

From high-resolution global climate modelling to precipitation downscaling

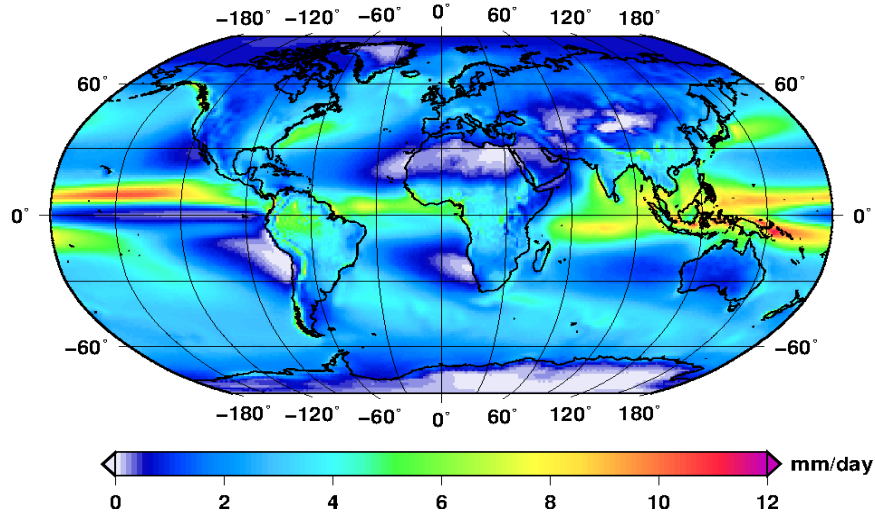


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with: E. Palazzi, S. Terzago, P. Davini,
D. D'Onofrio, S. Corti, A. Provenzale



Global climate model

Total precipitation annual mean 1951–2007



Impact on
eco-hydrological processes



Regional climate model

WRF 0.0375 deg/ 2000–10–11 21h00 3h average

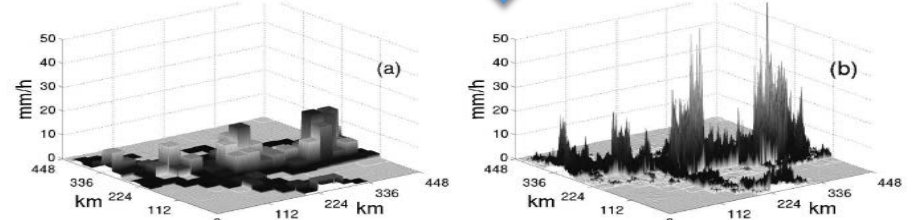
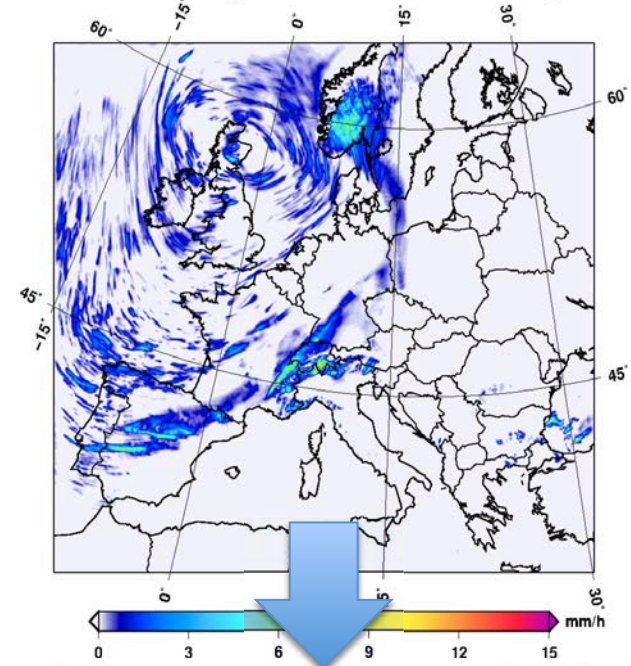


FIG. 10. (a) A snapshot of the forecasted rain field obtained from the LAM forecast and (b) one example of a downscaled field obtained by application of the RainFARM. The vertical scale indicates precipitation intensity (mm h⁻¹) and it is the same for the two fields.

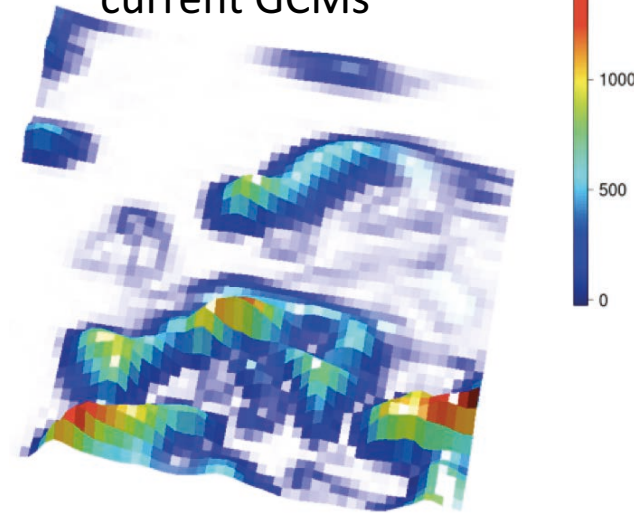
Statistical/stochastic
downscaling

THE ROLE OF HORIZONTAL RESOLUTION FOR GLOBAL CLIMATE MODELS

- The current-generation of relatively low-resolution climate models:
 - Underestimate the number of observed storms
 - Simulate poorly midlatitude atmospheric blocking
 - Systematic errors which impact on weather regimes, regional variability
- High resolution climate models show improved representation of
 - the global water cycle (Demory et al. 2014)
 - Interannual variability of tropical cyclone counts (Strachan et al. 2013)
 - Large scale circulation (jet streams)
 - Euro-Atlantic Blocking (Jung et al., 2012)
 - Madden-Julian oscillation (Peatman et al., 2015)
 - Heat waves, droughts (Van Haren et al., 2015)

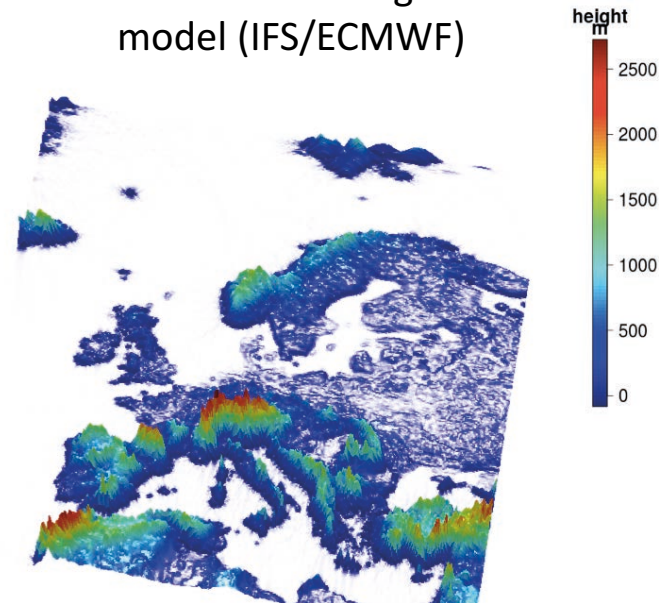
80-125 Km

Typical resolution of current GCMs



16 Km

Operational resolution of a state-of-the-art global weather model (IFS/ECMWF)



