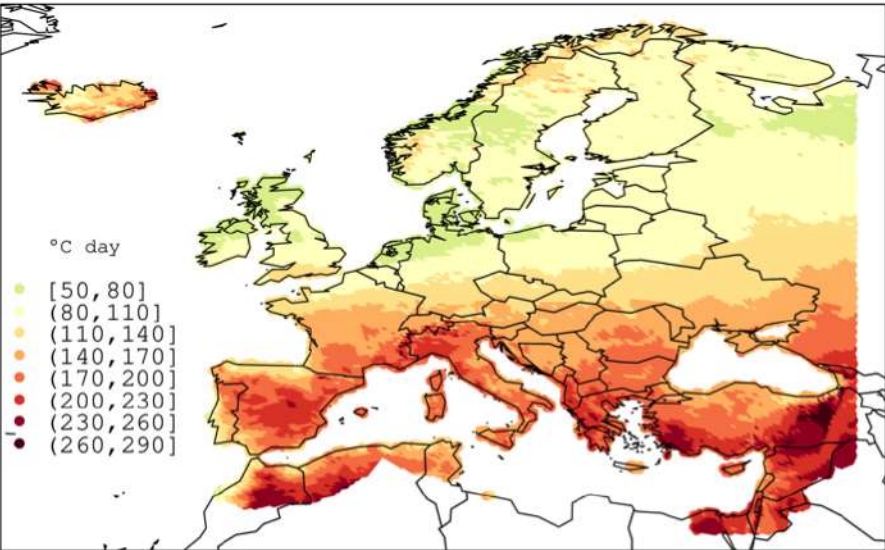
HWT: integral of the maximum daily temperatures over the duration of each individual heat wave, and accumulated for all heat waves in a given time interval

