

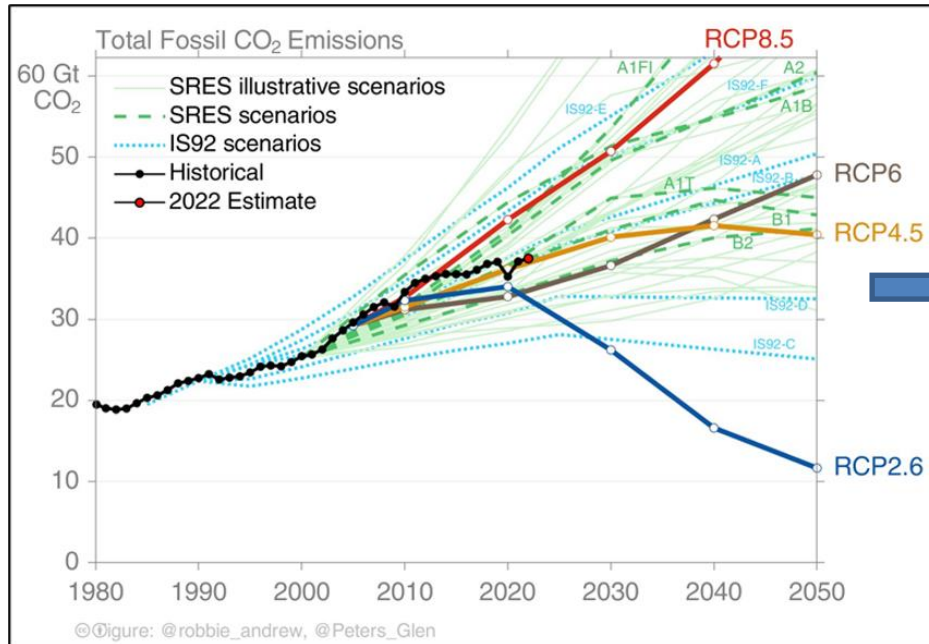
# Hydrological impacts of climate change: linking climate and hydrological models

Yves Tramblay

*yves.tramblay@ird.fr*

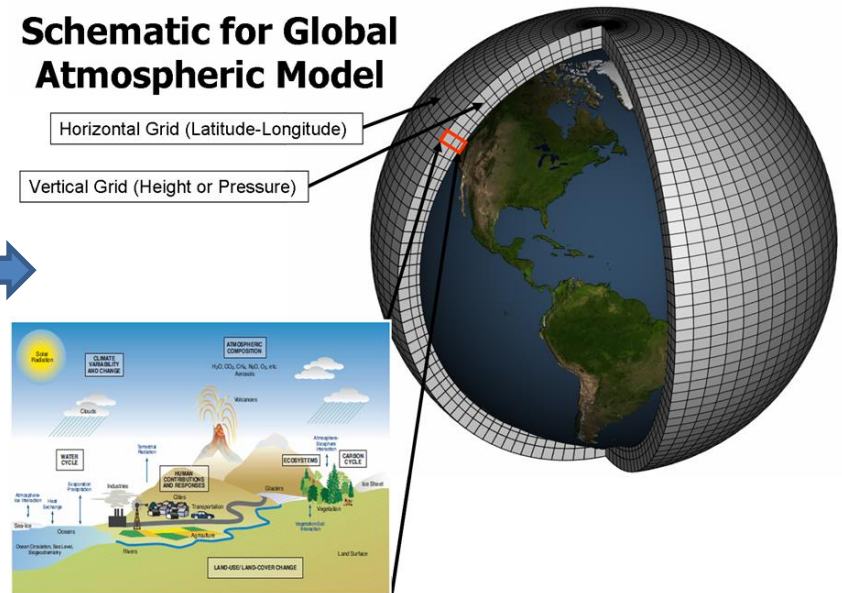
# How to model climate change?

## Emission scénarios



## Climate model

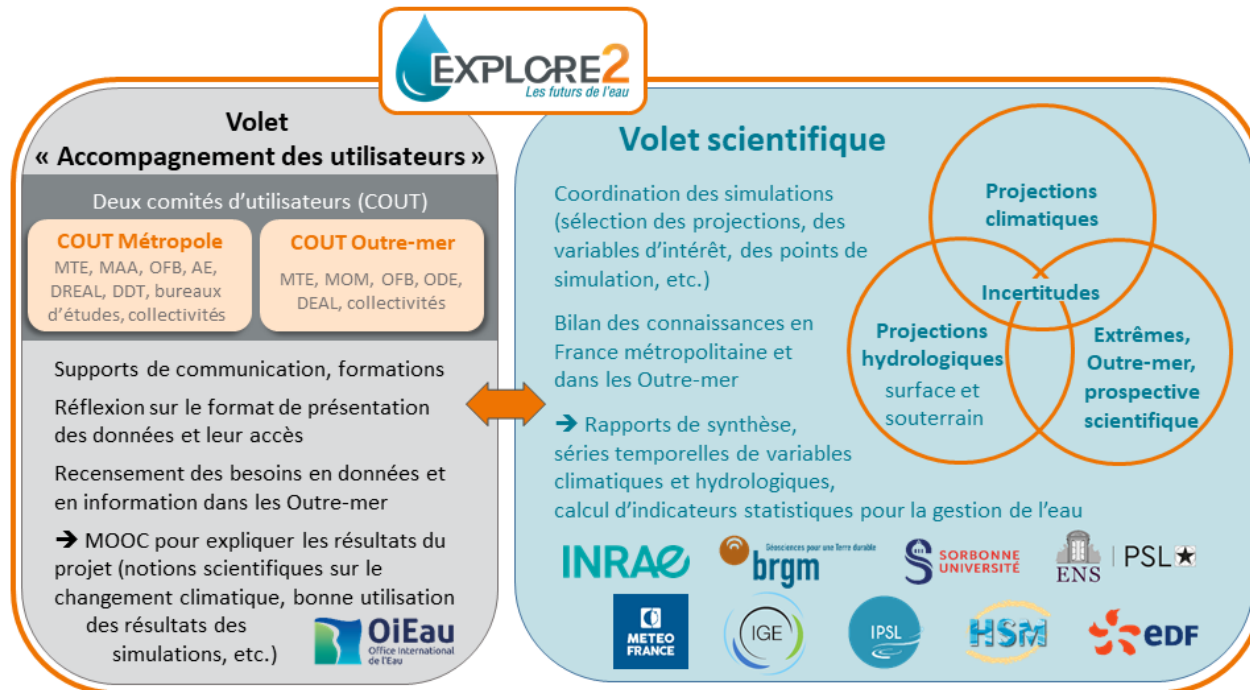
### Schematic for Global Atmospheric Model



Climate scenarios are based on greenhouse gas emission scenarios.

Climate models are based on physical equations and incorporate more and more elements: atmosphere, oceans, vegetation, aerosols, cities... and are constantly being improved.

# A large project to assess climate change impacts on hydrology (2021-2024)



Co-financements :

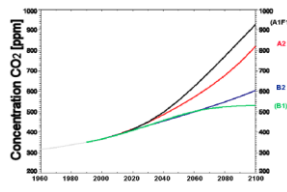


Assistance à maîtrise d'ouvrage :

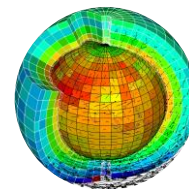


# Modelling chain

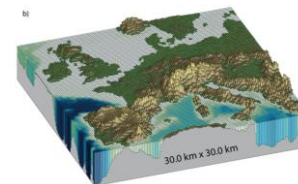
Emission scenarios



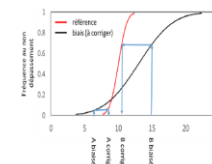
Global  
Circulation Model  
(GCM)



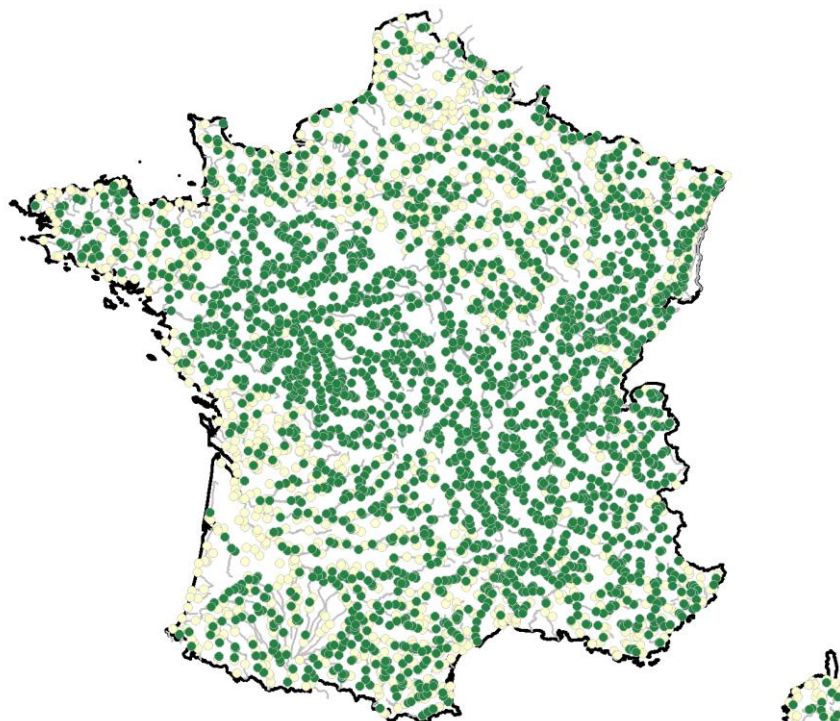
Regional Climate  
Model (RCM)



Bias correction methods



Hydrological models



Nombre de modèles hydrologiques disponibles

● 1 à 3 ● 4 et plus

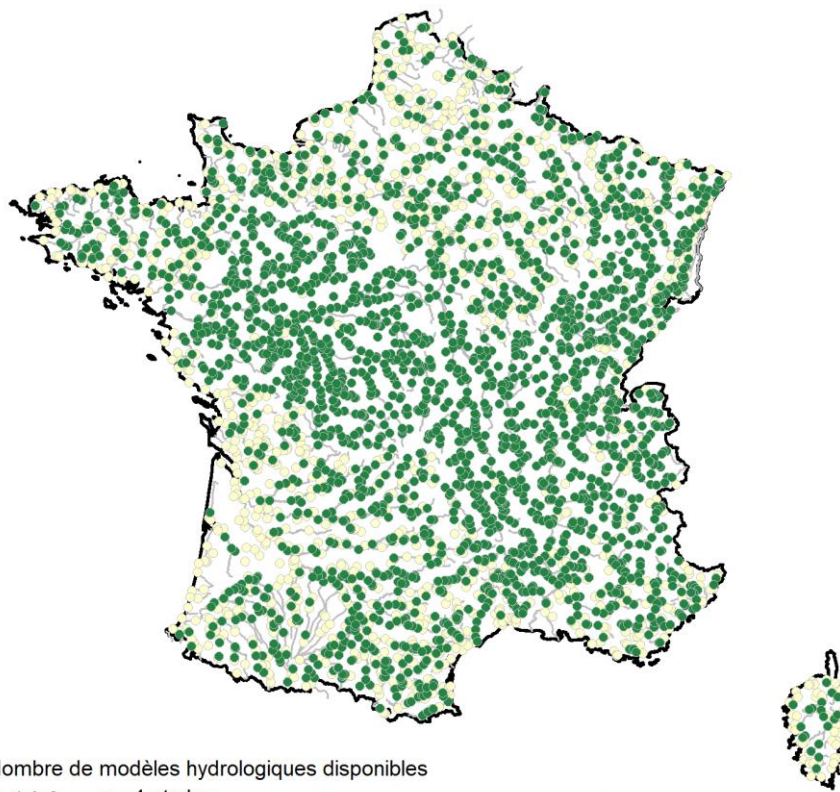
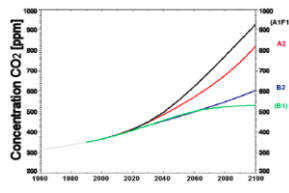
0 200 km

**Hydrologic projections**



# Modelling chain

Emission scenarios



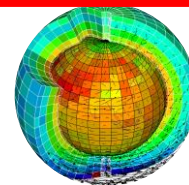
Nombre de modèles hydrologiques disponibles

● 1 à 3 ● 4 et plus

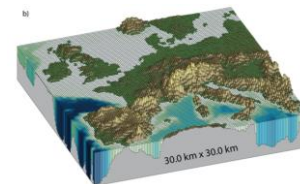
0 200 km

**Hydrologic projections**

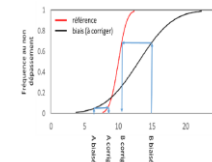
Global  
Circulation Model  
(GCM)



Regional Climate  
Model (RCM)

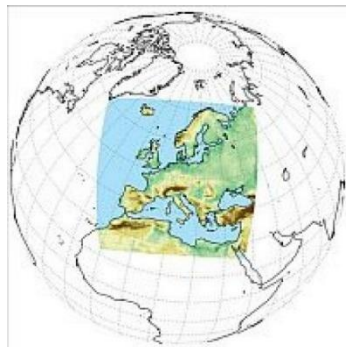
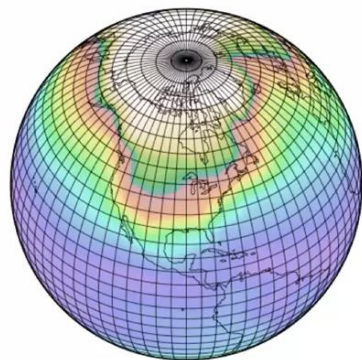


Bias correction methods

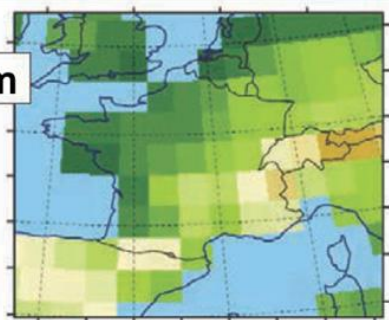


Hydrological models

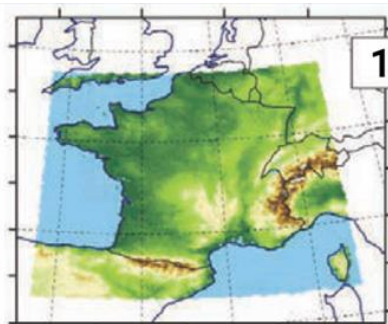




150 km

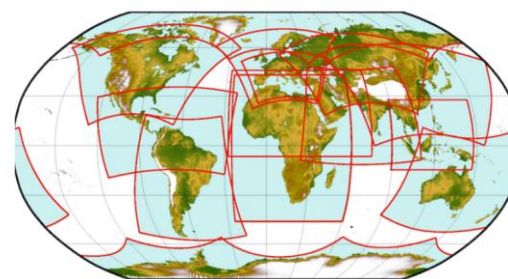


12 km



# CORDEX

Coordinated Regional Climate Downscaling Experiment



- Region 1: South America
- Region 2: Central America
- Region 3: North America
- Region 4: Africa
- Region 5: Europe (EURO)
- Region 6: South Asia
- Region 7: East Asia
- Region 8: Central Asia
- Region 9: Australasia
- Region 10: Antarctica
- Region 11: Arctic
- Region 12: Mediterranean (MEDI)
- Region 13: Middle East North Africa (MENA)
- Region 14: South-East Asia (SEA)

Global Climate Model

Regional Climate Model

Bias correction & statistical  
downscaling method



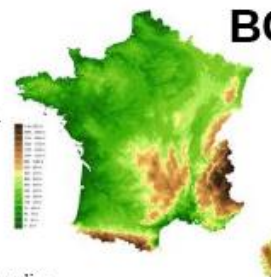
*Dynamical Downscaling*

**RCM**



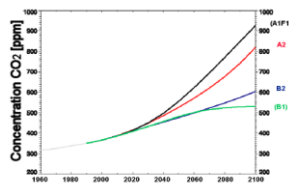
*Statistical Downscaling*

**BCSD**

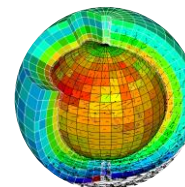


# Modelling chain

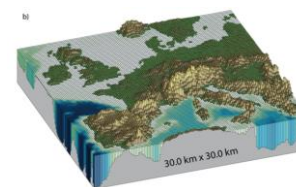
Emission scenarios



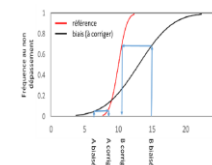
Global  
Circulation Model  
(GCM)