IMPROVEMENTS IN THE REPRESENTATION OF THE GLOBAL HYDROLOGICAL CYCLE WITH HIGHER RESOLUTION

- Classic GCMs too dependent on physical parameterisation because of unresolved atmospheric processes
- Role of resolved sea → land transport larger at high resolution
- Changes in moisture recycling, transport and moisture convergence over land → **convergence only below 60km in resolution**

Demory et al., Clim. Dyn., 2014

Equivalent resolution at 50N:
 270 km 135 km 90 km
 60 km 40 km 25 km

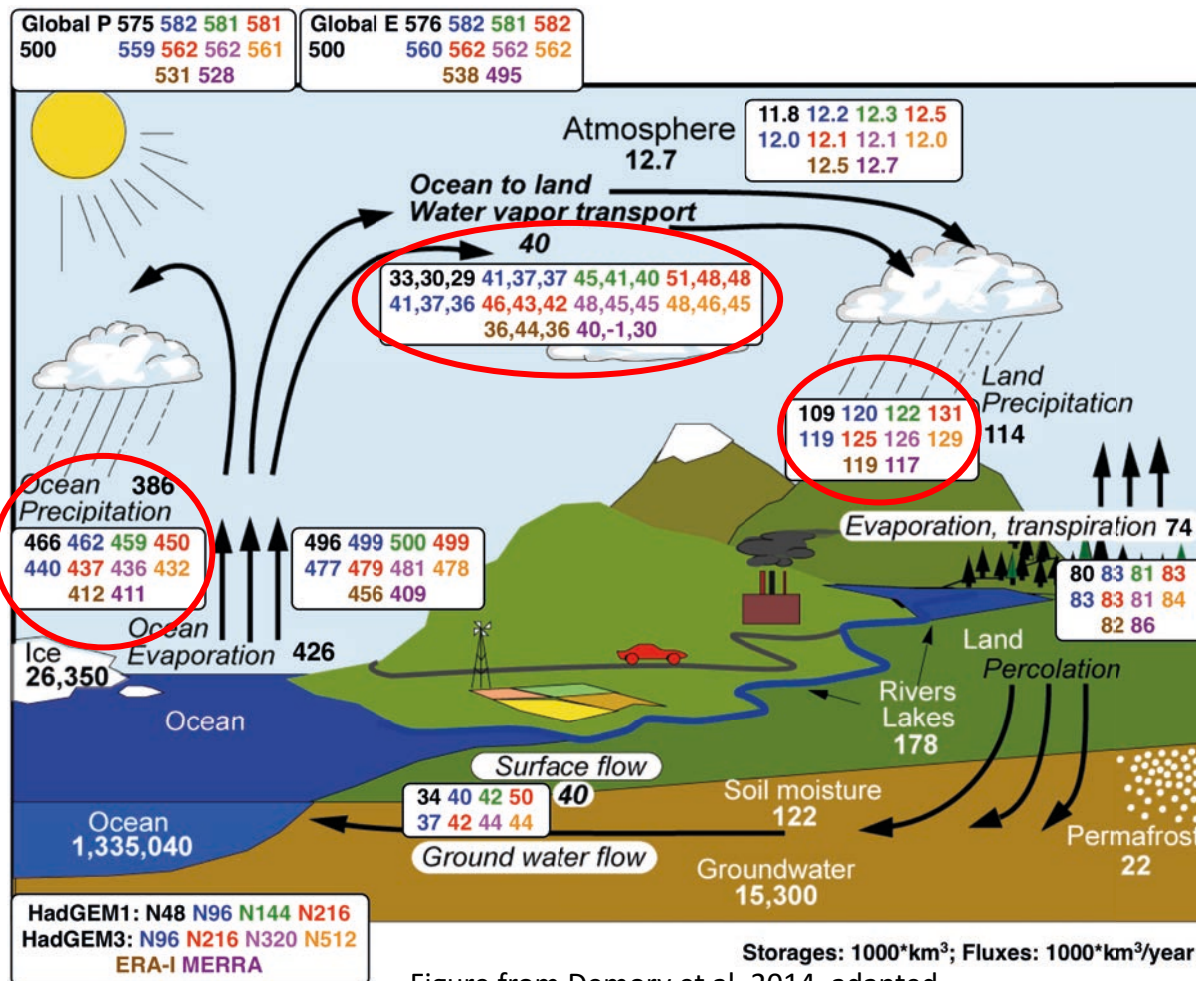
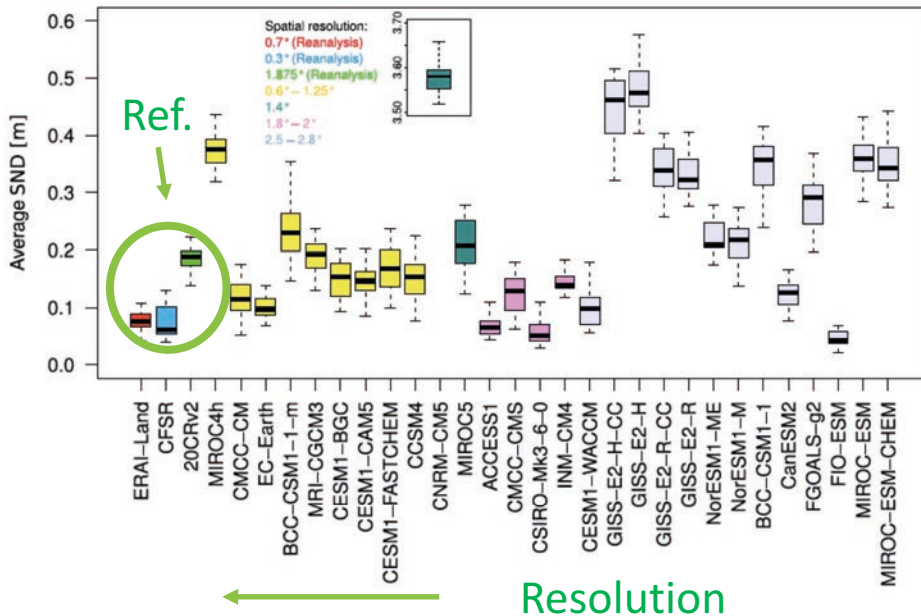