3.1.2 HEAT WAVES. HWA

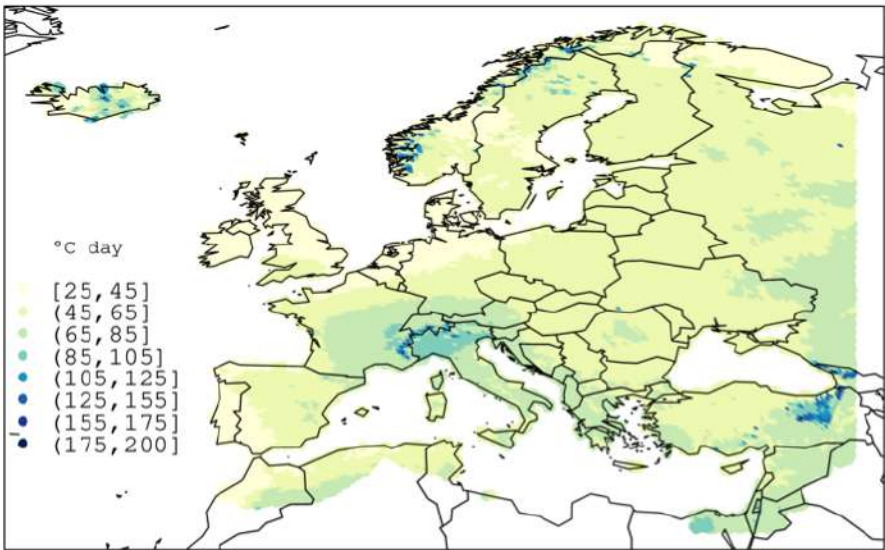
SUMMER



**FUTURE MULTI-MODEL MEAN CHANGE**



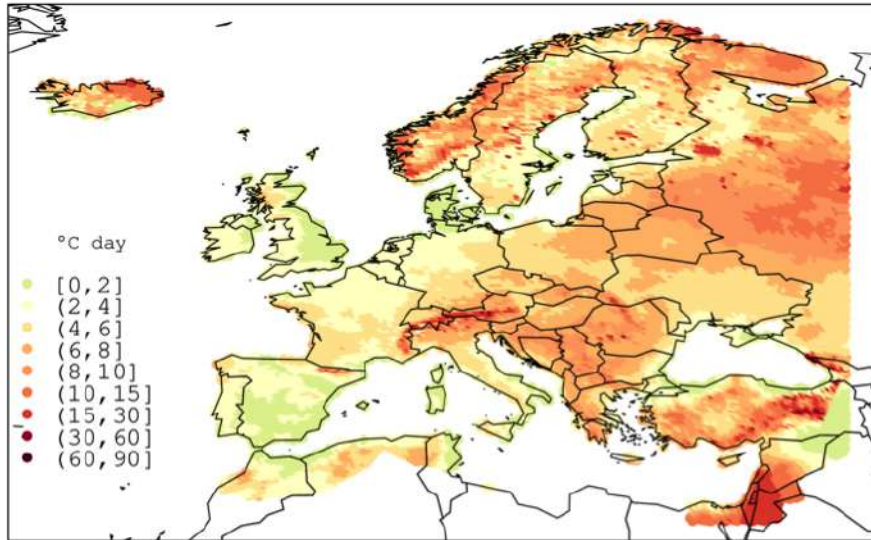
**SD (FUTURE MULTI-MODEL MEAN CHANGE)**



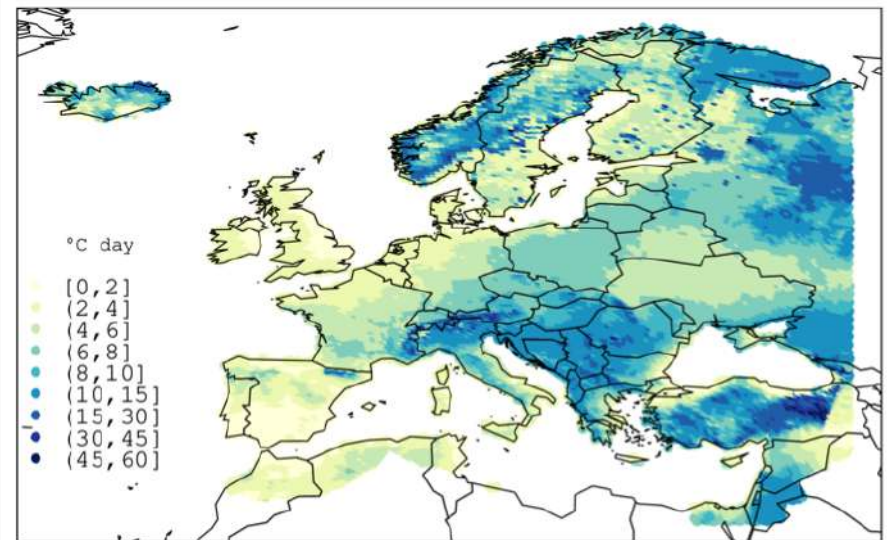
### 3.1.2 HEAT WAVES

**SPRING**

**FUTURE MULTI-MODEL MEAN CHANGE**

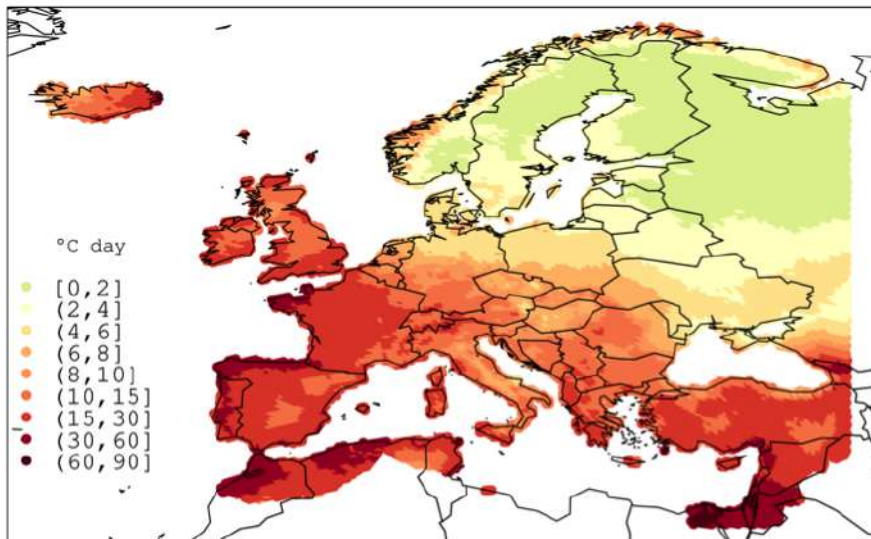


**SD (FUTURE MULTI-MODEL MEAN CHANGE)**

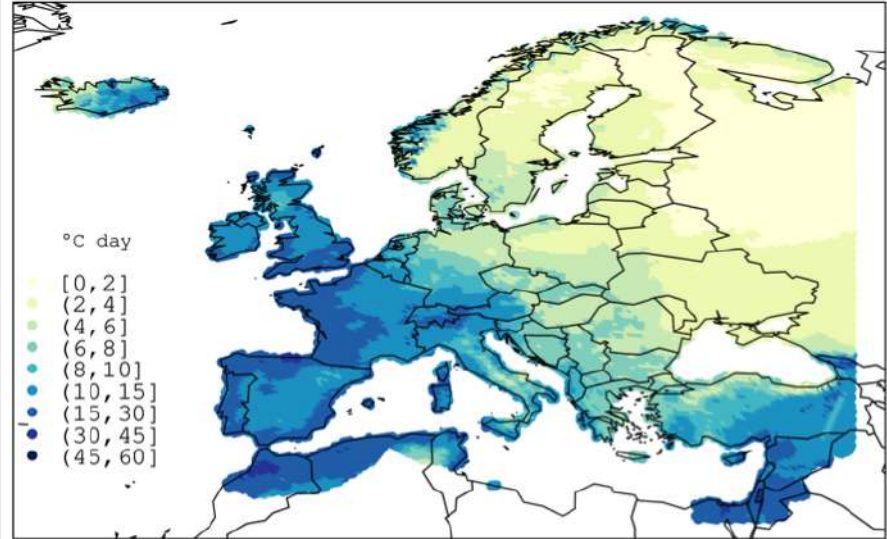


**AUTUMN**

**FUTURE MULTI-MODEL MEAN CHANGE**



**SD (FUTURE MULTI-MODEL MEAN CHANGE)**

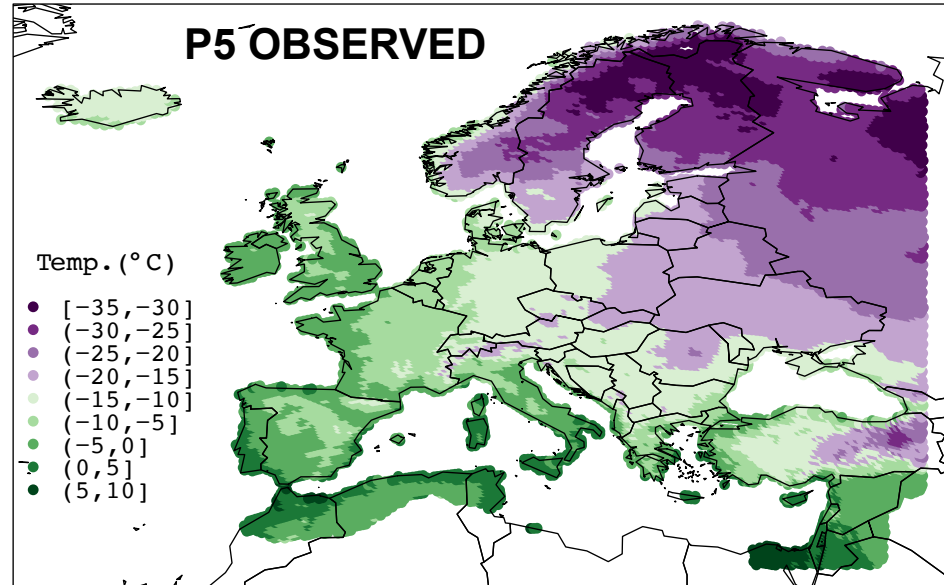


### 3. Results. Temperature extremes

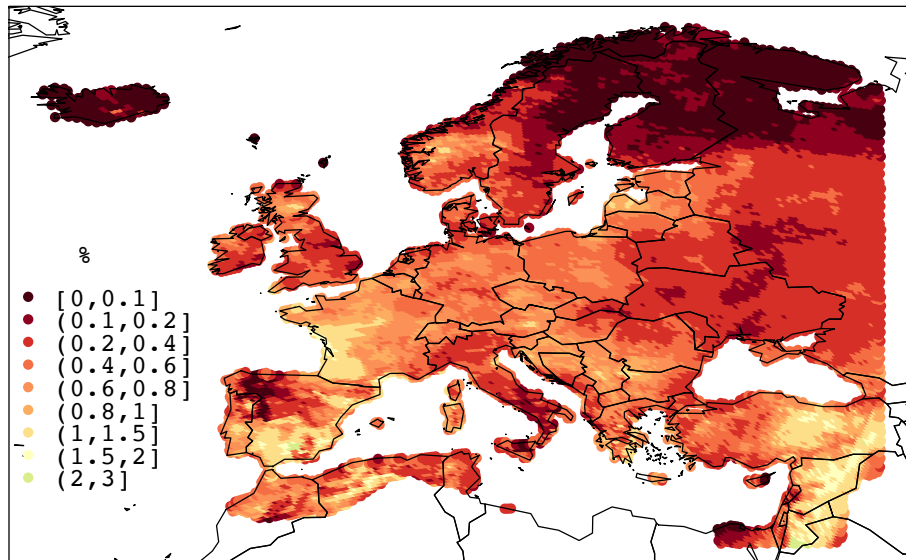
WINTER

#### 3.1.3 COLD NIGHTS

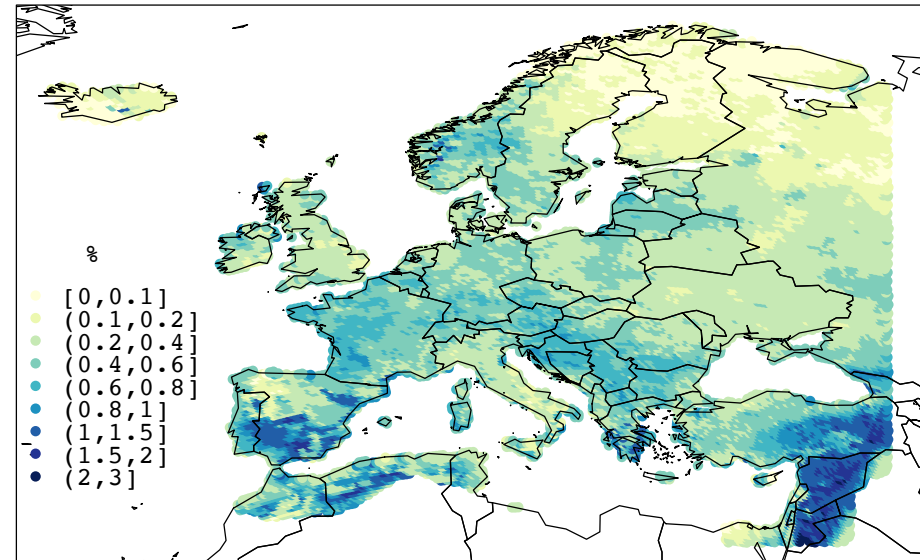
Day in which daily minimum temperature values are UNDER the observed P5 of minimum temperature in winter



**FUTURE MULTI-MODEL MEAN**



**SD (FUTURE MULTI-MODEL MEAN)**



### **3.1.4 COLD SPELL**

A spell lasting  $d_{th} = 3$  or more consecutive days with *daily mean temperature* under 10<sup>th</sup> percentile of observed daily mean temperature in winter.

### **COLD SPELL AMPLITUDE (CSA)**

The accumulated cold stress exceedance for all the days under extreme conditions in a given time interval.

$$CSA = T_{th} \text{ CSF} - CST$$

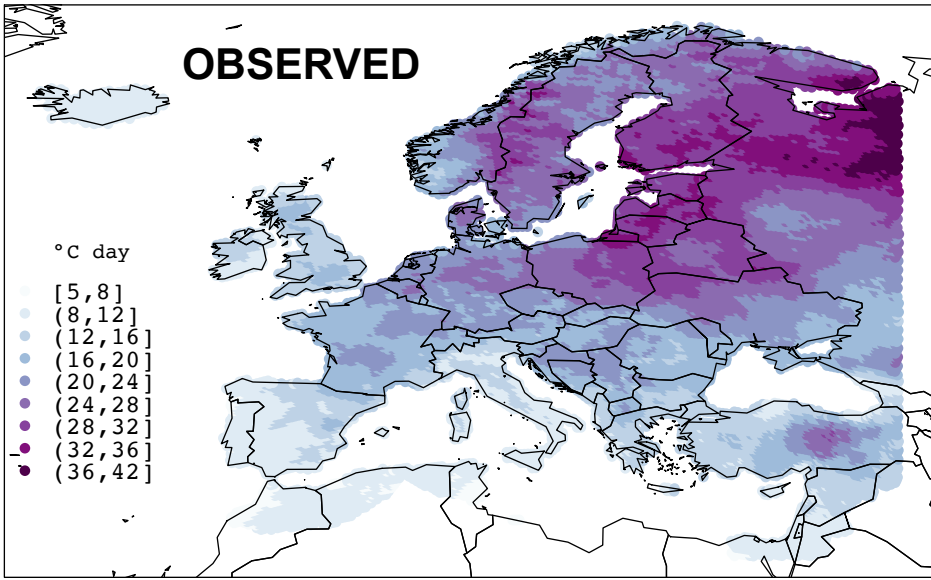
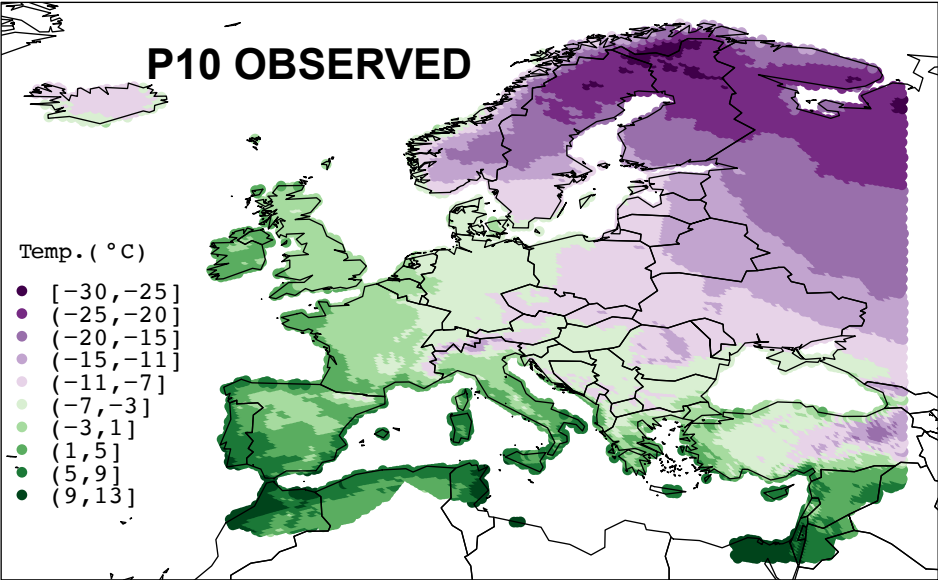
$T_{th}$ : thermal stress

CSF: cold spell frequency

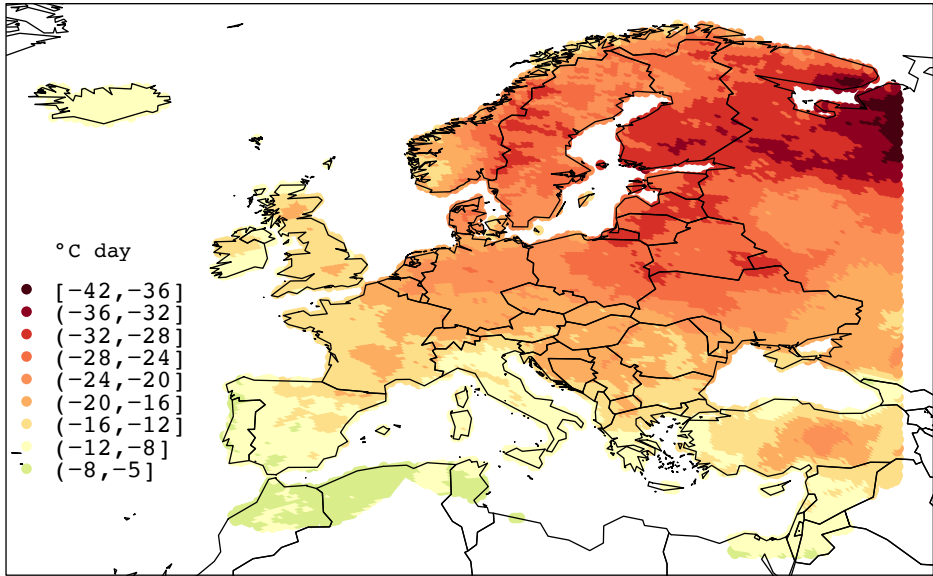
CST: integral of the minimum daily temperatures over the duration of each individual cold spell, and accumulated for all cold spells in a given time interval