Regional Climate  
Model (RCM)



Bias correction methods



Hydrological models

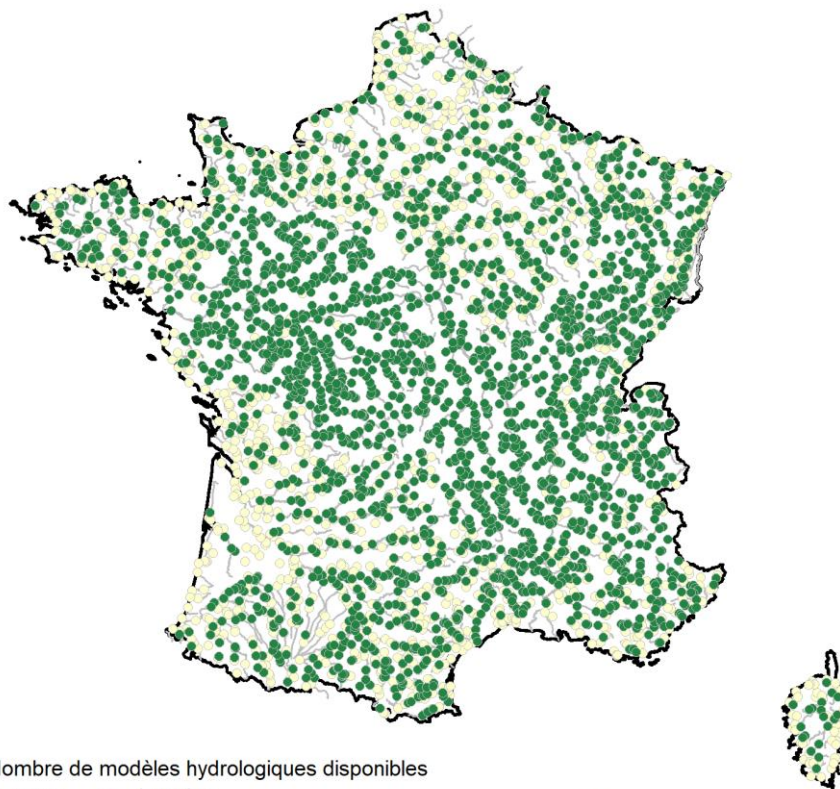


**Hydrologic projections**

Nombre de modèles hydrologiques disponibles

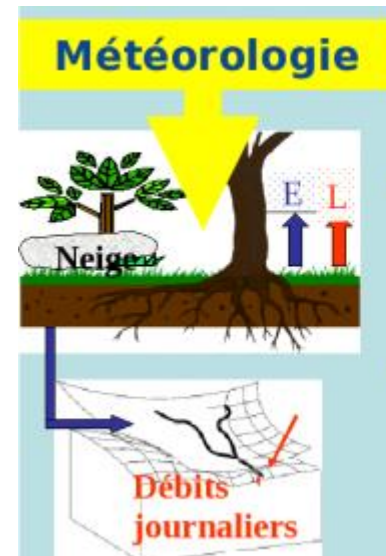
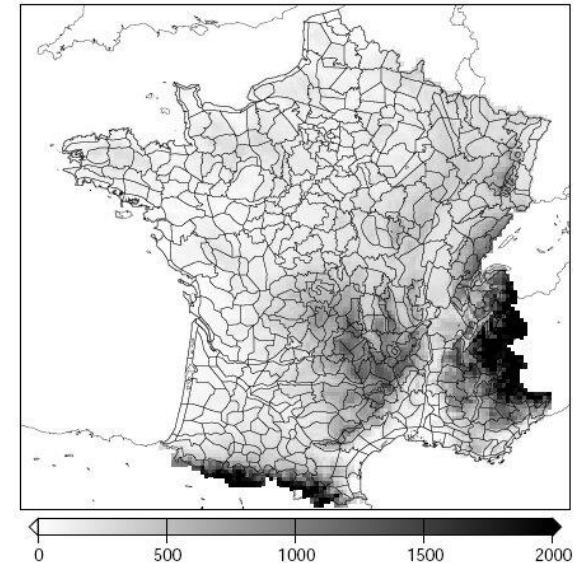
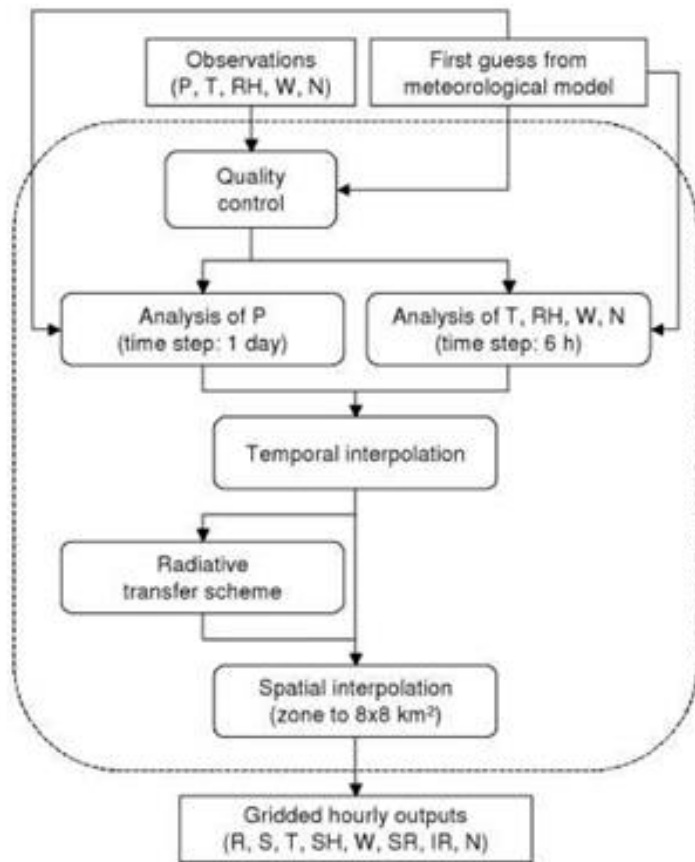
● 1 à 3 ● 4 et plus

0 200 km



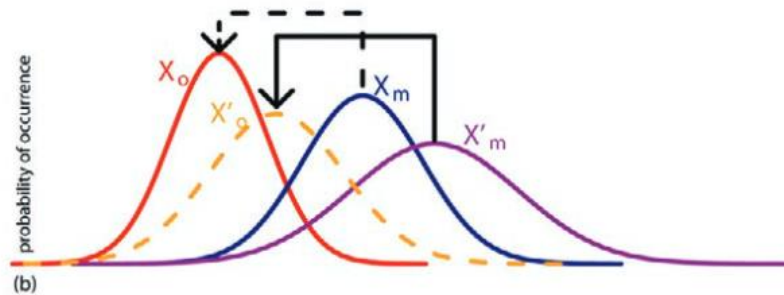
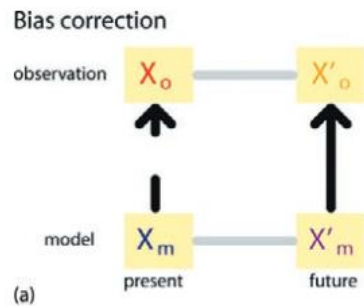


# The Safran-ISBA-Modcou (SIM) reanalysis 1958-present



- **SAFRAN** : analyse des paramètres météorologiques
- **ISBA** : flux d'eau et d'énergie à la surface du sol (évaporation, neige ruissellement, infiltration, ...)
- **MODCOU** : modèle hydrogéologique

**La Chaîne SIM**



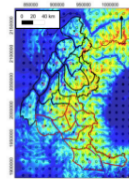
1. Bias-correction based on a quantile-mapping approach
2. Disaggregation from daily to hourly time steps
3. Correction based on weather analogs (weather types)
4. Using the SIM reanalysis as reference



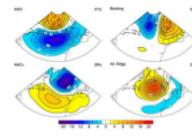
## ADAMONT Chaîne de traitement



1. Points RCM proches SAFRAN

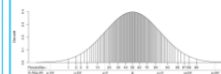


2. Régimes RCM & ERA-Interim (SAFRAN)

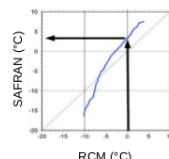


3. SAFRAN pdt 1h → JOUR

4. Centiles RCM histo & SAFRAN (variable, saison, régime)

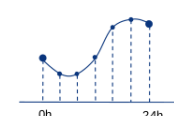


5. Correction q-q (variable, saison, régime)



6. Analogues (JOUR) SAFRAN, critères:  
- même mois  
- même régime  
- Pr. cohérentes  
- Jours consécutifs (si possible)

7. RCM corr pdt JOUR → 1h (forme analogues SAFRAN)



8. Séparation précips totales en pluie/neige (seuil 1°C)  
+ correction q-q additionnelle de pluie et neige séparément

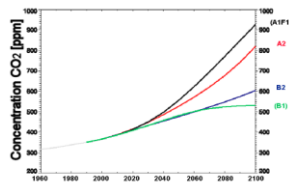
Verfaillie, D., Déqué, M., Morin, S., and Lafayesse, M. 2017 : The method ADAMONT v1.0 for statistical adjustment of climate projections applicable to energy balance land surface models, Geosci. Model Dev., 10, 4257-4283, [<https://doi.org/10.5194/gmd-10-4257-2017>].

Déqué M. et al., 2007 : Frequency of precipitation and temperature extremes over France in an anthropogenic scenario : model results and statistical correction according to observed values. Global and Planetary Change. 57 : 16-26.

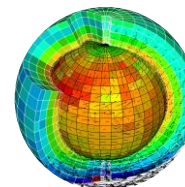


# Modelling chain

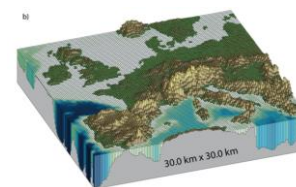
Emission scenarios



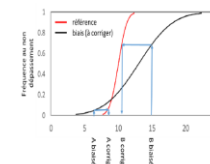
Global  
Circulation Model  
(GCM)



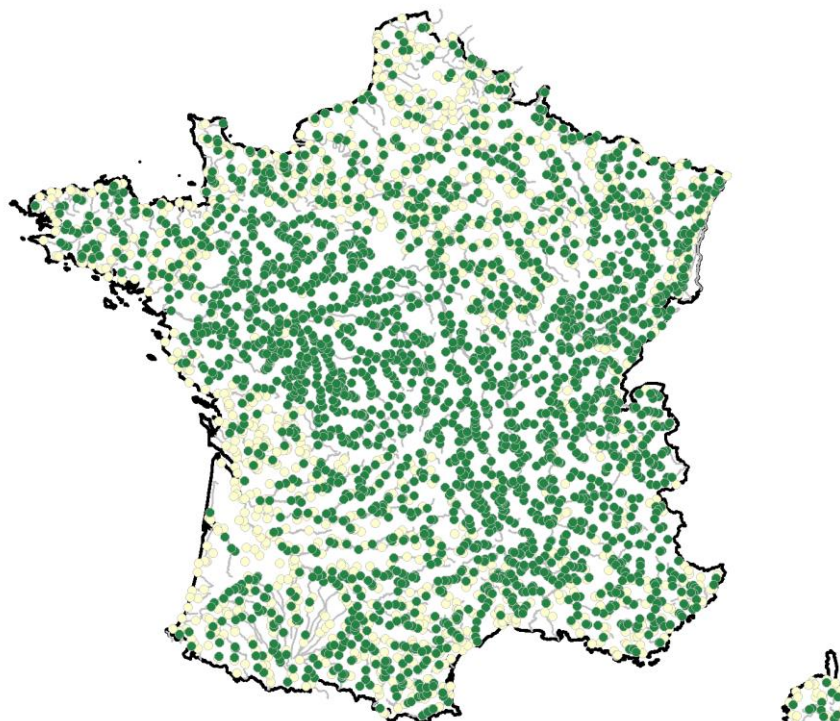
Regional Climate  
Model (RCM)



Bias correction methods



Hydrological models



Nombre de modèles hydrologiques disponibles

● 1 à 3 ● 4 et plus

0 200 km

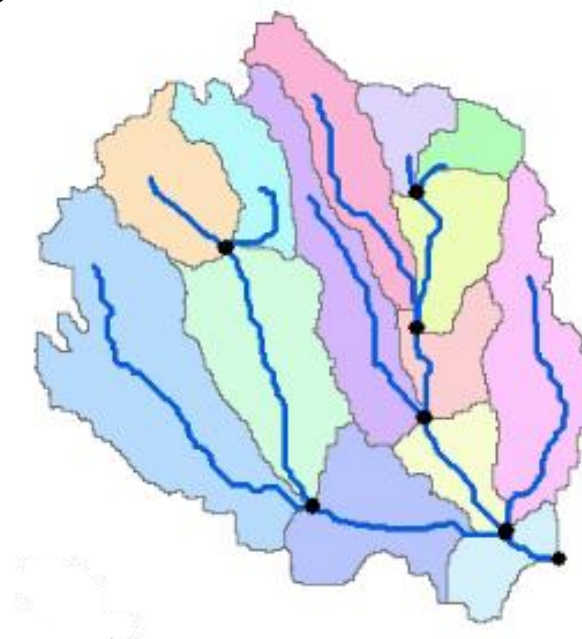
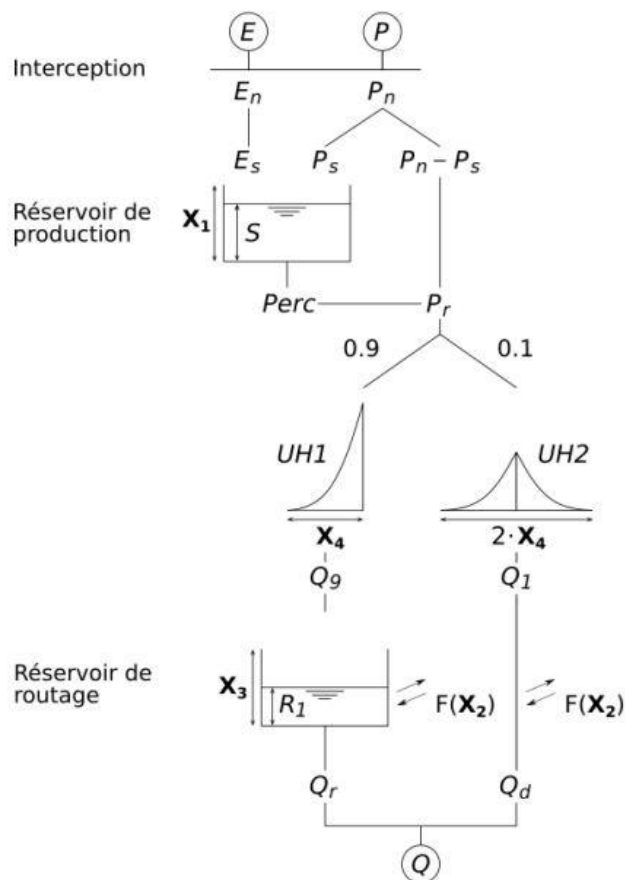
**Hydrologic projections**

Model	Spatial discretisation	Spatial domain	Nb of Q points	Type	Parameter optimisation	Bias correction method
GR4J	Lumped			Conceptual	Yes, needed	
GRSD	Semi-distributed	France	3712	Conceptual	Yes	ADAMONT CDF-t
SMASH	Semi-distributed	France	3821	Conceptual	Yes	ADAMONT CDF-t
EROS	Lumped	Bretagne	60	Conceptual	Yes	ADAMONT CDF-t
	Semi-distributed	Loire River basin	327		yes	
MORDOR-SD	Lumped with altitude bands	France	611	Conceptual	Yes	ADAMONT CDF-t
MORDOR-TS	Semi-distributed with altitude bands	Upper Loire River basin	535	Conceptual	Yes	ADAMONT CDF-t
J2000	Semi-distributed (HRU)	Loire and Rhône River basins	1291	Process-oriented	No	ADAMONT CDF-t
ORCHIDEE	Distributed (regular grid cells)	France	3587	Physically-based Resolving energy balance	No	ADAMONT
SIM2	Distributed (regular grid cells)	France	649	Physically-based Resolving energy balance	No	ADAMONT
CTRIP	Distributed (regular grid cells)	France	2024	Physically-based Resolving energy balance	No	ADAMONT

