



**Barcelona
Supercomputing
Center**
Centro Nacional de Supercomputación



The ADAMONT method for statistical adjustment of climate projections and seasonal-to-decadal predictions applicable to energy balance land surface models

D. Verfaillie^{1,2}, M. Déqué³, S. Morin¹, M. Lafaysse¹, J.-M. Soubeyroux⁴, S. Bernus⁴, V. Gouget⁴, R. Samacoits⁴, P. Lassègues⁴, P. Etchevers⁴, A.-L. Gibelin⁴, L. Batté³, C. Viel⁴, L.-P. Caron², F. J. Doblas-Reyes²

¹Météo-France – CNRS, CNRM UMR 3589, CEN, Grenoble, FR

²Barcelona Supercomputing Center, Barcelona, ES

³Météo-France – CNRS, CNRM UMR 3589, Toulouse, FR

⁴Météo-France – DCSC, Toulouse, FR

The issue

Strong societal demand about **climate change** impacts and its **adaptation/mitigation**

→ Need **multi-variable** climate projections at **sub-diurnal** time scales

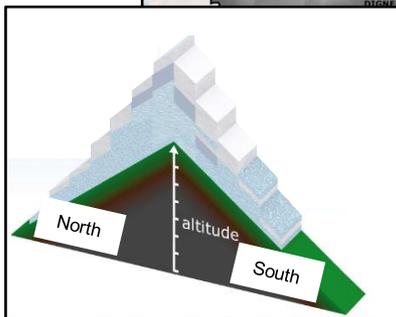
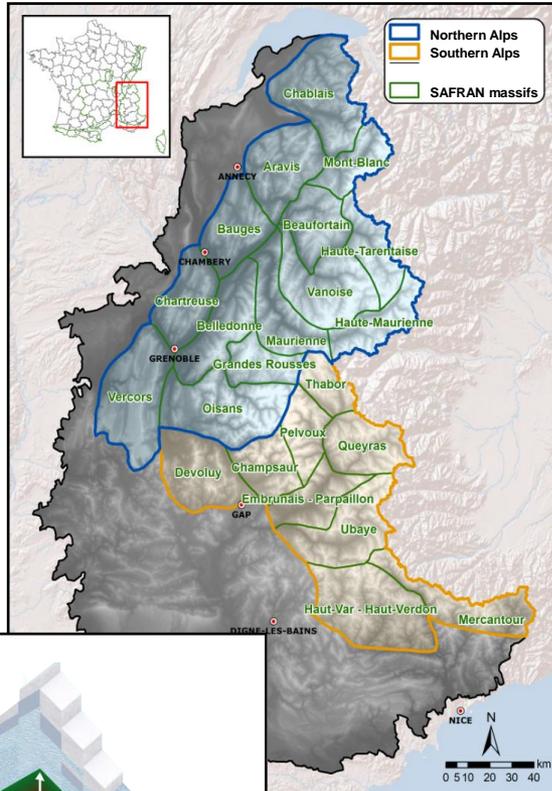
Bias-adjustment method :

- quantile mapping & weather regimes
- vs. a meteorological reanalysis (SAFRAN)
- multi-variable and hourly



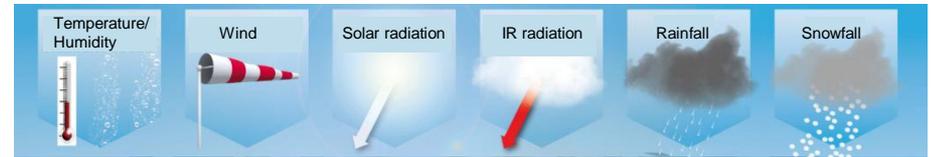
Reanalysis and snow modelling

Study sites: mountain regions

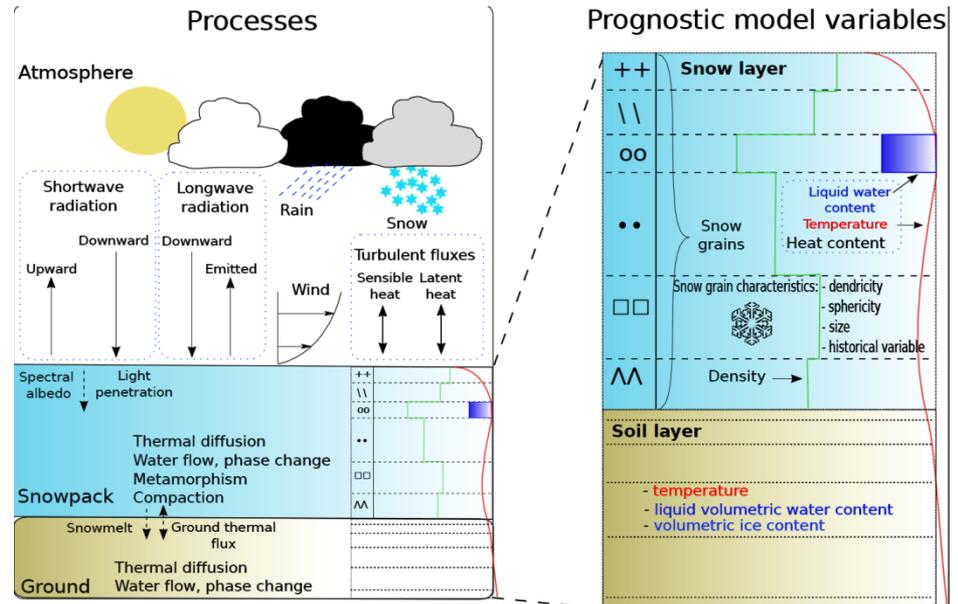


Spatial subdivision by massifs & 300 m elevation bands

Models



SAFRAN reanalysis used as « pseudo-observation »



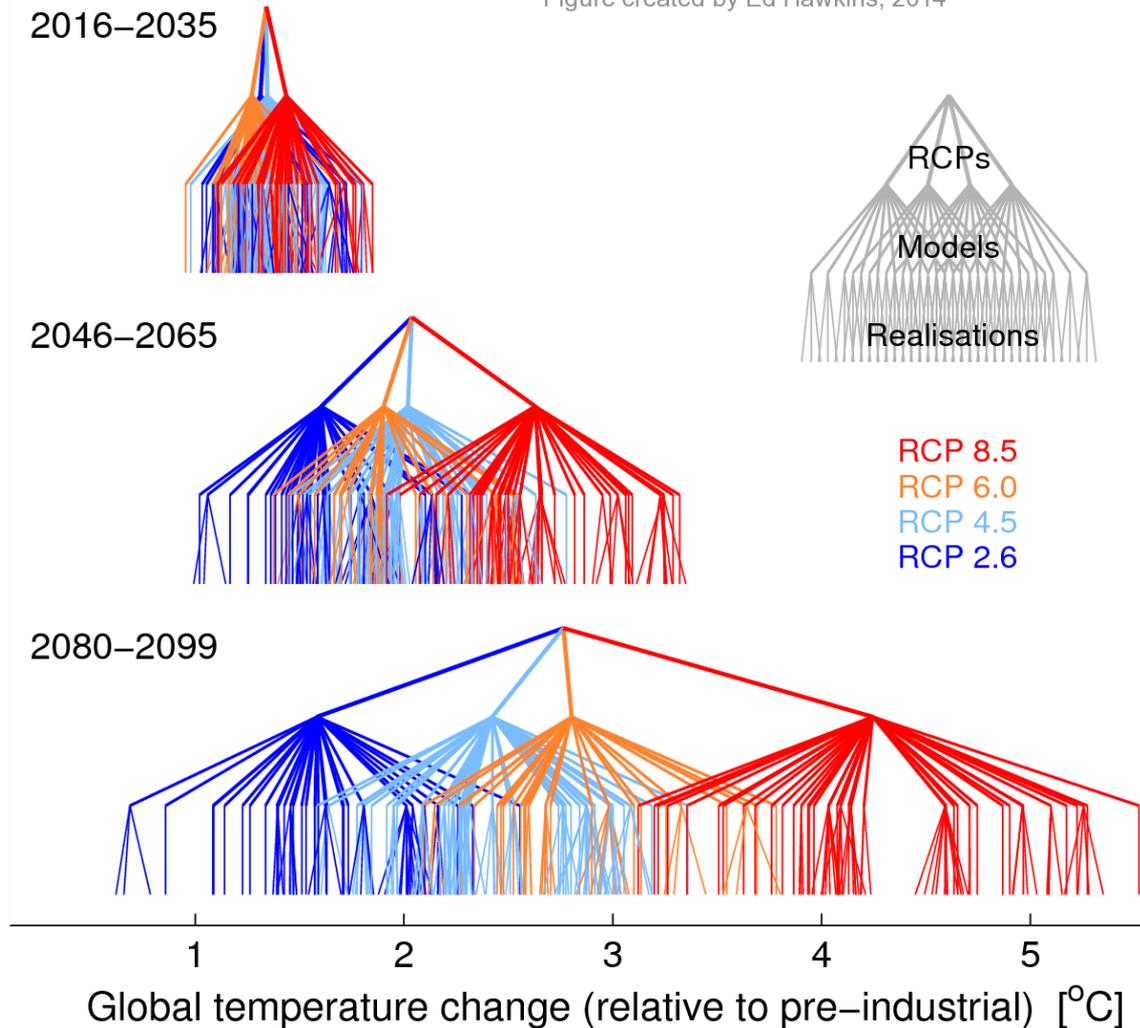
Snow model ISBA-Crocus

21st century climate projections

- Global warming, what are the **local impacts** ?
- Need to account for various greenhouse emission/concentrations pathways (**RCPs**)
- Absolute need to use an **ensemble framework**, to properly address **uncertainty** components.