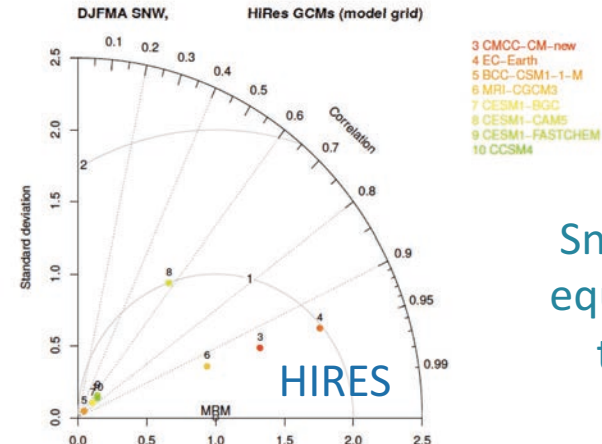
Figure from Demory et al. 2014, adapted from Trenberth et al, 2007, 2011

SNOW DEPTH AND SNOW-WATER EQUIVALENT IN HIGH-RESOLUTION MODELS

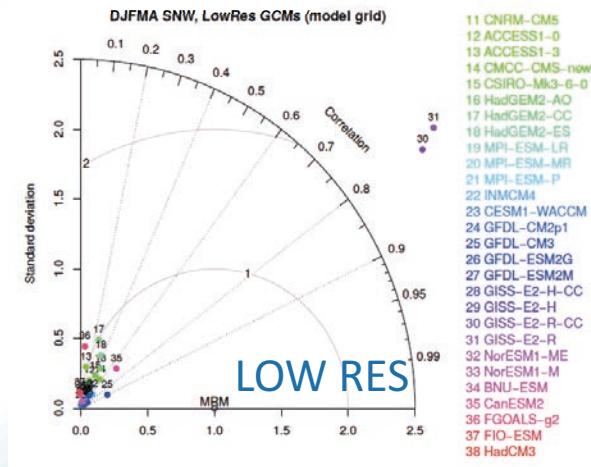
Average snow depth in the Himalayan region for CMIP5 models



Terzago et al. 2014, Snowpack Changes in the Hindu Kush-Karakoram-Himalaya from CMIP5 Global Climate Models, *Journal of Hydrometeorology*, 15 (6), 2293-2313



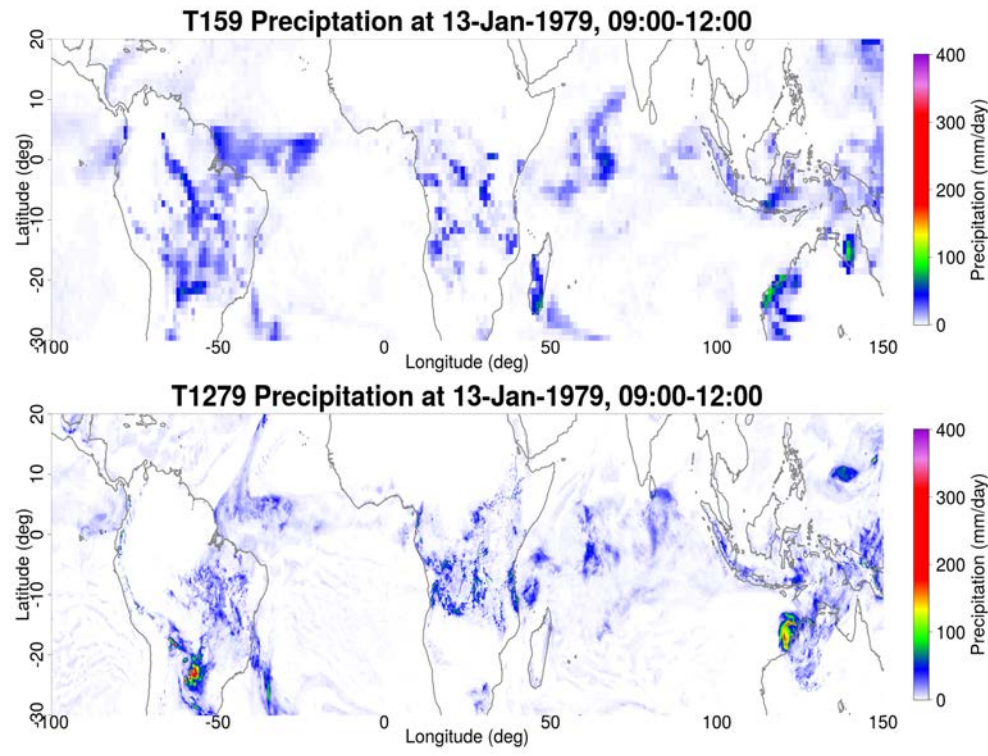
Snow-water equivalent in the Alps



Terzago et al. 2017, Snow water equivalent in the Alps as seen by gridded datasets, CMIP5 and CORDEX climate models, *The Cryosphere, sub judice*

HIGH-RESOLUTION CLIMATE MODELING

- Impact of small-scale processes on large-scale atmospheric motion → Importance of representing small scale processes.
- **High-resolution global climate modeling** has the potential to improve significantly the representation of climate variability, circulation regimes, extremes and transport.
- ***BUT*** high-resolution is computationally expensive, particularly in fully coupled models and the same model parameterizations may not be suitable

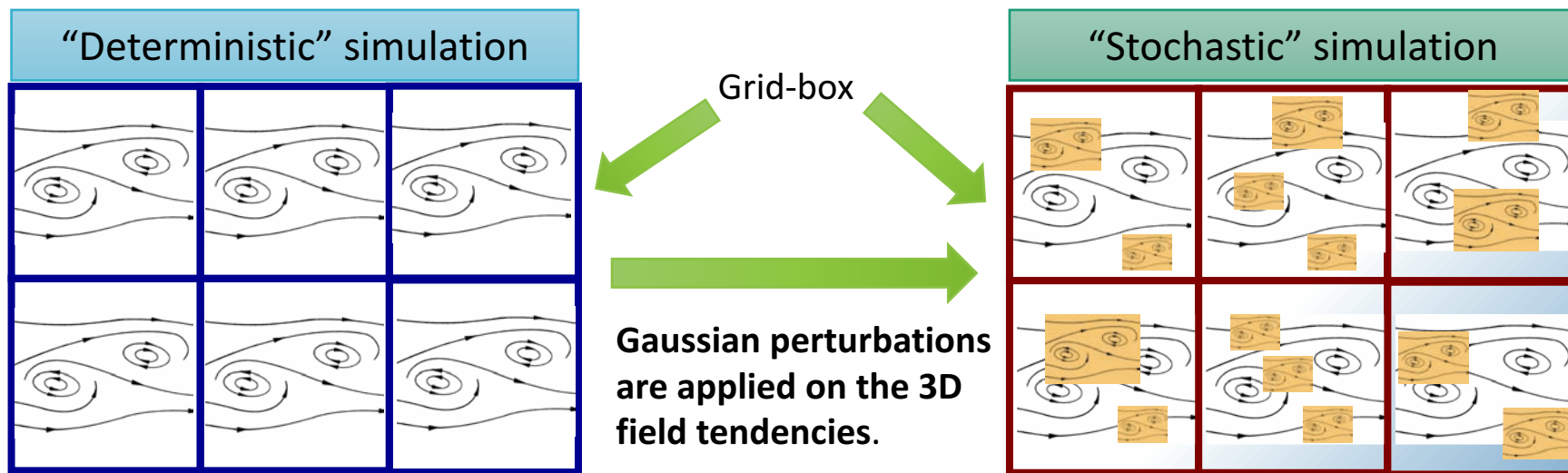


16 km

STOCHASTIC PHYSICS PARAMETERIZATIONS

Instead of explicitly resolving small-scale processes by increasing the resolution of climate models, a **computationally cheaper** alternative is to **use stochastic parameterization schemes** (Palmer 2012).