Sauquet et al., soumis, HESSD

# GRSD

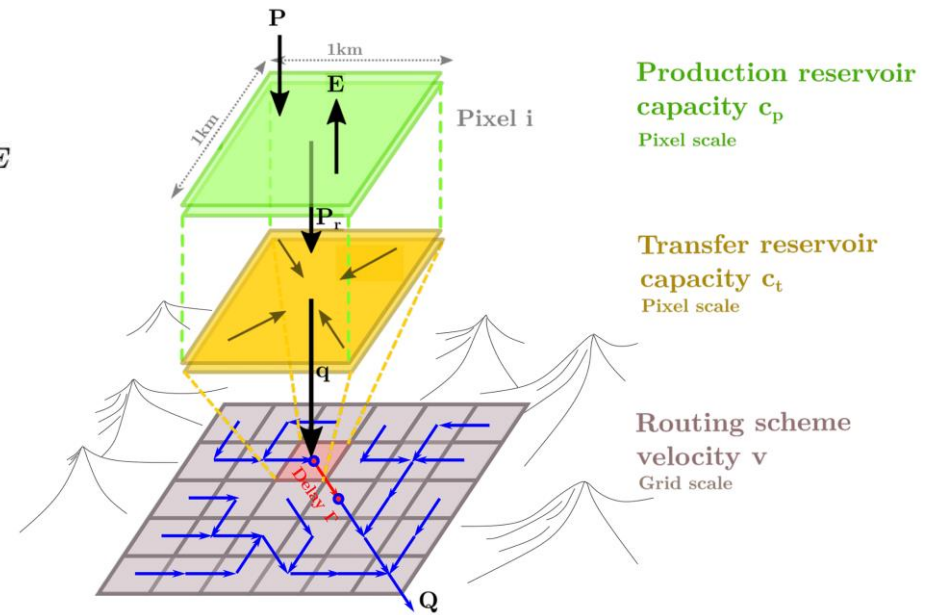
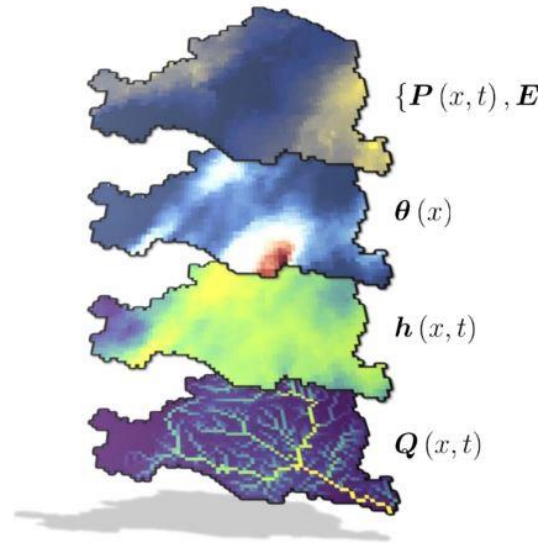
- Simulation of  $Q$  only, from  $P$  and ETP
- Process: water balance + routing + volume correction
- Empirical to conceptual representation
- Optimization of 4 parameters to fit observed discharge
- Lumped/global: one model/parameter set per BV
- No vegetation, no topography, no anthropogenic pressures



Lobligeois, F., Andréassian, V., Perrin, C., Tabary, P., and Loumagne, C.: When does higher spatial resolution rainfall information improve streamflow simulation? An evaluation using 3620 flood events, *Hydrol. Earth Syst. Sci.*, 18, 575–594, <https://doi.org/10.5194/hess-18-575-2014>, 2014

de Lavenne, A., Andréassian, V., Thirel, G., Ramos, M.-H., & Perrin, C. (2019). A regularization approach to improve the sequential calibration of a semidistributed hydrological model. *Water Resources Research*, 55, 8821–8839. <https://doi.org/10.1029/2018WR024266>

# SMASH



- Same type of conceptual model as GR4J/GRSD
- Fully distributed with a routing scheme able to take into account channel characteristics



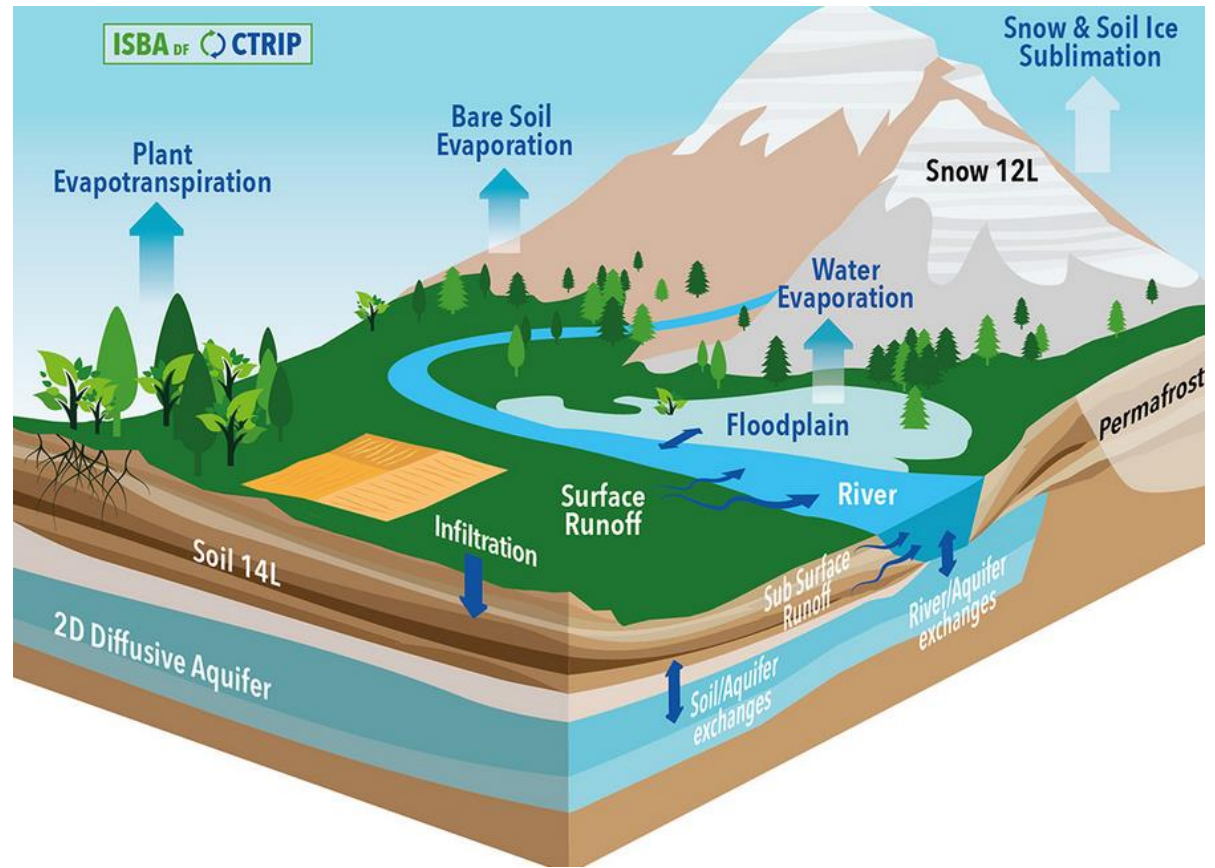
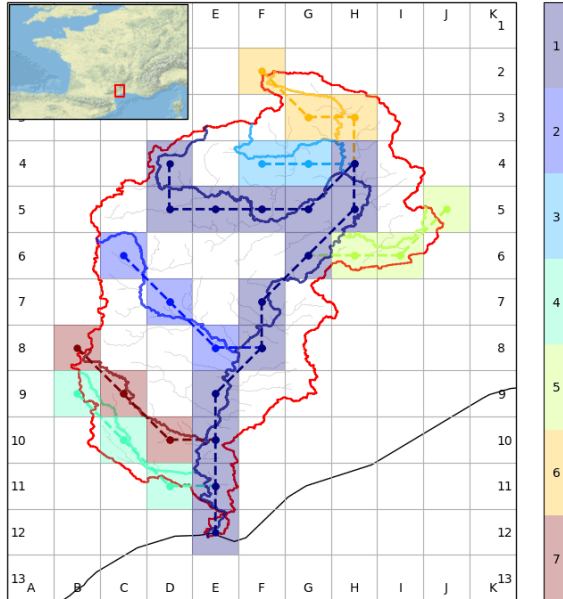
Huynh, N. N. T., Garambois, P.-A., Colleoni, F., & Javelle, P. (2023). Signatures-and-sensitivity-based multi-criteria variational calibration for distributed hydrological modeling applied to Mediterranean floods. Journal of Hydrology, 625, 129992. <https://doi.org/10.1016/j.jhydrol.2023.129992>

Jay-Allemand, M., Demargne, J., Garambois, P.-A., Javelle, P., Gejadze, I., Colleoni, F., Organde, D., Arnaud, P., and Fouchier, C.: Spatially distributed calibration of a hydrological model with variational optimization constrained by physiographic maps for flash flood forecasting in France, Proc. IAHS, 385, 281–290, <https://doi.org/10.5194/piahs-385-281-2024>, 2024.



# ISBA-CTRIP

Land-surface scheme  
of the CNRM global  
climate model

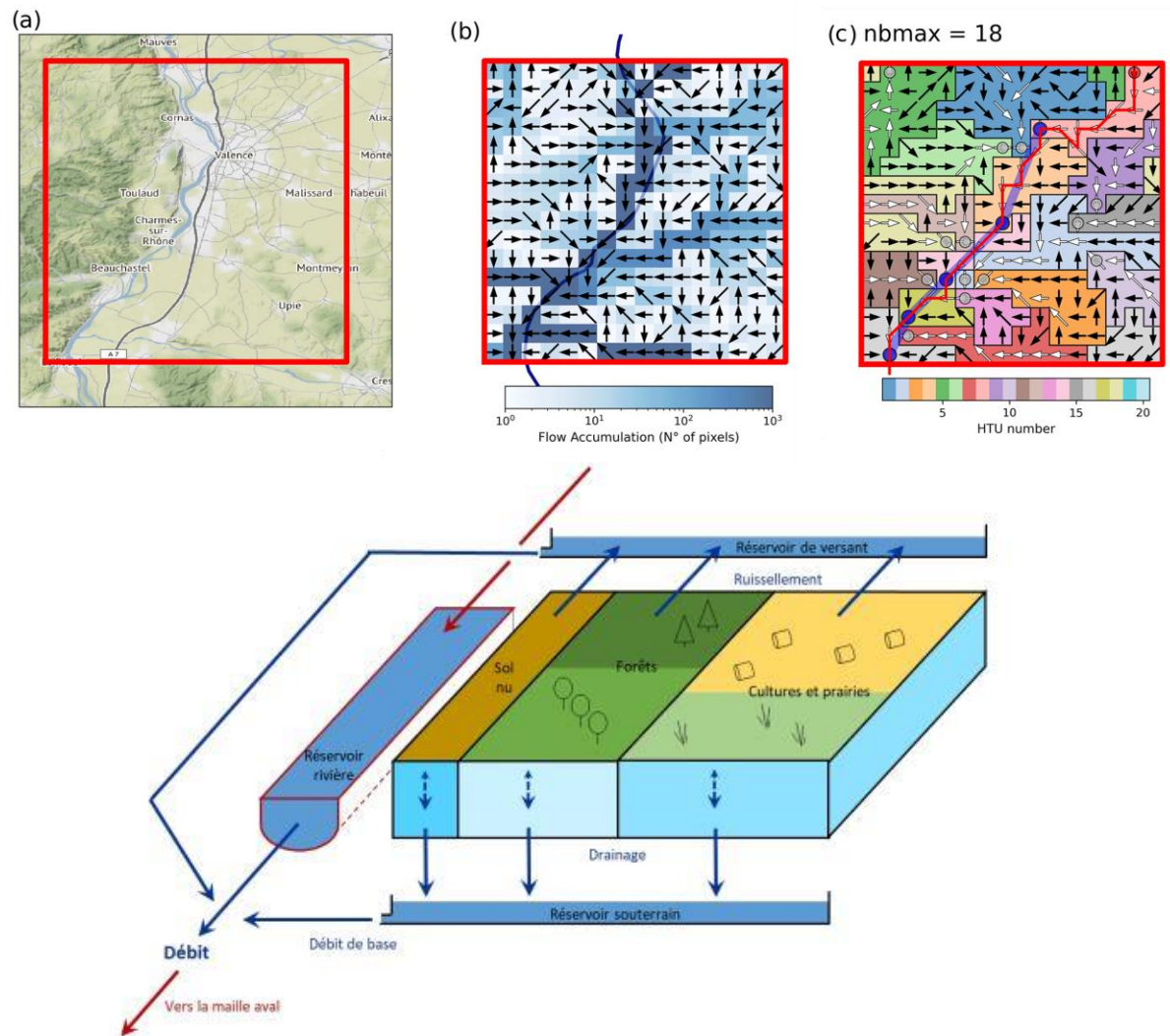


Decharme, B., Delire, C., Minvielle, M., Colin, J., Vergnes, J.-P., Alias, A., et al. (2019). Recent changes in the ISBA-CTRIP land surface system for use in the CNRM-CM6 climate model and in global off-line hydrological applications. *Journal of Advances in Modeling Earth Systems*, 11, 1207–1252. <https://doi.org/10.1029/2018MS001545>



# ORCHIDEE

Land-surface scheme  
of the IPSL global  
climate model



Cheruy, F., Ducharne, A., Hourdin, F., Musat, I., Vignon, É., Gastineau, G., et al. (2020). Improved near-surface continental climate in IPSL-CM6A-LR by combined evolutions of atmospheric and land surface physics. *Journal of Advances in Modeling Earth Systems*, 12, e2019MS002005.

<https://doi.org/10.1029/2019MS002005>

Polcher, J., Schrapffer, A., Dupont, E., Rinchiuso, L., Zhou, X., Boucher, O., Mouche, E., Ottlé, C., and Servonnat, J.: Hydrological modelling on atmospheric grids: using graphs of sub-grid elements to transport energy and water, *Geosci. Model Dev.*, 16, 2583–2606, <https://doi.org/10.5194/gmd-16-2583-2023>, 2023.