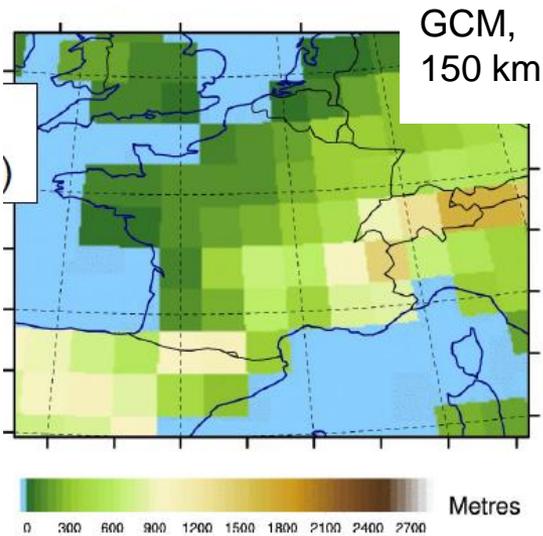
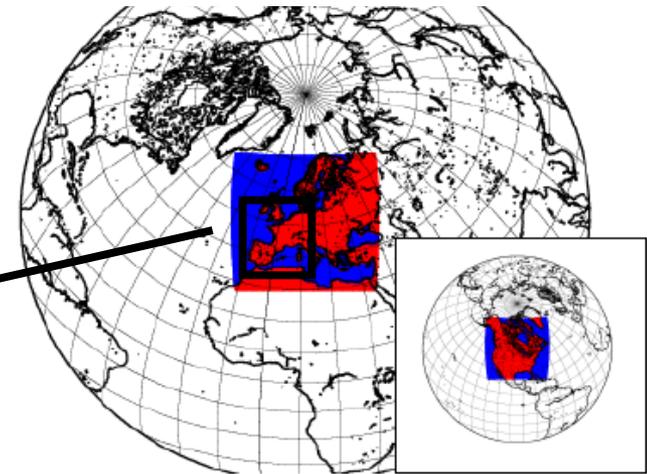
Cascade of Uncertainty in CMIP5

Figure created by Ed Hawkins, 2014

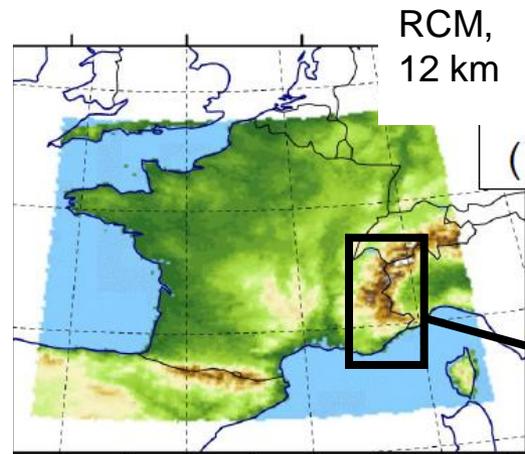


21st century climate projections

Chain of models making it possible to adjust and exploit climate projections from the global to regional to local/mountain scale

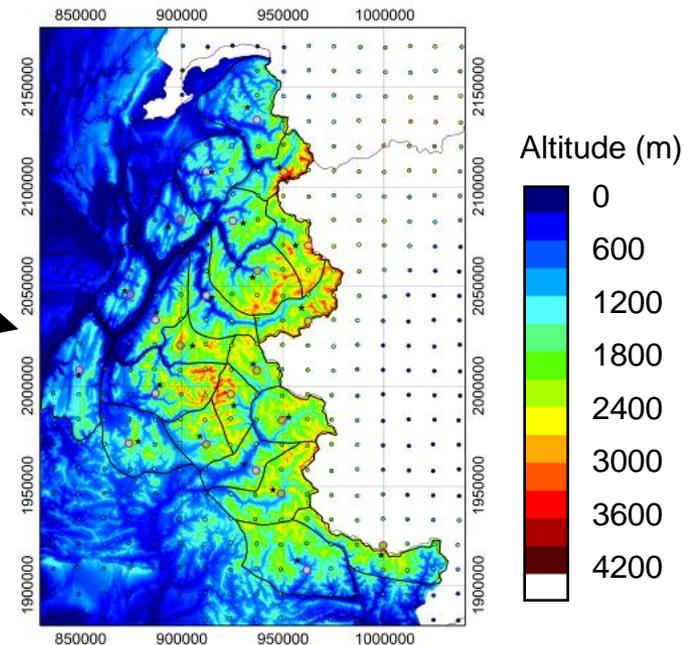


EUROCORDEX



Regional climate
model (RCM)

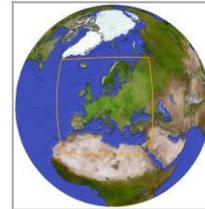
Statistical
adjustment
ADAMONT



The ADAMONT method

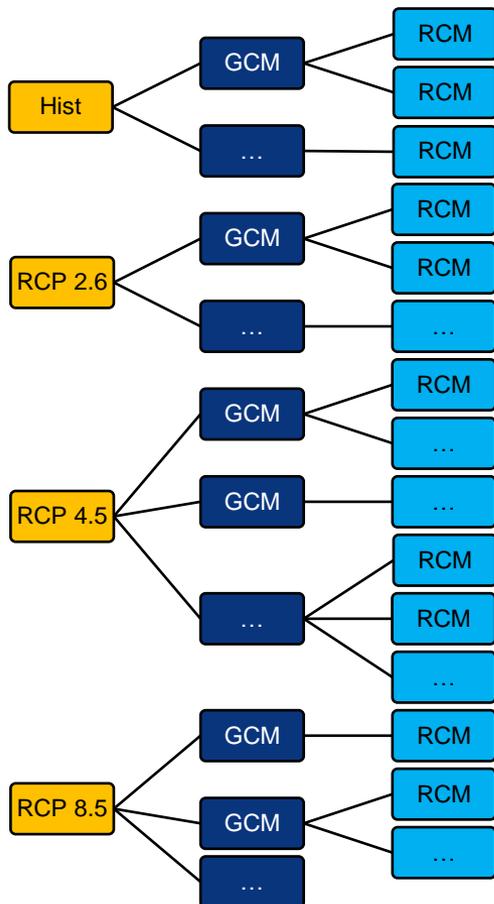
Forcing/
Scenarios

EUROCORDEX
simulations



12,5 km
resolution

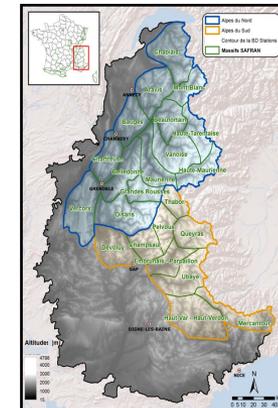
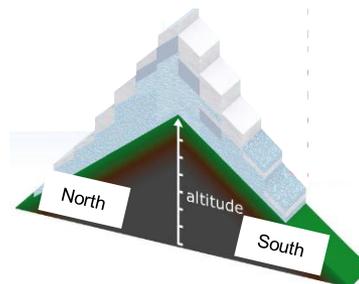
WCRP
CORDEX



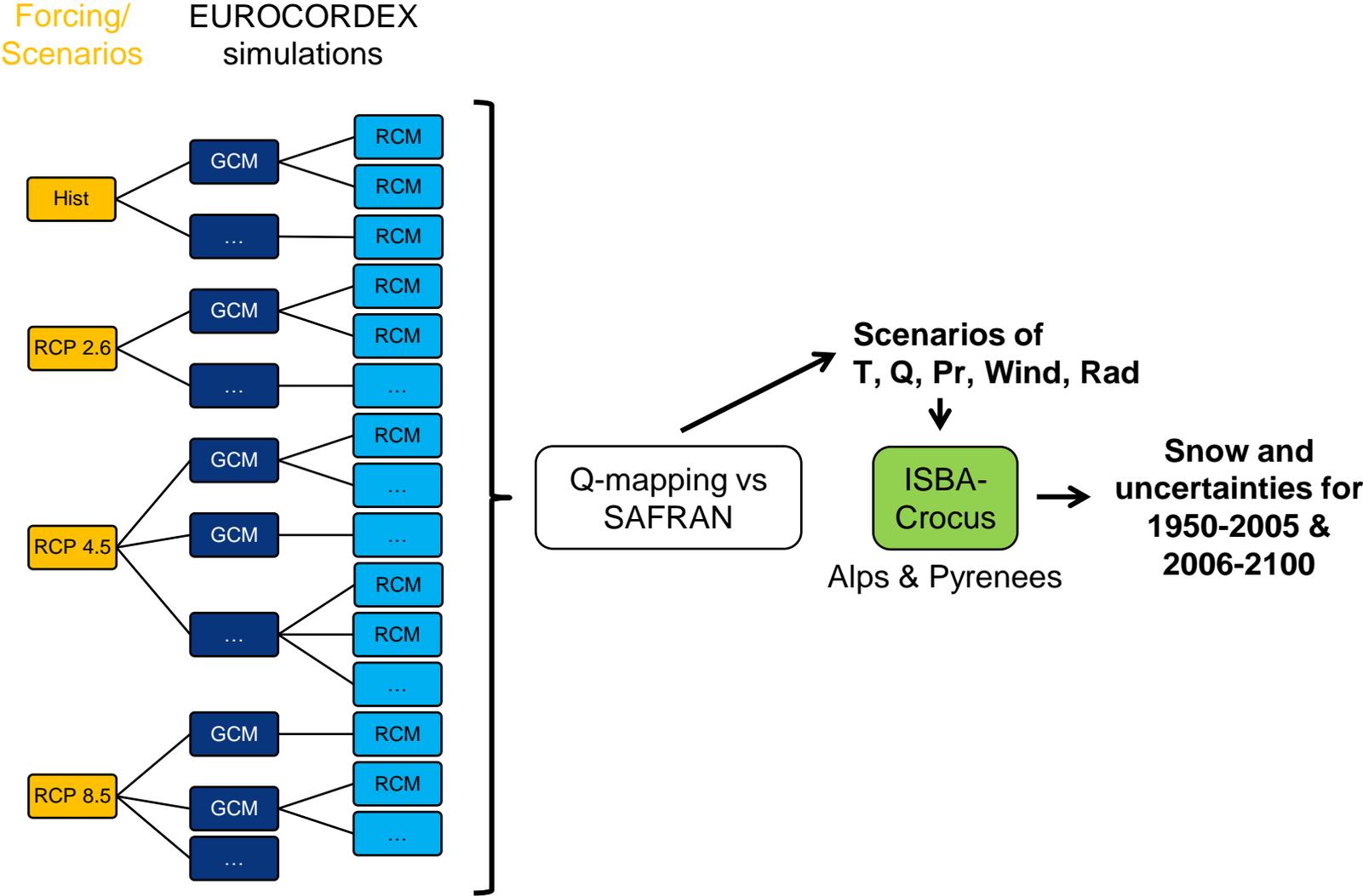
Q-mapping vs
SAFRAN

Scenarios of
T, Q, Pr, Wind, Rad

*Spatial subdivision by massifs
& 300 m elevation bands*

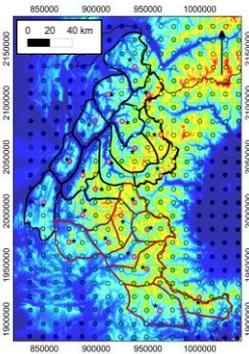


The ADAMONT method

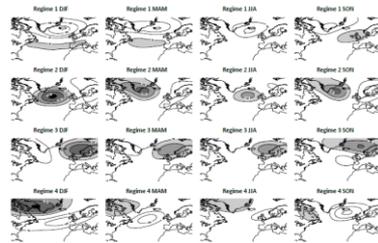


The ADAMONT method

1. Neighbouring RCM grid points

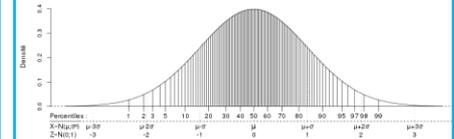


2. RCM & ERA-Interim regimes

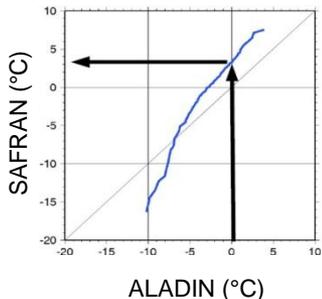


3. SAFRAN :
1h → daily

4. Percentiles of historical RCM & SAFRAN (variable, season, regime)



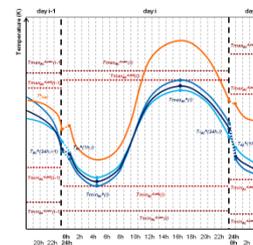
5. Quantile mapping (variable, season, regime)