# 3.1.4 COLD SPELLS. CSA

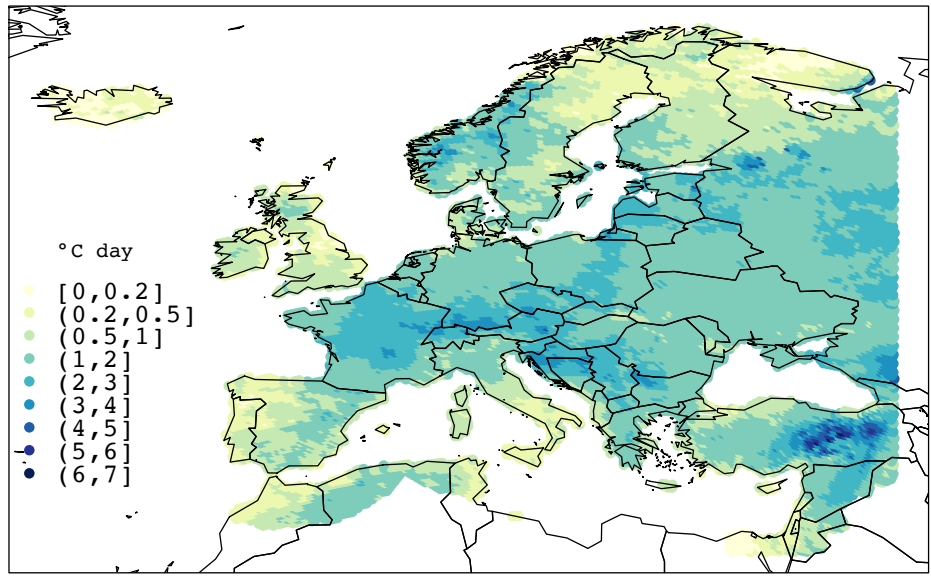
WINTER



**FUTURE MULTI-MODEL MEAN CHANGE**



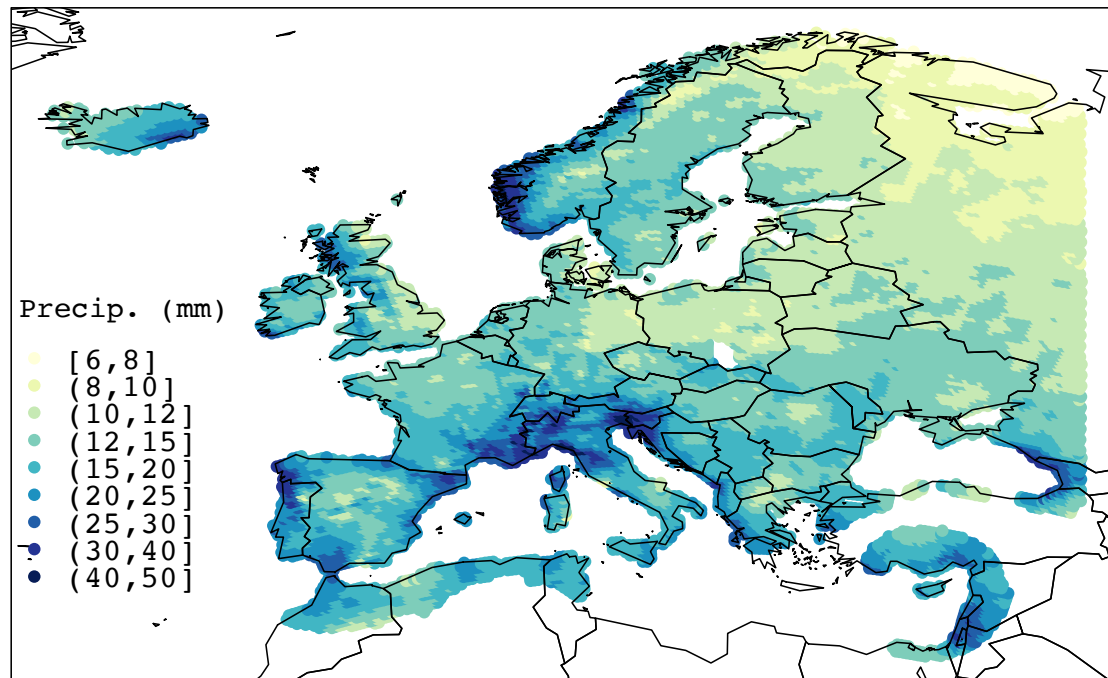
**SD (FUTURE MULTI-MODEL MEAN CHANGE)**



### 3. Results. Precipitation extremes

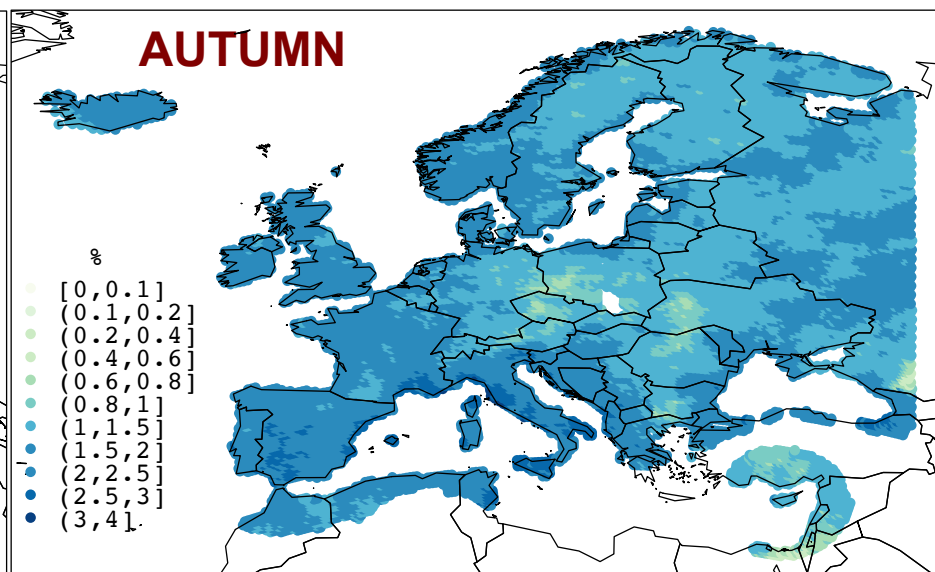
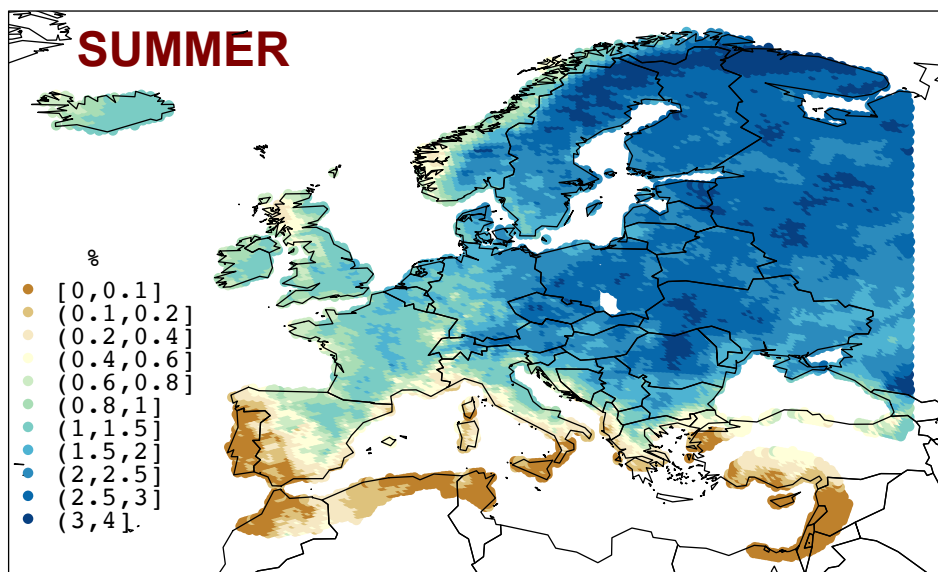
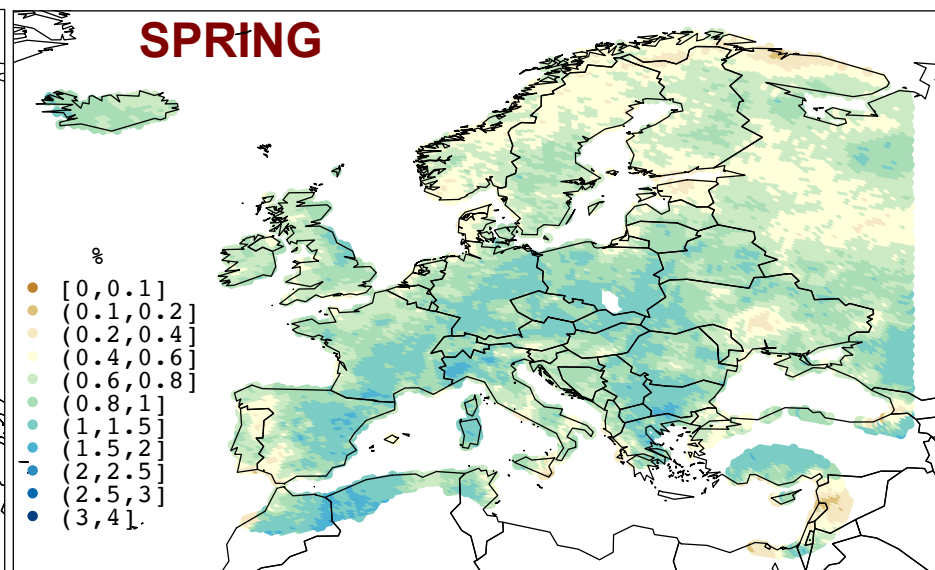
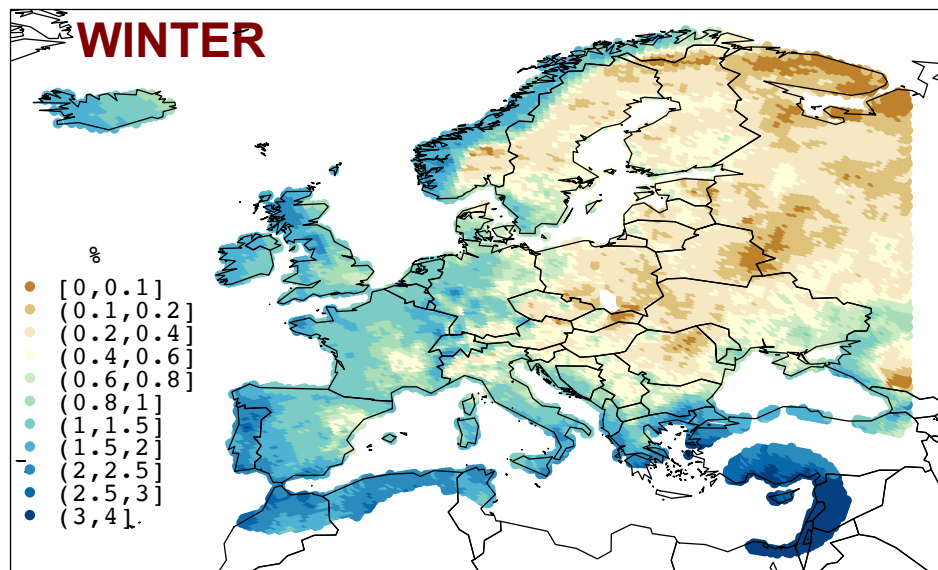
#### 3.2.1 HEAVY PRECIPITATION DAY

Day in which daily accumulated precipitation values are in EXCESS of the observed annual P95 (only days with precipitation  $\geq 0.1\text{mm}$ ).



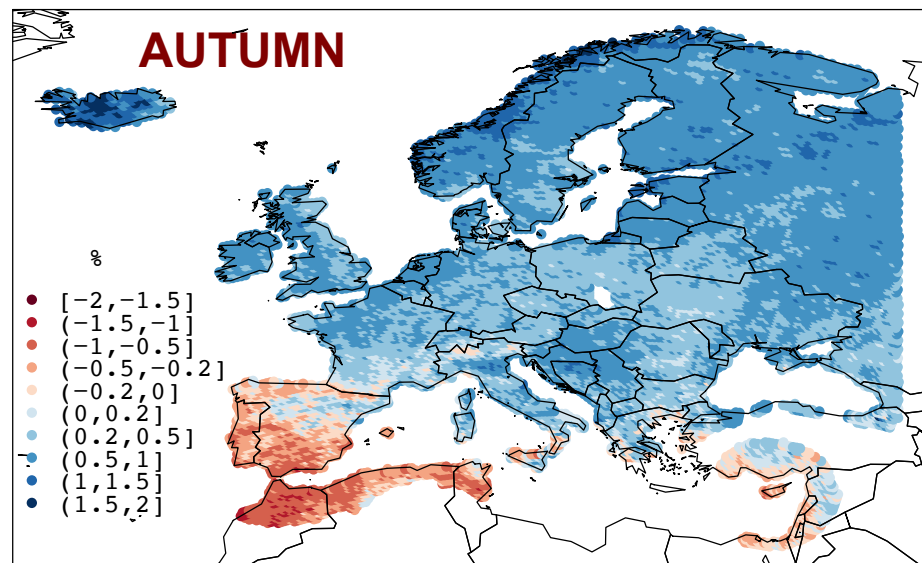
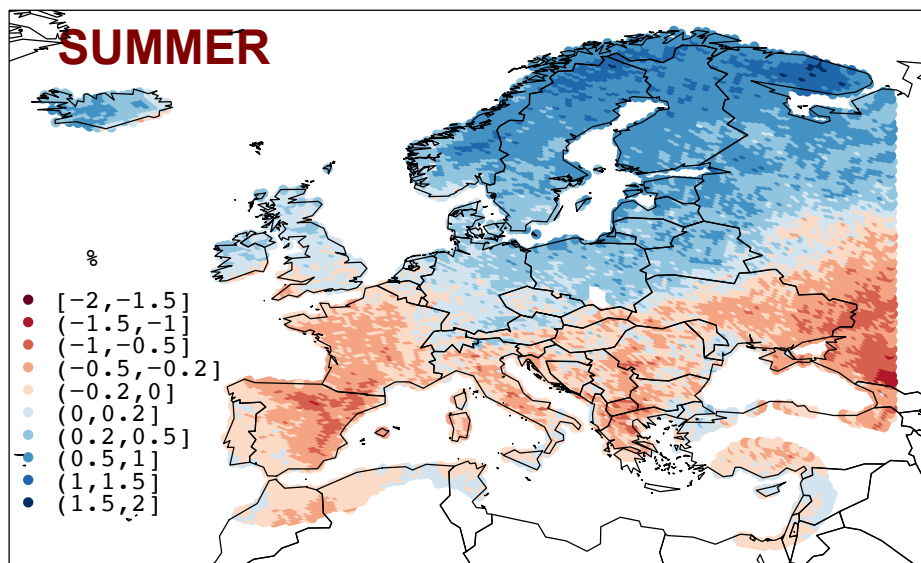
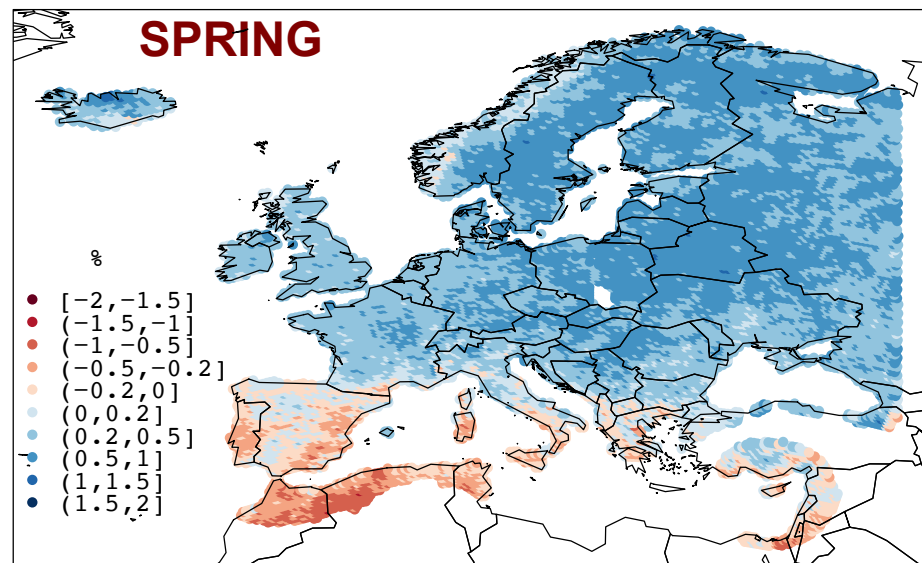
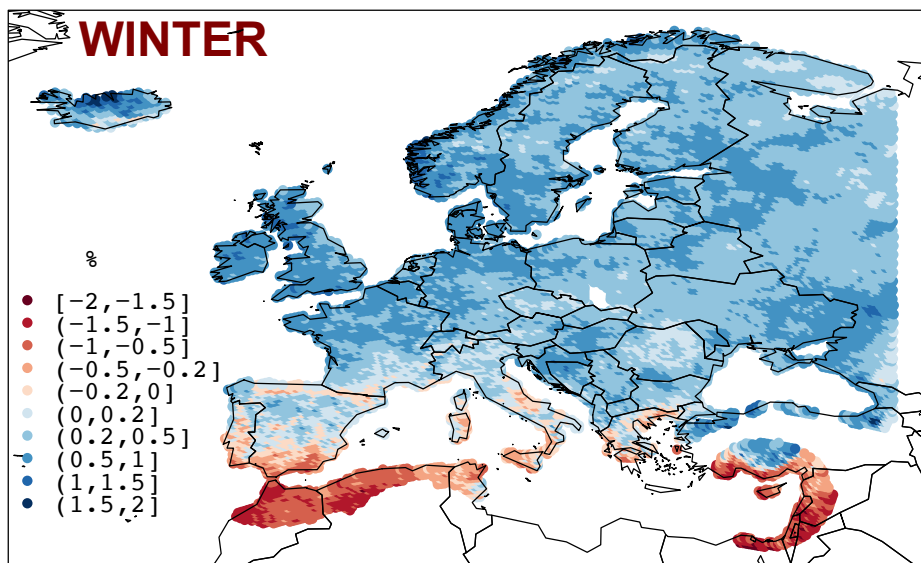
## 3.2.1 HEAVY PRECIPITATION DAYS.