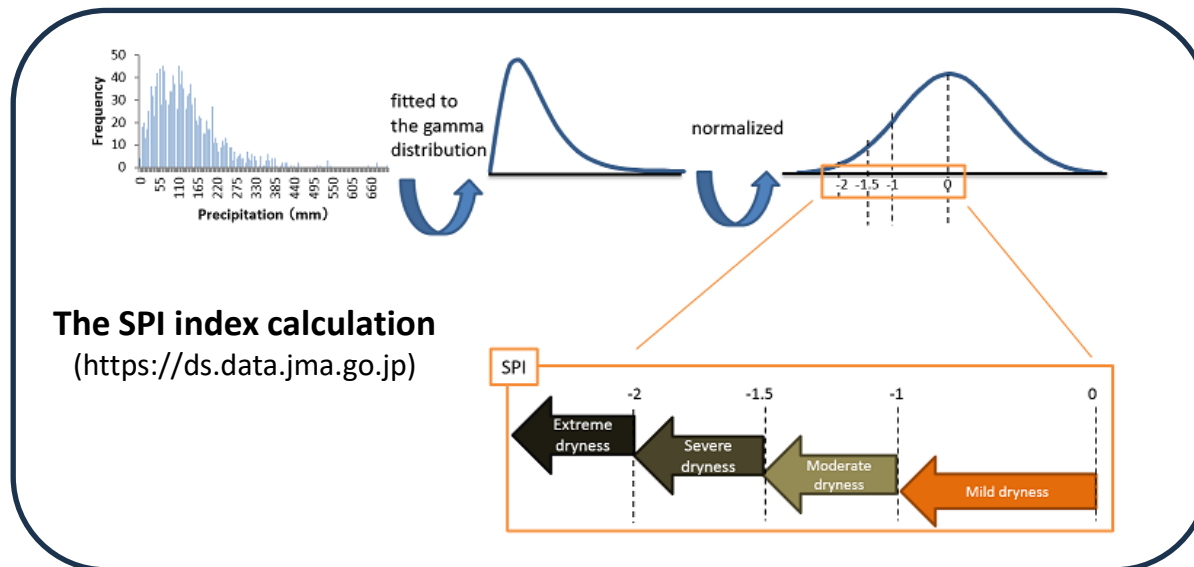
# METHODOLOGY

- 2 scenarios (RCP45 and RCP8.5), 2 future periods (2041-2070, 2071-2100, compared to 1975-2005) for an ensemble of 17 bias-corrected Euro-CORDEX simulations
  - 4 Hydrological models : GRSD, SMASH, ISBA-CTRIIP, ORCHIDEE
  - Return level of extreme events :
    - Annual maximum rainfall with a 20-year return period (PJXA20)
    - Annual maximum river discharge with a 20-year return period (QJXA20)
    - Annual minimum monthly river discharge with a 5-year return period (QMNA5)
1. Computation with a Generalized Extreme Value distribution fitted to the data (L-Moments)
  2. Estimation of the significance of the changes in quantiles with a parametric bootstrap
  3. Estimation of the agreement between models using a Multi-Model Index of Agreement for each basin  $u$ :

$$MIA_u = \frac{1}{n} \left( \sum_{m=1}^n i_m \right)$$

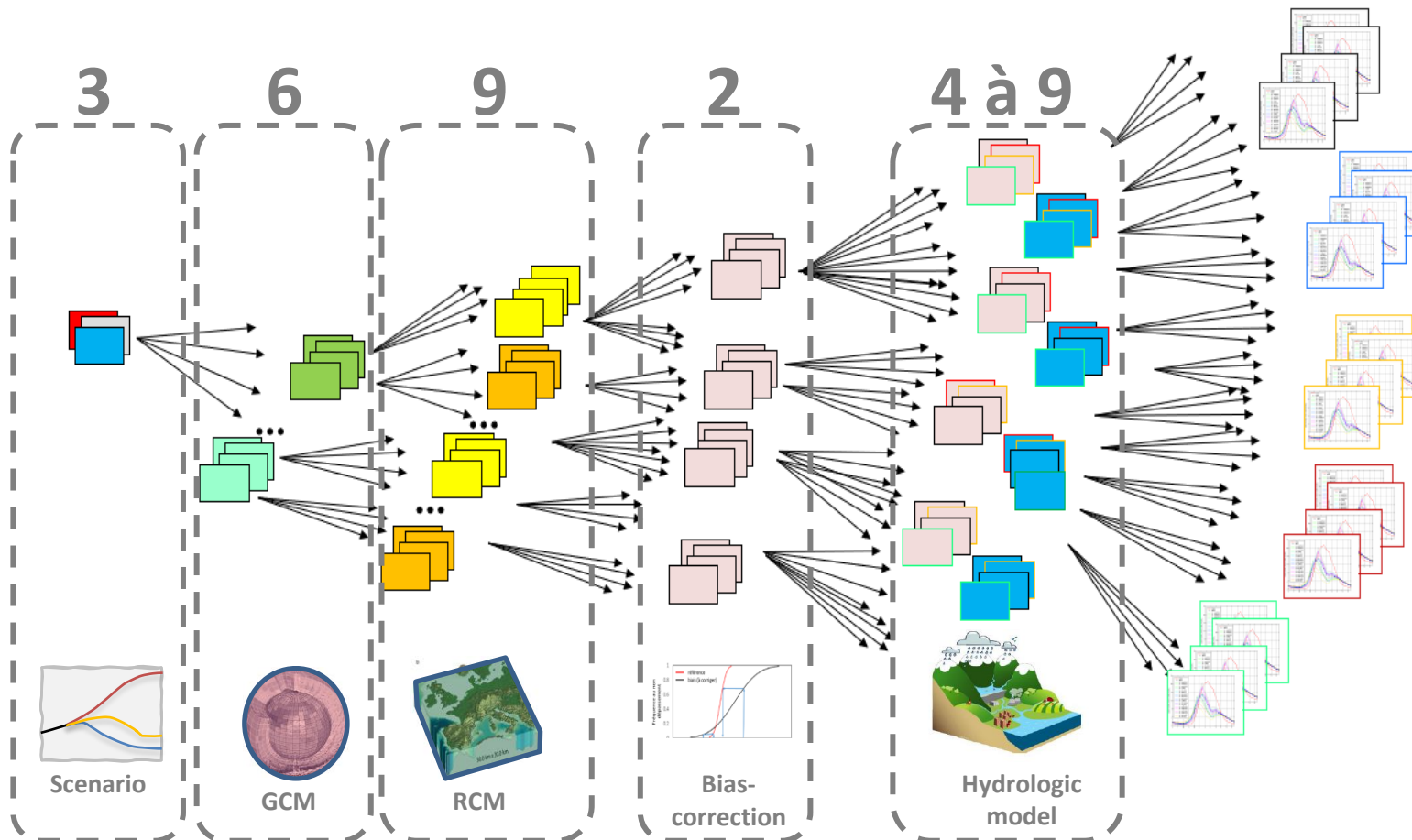
For a given model  $m$ ,  $i_m = 1$  for significant positive trends,  $i_m = -1$  for significant negative trends,  $i_m = 0$  in case of no significant trends, and  $n$  is the number of climate simulations. The index is equal to 1 (– 1) if all model projects an increasing (decreasing) trend.

# METHODOLOGY FOR DROUGHTS



- Computation of the Standardized Precipitation index (SPI) for meteorological droughts and the Standardized Soil Moisture Index (SSWI) for agricultural droughts (with soil moisture from the ISBA land surface model)
- Comparison of the frequency of 10-year return level droughts (-1.28) between historical and future time periods, for winter (DJF) and summer (JJA).
- Computation of the fraction of France each year from 1976 to 2100 experiencing severe droughts

# UNCERTAINTY CASCADE



## THREE UNCERTAINTY SOURCES

- **Emission scenarios**

> The different RCP/SSP scenarios, different choices of future

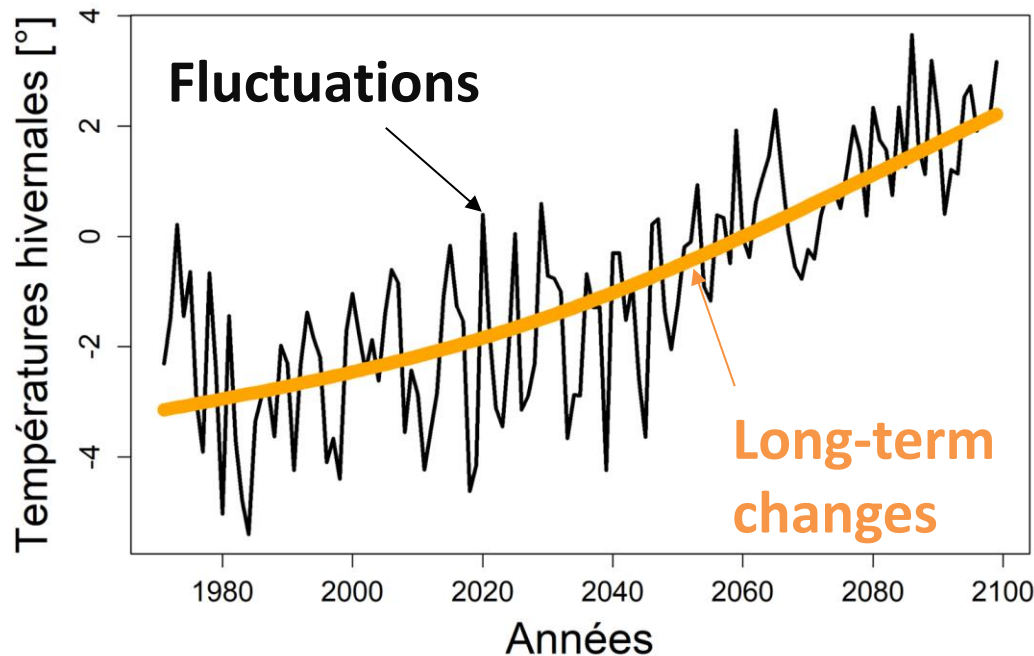
- **Modelling uncertainties**

> Scientific and technical uncertainties, imperfect models

- **Internal climate variability**

> Unpredictable, adds random noise to profound changes

> **It must be distinguished from long-term trends resulting from climate change**





# All the outputs of the Explore2 projet are 100% open data



- **A central repository including the topical reports:**

<https://entrepot.recherche.data.gouv.fr/dataverse/explore2>

- **Data access:**

<https://www.drias-climat.fr/> et <https://www.drias-eau.fr/>

- **User-friendly websites to display results:**

<https://makaho.sk8.inrae.fr/> (past trends)

<https://meandre.explore2.inrae.fr/> (future scenarios)

- **MOOC :** <https://e-learning.oieau.fr/enrol/index.php?id=3799>



### 3- Climate change impacts on extreme rainfall and floods



Derna, Libye, 11 sep. 2023

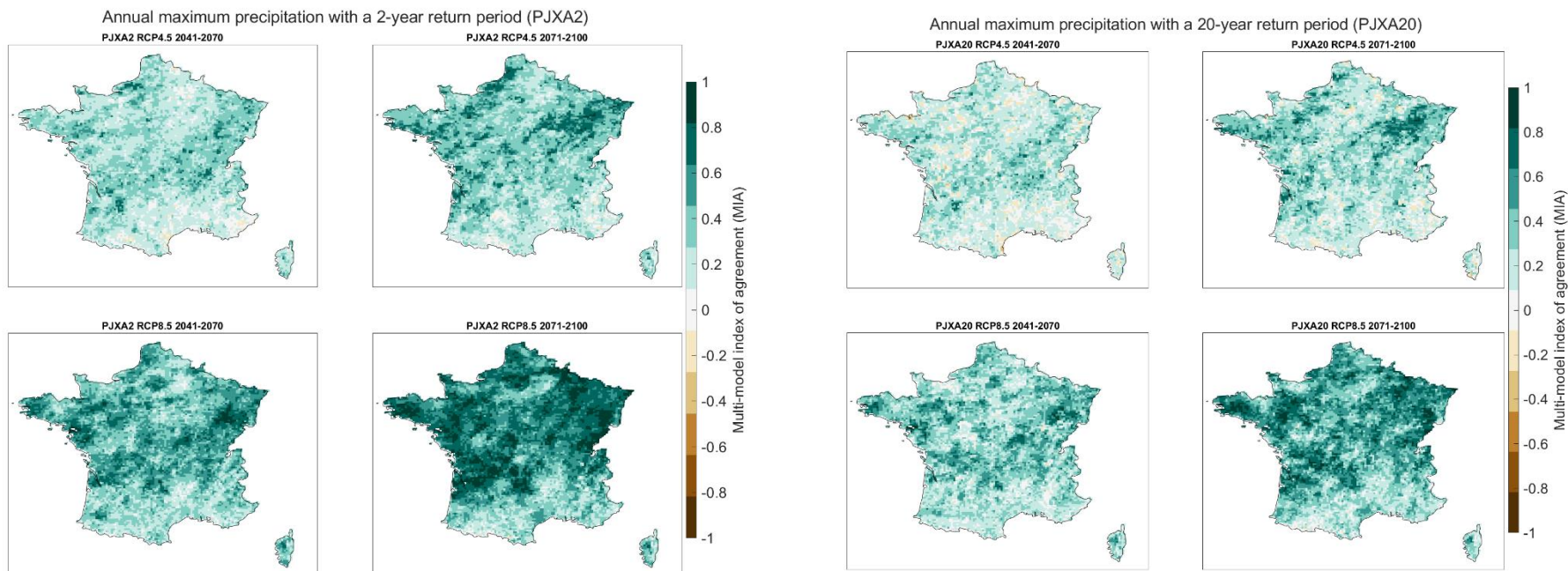
*In France, 10 millions of building are exposed to flood risk (18 millions people)*