6. SAFRAN analogous days, criteria:

- same month
- same regime
- coherent Pr.
- consecutive days (when possible)

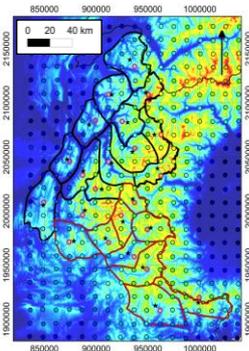
7. Adjusted RCM :
daily → 1h
(shape from SAFRAN analogues)



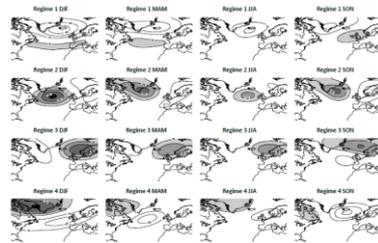
8. Total precipitation separation into rain and snow (1°C threshold) + additional quantile mapping of rain and snow separately

The ADAMONT method

1. Neighbouring RCM grid points

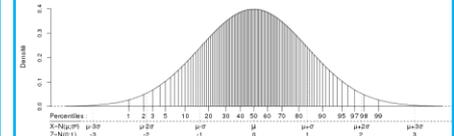


2. RCM & ERA-Interim regimes

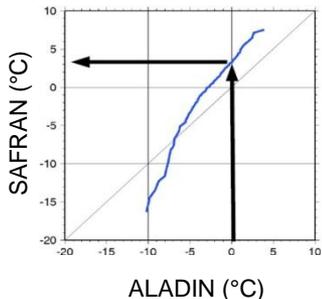


3. SAFRAN : 1h → daily

4. Percentiles of historical RCM & SAFRAN (variable, season, regime)



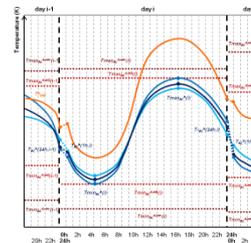
5. Quantile mapping (variable, season, regime)



6. SAFRAN analogous days, criteria:

- same month
- same regime
- coherent Pr.
- consecutive days (when possible)

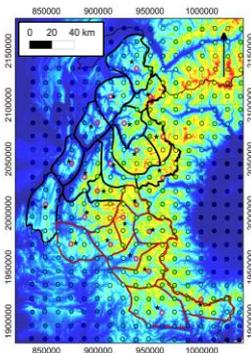
7. Adjusted RCM : daily → 1h (shape from SAFRAN analogues)



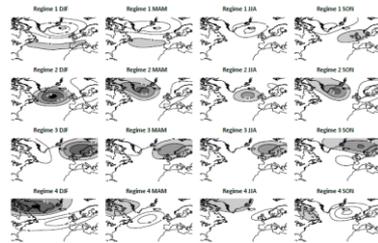
8. Total precipitation separation into rain and snow (1°C threshold) + additional quantile mapping of rain and snow separately

The ADAMONT method

1. Neighbouring RCM grid points

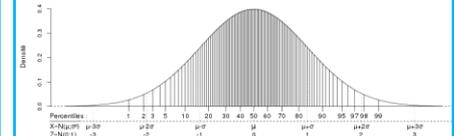


2. RCM & ERA-Interim regimes

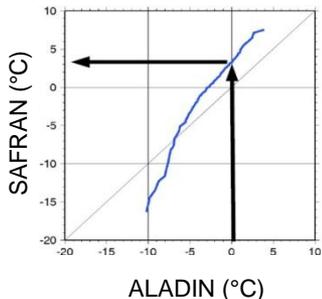


3. SAFRAN : 1h → daily

4. Percentiles of historical RCM & SAFRAN (variable, season, regime)



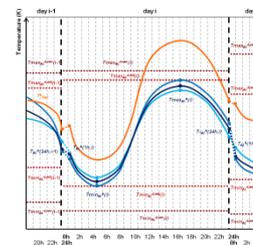
5. Quantile mapping (variable, season, regime)



6. SAFRAN analogous days, criteria:

- same month
- same regime
- coherent Pr.
- consecutive days (when possible)

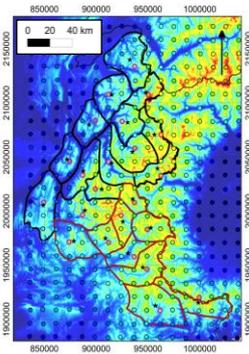
7. Adjusted RCM : daily → 1h (shape from SAFRAN analogues)



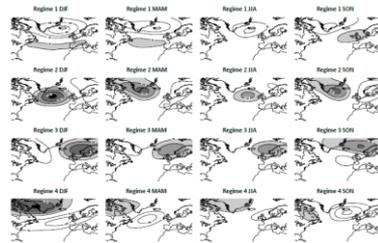
8. Total precipitation separation into rain and snow (1°C threshold) + additional quantile mapping of rain and snow separately

The ADAMONT method

1. Neighbouring RCM grid points

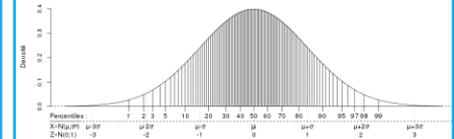


2. RCM & ERA-Interim regimes

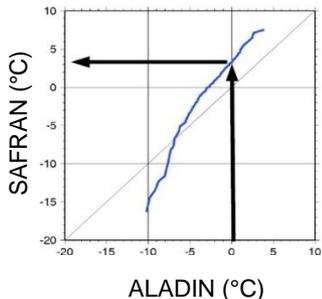


3. SAFRAN : 1h → daily

4. Percentiles of historical RCM & SAFRAN (variable, season, regime)



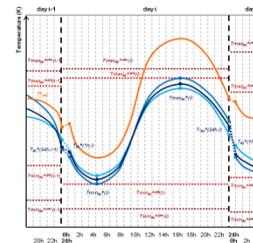
5. Quantile mapping (variable, season, regime)



6. SAFRAN analogous days, criteria:

- same month
- same regime
- coherent Pr.
- consecutive days (when possible)

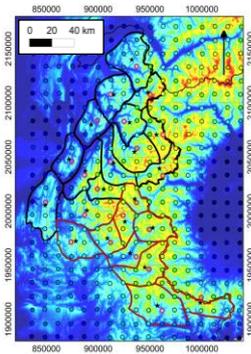
7. Adjusted RCM : daily → 1h (shape from SAFRAN analogues)



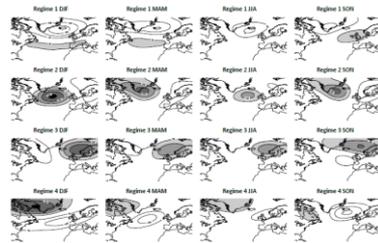
8. Total precipitation separation into rain and snow (1°C threshold) + additional quantile mapping of rain and snow separately

The ADAMONT method

1. Neighbouring RCM grid points

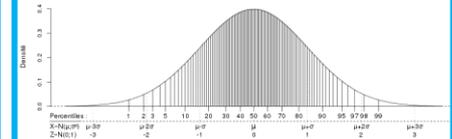


2. RCM & ERA-Interim regimes

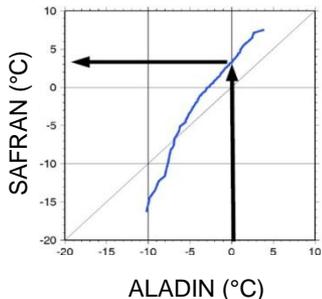


3. SAFRAN : 1h → daily

4. Percentiles of historical RCM & SAFRAN (variable, season, regime)



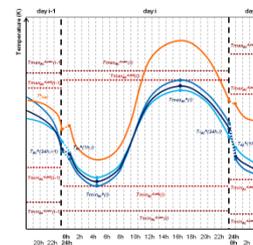
5. Quantile mapping (variable, season, regime)



6. SAFRAN analogous days, criteria:

- same month
- same regime
- coherent Pr.
- consecutive days (when possible)

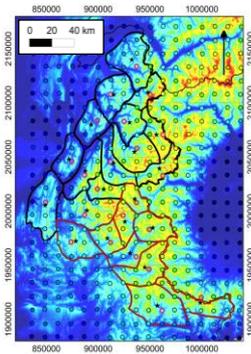
7. Adjusted RCM : daily → 1h (shape from SAFRAN analogues)



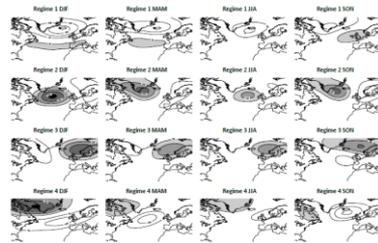
8. Total precipitation separation into rain and snow (1°C threshold) + additional quantile mapping of rain and snow separately

The ADAMONT method

1. Neighbouring RCM grid points

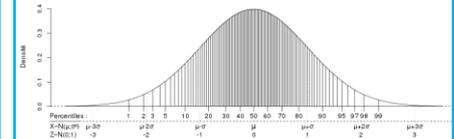


2. RCM & ERA-Interim regimes

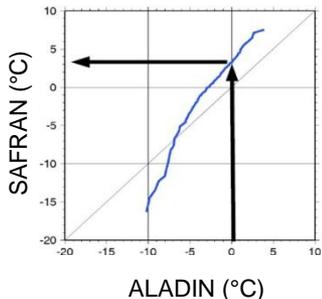


3. SAFRAN : 1h → daily

4. Percentiles of historical RCM & SAFRAN (variable, season, regime)



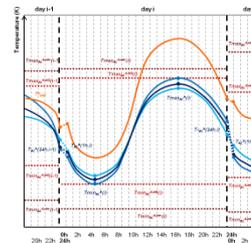
5. Quantile mapping (variable, season, regime)



6. SAFRAN analogous days, criteria:

- same month
- same regime
- coherent Pr.
- consecutive days (when possible)