OBSERVED



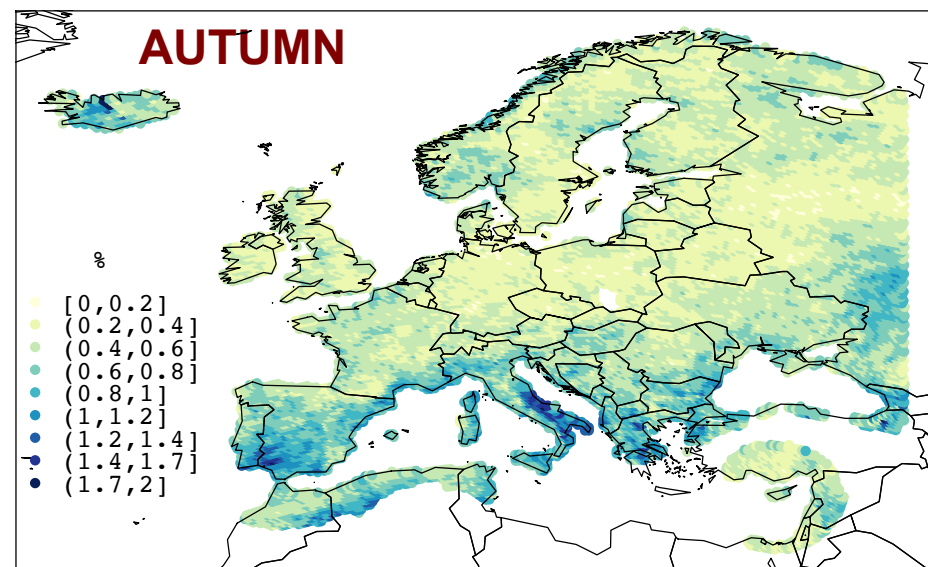
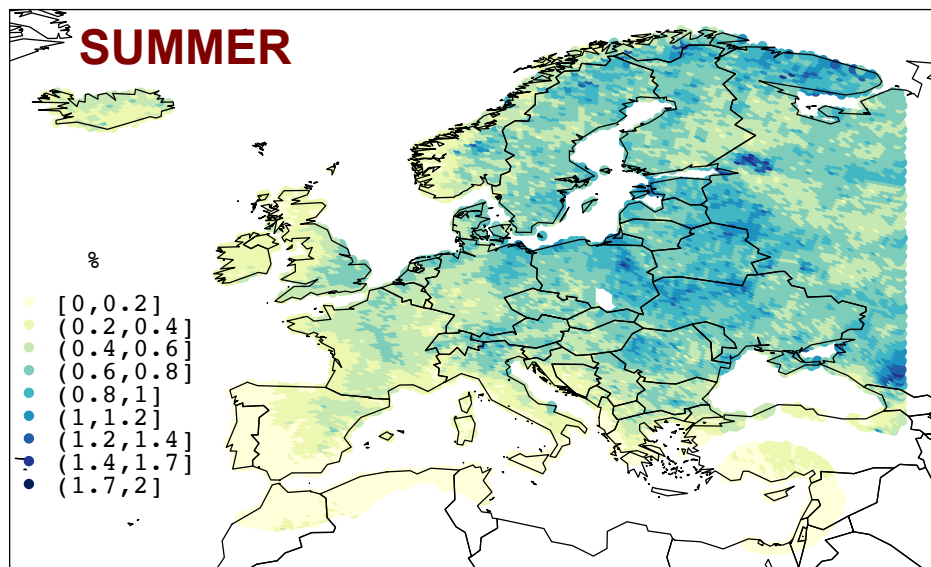
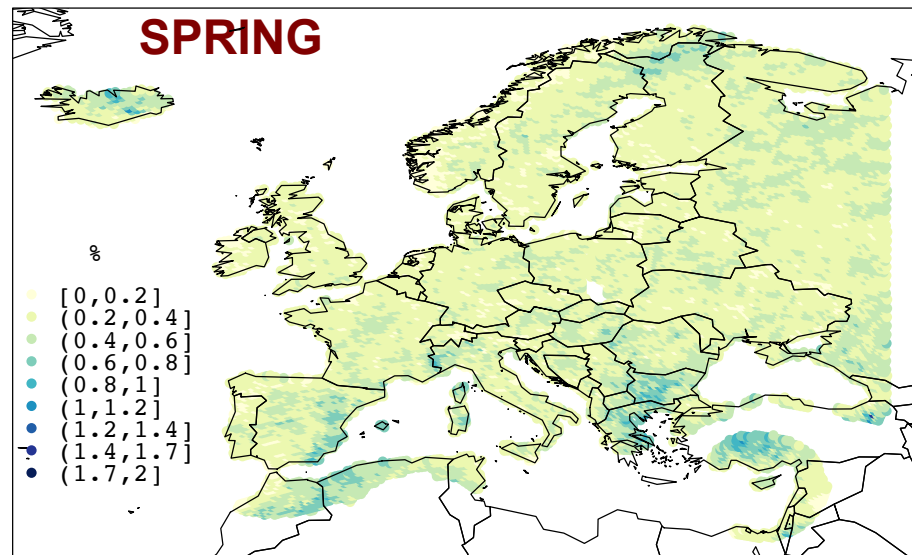
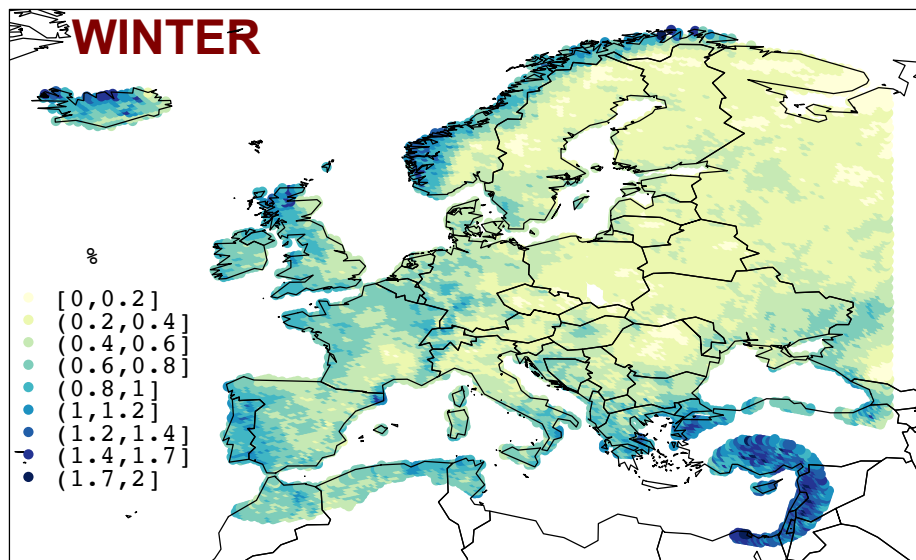
## 3.2.1 HEAVY PRECIPITATION DAYS.

## FUTURE MULTI-MODEL MEAN CHANGE



### 3.2.1 HEAVY PRECIPITATION DAYS.

SD (FUTURE MULTI-MODEL MEAN CHANGE)



### 3. Results

#### **3.2.2 HEAVY PRECIPITATION EPISODE**

A spell lasting  $d_{th} = 2$  or more consecutive days with *daily precipitation above 95<sup>th</sup> percentile* ( $pr \geq 0.1\text{mm}$ ) of observed daily annual precipitation

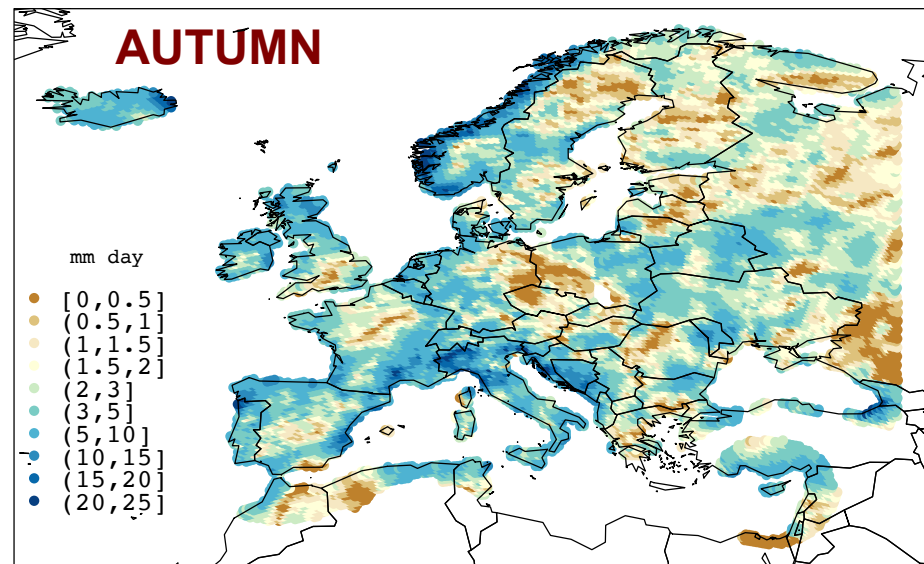
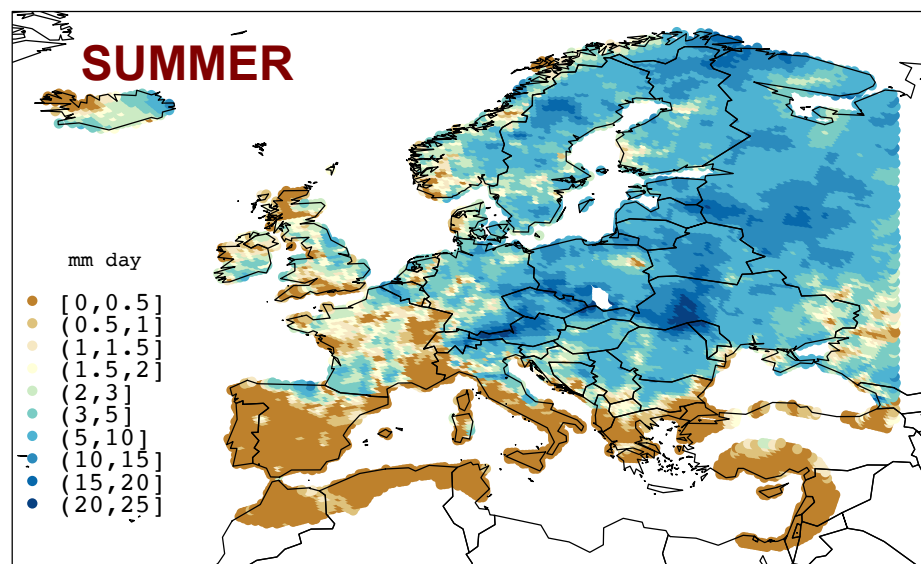
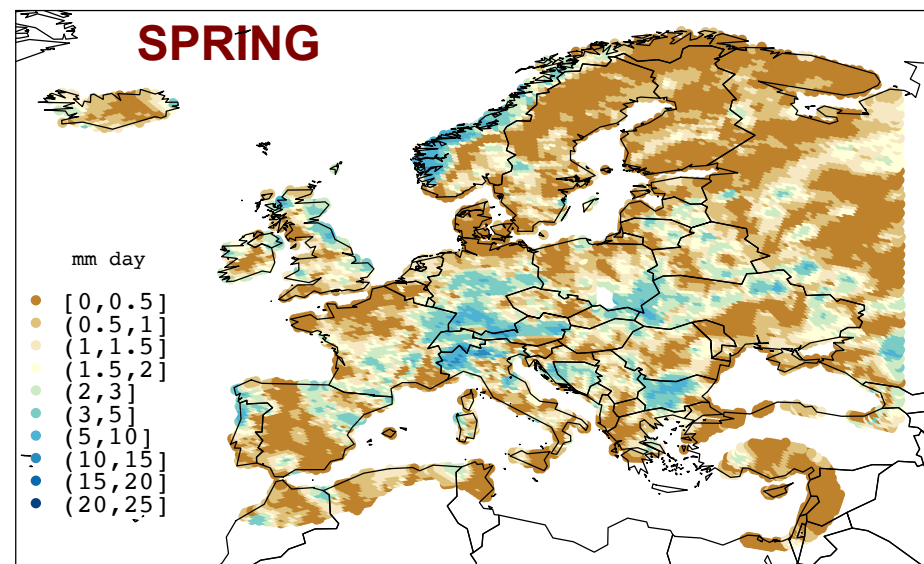
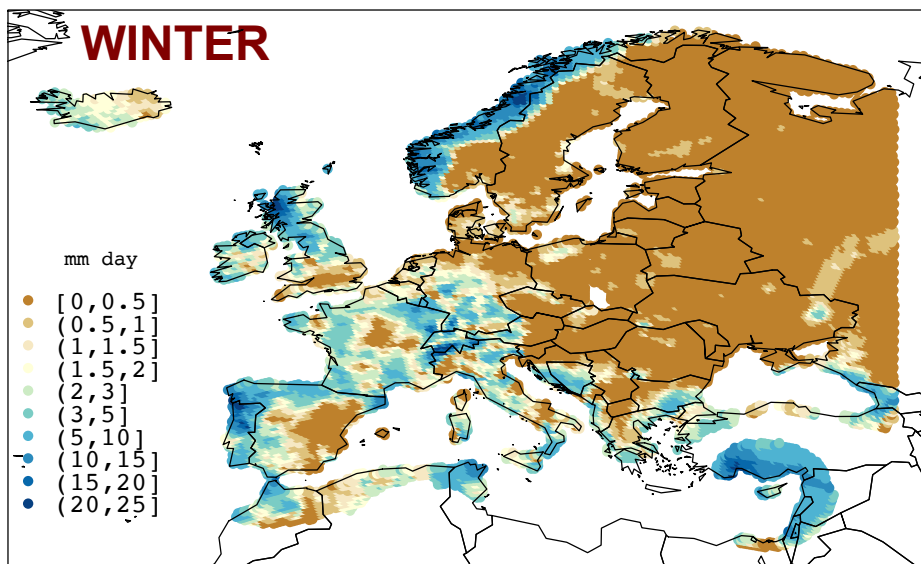
#### **HEAVY PRECIPITATION AMPLITUDE (HPA)**