Valencia, Espagne, 29 oct. 2024

# Projections of extreme rainfall

## Agreement between the models

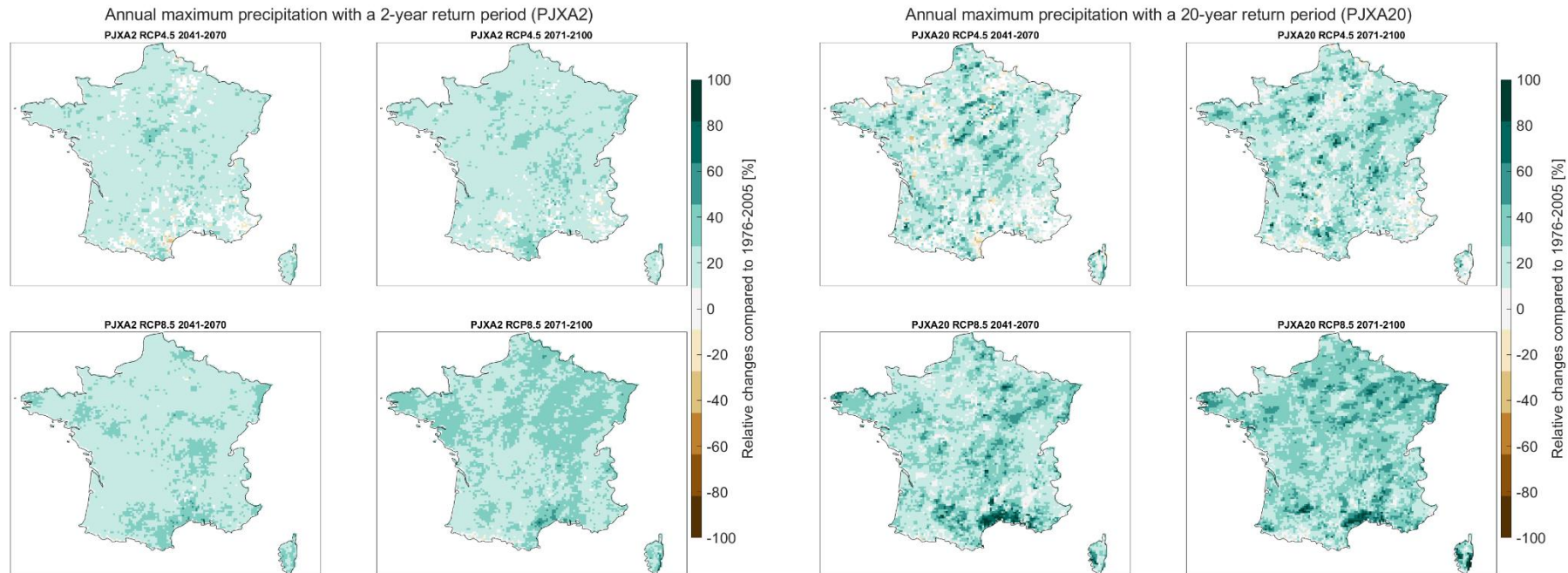


**Strong convergence towards an increase, more important at the end of the century and 2-year return levels**



# Projections of extreme rainfall

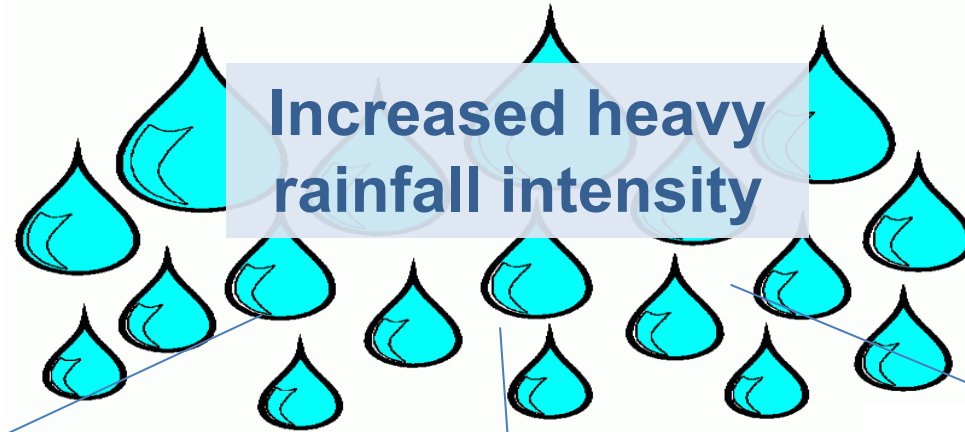
## Changes in intensity



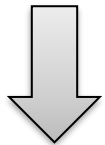
**+20 / +30% on average in France**

**Strong signal in the Mediterranean for 20-year return levels**

# What is the impact on floods?



Impervious areas, urban



**Increased surface runoff**



« Natural » soils



**Cultivated soils**



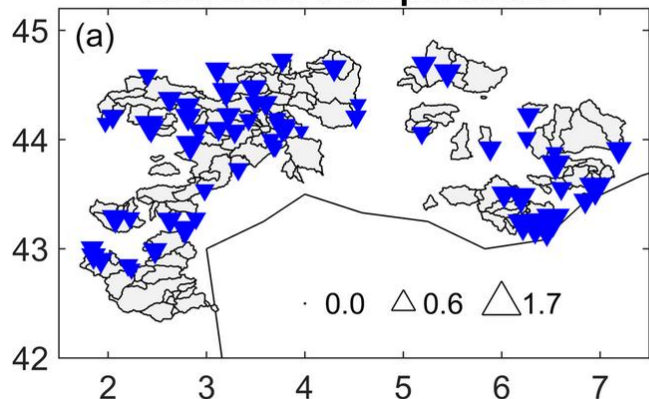
**Different hydrological responses**

**[ Without flood mitigation structures! ]**

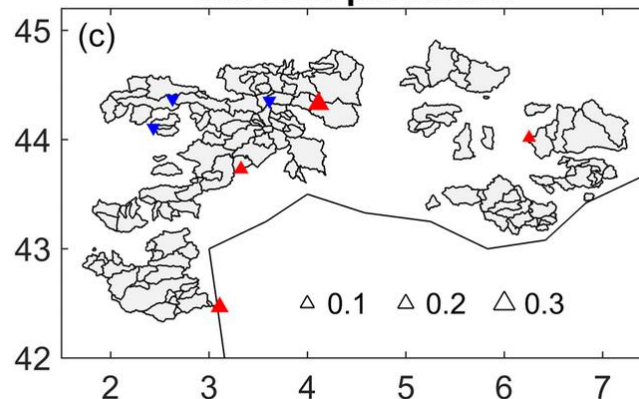


# Historical trends in floods in Mediterranean basins

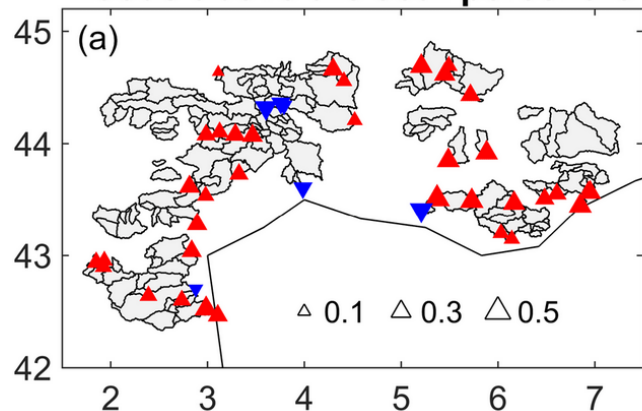
**Annual number of floods above the 95th percentile**



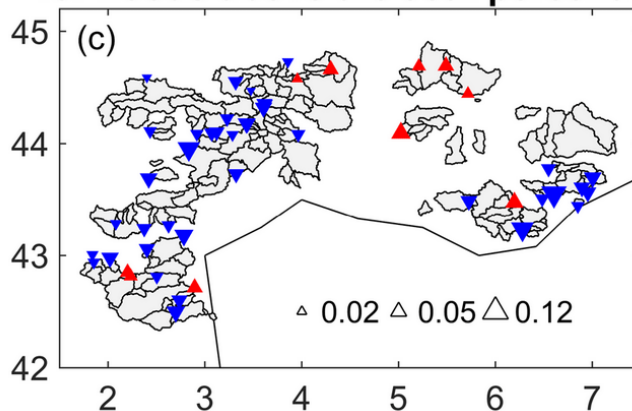
**Flood magnitudes above the 95th percentile**



**Cumulative precipitation during floods above the 95th percentile**

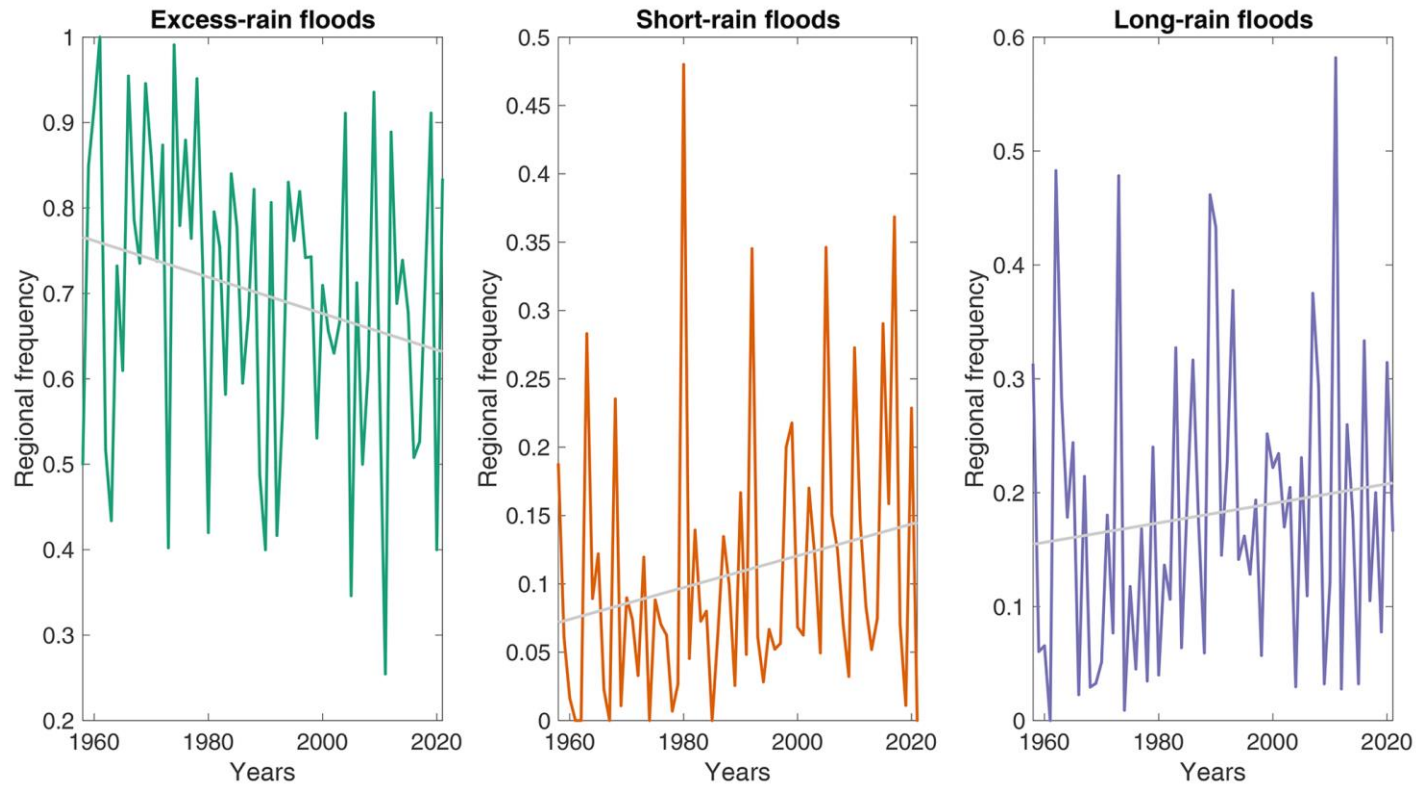


**Antecedent wetness conditions for floods above the 95th percentile**



1. Rainfall extremes are intensifying
2. Soil moisture before floods are decreasing
3. Flood frequency for frequent floods is decreasing, no clear signal for large floods

# Changes in floods characteristics in Mediterranean basins



Tramblay Y., Arnaud P., Artigue G., Lang M., Paquet E., Neppel L., Sauquet E., 2023. Changes in Mediterranean flood processes and seasonality, *Hydrology and Earth System Sciences*, 27, 2973–2987, <https://doi.org/10.5194/hess-27-2973-2023>

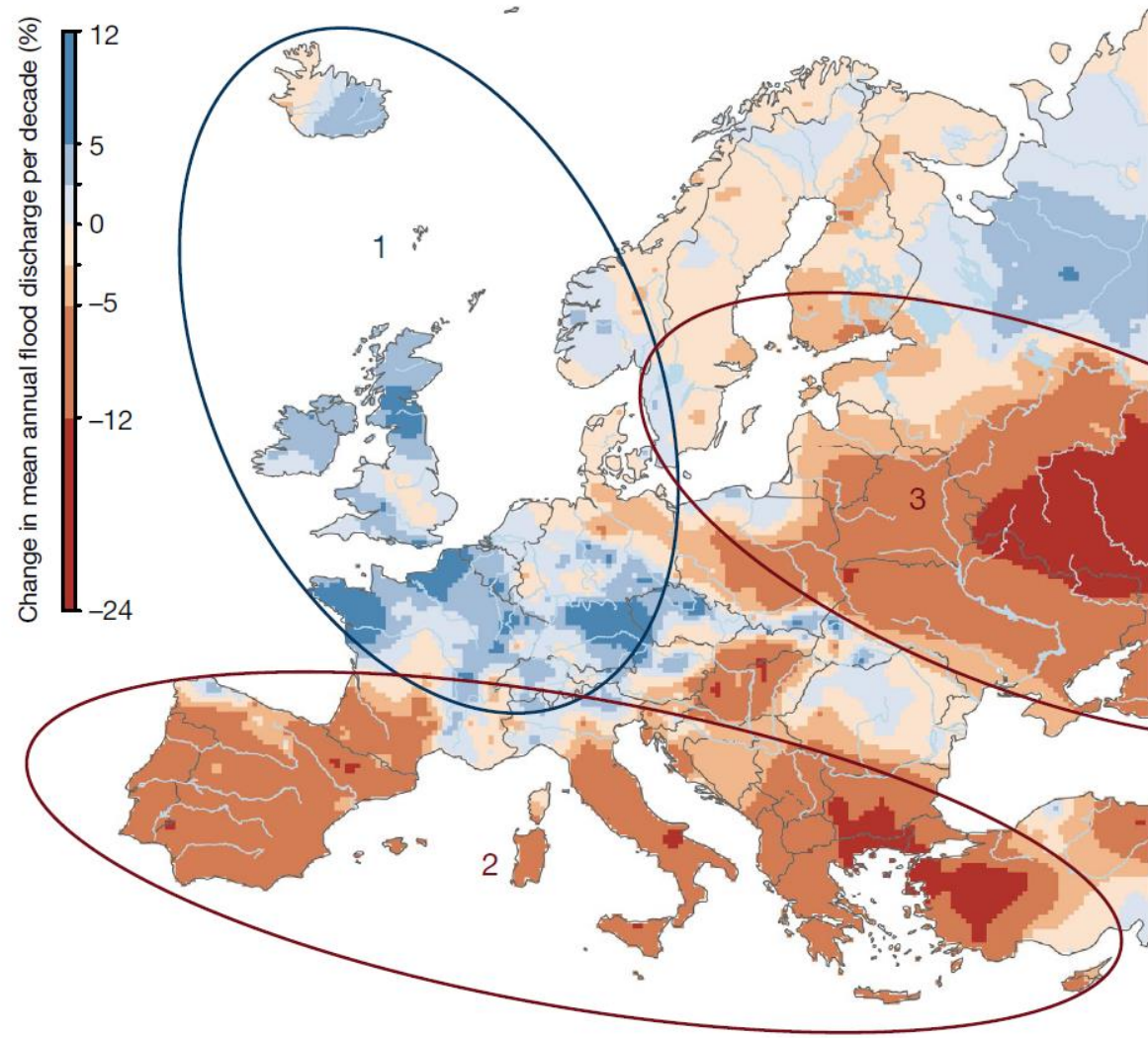
# No uniform historical changes in floods

Historical trends in the Mediterranean show a decline in flooding, despite an increase in intense rainfall.

Factors influencing flood trends :

- Changes in soil moisture
- Changes in the rainfall mechanisms that cause flooding
- Changes in land use (urbanization..)
- Changes in agricultural practices
- Effects of compensatory measures (soil sealing, dams..)

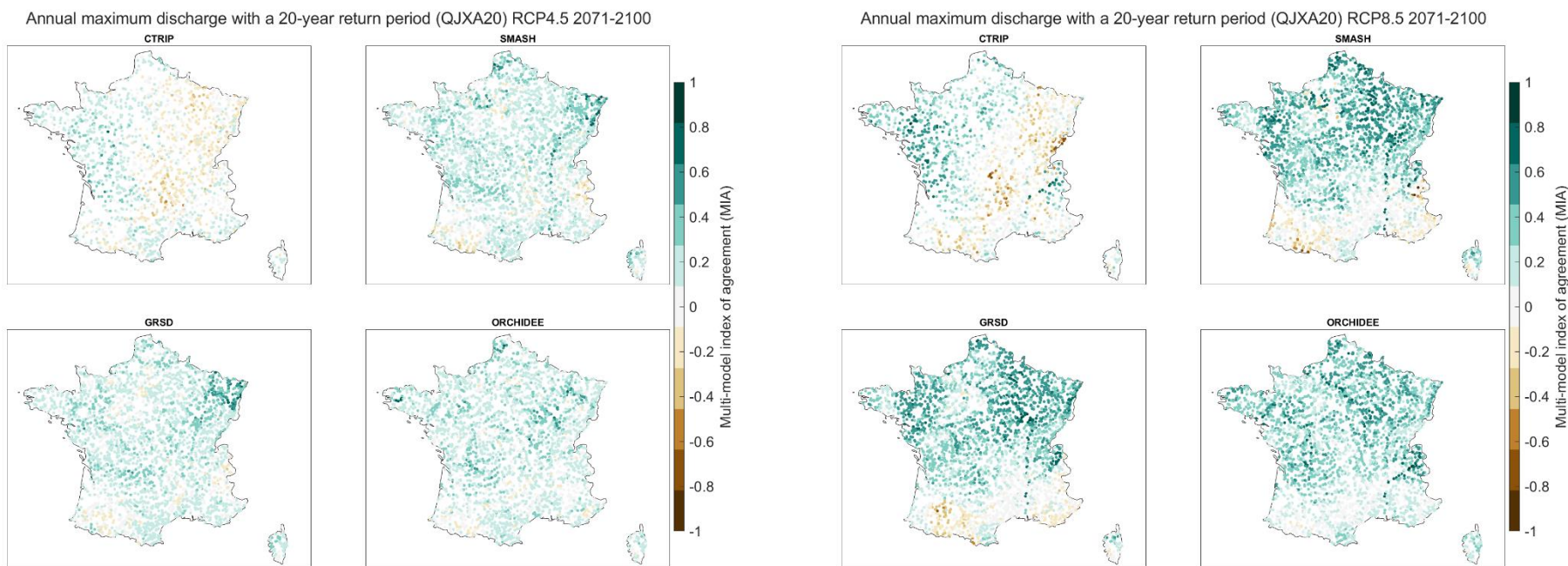
**(subtitle: it's not easy!)**



Observed regional trends of river flood discharges in Europe (1960–2010)