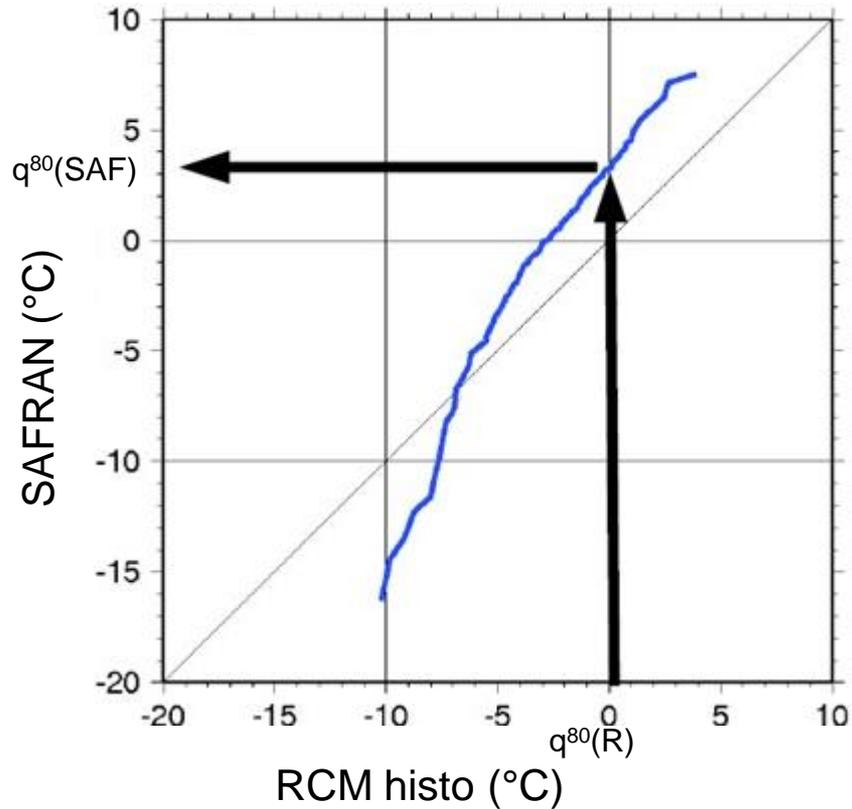
7. Adjusted RCM : daily → 1h (shape from SAFRAN analogues)



8. Total precipitation separation into rain and snow (1°C threshold) + additional quantile mapping of rain and snow separately

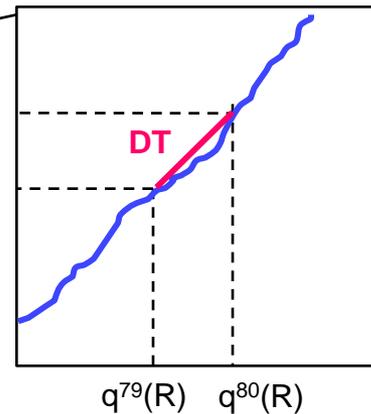
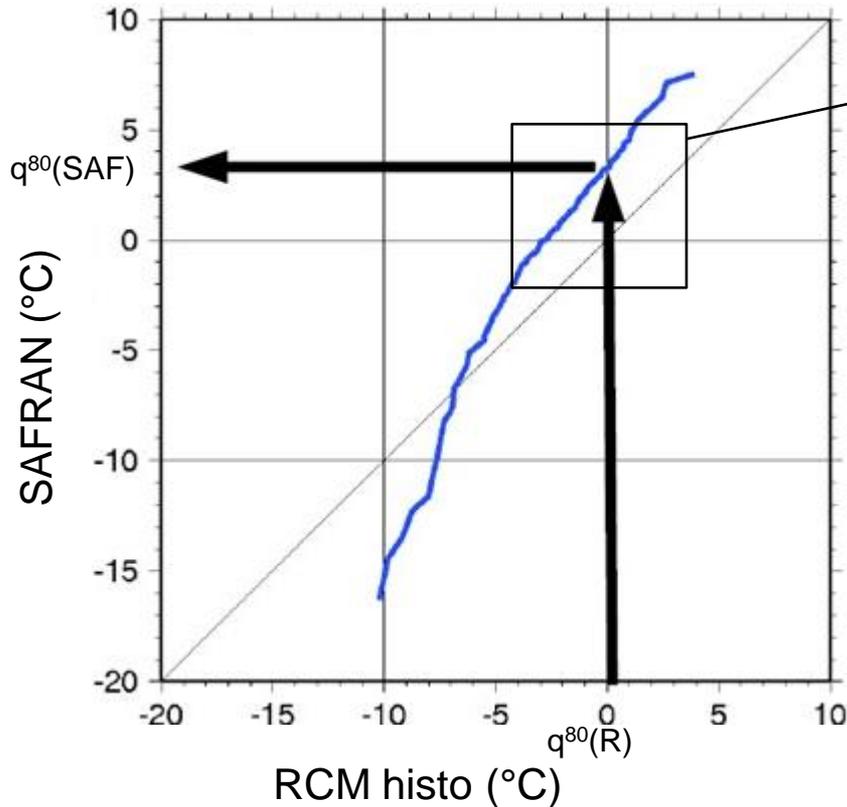
The ADAMONT method

Quantile-quantile historical SAFRAN/RCM diagrams



The ADAMONT method

Adjustment of RCM values (histo + scenarios) vs. SAFRAN



Adjustment :

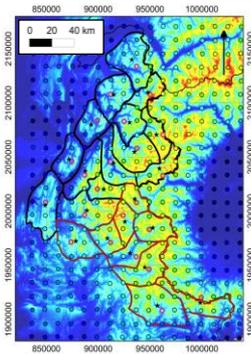
For a value $z(\text{R})$,

As soon as $q^x(\text{R}) \geq z(\text{R})$:

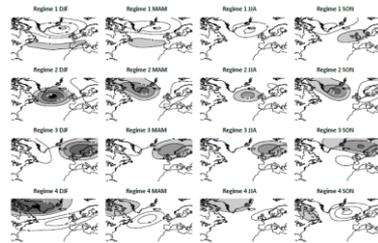
$$z(\text{R})_{\text{corr}} = q^{x-1}(\text{SAF}) + (z(\text{R}) - q^{x-1}(\text{R})) \times \text{DT}^x$$

The ADAMONT method

1. Neighbouring RCM grid points

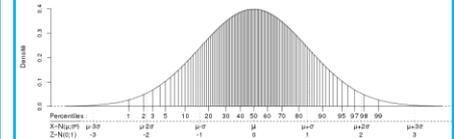


2. RCM & ERA-Interim regimes

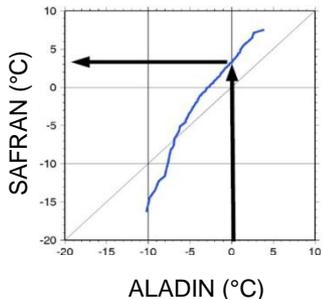


3. SAFRAN :
1h → daily

4. Percentiles of historical RCM & SAFRAN (variable, season, regime)



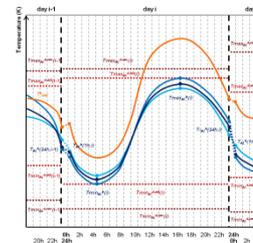
5. Quantile mapping (variable, season, regime)



6. SAFRAN analogous days, criteria:

- same month
- same regime
- coherent Pr.
- consecutive days (when possible)

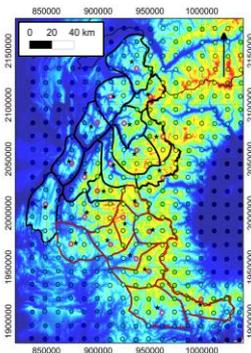
7. Adjusted RCM :
daily → 1h
(shape from SAFRAN analogues)



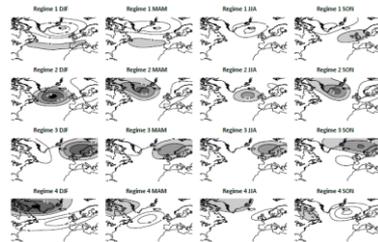
8. Total precipitation separation into rain and snow (1°C threshold) + additional quantile mapping of rain and snow separately

The ADAMONT method

1. Neighbouring RCM grid points

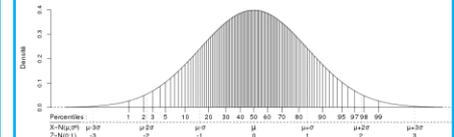


2. RCM & ERA-Interim regimes

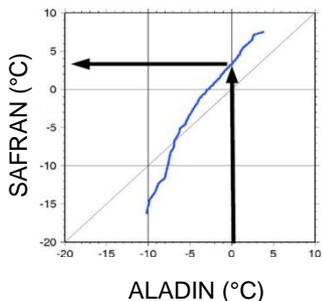


3. SAFRAN : 1h → daily

4. Percentiles of historical RCM & SAFRAN (variable, season, regime)



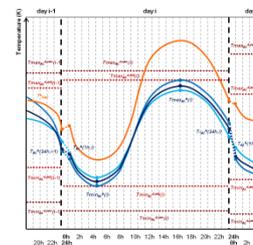
5. Quantile mapping (variable, season, regime)



6. SAFRAN analogous days, criteria:

- same month
- same regime
- coherent Pr.
- consecutive days (when possible)

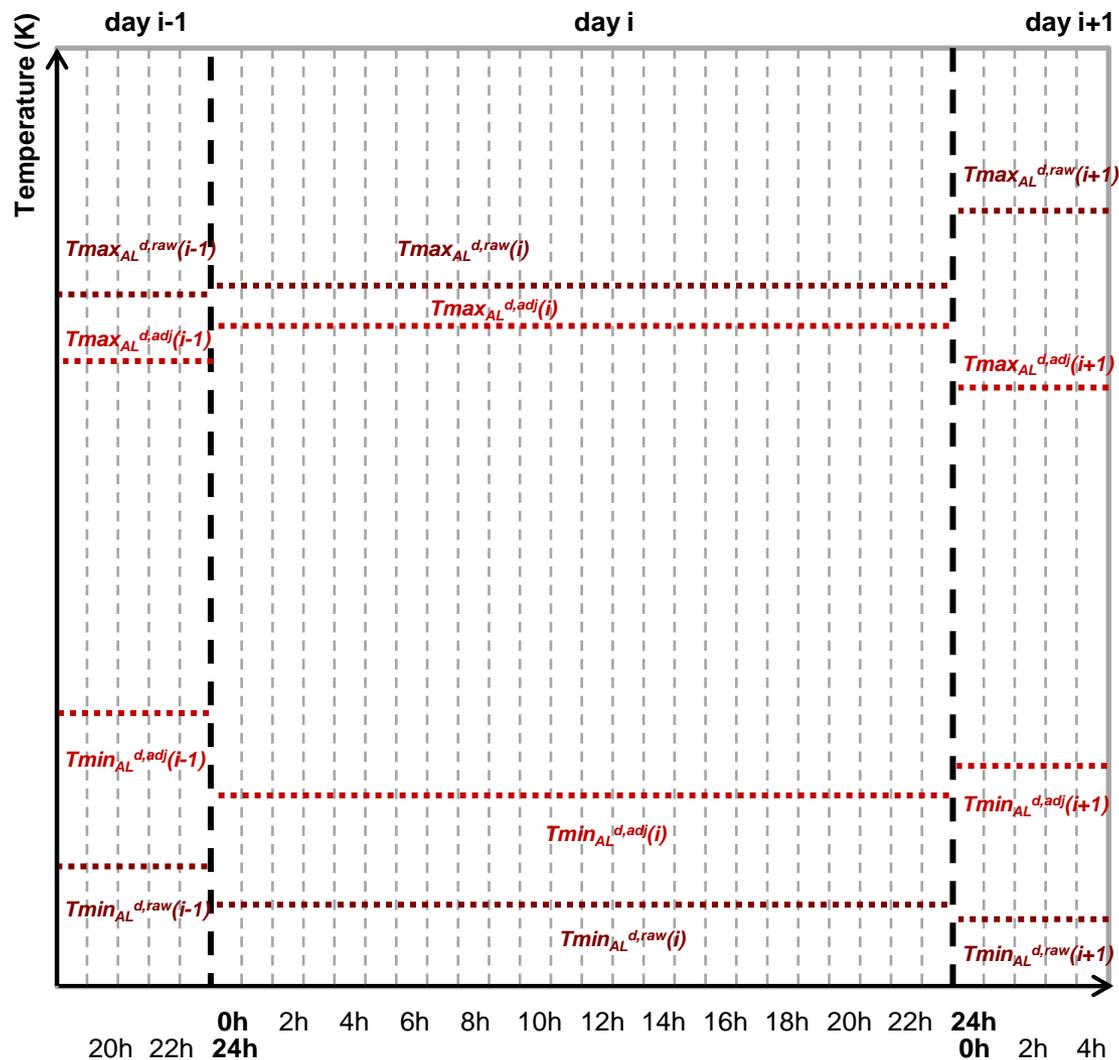
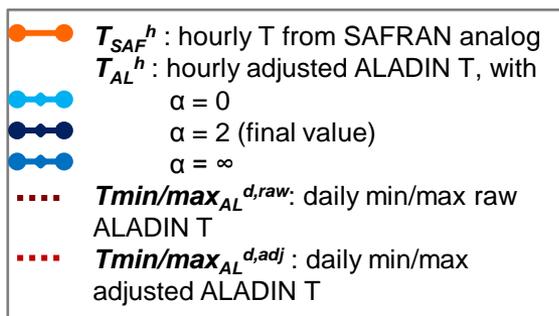
7. Adjusted RCM : daily → 1h (shape from SAFRAN analogues)