A stochastic scheme includes a **statistical representation of the small scales**, and hence is able to represent the impact of such small-scale processes on the resolved scale.



There is mounting evidence that stochastic parameterizations are beneficial for climate variability in GCM simulations (Dawson et al, 2012):

- Better representation of flow regimes
- Reduction of systematic biases

Climate SPHINX (Stochastic Physics High Resolution Experiments) is a supercomputing **PRACE** project (2015-2016) investigating **high-resolution** climate simulations and the role of **stochastic parameterizations**



Stochastic Physics High resolution eXperiments

- **20 million of core hours** on **Supermuc** @ LRZ Computing Center, Garching, Germany + **10 million** core hours on **Marconi** @ CINECA, Italy
- About **150 TB** of post-processed data available
- More than 110 ensemble members at resolutions from 125 to 16km available.



Model:
global climate model
with additional tuning.

See:

Davini P., von Hardenberg J., Corti S., Christensen H., Juricke S., Subramanian A., Watson P., Weisheimer A., Palmer T. N.,
Climate SPHINX: evaluating the impact of resolution and stochastic physics parameterisations in climate simulations,
Geosci. Model Dev., in press, doi:10.5194/gmd-2016-115



EXPERIMENTS & RESOLUTIONS

**Atmospheric-only:
5 horizontal resolutions**

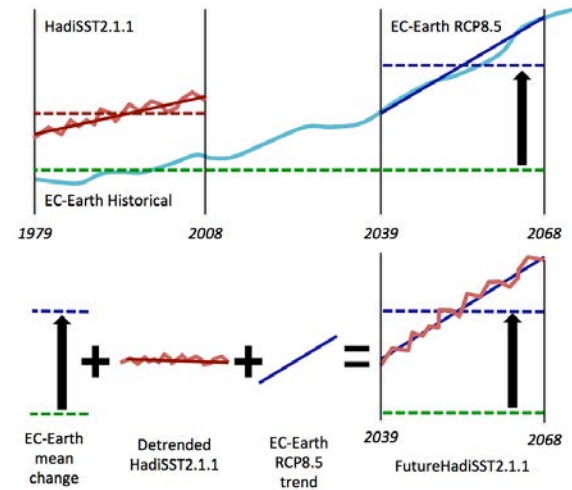
*Present day
1979-2008*

*Future Scenario
2039-2068 RCP85*

- More than 110 simulations
- About 5000 model years of simulation



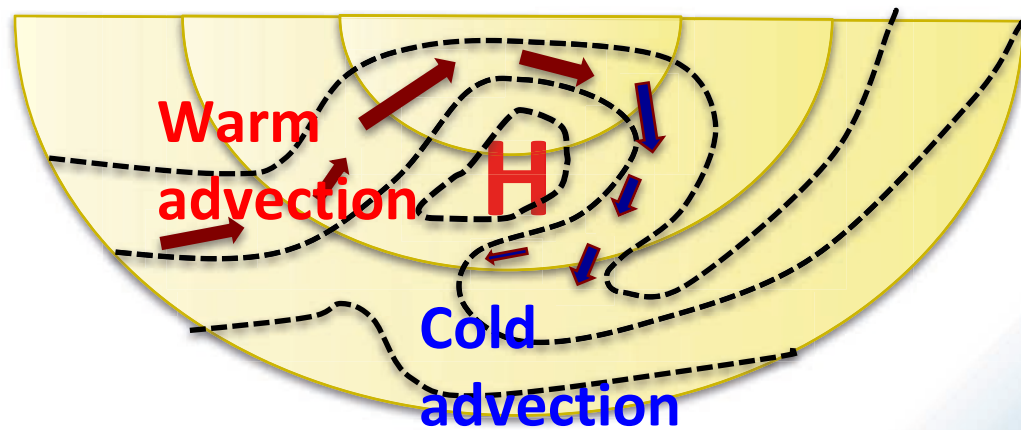
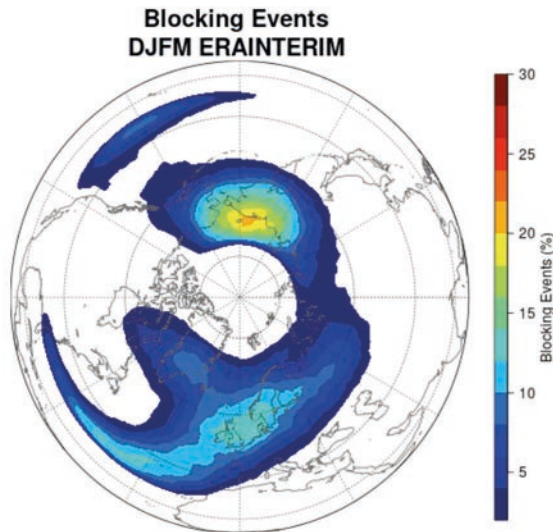
**Coupled: T255L91
1850-2100, historical + RCP8.5**



T159L91 (125km): 10+10 ensemble members
T255L91 (80km): 10+10
T511L91 (40km): 5+5
T799L91 (25km): 3+3
T1279L91 (16km): 1+1

ATMOSPHERIC BLOCKING

- Atmospheric blocking describes a mid-latitude weather pattern where a **quasi-stationary high-pressure system** modifies the westerly flow, “blocking” (or at least diverting) the eastward movement of the migratory cyclones (Rex, 1950).
- Blocking affects leading to **cold spells in winter (when it is more frequent)** and **heat waves in summer**.



- Evaluation of winter (DJFM) **atmospheric blocking** using the 2D index extension of Tibaldi and Molteni (Davini et al 2012) in the present day (30 years).
- Blocking over the **Pacific** and the **Atlantic**, at the exit of the jet stream.
- **Long-standing issue in GCMs**, large negative bias over Europe even in CMIP5 models.

RESULTS: BLOCKING

Improvements in atmospheric blocking with increasing resolution.