# Projections of floods

## Agreement between the models

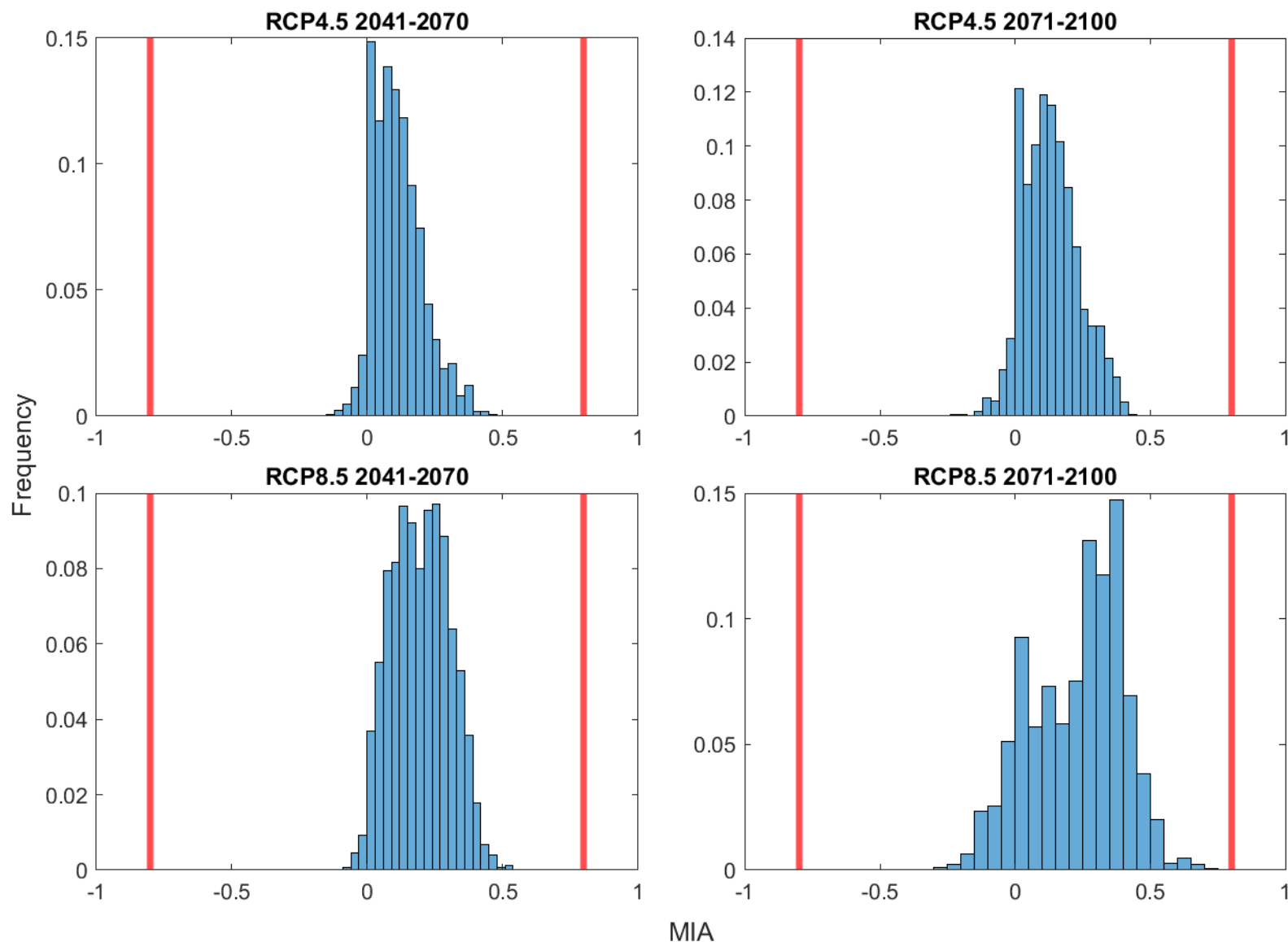


**Very small convergence between the models = signal not robust**

**Different signals with different hydrological models**



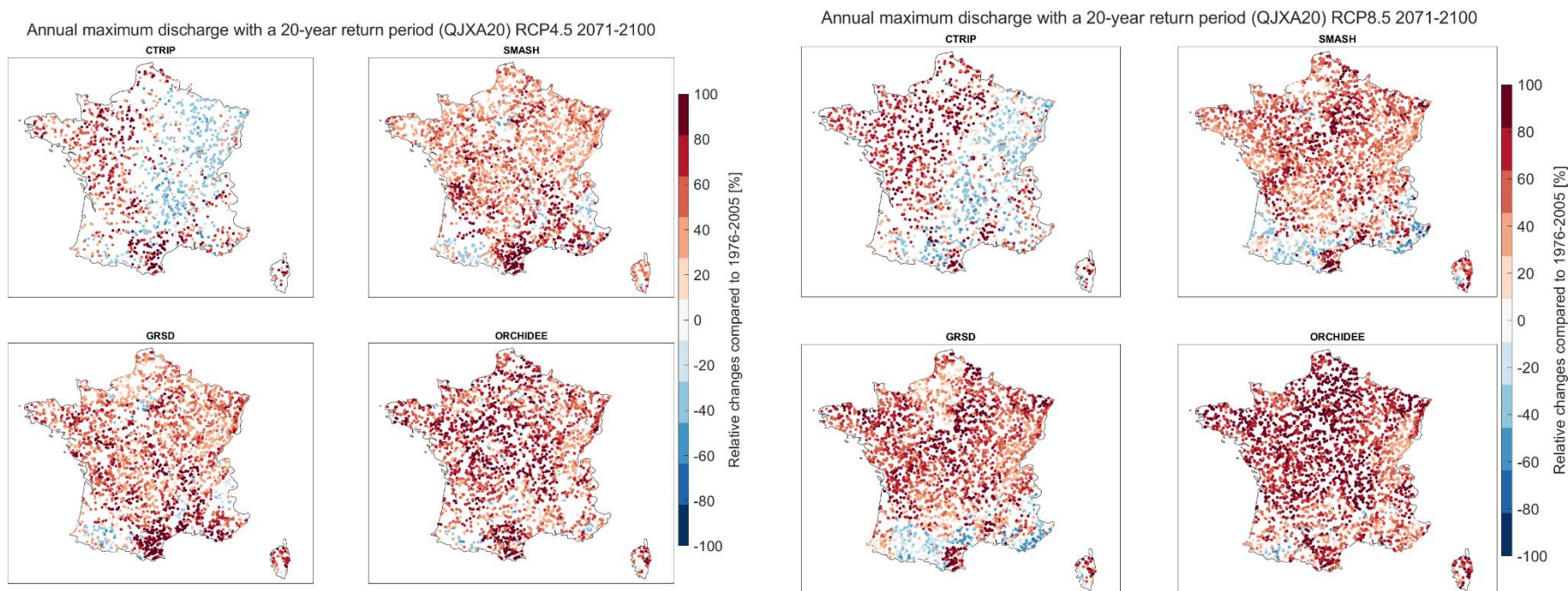
## Multi-model index of agreement for floods (QJXA20)





# Projections of floods

## Relative changes



**Misleading !**

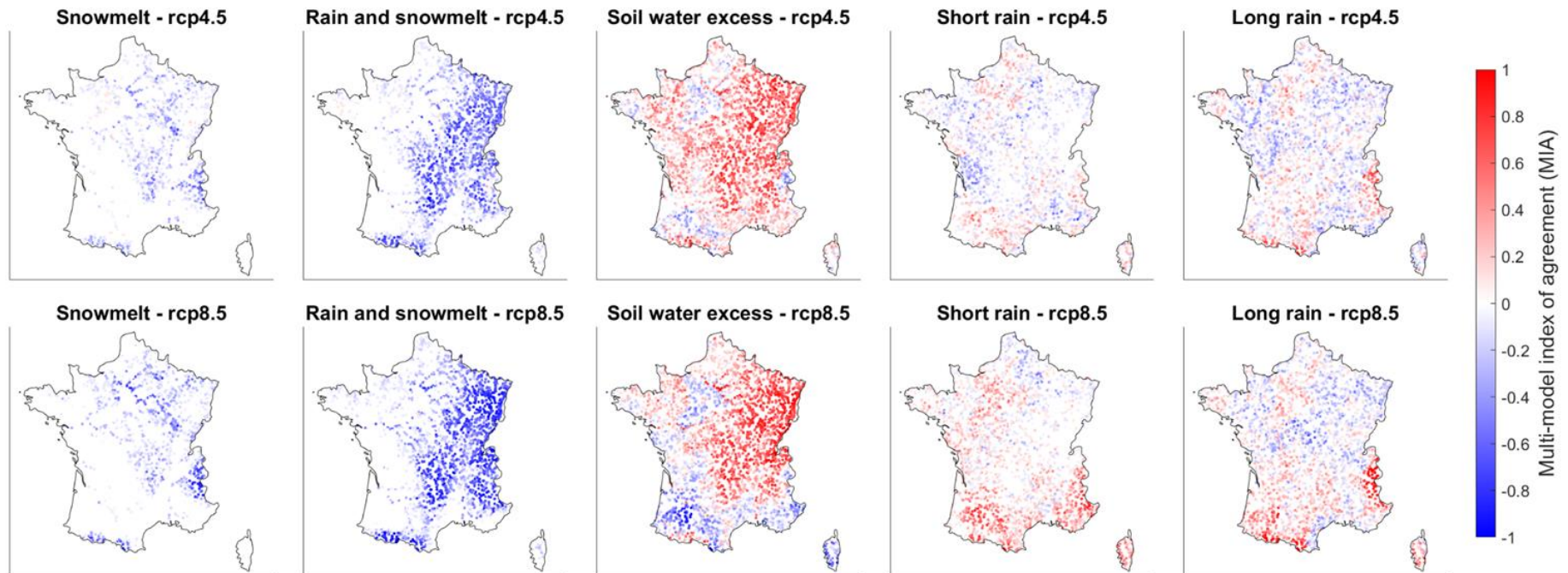
**Averaging different simulations gives more weight to outliers**

# Future changes in flood types

Soil Water Excess (*ie. saturation excess floods*)

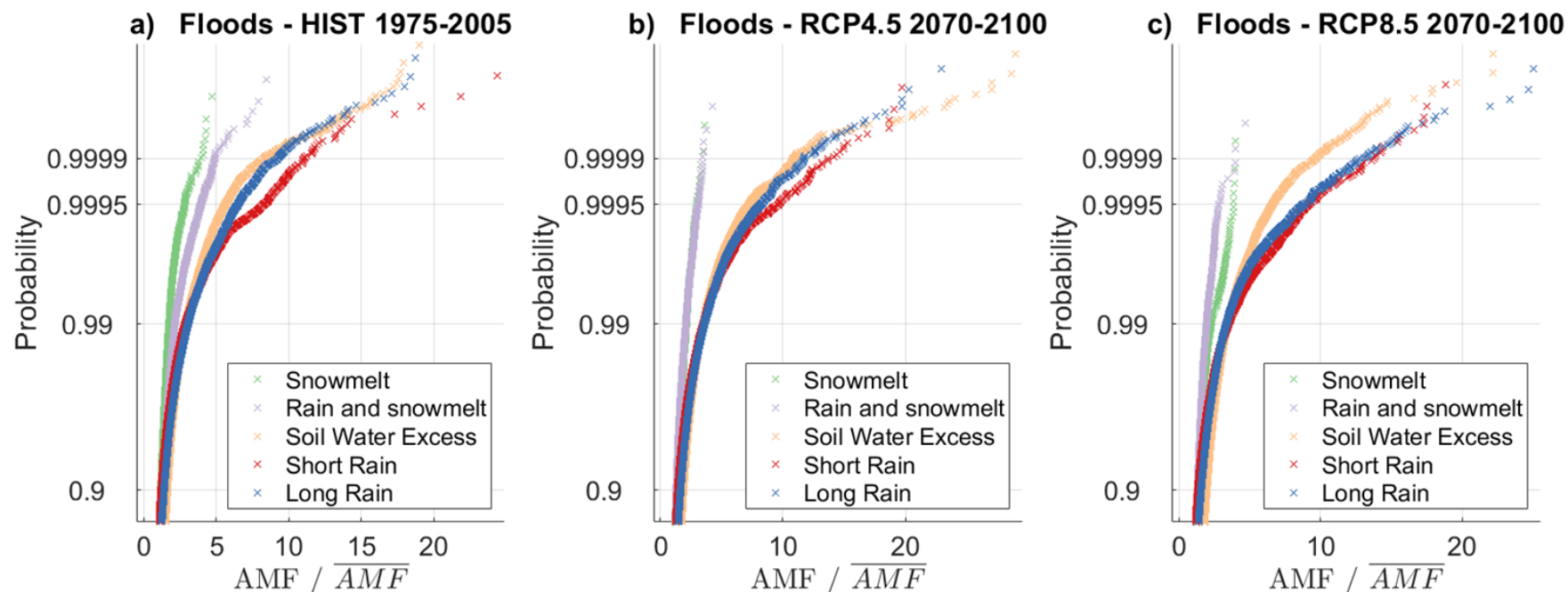
Short rain (*ie. short intense rainfall event on dry soils*)

Long rain (*ie. long rainfall event on dry soils*)



- Sharp decline of snowmelt-related floods
- Increasing percentage of Soil Water Excess floods in the East/Center
- Increase of rainfall-induced floods on dry soils, mostly in the southern and mountainous regions

# Changes in the severity of floods depending on the generating process



Severity of floods: Short rain > Long rain > Soil Water Excess > Rain and Snowmelt > Snowmelt

Not much change under RCP4.5, but with RCP8.5 increasing severity of the most extreme floods on dry soils (Short rain, Long rain)

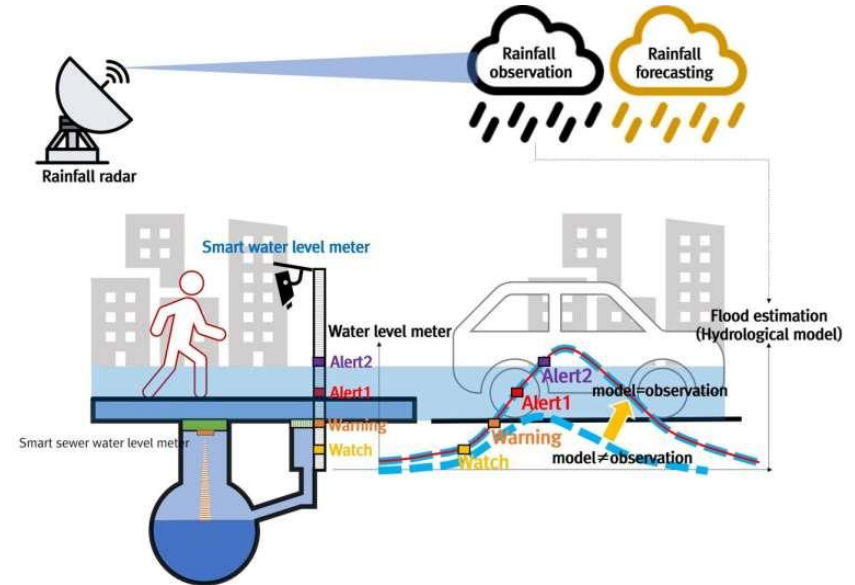


# Reducing the impacts of floods

Dams



## Real time monitoring and alert systems



## Improve soil infiltration



## Local protection measures



**The cheapest solution: don't build in flood-prone areas**



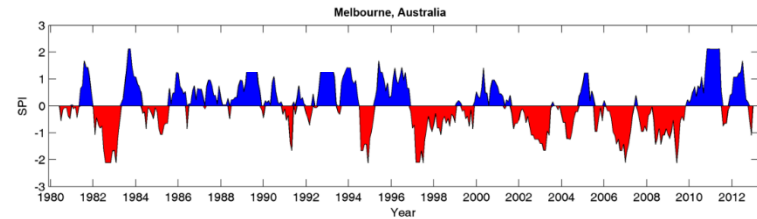
## 4- Climate change impacts on droughts