8. Total precipitation separation into rain and snow (1°C threshold) + additional quantile mapping of rain and snow separately

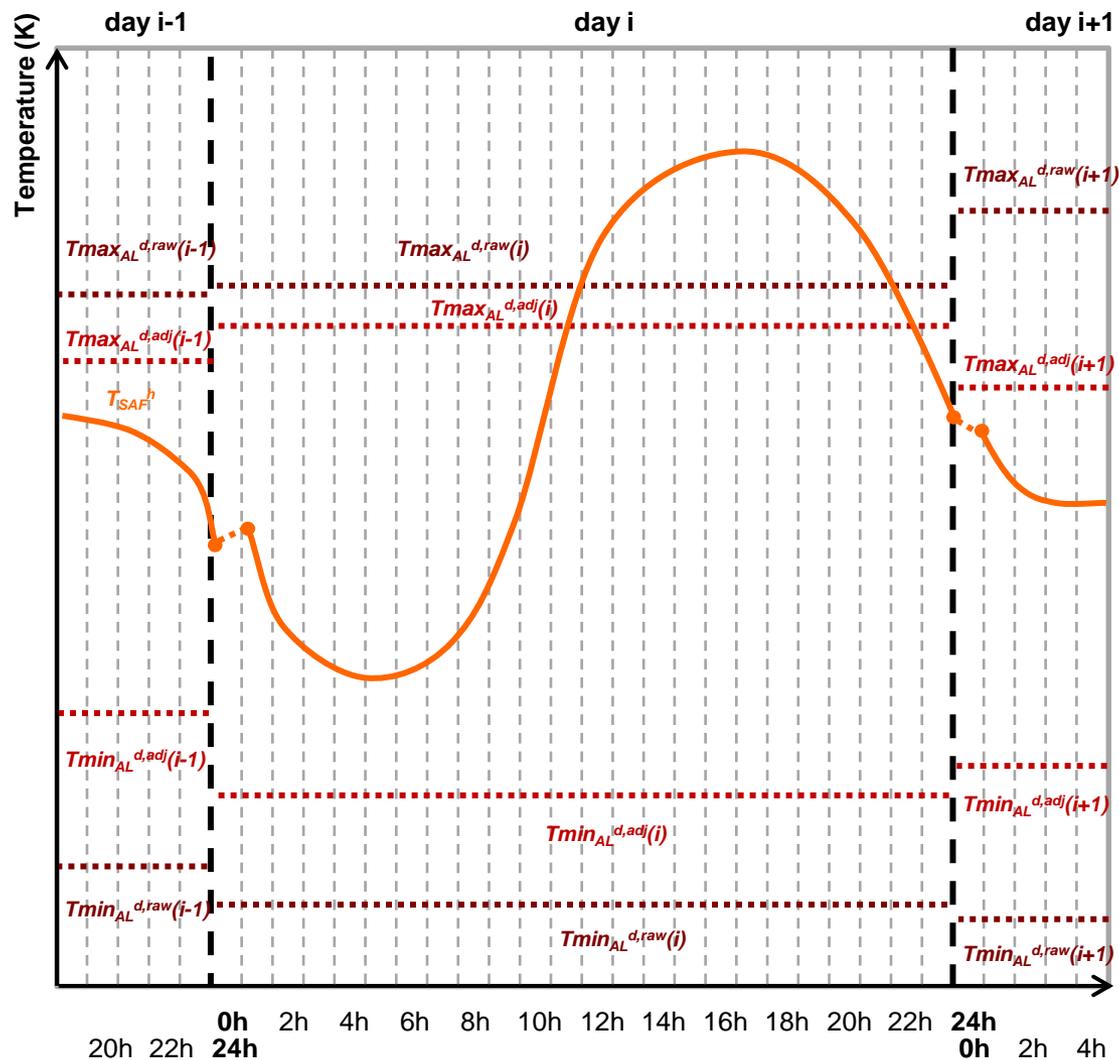
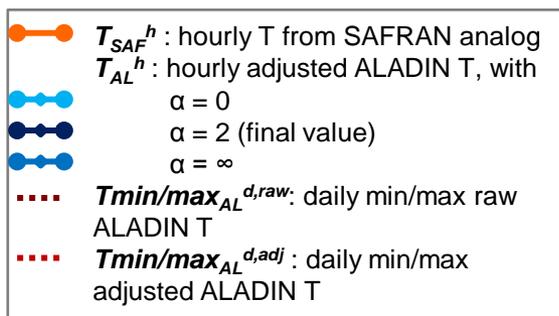
The ADAMONT method

Disaggregation of adjusted RCM from daily to hourly : temperature



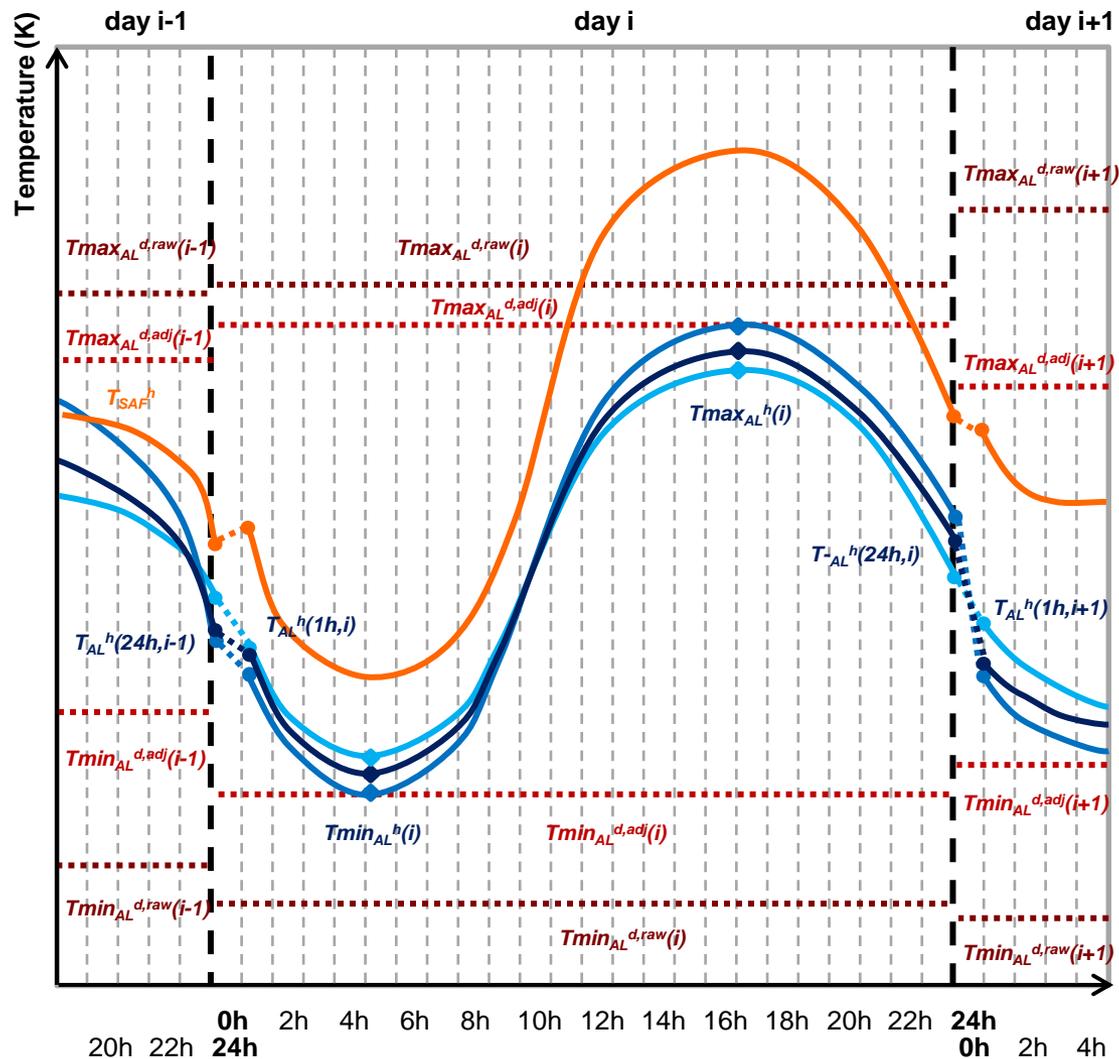
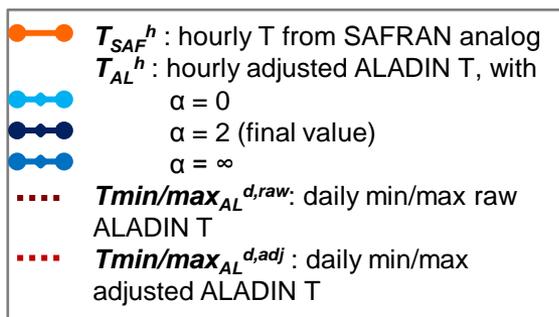
The ADAMONT method