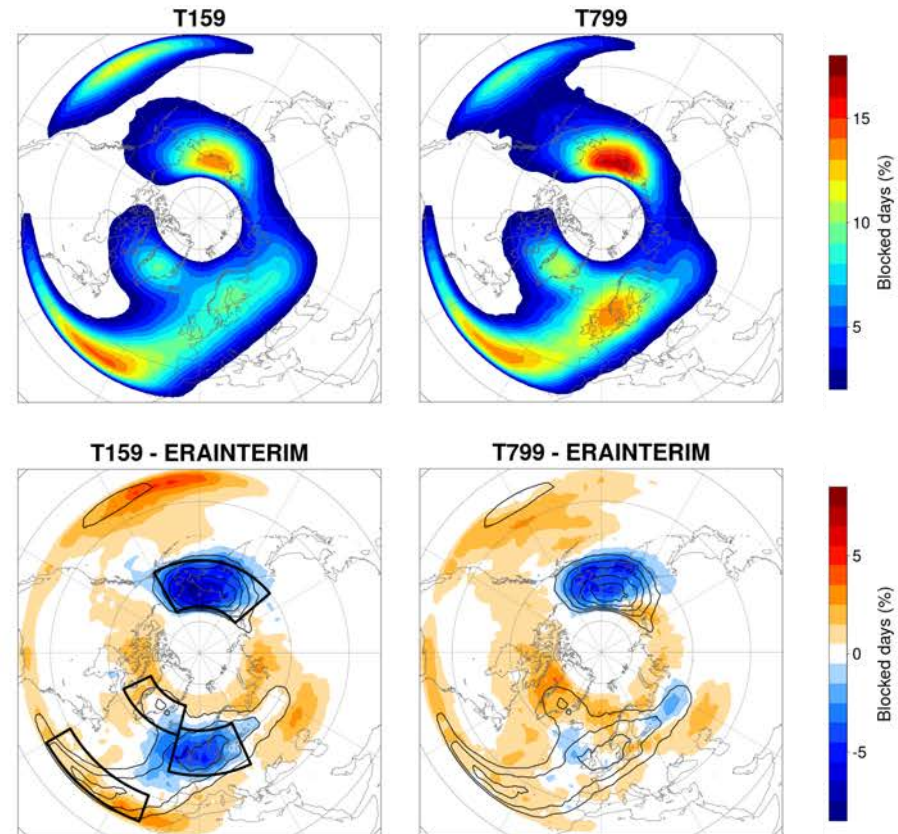
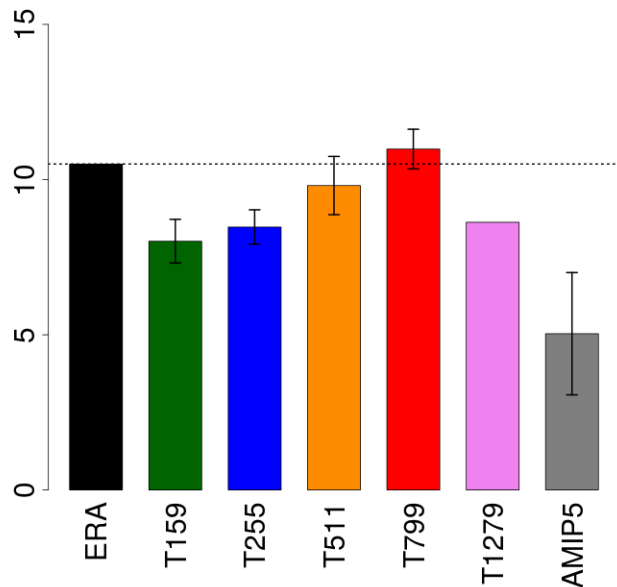
Winter (DJFM) , Present Day

125 km resolution

40 km resolution

Way better than any CMIP5 models

Euro Blocking frequency

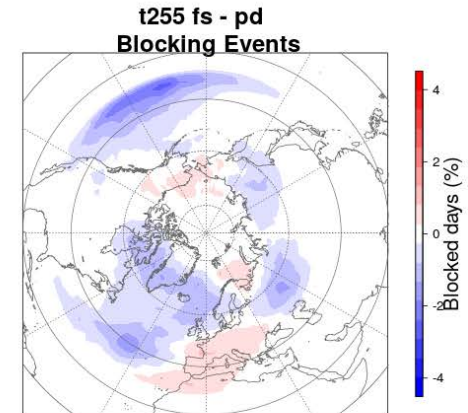
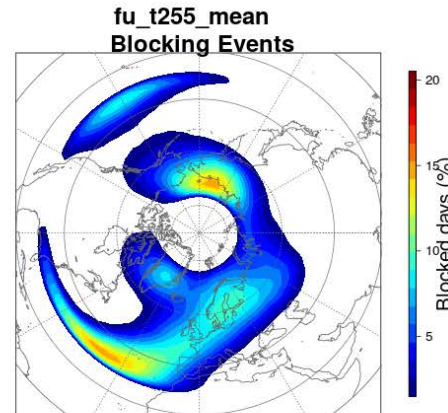
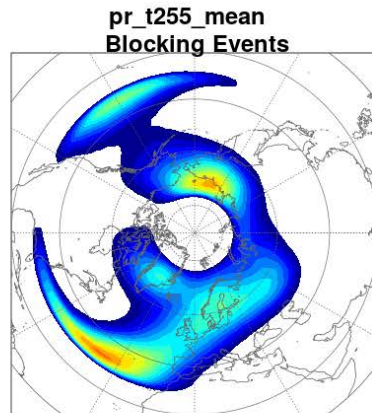


RESULTS: BLOCKING

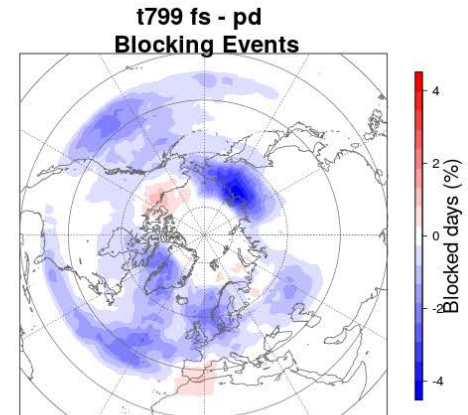
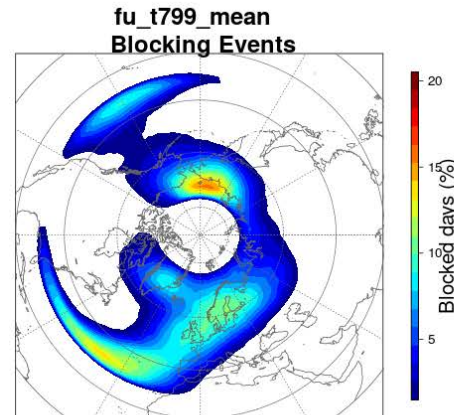
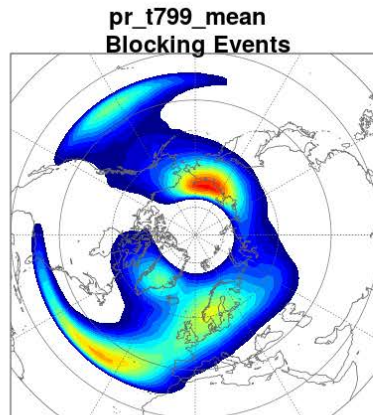
Resolving the present day blocking allows us provide possibly more reliable predictions for the future climate