# Droughts, some definitions

1. Drought = water deficit over a more or less long period
2. Drought  $\neq$  aridity

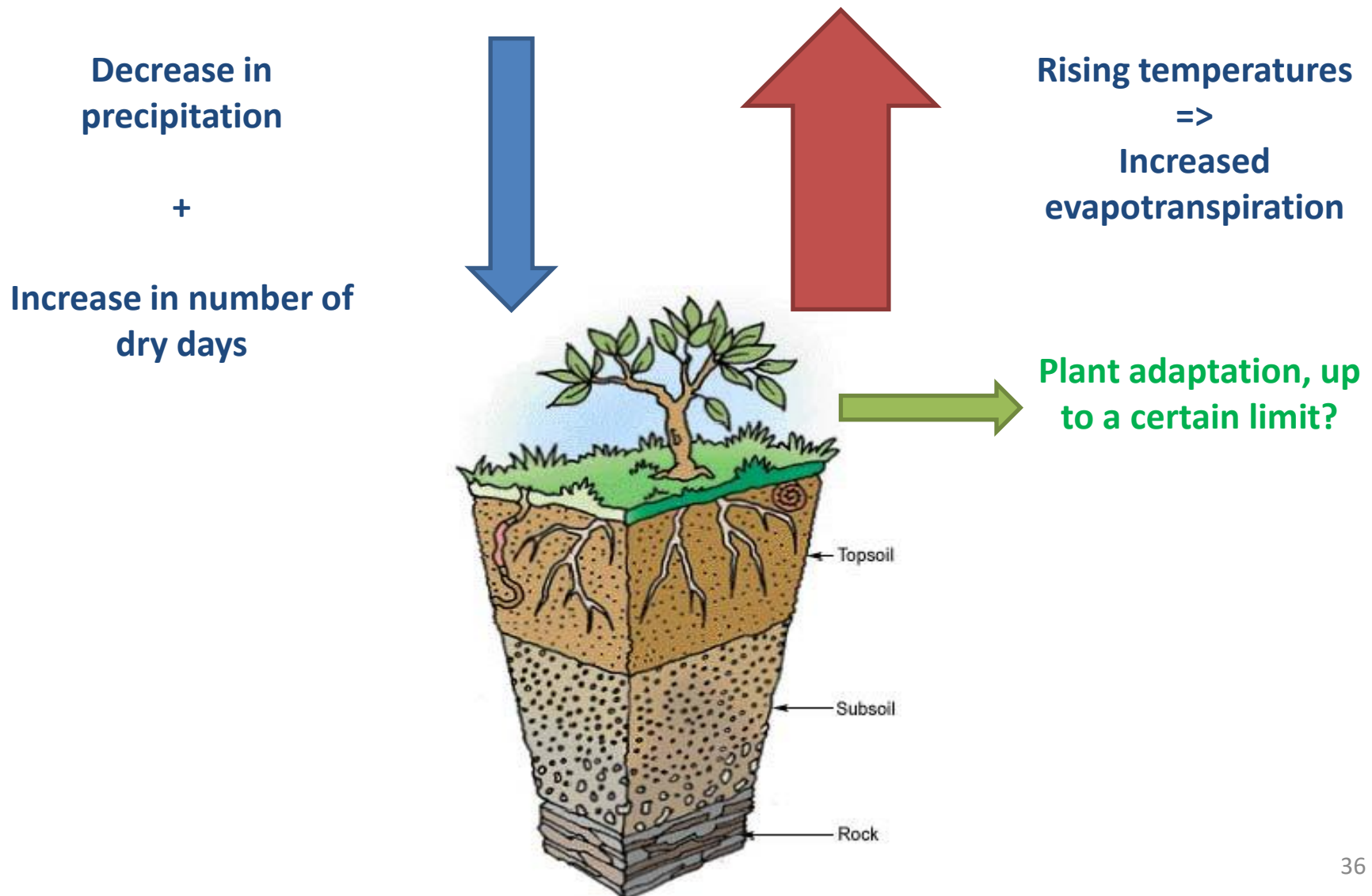


Different types of drought:

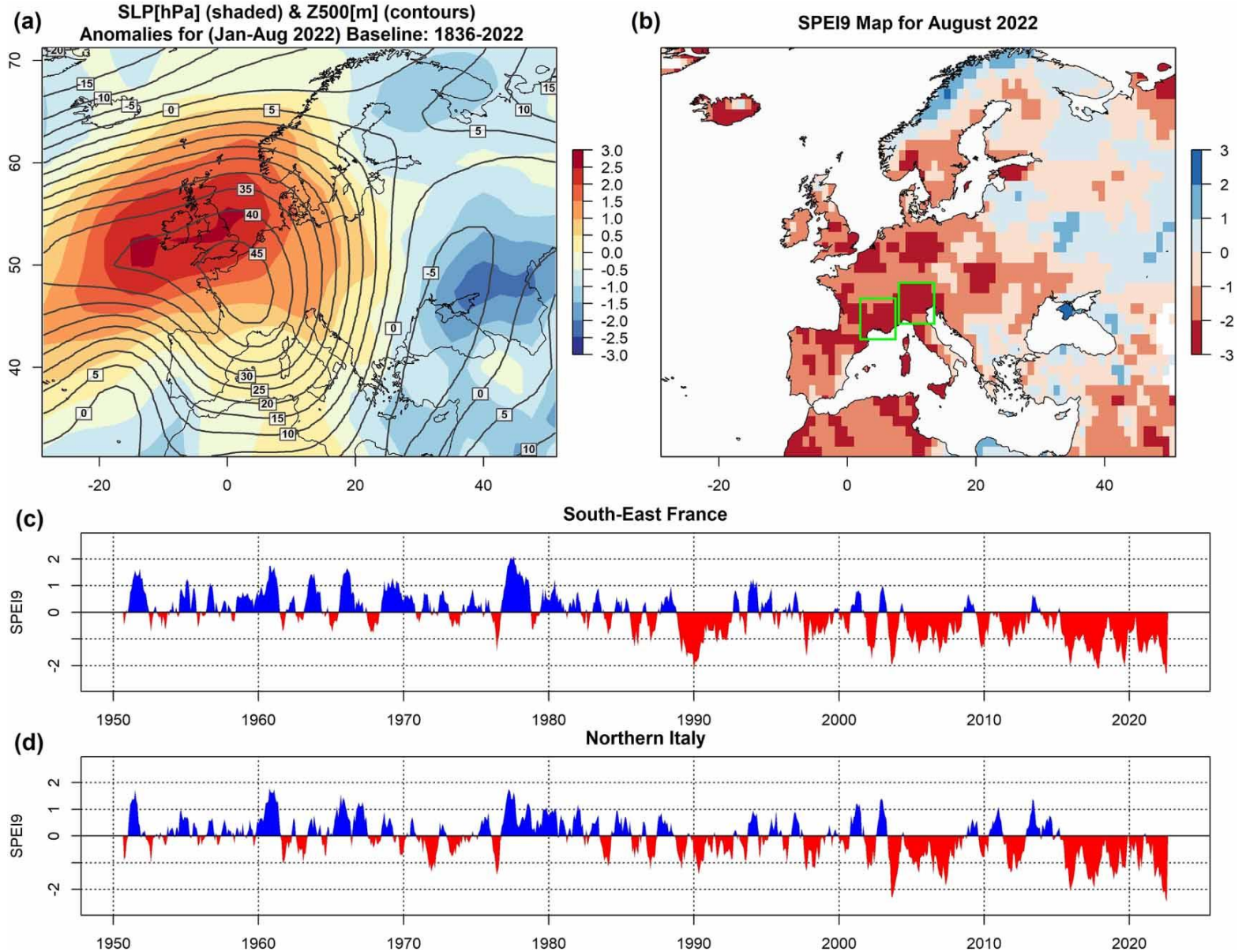
1. Meteorological: precipitation, zero or below average
2. Agronomic: soil moisture deficit (water content available to plants)
3. Hydrological: low water table and aquifer levels (absence or low base flow)



# Mechanisms of drought increase



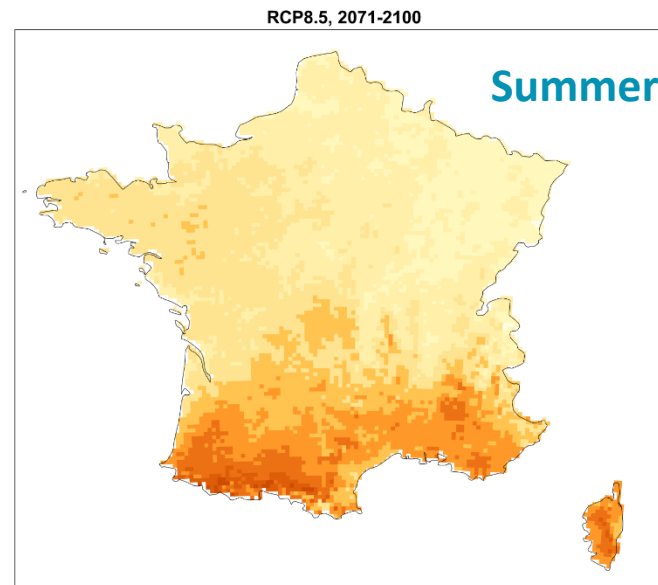
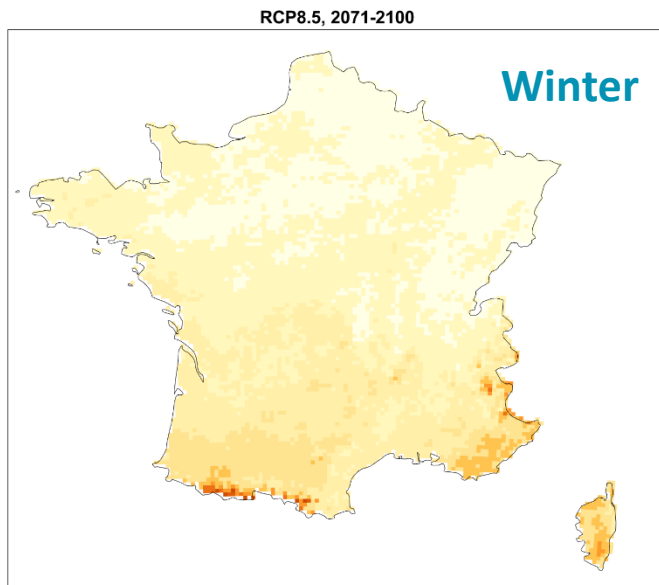
# Drought of 2022



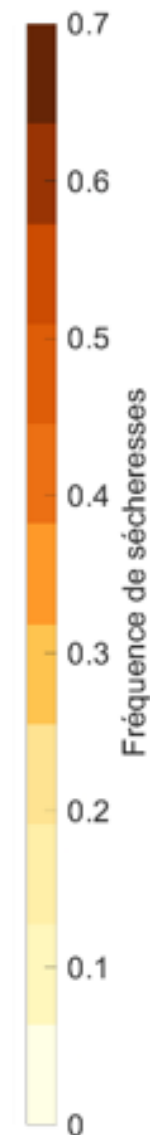
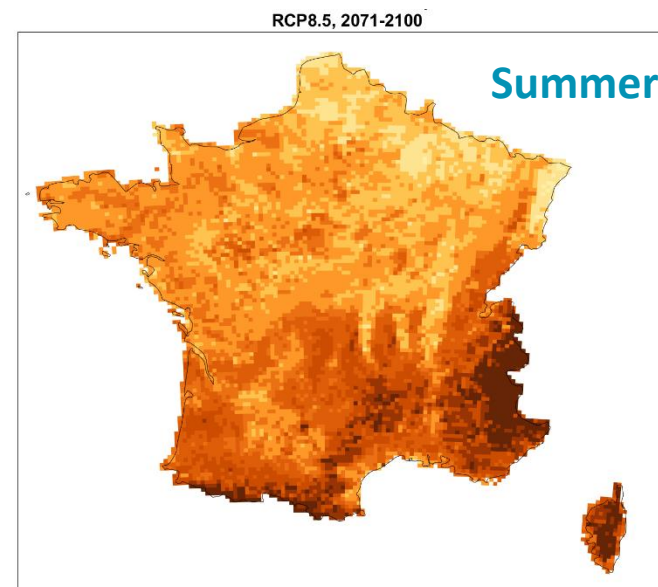
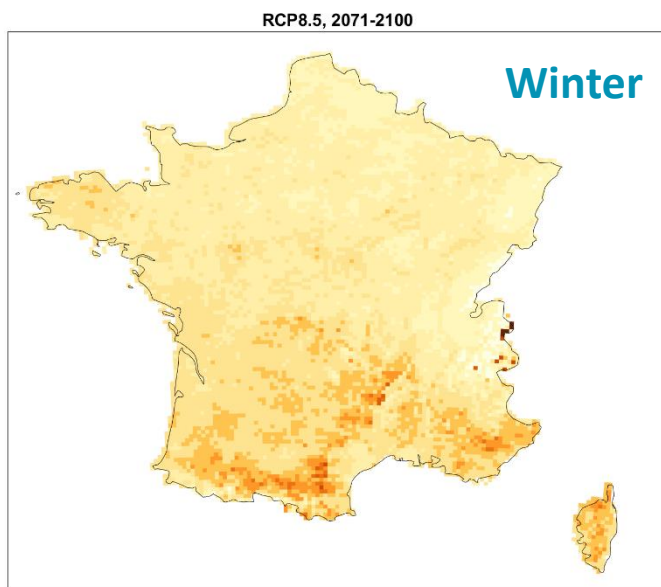


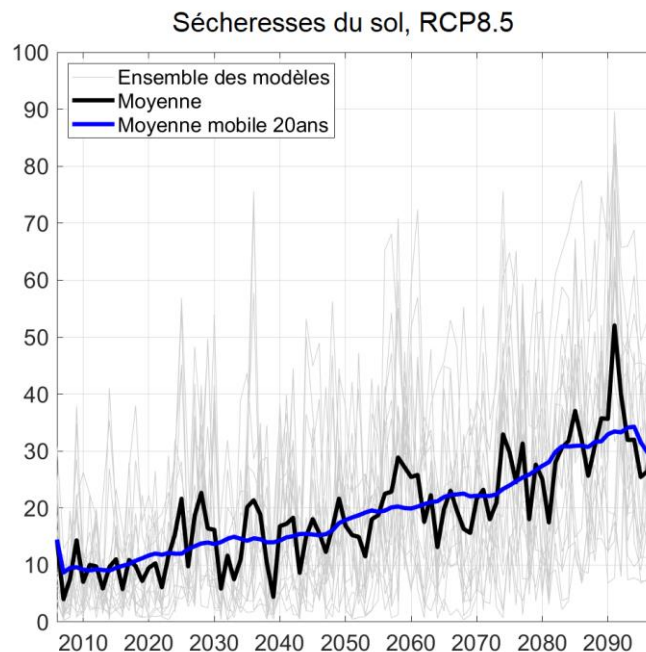
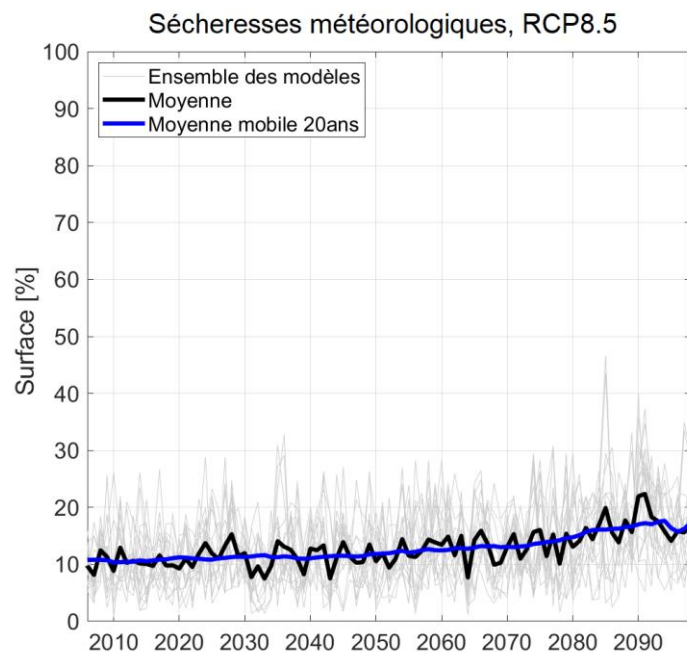
# Projections of meteo and soil moisture droughts