Disaggregation of adjusted RCM from daily to hourly : temperature



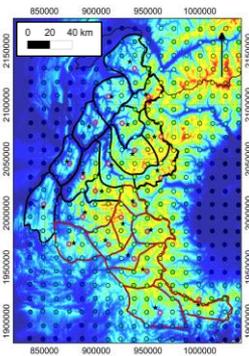
The ADAMONT method

Disaggregation of adjusted RCM from daily to hourly : temperature

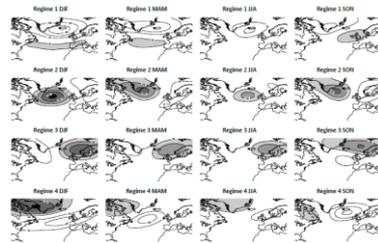


The ADAMONT method

1. Neighbouring RCM grid points

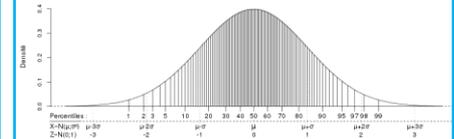


2. RCM & ERA-Interim regimes

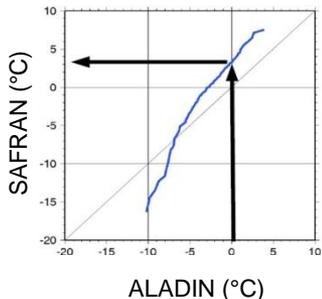


3. SAFRAN :
1h → daily

4. Percentiles of historical RCM & SAFRAN (variable, season, regime)



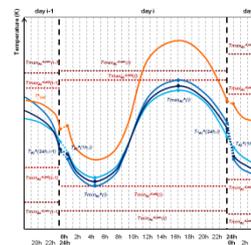
5. Quantile mapping (variable, season, regime)



6. SAFRAN analogous days, criteria:

- same month
- same regime
- coherent Pr.
- consecutive days (when possible)

7. Adjusted RCM :
daily → 1h
(shape from SAFRAN analogues)



8. Total precipitation separation into rain and snow (1°C threshold) + additional quantile mapping of rain and snow separately

The ADAMONT method

Evaluated in a recent paper:

Verfaillie, D., Déqué, M., Morin, S., and Lafaysse, M.: The method ADAMONT v1.0 for statistical adjustment of climate projections applicable to energy balance land surface models, *Geosci. Model Dev.*, 10, 4257-4283, <https://doi.org/10.5194/gmd-10-4257-2017>, 2017.

Geosci. Model Dev., 10, 4257–4283, 2017
<https://doi.org/10.5194/gmd-10-4257-2017>
© Author(s) 2017. This work is distributed under the Creative Commons Attribution 4.0 License.



Geoscientific
Model Development



The method ADAMONT v1.0 for statistical adjustment of climate projections applicable to energy balance land surface models

Deborah Verfaillie¹, Michel Déqué², Samuel Morin¹, and Matthieu Lafaysse¹

¹Météo-France – CNRS, CNRM UMR 3589, Centre d'Études de la Neige, Grenoble, France

²Météo-France – CNRS, CNRM UMR 3589, Toulouse, France

Correspondence to: Samuel Morin (samuel.morin@meteo.fr)

Received: 9 June 2017 – Discussion started: 17 July 2017

Revised: 18 September 2017 – Accepted: 18 October 2017 – Published: 24 November 2017

A few results

- **13 GCM/RCM pairs** covering RCP4.5 and RCP8.5 (4 feature RCP2.6)
- HIST: 1950-2005, RCP: 2005-2100 → 3500+ simulation years

RCM (Institute) / GCM	Period	CNRM-CM5	EC-EARTH	HadGEM2-ES	MPI-ESM-LR	IPSL-CM5A-MR
CCLM 4.8.17 (CLMcom)	HIST	1950–2005	1950–2005	1981–2005	1950–2005	
	RCPs	2006–2100	2006–2100	2006–2099	2006–2100	
ALADIN 53 (CNRM)	HIST	1950–2005				
	RCPs	2006–2100				
WRF 3.3.1F (IPSL-INERIS)	HIST					1951–2005
	RCPs					2006–2100
RACMO 2.2E (KNMI)	HIST			1981–2005		
	RCPs			2006–2099		
REMO 2009 (MPI-CSC)	HIST				1950–2005	
	RCPs				2006–2100	
RCA 4 (SMHI)	HIST	1970–2005	1970–2005	1981–2005	1970–2005	1970–2005
	RCPs	2006–2100	2006–2100	2006–2099	2006–2100	2006–2100

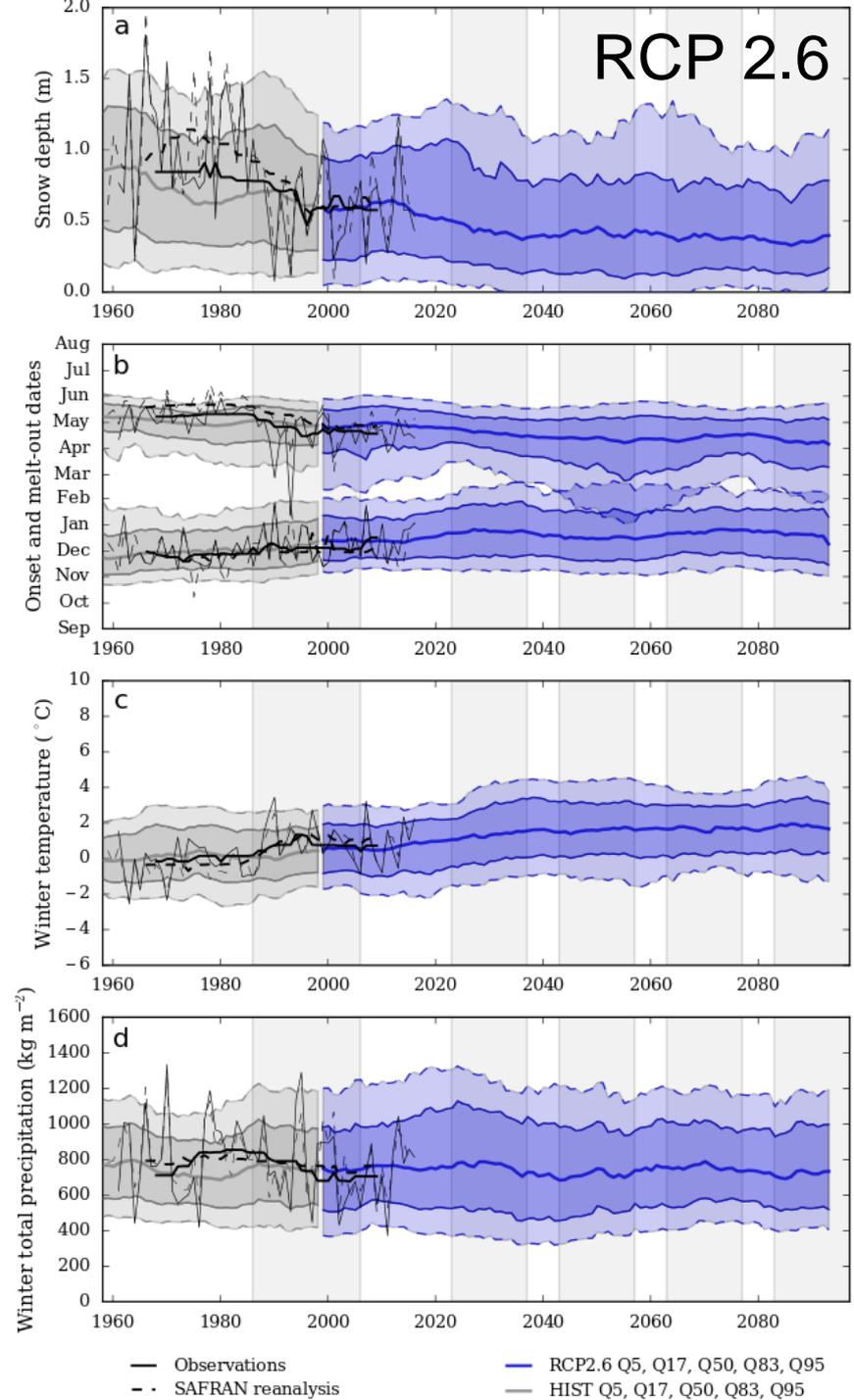
- Use of **ISBA-Crocus** model to compute snow conditions
- Definition of annual scale **indicators** characterising atmospheric and snow conditions (mean, days above threshold etc.)
- Statistical framework to handle multi-scenario multi-annual multi-GCM/RCM pairs (+ multiphysics Crocus version, not shown here)

A few results

Climate projections for natural snow on the ground

- Sustained interannual variability
- Increased snow scarcity
- RCP differentiation after 2020

Verfaillie, D., Lafaysse, M., Déqué, M., Eckert, N., Lejeune, Y., and Morin, S.: Multi-component ensembles of future meteorological and natural snow conditions for 1500 m altitude in the Chartreuse mountain range, Northern French Alps, *The Cryosphere*, 12, 1249-1271, <https://doi.org/10.5194/tc-12-1249-2018>, 2018.