Winter (DJFM) , Future change

80 km
resolution



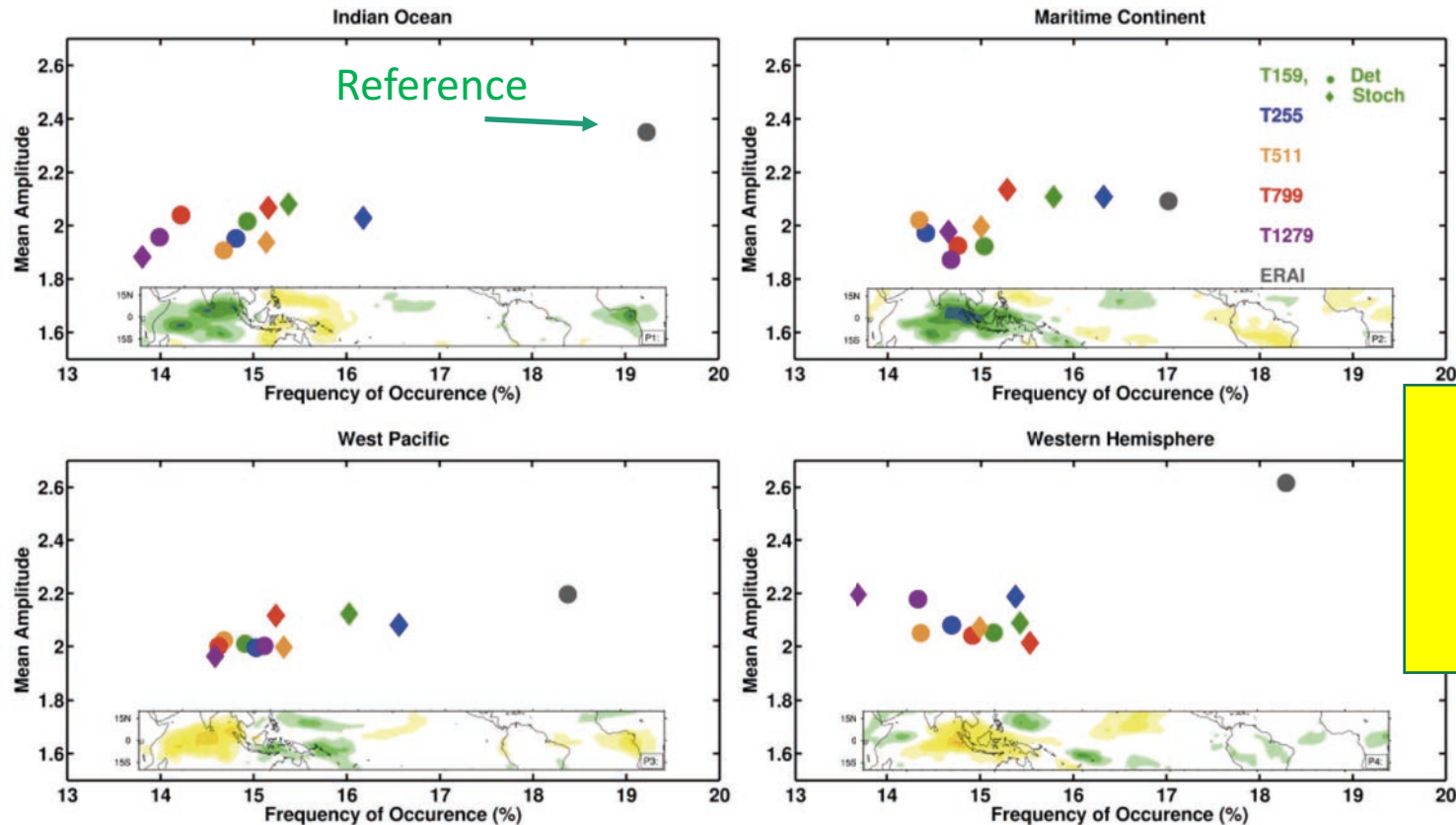
25 km
resolution



MADDEN-JULIAN OSCILLATION

- The **Madden-Julian Oscillation** (MJO) is the dominant mode of variability in the tropical region on sub-seasonal timescales (30-90 days). Eastward travelling pattern in Indian Ocean and Pacific.
- It is a challenge for the current generation of global climate and weather models to represent the dynamics and thermodynamics of the MJO realistically

Mean Amplitude



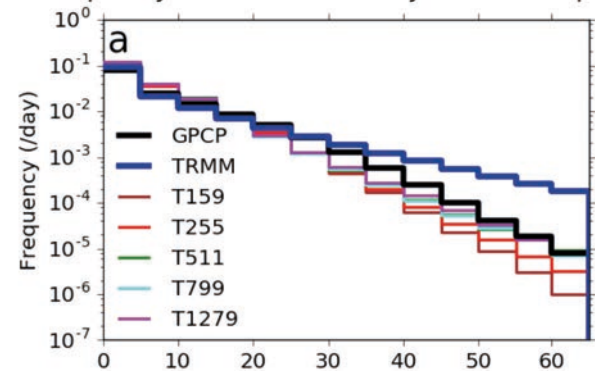
Frequency of occurrence

Benefit only
from
stochastics
physics

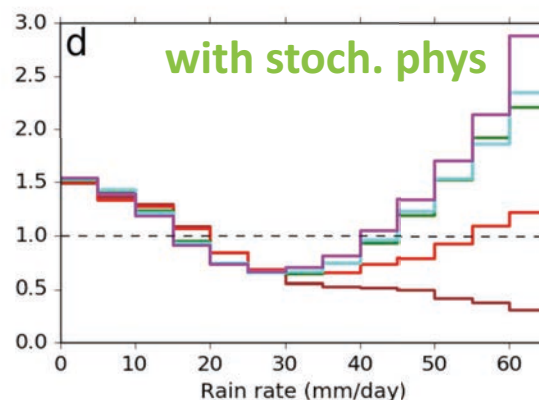
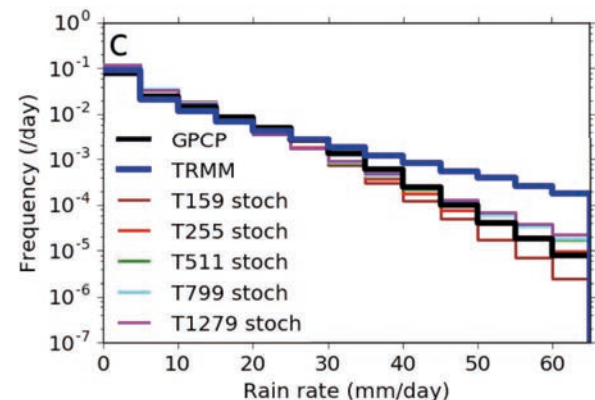
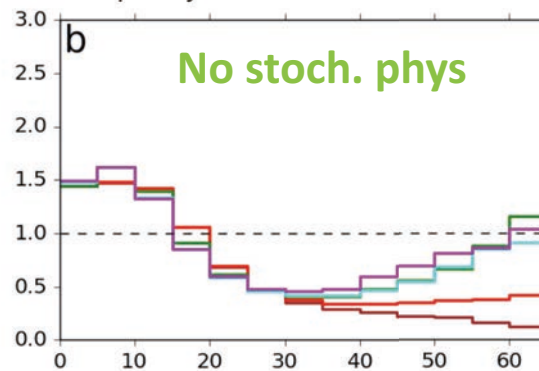
TROPICAL PRECIPITATION