The accumulated precipitation stress exceedance for all the days under extreme conditions in a given time interval.

$$HPA = HPT - T_{th} \quad HPF$$

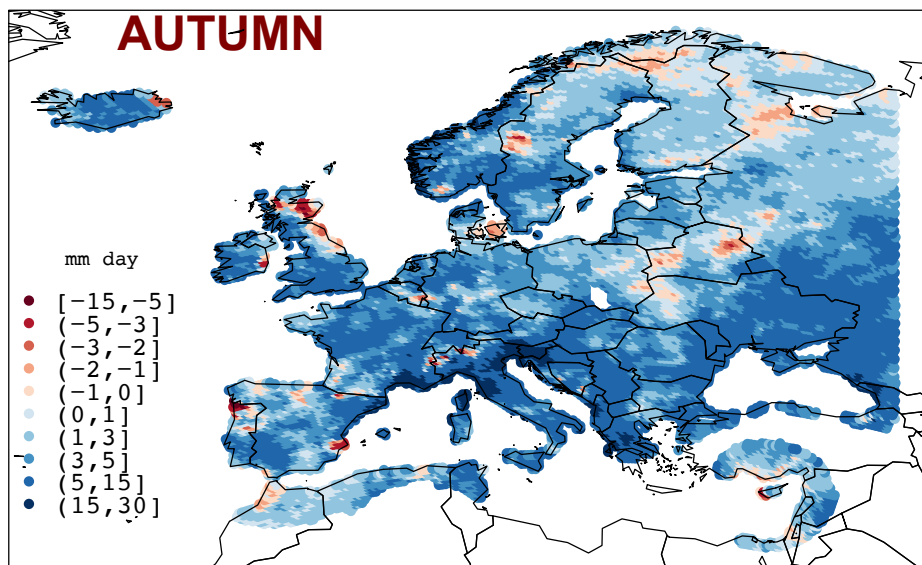
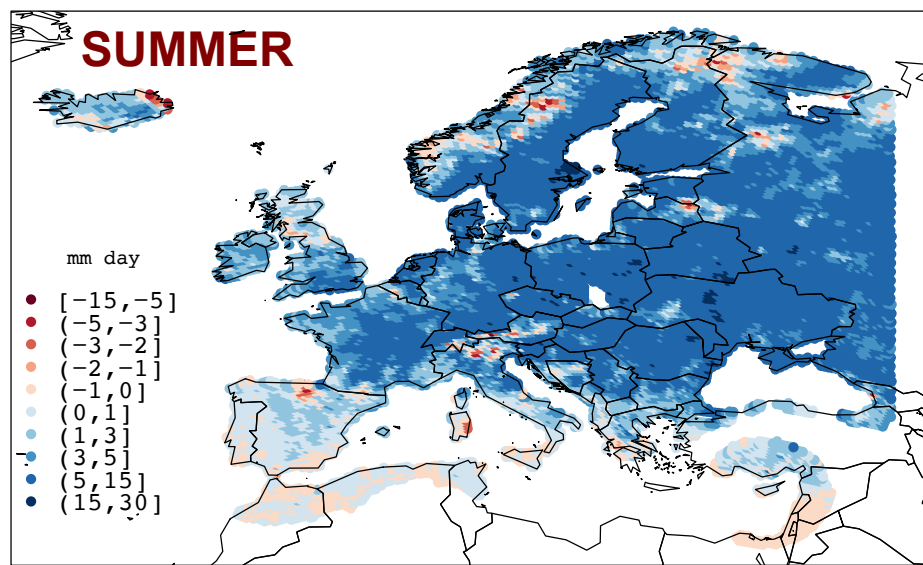
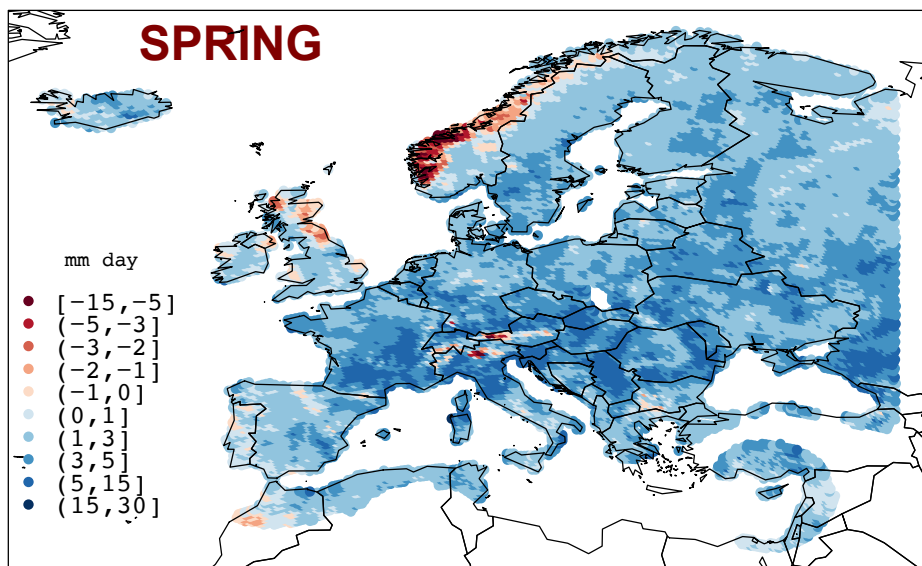
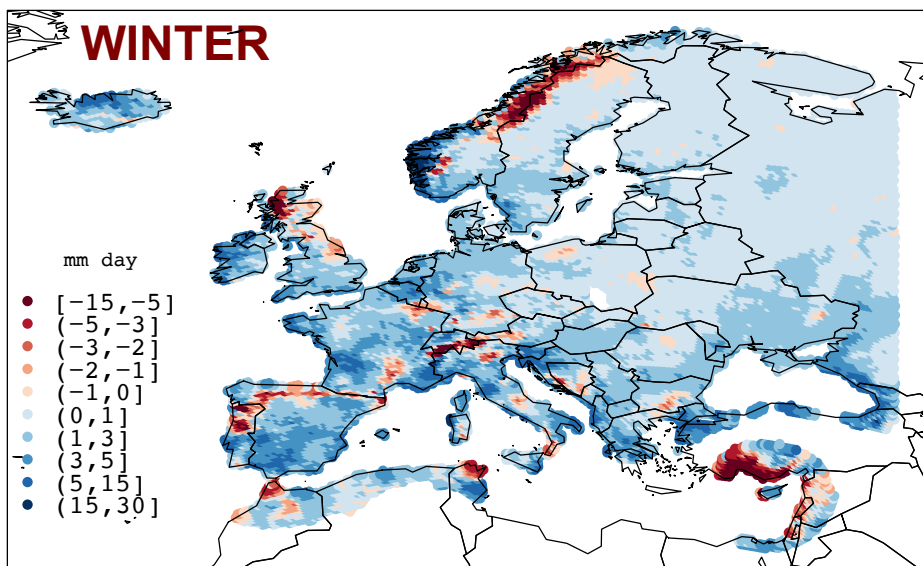
## 3.2.2 HEAVY PRECIPITATION EPISODE. HPA