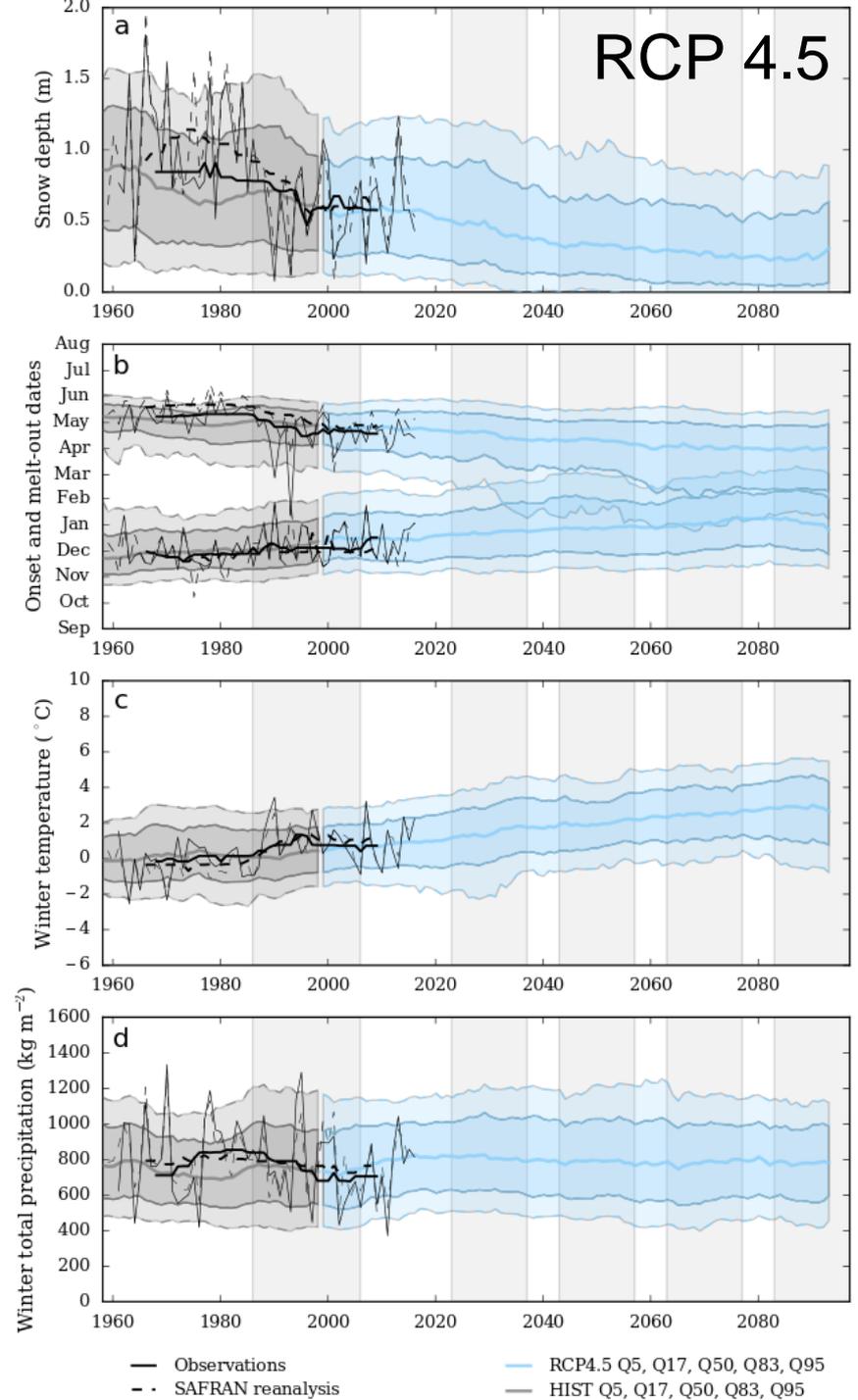


A few results

Climate projections for natural snow on the ground

- Sustained interannual variability
- Increased snow scarcity
- RCP differentiation after 2020

Verfaillie, D., Lafaysse, M., Déqué, M., Eckert, N., Lejeune, Y., and Morin, S.: Multi-component ensembles of future meteorological and natural snow conditions for 1500 m altitude in the Chartreuse mountain range, Northern French Alps, *The Cryosphere*, 12, 1249-1271, <https://doi.org/10.5194/tc-12-1249-2018>, 2018.

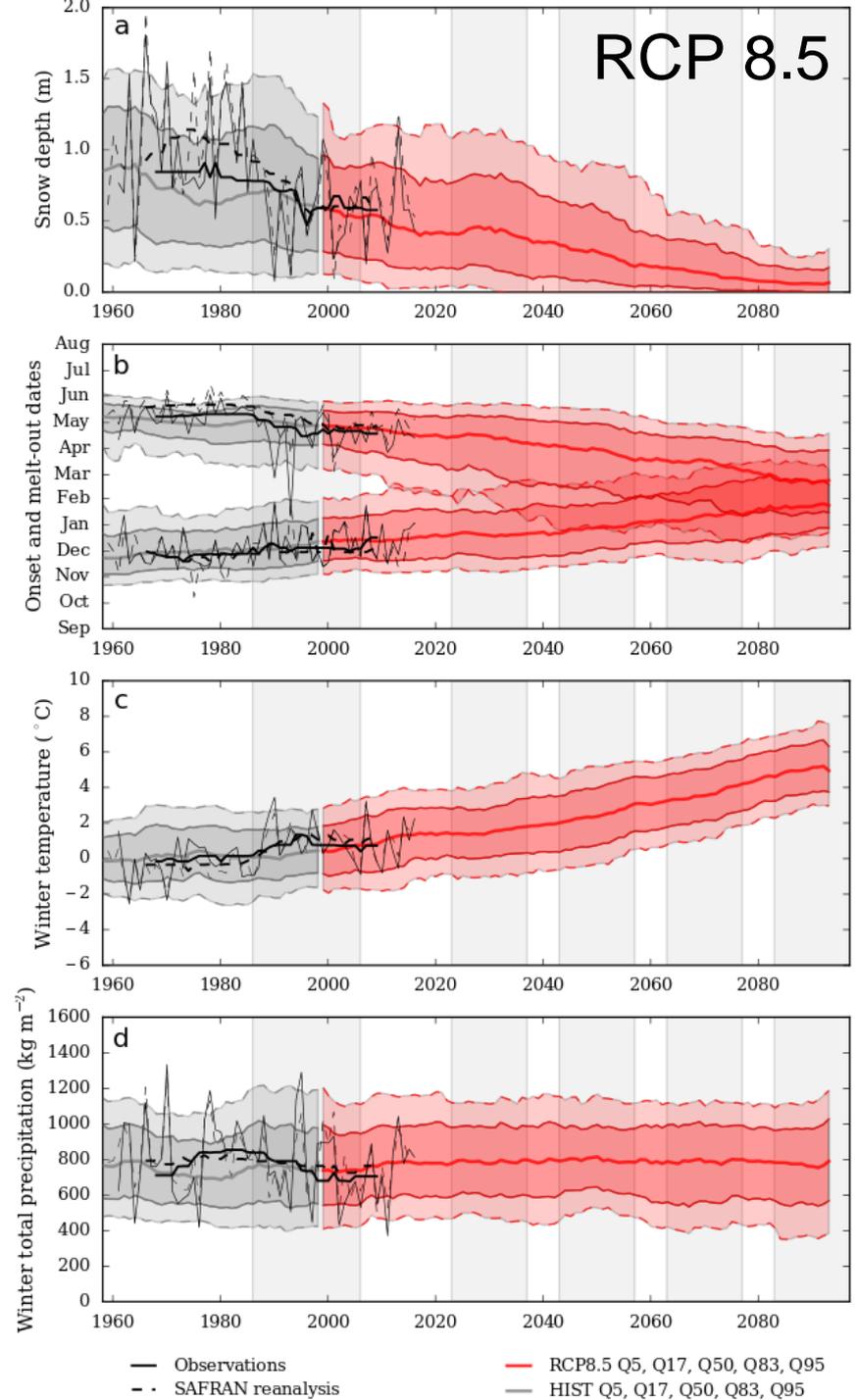


A few results

Climate projections for natural snow on the ground

- Sustained interannual variability
- Increased snow scarcity
- RCP differentiation after 2020

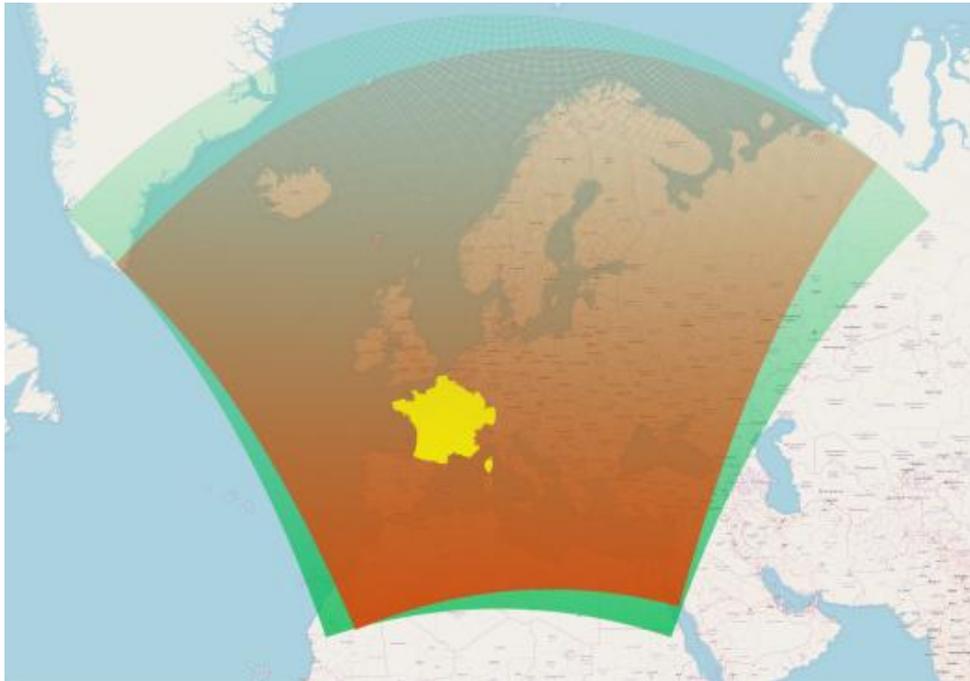
Verfaillie, D., Lafaysse, M., Déqué, M., Eckert, N., Lejeune, Y., and Morin, S.: Multi-component ensembles of future meteorological and natural snow conditions for 1500 m altitude in the Chartreuse mountain range, Northern French Alps, *The Cryosphere*, 12, 1249-1271, <https://doi.org/10.5194/tc-12-1249-2018>, 2018.



Perspectives



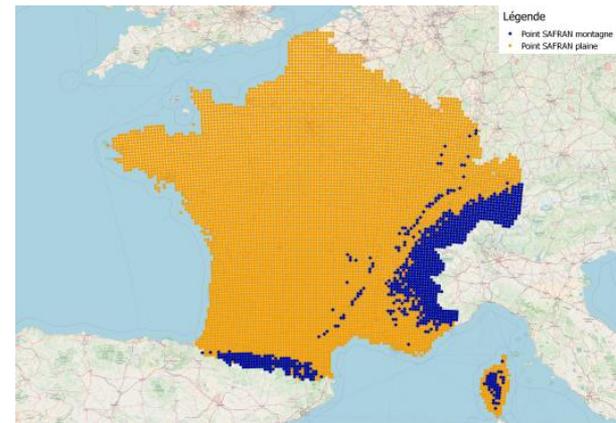
- Application of ADAMONT for **entire France**



Green: CNRM-ALADIN grid

Red : EUR-11 grid

Yellow: SAFRAN-France grid



Downscaling on the SAFRAN-France grid (~10 000 points) and **statistical adjustment**

Modification of original code for time disaggregation of direct/diffuse radiation, humidity and precipitation

Perspectives

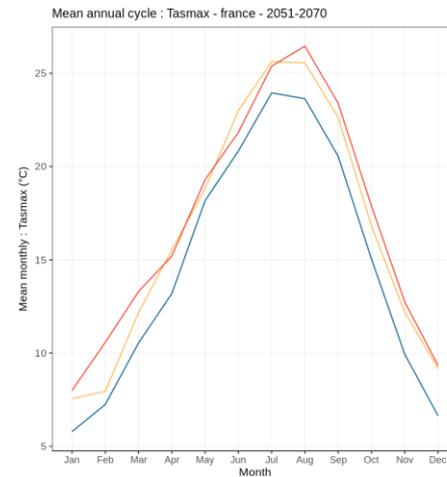
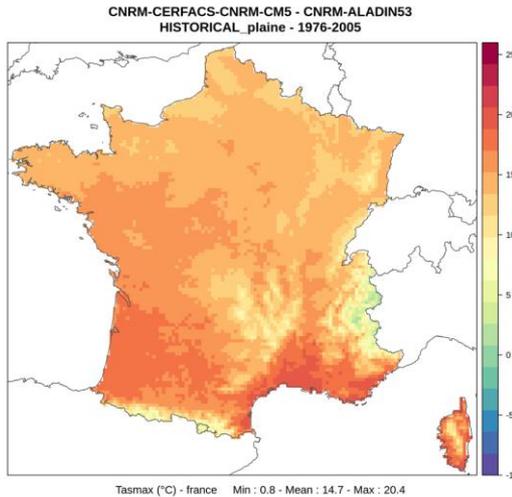