- One aspect of the **tropical variability** of particular interest is the **occurrence of heavy precipitation events**, which can result in flooding or reduce crop yields (IPCC, 2014).
- Estimated through the **frequency distribution of daily-mean precipitation rates** averaged over $2.5^\circ \times 2.5^\circ$ grid boxes **between 10°S - 10°N** over the period 1998-2008

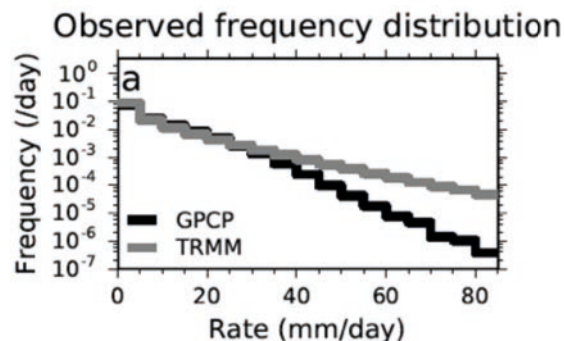
Frequency distribution of daily-mean total precip



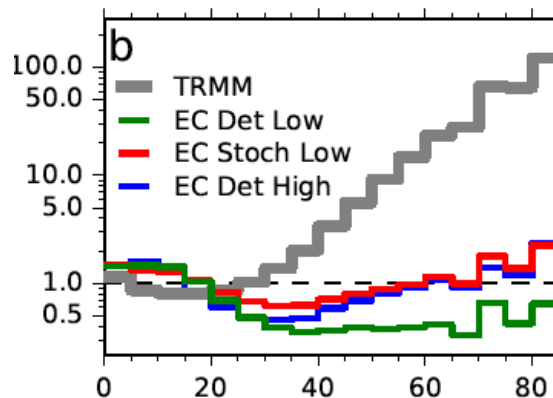
Frequency as fraction of that in GPCP



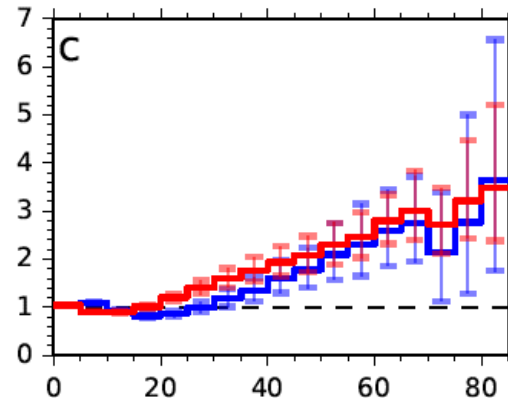
- In general, **underestimation of extreme rainfall events**
- **Increasing resolution leads to reduced bias:** however applying **stochastic parameterization improves the variability of low resolution models (T159-T255).**



Frequency vs
GPCP

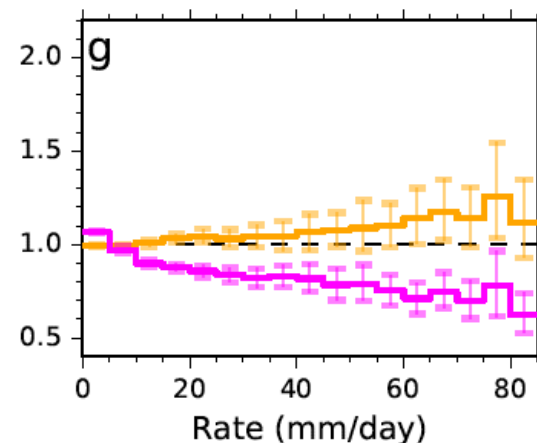
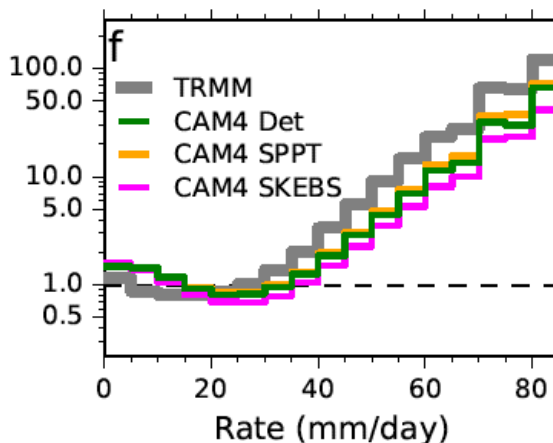
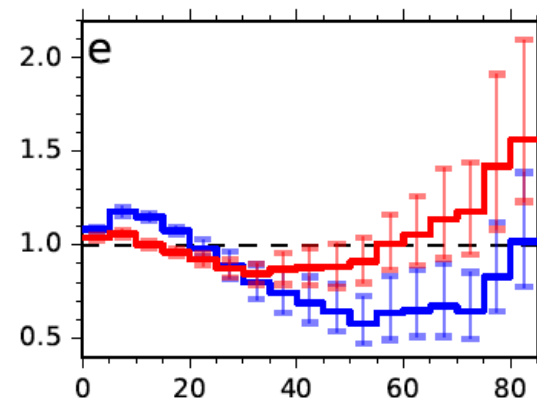
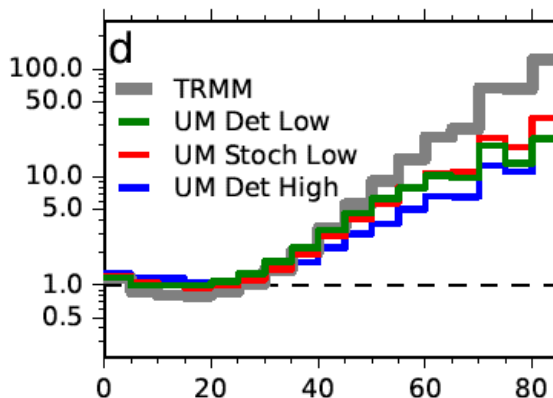


Frequency vs
Det Low-res Model



Watson, P.A.G., Berner, J.,
Corti S., Davini, P., von
Hardenberg, J., Sanchez, C.
Weisheimer, A., Palmer T.
(2017):

The impact of stochastic
physics on tropical rainfall
variability on daily
timescales in global
weather and climate
models, JGR-Atmospheres,
sub judice