OBSERVED



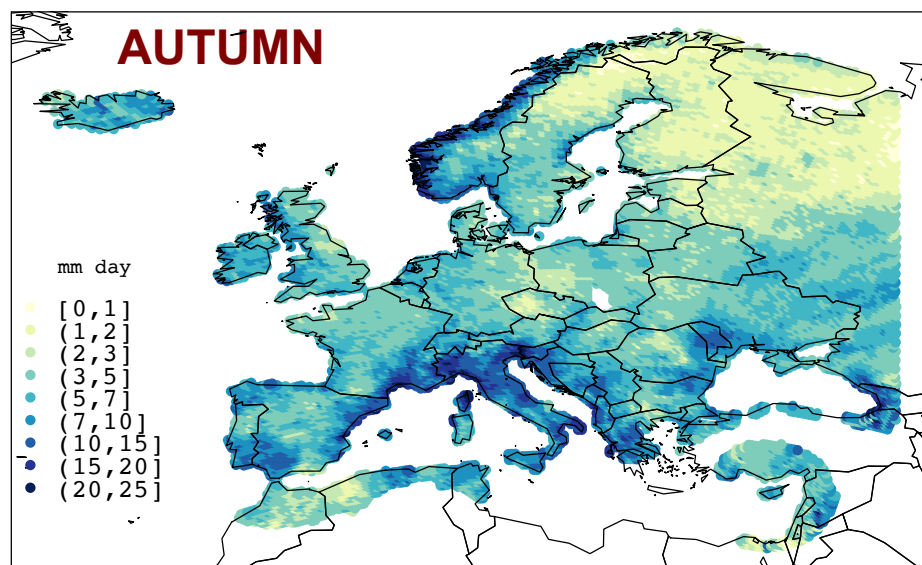
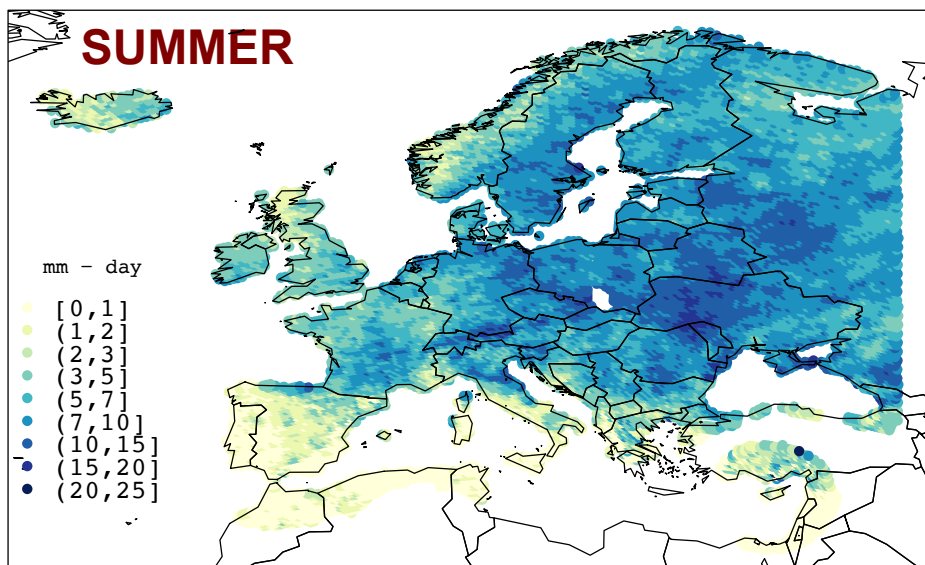
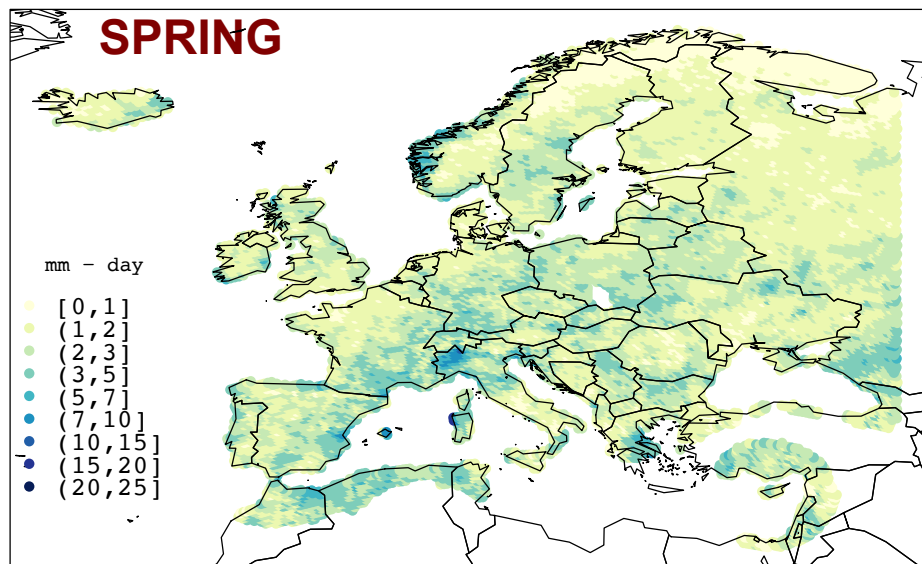
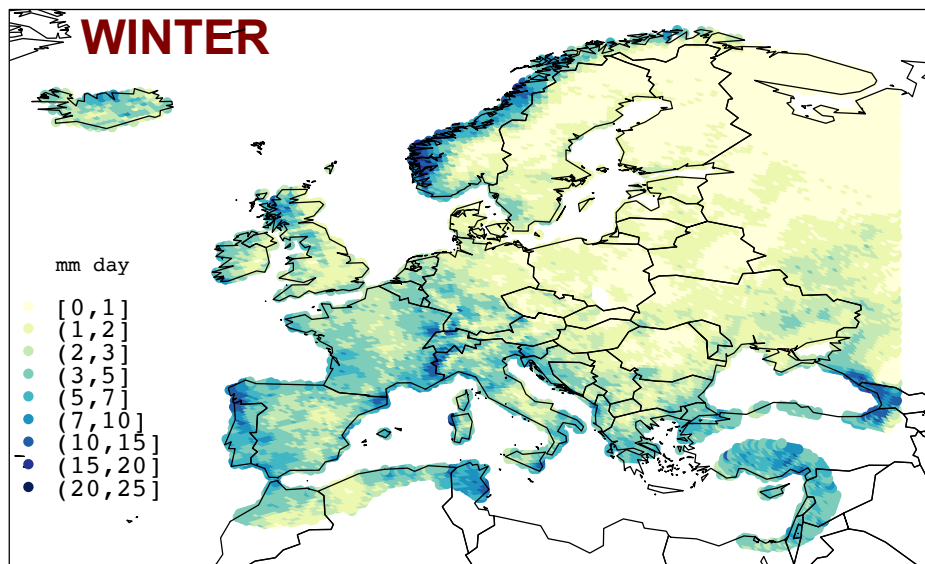
## 3.2.2 HEAVY PRECIPITATION EPISODE. HPA

## FUTURE MULTI-MODEL MEAN CHANGE



## 3.2.2 HEAVY PRECIPITATION EPISODE. HPA

## SD FUTURE MULTI-MODEL MEAN CHANGE

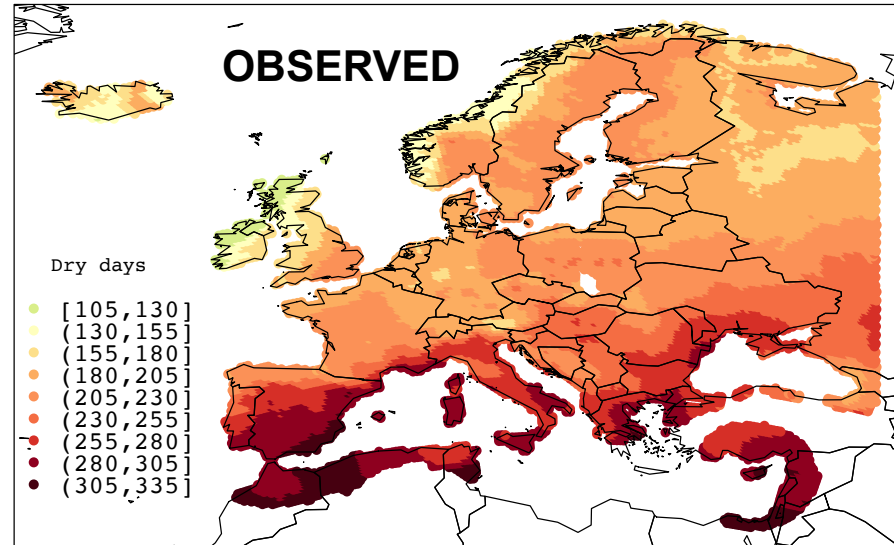


### 3. Results. Precipitation extremes

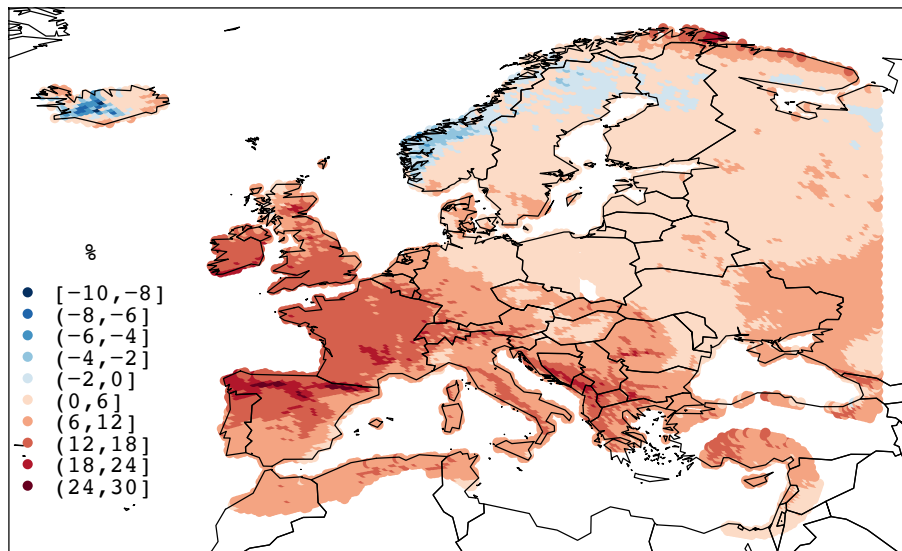
**ANNUAL**

#### 3.2.3 DRY DAYS

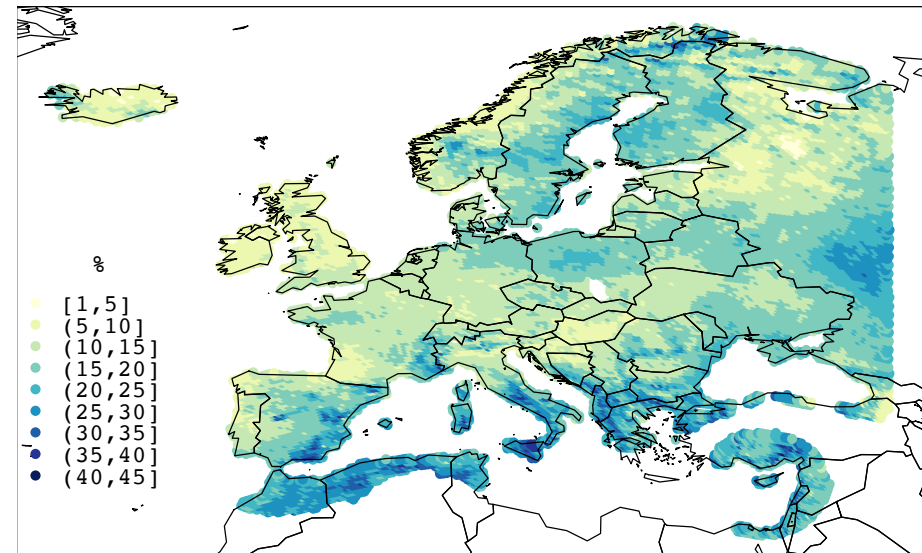
Day in which daily  
accumulated  
precipitation values  
are UNDER 0.1 mm