- Application of ADAMONT for **entire France** – First results

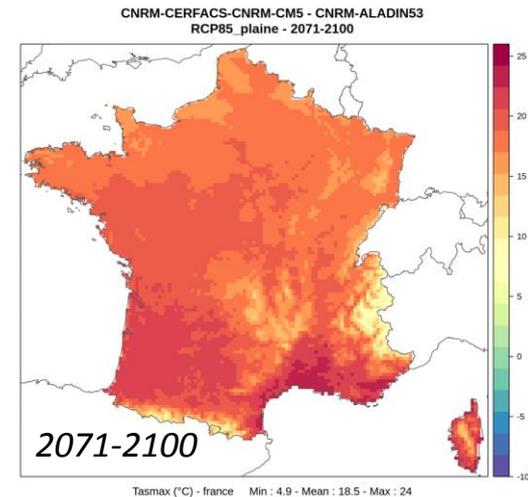
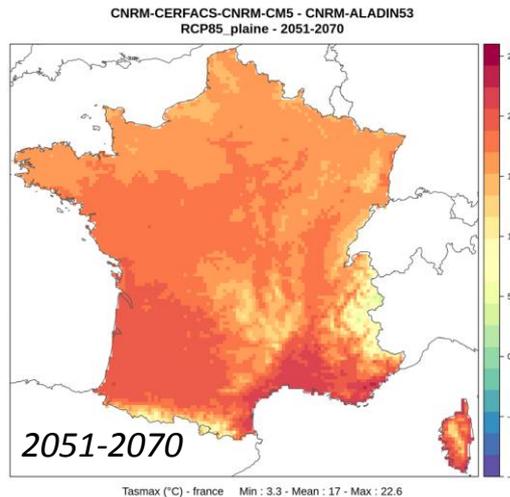
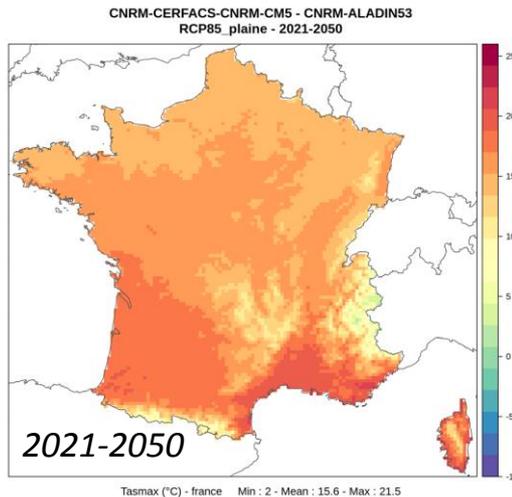
Maximum T
 CNRM-ALADIN53 /
 CNRM-CERFACS-CNRM-CM5

Blue: HISTORICAL 1976-2005
Yellow: RCP 4.5 2051-2070
Red : RCP 8.5 2051-2070

HISTORICAL
 1976-2005



RCP 8.5



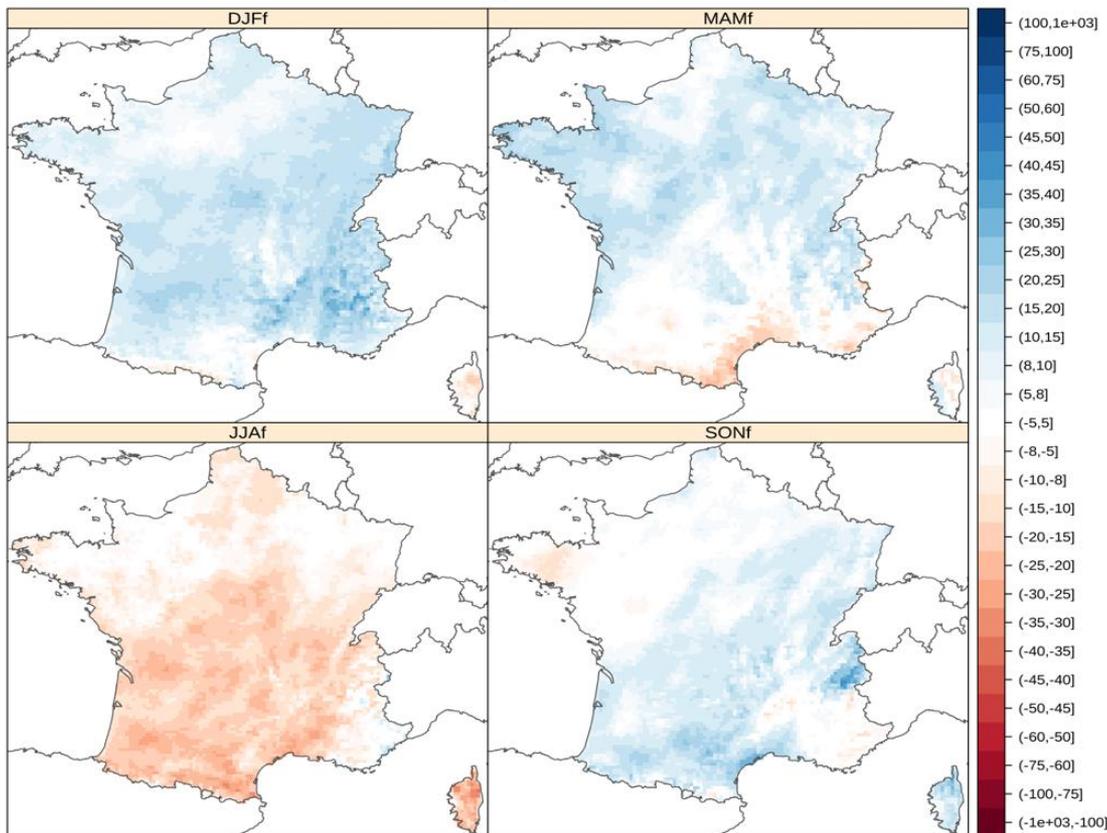
Perspectives



- Application of ADAMONT for **entire France** – First results

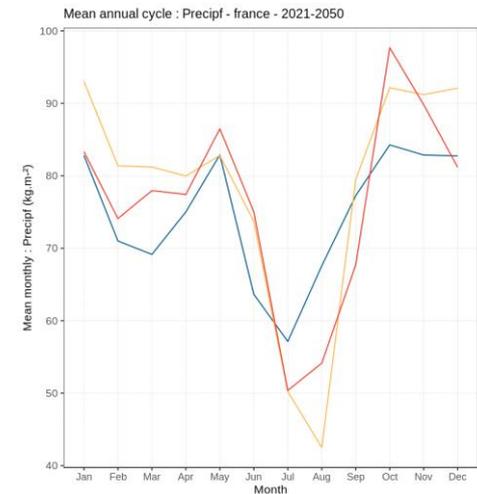
Change RCP 4.5 2021-2050 vs. HISTORICAL 1976-2005 (%)

MPI-M-MPI-ESM-LR - SMHI-RCA4
RCP45_plaine - 2021-2050



Mean bias model 1976-2005/model : Precipf (%) - france
 DJF - Min : -18.9 - Mean : 12.7 - Max : 39.9
 MAM - Min : -26.7 - Mean : 8 - Max : 25.1
 JJA - Min : -36.4 - Mean : -11.6 - Max : 25.7
 SON - Min : -15.3 - Mean : 7.4 - Max : 43.9

Precipitation SMHI-RCA4 / MPI-M-MPI-ESM-LR



*Blue: HISTORICAL 1976-2005
 Yellow: RCP 4.5 2021-2050
 Red : RCP 8.5 2021-2050*

Perspectives

- Application of ADAMONT for impact of **climate change on mountain snow conditions over Europe – Copernicus C3S SIS « European Tourism »**

Objective: Providing climate projections for mountain areas of Europe applicable for assessing natural and managed snow conditions (grooming, snowmaking).

Contribute to the **Copernicus C3S Sectoral Information System “European Tourism”**

Use of the **UERRA5.5 km reanalysis** as an observation database



Copernicus Climate Change Service



Copernicus Climate Change Service: European Tourism

C3S European Tourism is an EU Copernicus Climate Change Service (C3S) contract led by TEC Conseil together with 11 sub-contractors across Europe.



Perspectives

- Application of ADAMONT for **seasonal-to-decadal prediction**
- *H2020 PROSNOW (2017-2020)*

Objective: Coupling seasonal forecast system with snow models accounting for snow management

Seasonal forecast data (Copernicus Climate Change Services) **downscaled** and **adjusted to ski resorts conditions** using the meteorological records available

Downscaled predictions used **as such** (e.g. forecast of conditions appropriate for snowmaking) or to **drive snowpack models** with the simulation of **processes on ski slopes** (grooming, snowmaking)

→ integrated vision of future state of snow on ski slopes at submonthly to seasonal time scale, depending on the **management decision** (e.g. with and without snowmaking)



Perspectives

- Application of ADAMONT for **seasonal-to-decadal prediction**
- *ERA4CS MEDSCOPE (2017-2020)*

Objective: Provide climate forecasts in the Mediterranean region on seasonal-to-decadal time scales tailored for sectoral applications

Use of ADAMONT: seasonal forecast data (e.g. Copernicus Climate Change Service) will be **downscaled** and **adjusted** using UERRA reanalysis data to basin-scale areas for **applications in hydrology and agriculture**

ADAMONT will help derive consistent time series for precipitation, temperature, specific humidity and radiation

Final products: **ensemble seasonal forecasts** of impact variables (e.g. number of days with low flow for dam management)



European Research Area
for Climate Services



<https://www.medscope-project.eu/>

Perspectives

- Application of ADAMONT for **seasonal-to-decadal prediction**
- *H2020 EUCP (2018-2021)*

Main objectives:

1. Development of an innovative **ensemble climate prediction system** based on high-resolution climate models for Europe for the near-term (1-40 years), with improved methods to characterise **uncertainty**, seamlessly **blend decadal predictions and projections**, regional **downscaling**, and **evaluation** against observations
2. Production of consistent, authoritative and actionable climate information. **Co-designed with users**, to support climate-related risk assessments and climate change adaptation programmes
3. Demonstration of the **value** of this prediction system through **high impact extreme weather events** in the near past and near future
4. Development and publication of **methodologies**, good practice and **guidance** for producing and using authoritative climate predictions for 1-40 year timescale



Conclusions

Explicit **ensemble-based** model chain from global to regional to local impacts of climate change (atmospheric & snow conditions)

Quantitative analysis based on explicit computation of continuous scenarios 1950-2100.

→ Sustained **interannual variability, differences between RCPs** visible after 2050

Future application to **entire France**, for impact of **climate change on mountain snow conditions** and to **seasonal/decadal prediction**

Data available for further impact studies: managed snow, glacier mass balance, hydrology, ecosystem response, etc.



Thank you!

deborah.verfaillie@bsc.es