**Meteo**

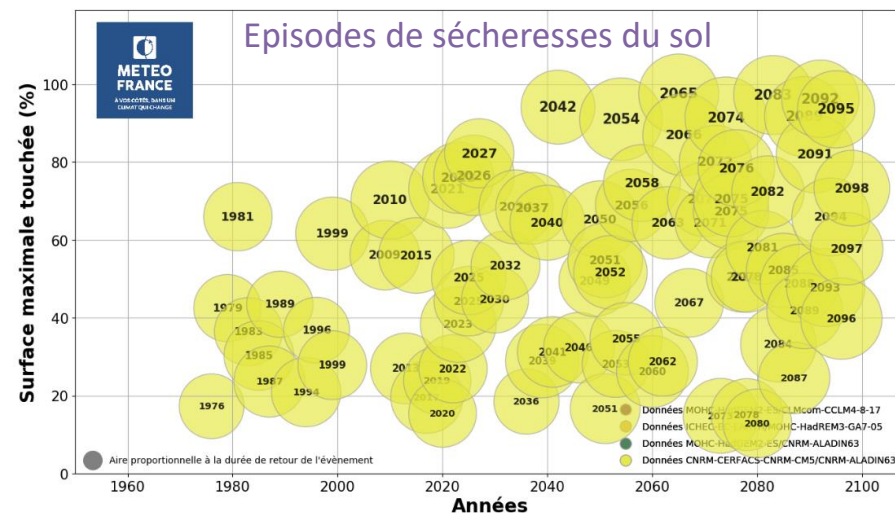
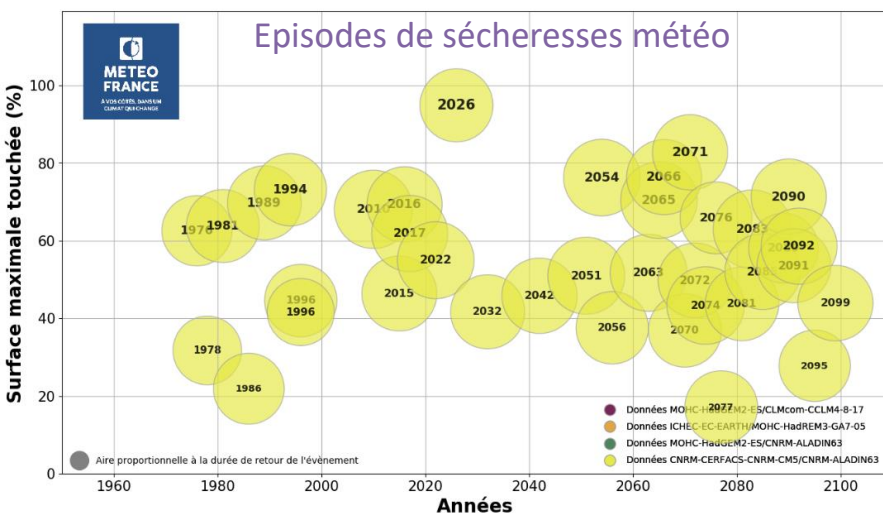


**Soil**





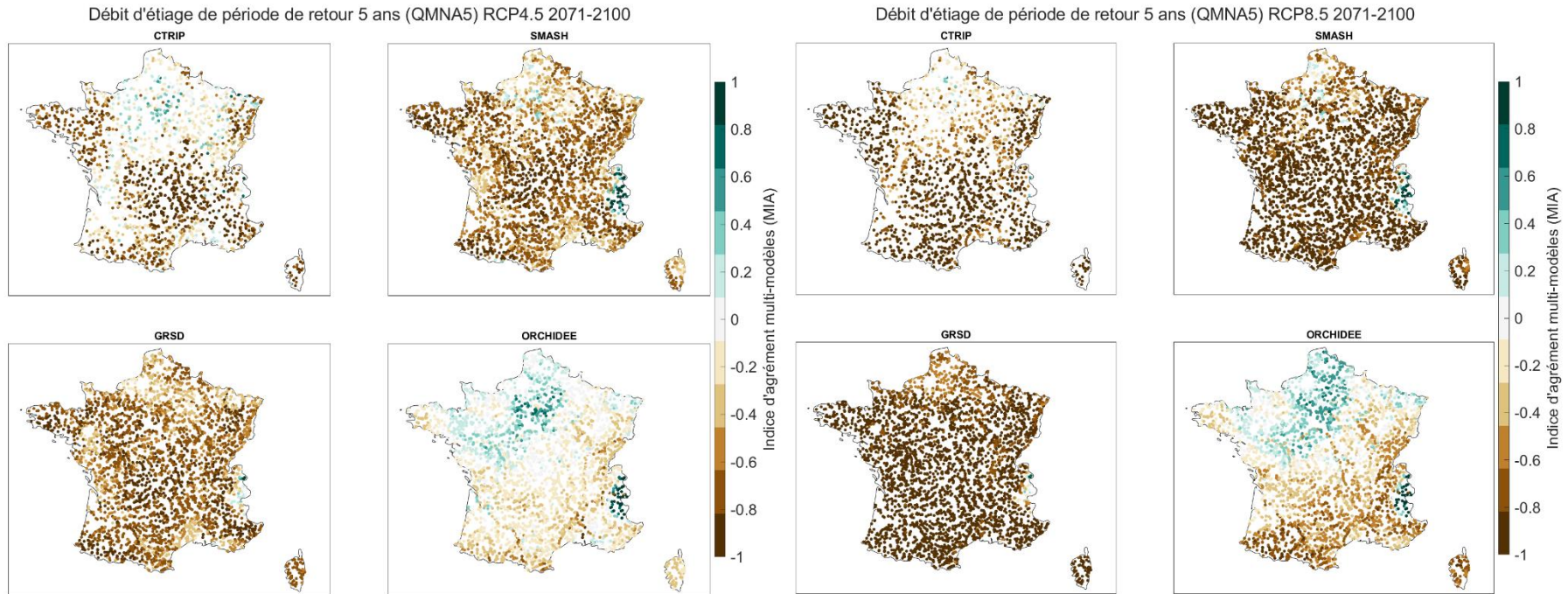
Evolution of the number of episodes (yellow storyline = small climate changes)





# Projections of hydrological droughts

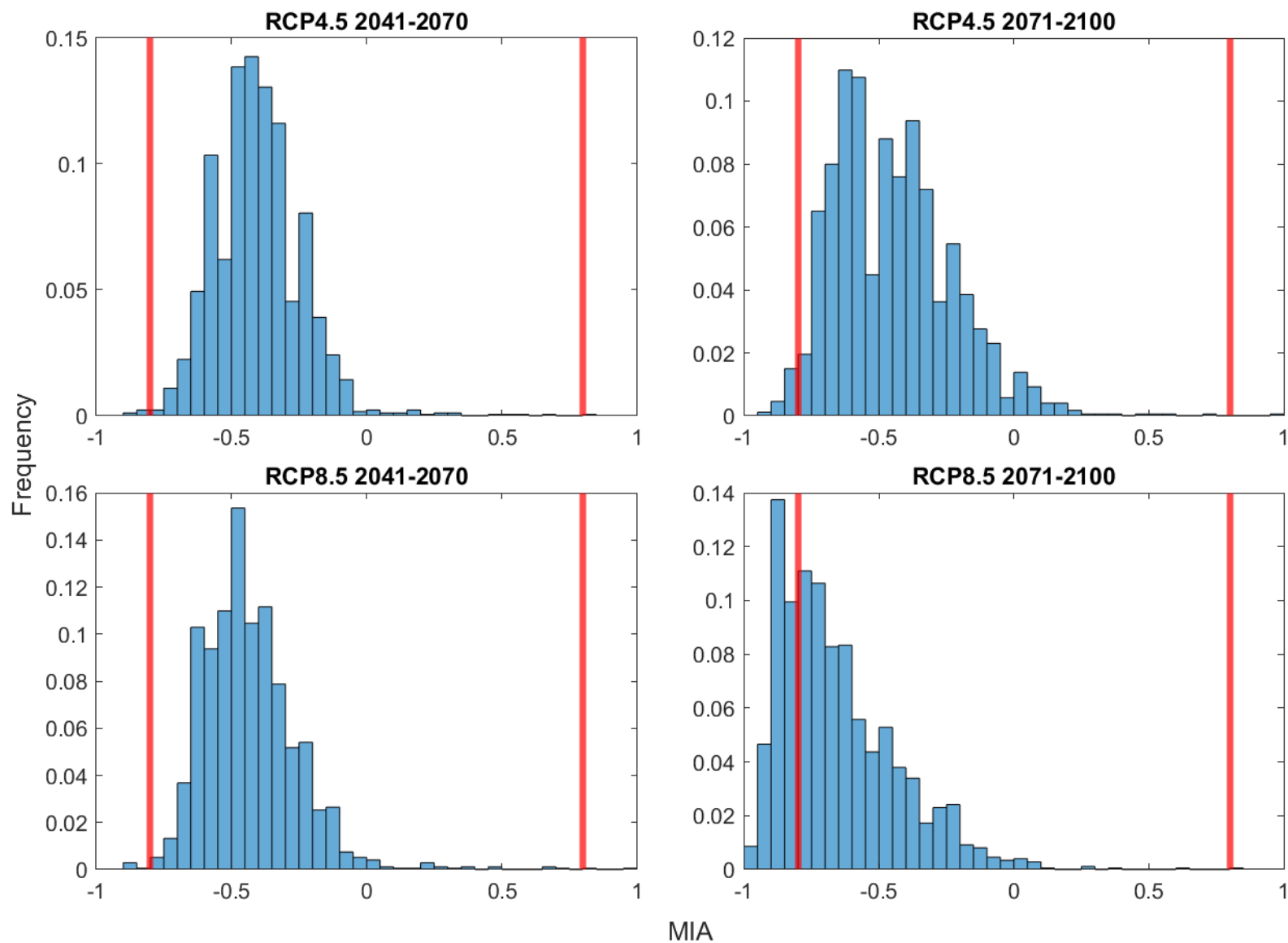
## Agreement between the models



**Good convergence towards an increase in hydrological drought severity**

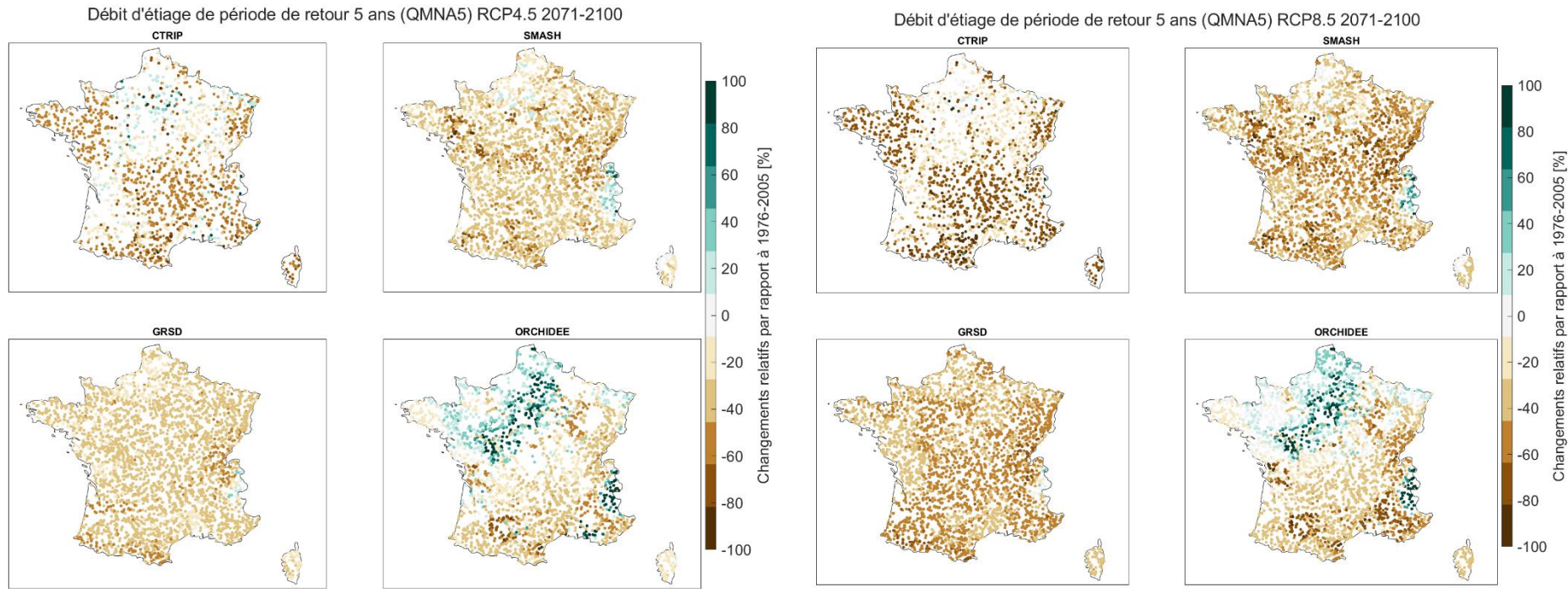
**Different signals with different hydrological models**

## Multi-model index of agreement for low flows (QMNA5)



# Projections of hydrological droughts

## Relative changes



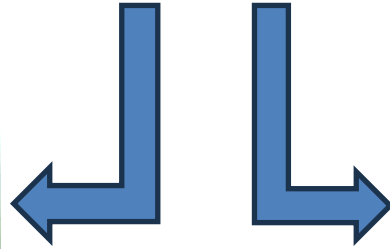
**Relative changes up to -40 / -50%**

**Different signals with different hydrological models for some regions = uncertainties on the representation of low flow processes**



# Which solutions ?

- Greater sobriety in water use
- Improving network efficiency
- Large-scale/small-scale infrastructures?



Observation: we're going to have less and less water.  
Should we have more irrigation?



## WATER

# The paradox of irrigation efficiency

Higher efficiency rarely reduces water consumption

By R. Q. Grafton<sup>1,2</sup>, J. Williams<sup>1</sup>, C. J. Perry<sup>2</sup>, F. Molle<sup>2</sup>, C. Ringler<sup>2</sup>, P. Steduto<sup>2</sup>, B. Udall<sup>2</sup>, S. A. Wheeler<sup>2</sup>, Y. Wang<sup>2</sup>, D. Garrick<sup>10</sup>, R. G. Allen<sup>11</sup>

Reconciling higher freshwater demands with finite freshwater resources remains one of the great policy dilemmas. Given that crop irrigation constitutes 70% of global water extractions, which contributes up to 40% of globally available calories (1), governments often support increases in irrigation efficiency (IE), promoting advanced technologies to improve the “crop per drop.” This provides private benefits to irrigators and is justified, in part, on the premise that increases in IE “save” water for reallocation to other sectors, including cities and the environment. Yet substantial scientific evidence (2) has long shown that

increased IE rarely delivers the presumed public-good benefits of increased water availability. Decision-makers typically have not known or understood the importance of basin-scale water accounting or of the behavioral responses of irrigators to subsidies to increase IE. We show that to mitigate global water scarcity, increases in IE must be accompanied by robust water accounting and measurements, a cap on extractions, an assessment of uncertainties, the valuation of trade-offs, and a better understanding of the incentives and behavior of irrigators.

## LOGIC AND LIMITS

Field IE is the ratio of the volume of all irrigation water beneficially used on a farmer's field [predominantly, evapotranspiration (ET) by crops and salt removal to maintain soil productivity] to the total volume of irrigation water applied (adjusted for changes in water

stored for irrigation in the soil) (2). Annually, governments spend billions of dollars subsidizing advanced irrigation technologies, such as sprinklers or drip systems (3). Sometimes their goal is to increase IE on the understanding that this will allow water to be reallocated from irrigation to cities (4), industry, or the environment, while maintaining or even increasing agricultural production.

But water saved at a farm scale typically does not reduce water consumption at a watershed or basin scale. Increases in IE for field crops are rarely associated with increased water availability at a larger scale (5), and an increase in IE that reduces water extractions may have a negligible effect on water consumption. This paradox, that an increase in IE at a farm scale fails to increase the water availability at a watershed and basin scale, is explained by the fact that previously nonconsumed water “losses” at a farm scale (for ex-



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## Water conservation in irrigation can increase water use

Frank A. Ward<sup>a,1</sup> and Manuel Pulido-Velazquez<sup>b</sup>

<sup>a</sup>Department of Agricultural Economics and Agricultural Business, New Mexico State University, Las Cruces, NM 88003; and <sup>b</sup>Department of Hydraulic and Environmental Engineering–Institute of Water and Environmental Engineering, Universidad Politécnica de Valencia, Cami de Vera s/n 46120 Valencia, Spain

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