#### FUTURE MULTI-MODEL MEAN CHANGE

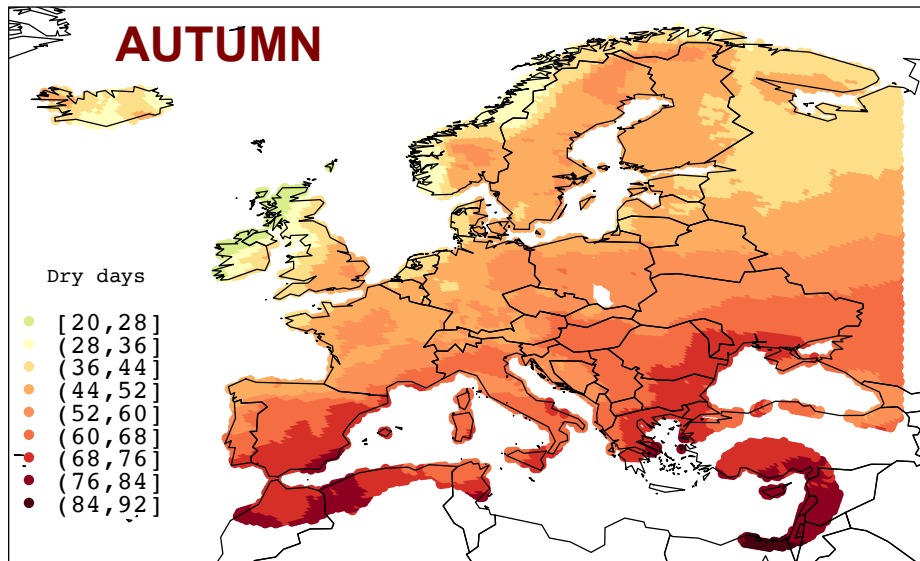
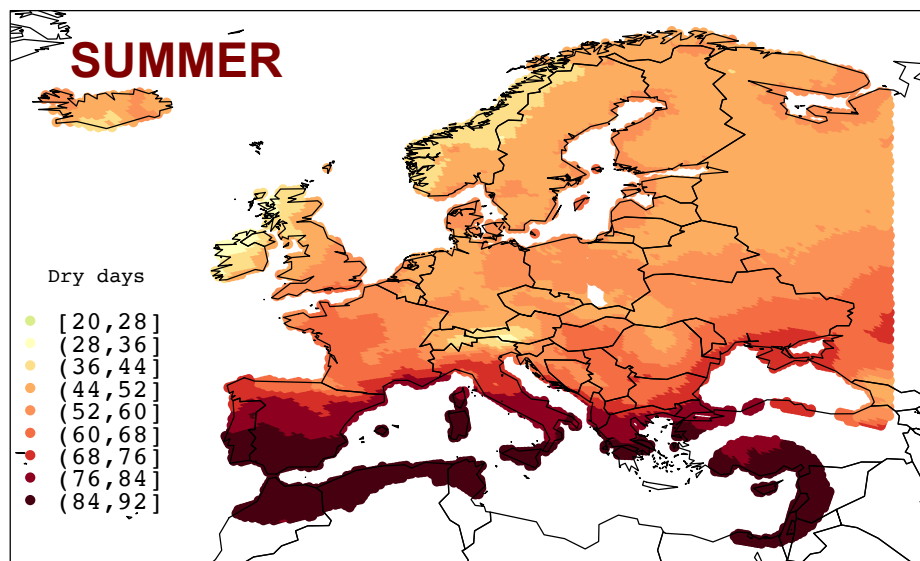
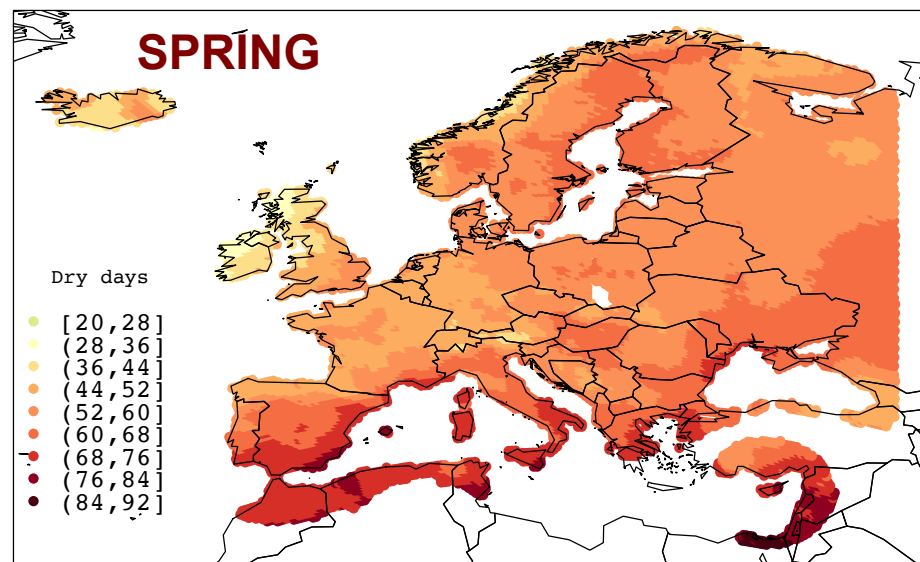
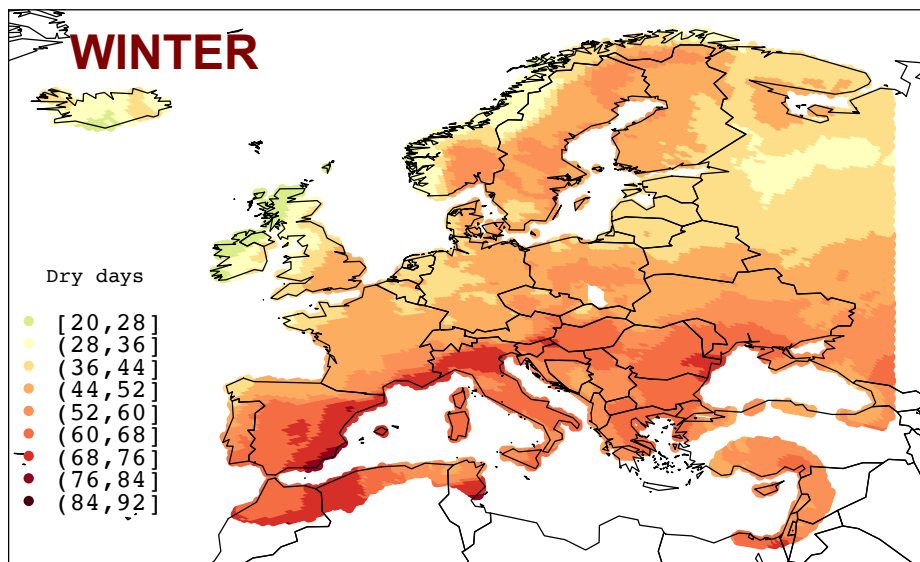


#### SD (FUTURE MULTI-MODEL MEAN CHANGE)



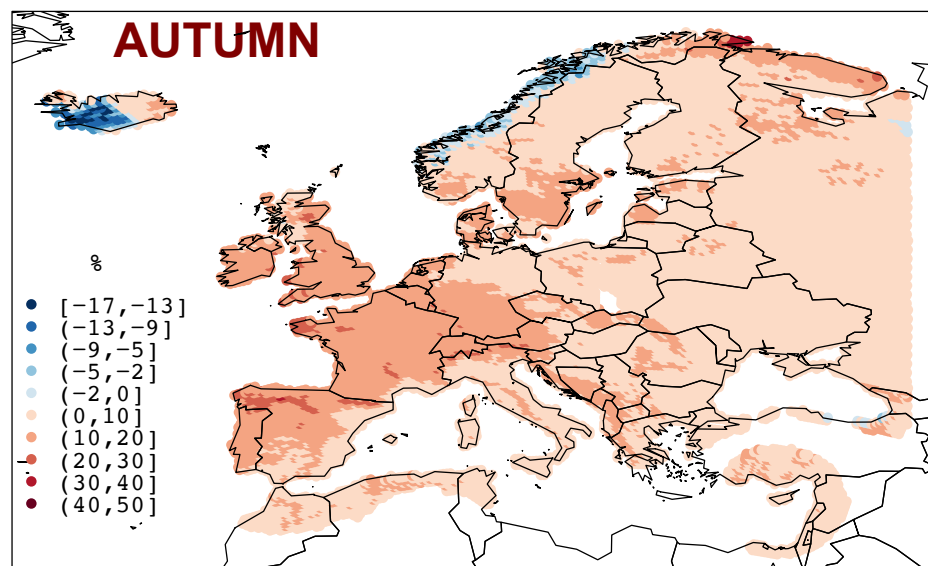
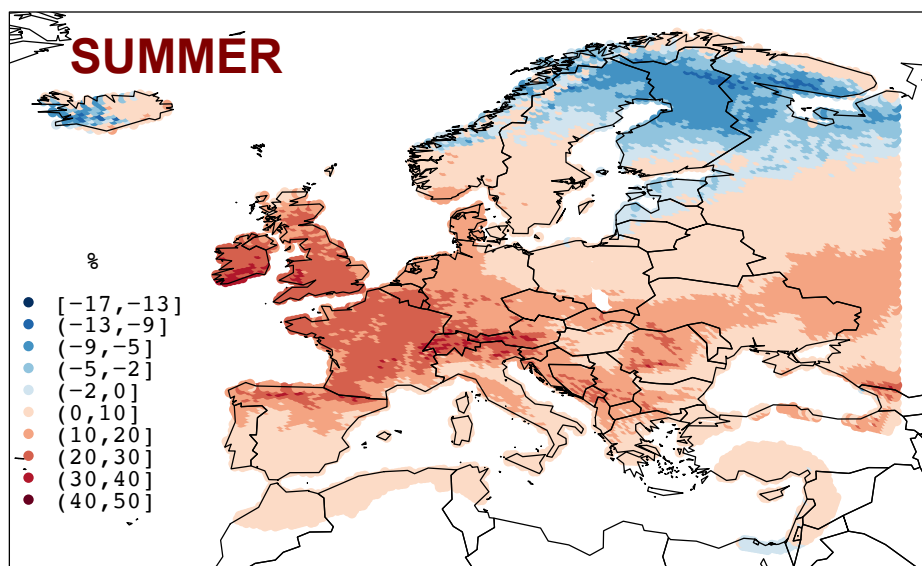
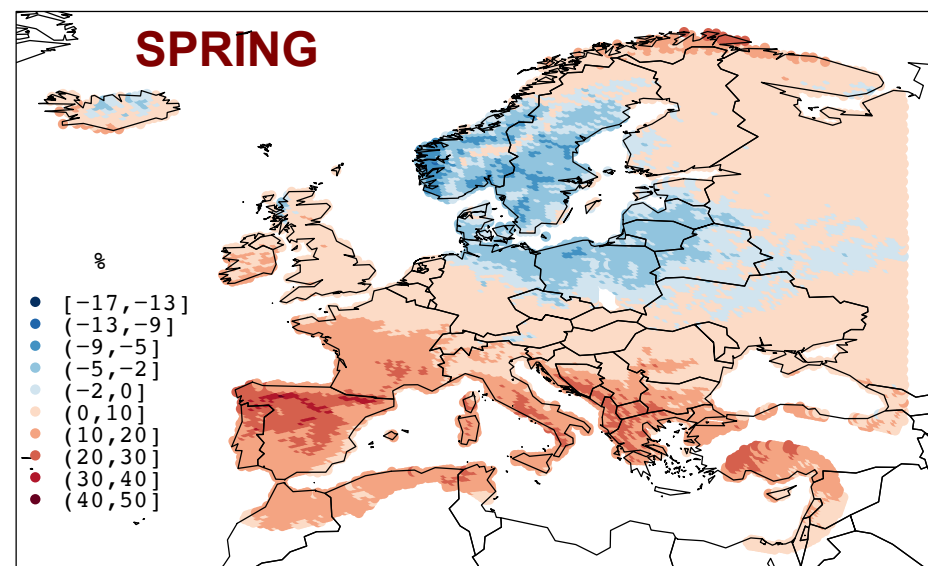
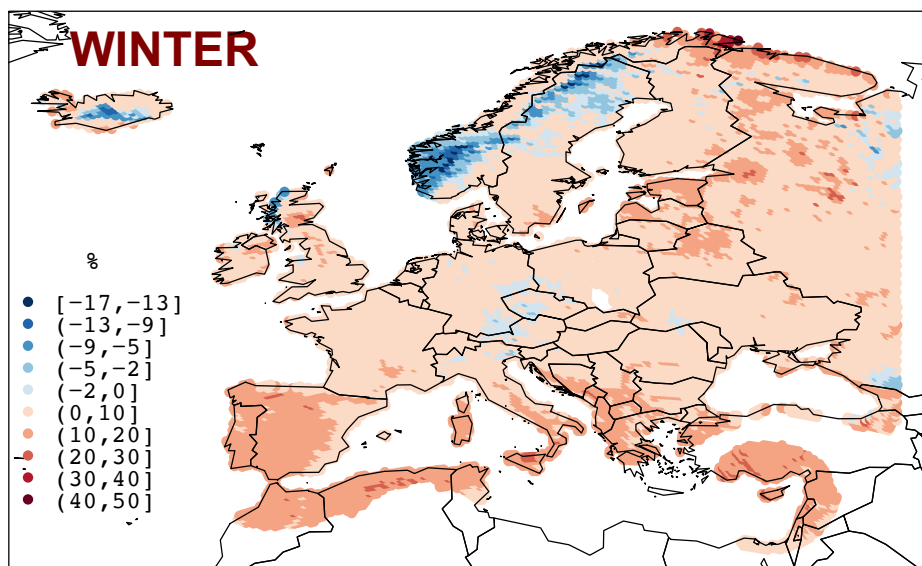
### 3.2.3 DRY DAYS.

OBSERVED



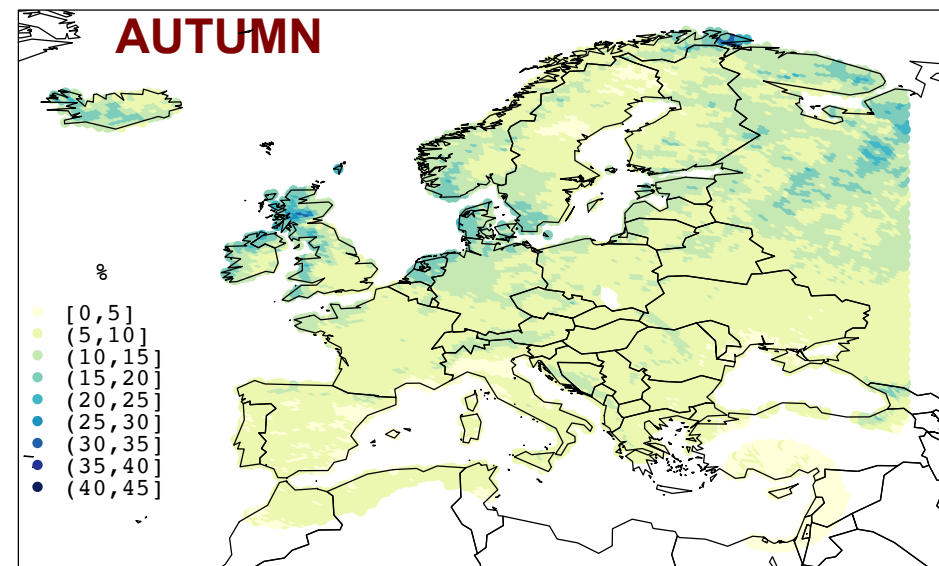
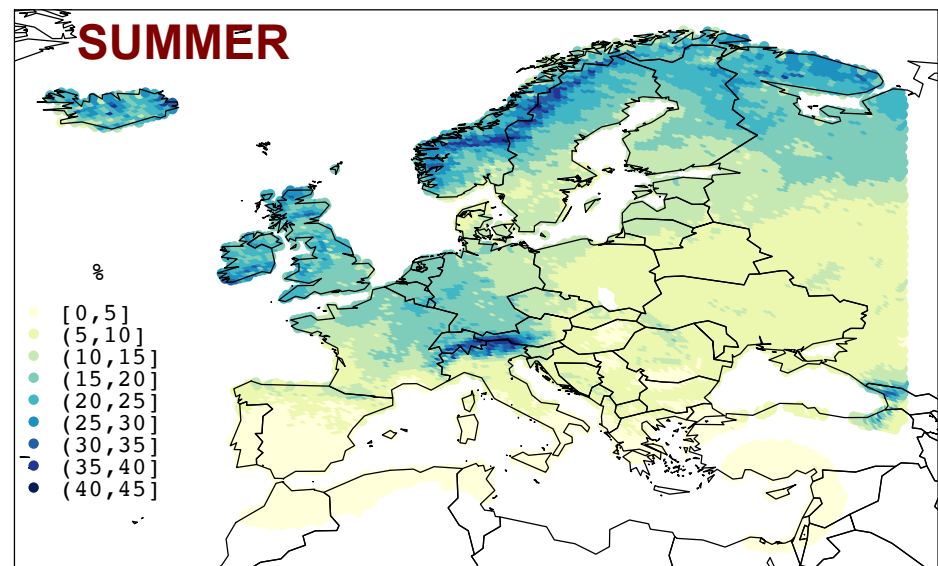
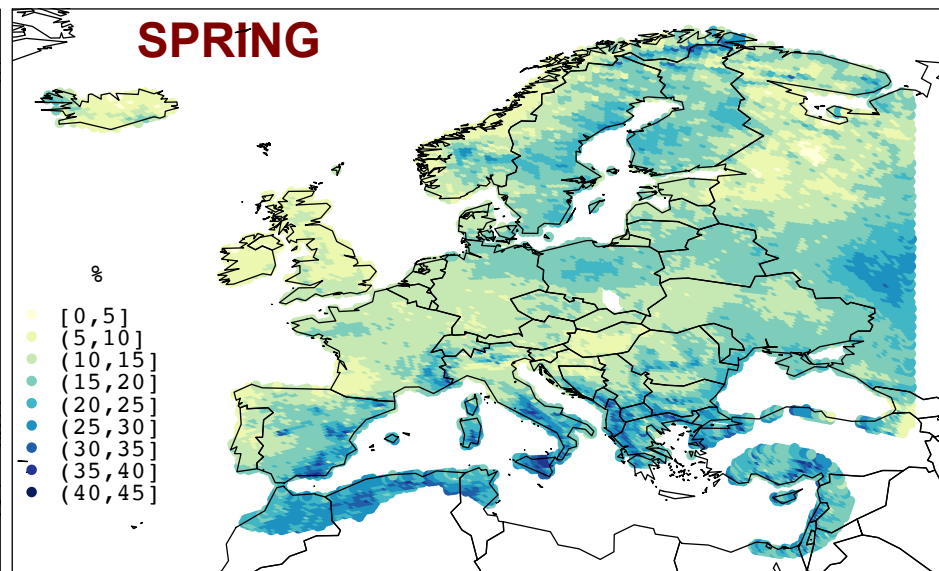
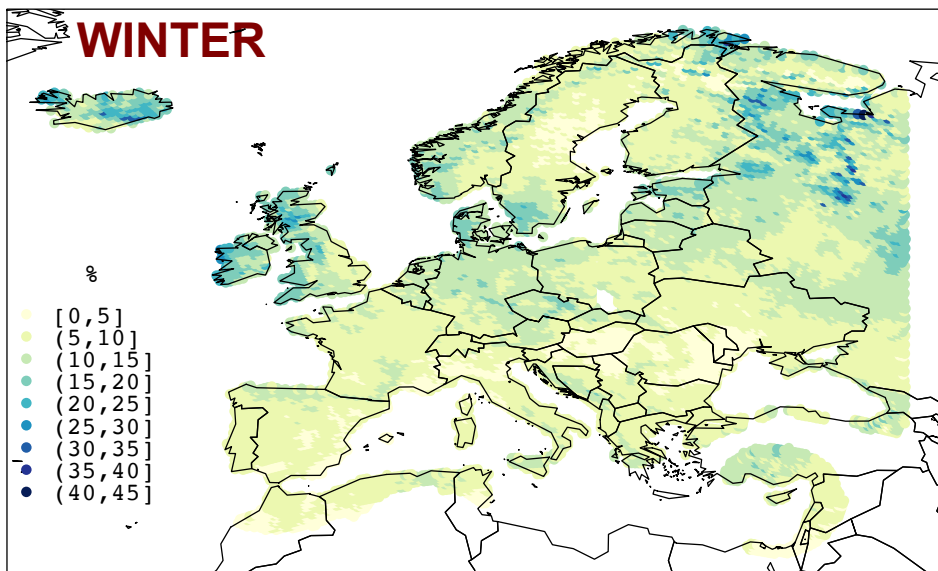
### 3.2.3 DRY DAYS.

### FUTURE MULTI-MODEL MEAN CHANGE



### 3.2.3 DRY DAYS.

### SD FUTURE MULTI-MODEL MEAN CHANGE



## 3. Results

We firstly define a **dry spell** as period of at least 3 consecutive days with daily precipitation below 0.1 mm. The 95th percentile of the length of all identified dry spells in 1981-2005 is considered to analyse extended dry spells.

### 3.2.4 Droughts

Dry spells with a length over the observed P95 of dry spell

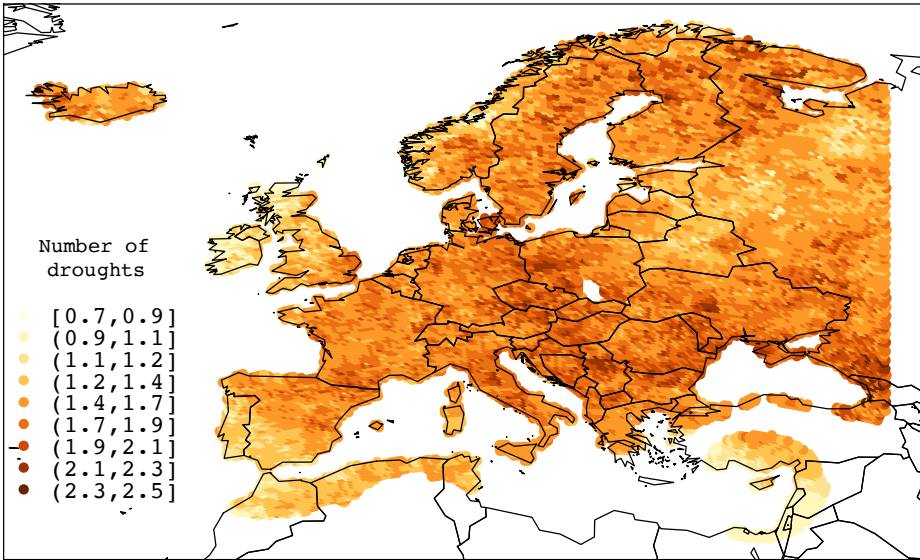
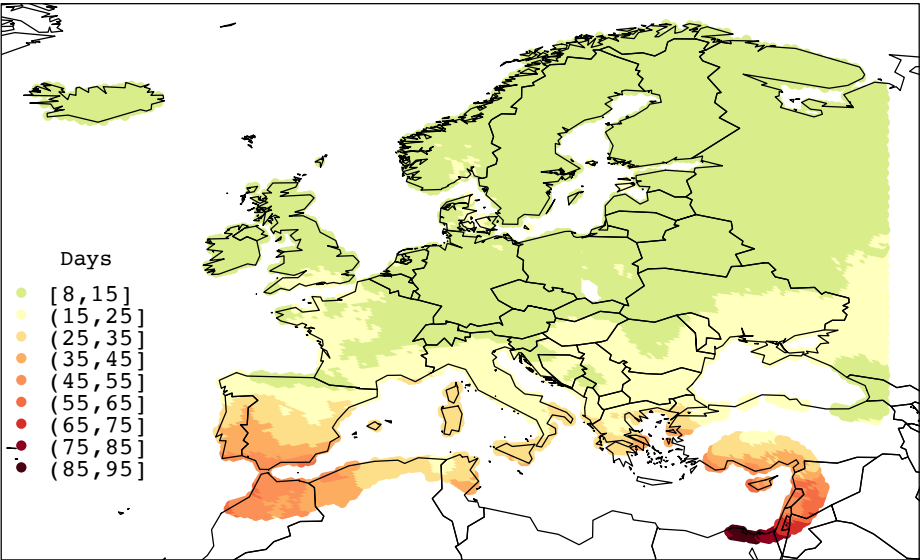
Number of droughts with a duration over P95 of observed dry spell duration

3.2.4 DROUGHTS.

ANNUAL

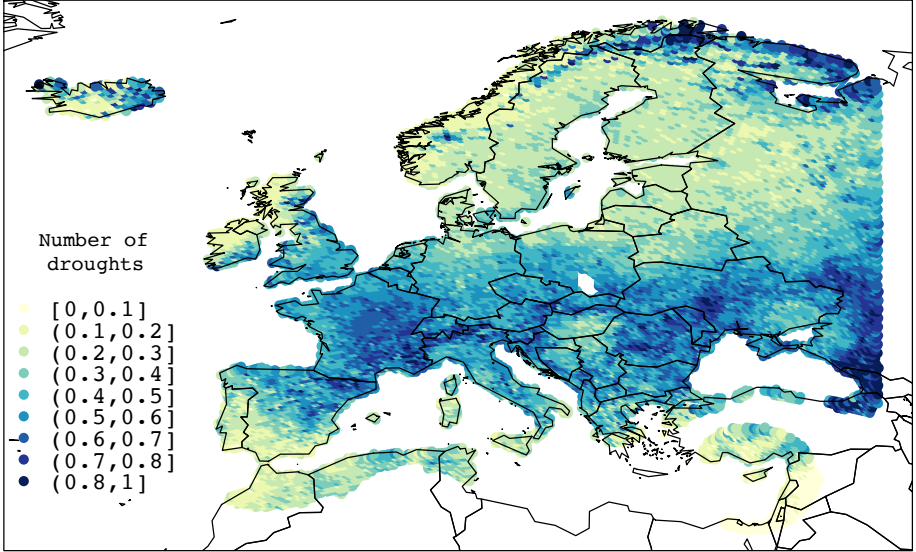
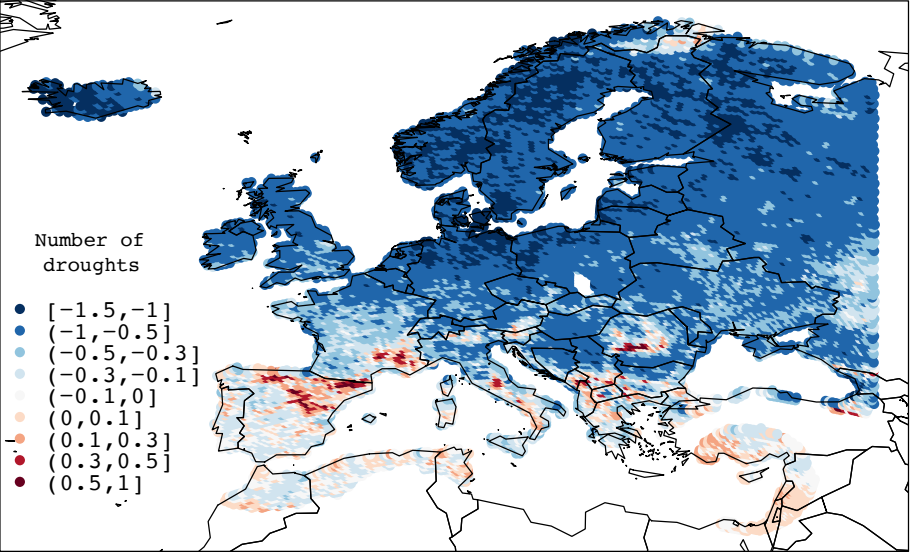
P95 OBSERVED dry spell duration

OBSERVED



FUTURE MULTI-MODEL MEAN CHANGE

SD (FUTURE MULTI-MODEL MEAN CHANGE)



# Acknowledgements:

**FPI-CAIB (FPI/1931/2016)**  
**EXTREMO CGL2014-52199-R**  
**COASTEPS CGL2017-82868-R**

(Conselleria d'Innovació, Recerca i Turisme del Govern de les Illes  
Balears and the Fons Social Europeu)

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Thank you for  
your attention!