Projects working on improving the current generation of models and on high-resolution



- **CRESCENDO H2020 Project (2015-2020)**

- Improve the process realism and future projection reliability of European **Earth-System Models**,



- **PRIMAVERA H2020 Project (2015-2020)**

- Develop a new generation of well-evaluated **high-resolution global climate models**

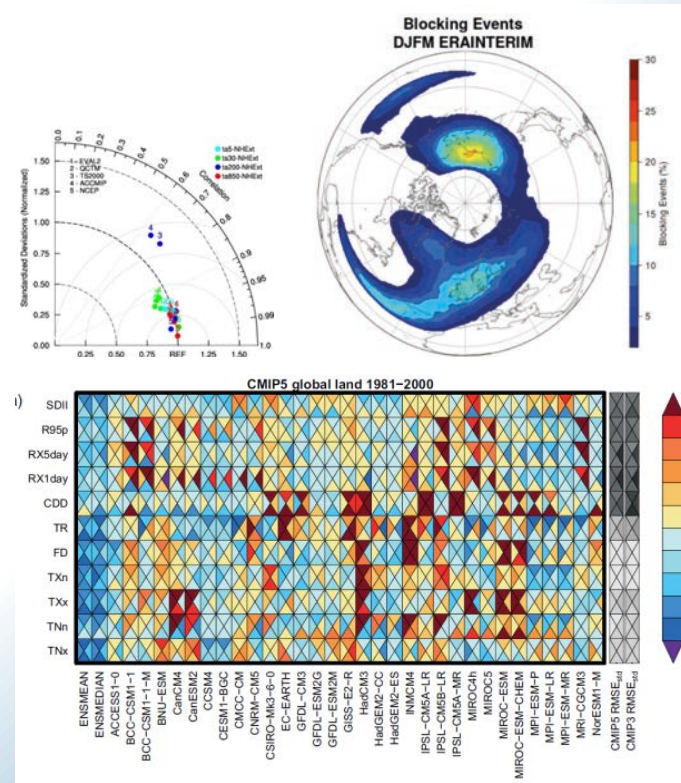
- **HighResMIP**

(The High Resolution Model Intercomparison Project)

- A multi-model approach to the systematic investigation of the impact of horizontal resolution

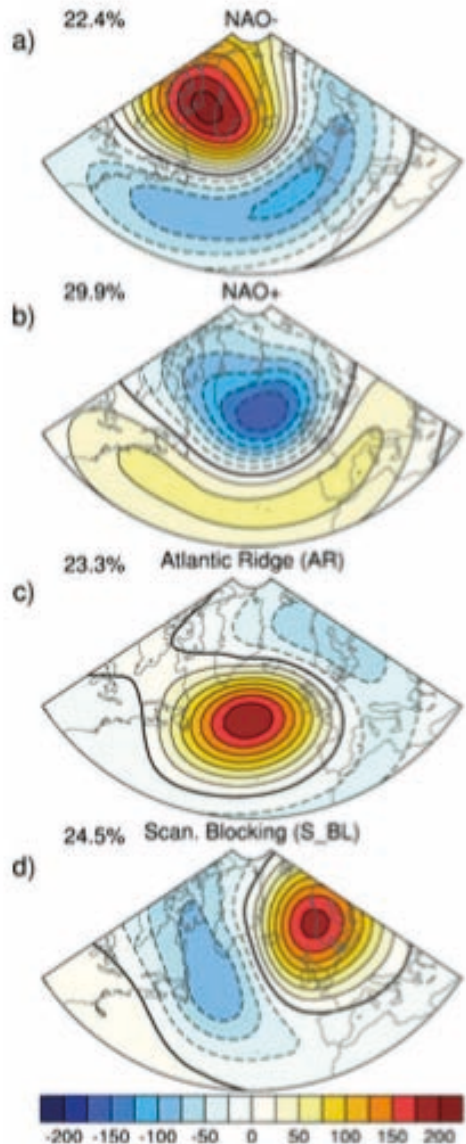
The Copernicus Project: “Development of C3S software for data analysis from climate models”

- This project (2016-2018) will, with a consortium formed by KNMI, ISAC-CNR, BSC, DLR, NLeSC, SMHI, U.Reading, develop a software solution allowing to calculate and present metrics, statistics, time series, and products tailored to applications from climate model data
- This will allow to make climate model data accessible to users, other researchers and stakeholders with derived products tailored to applications in specific sectors, including water, insurance and coastal areas.



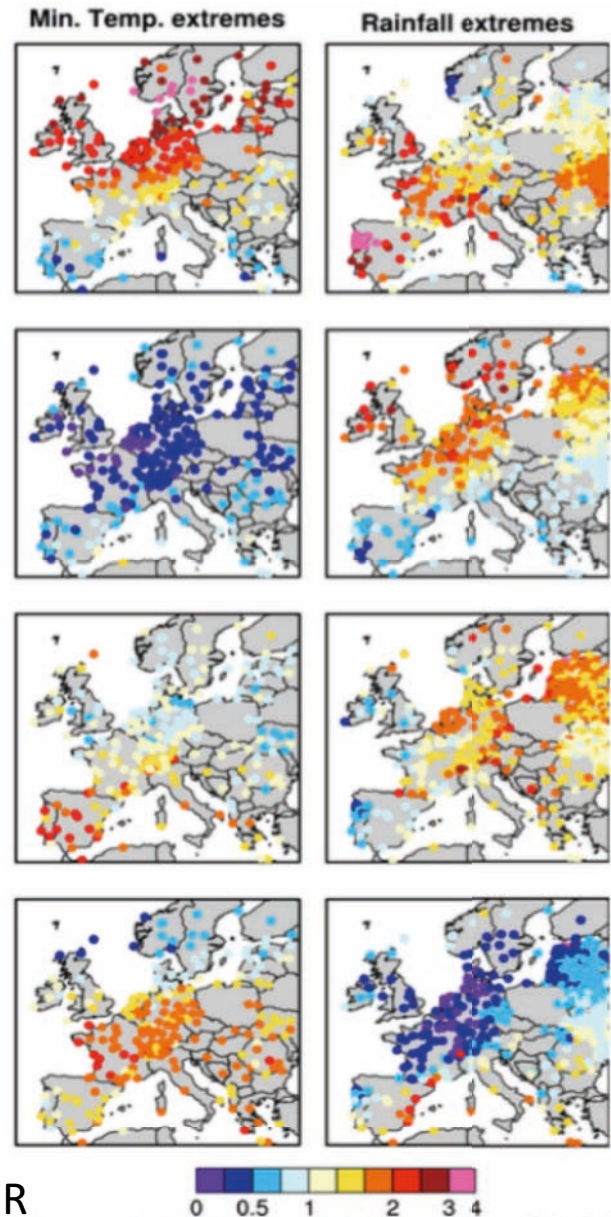
NEED FOR ENSEMBLE SELECTION

Clusters based on
wintertime
circulation
anomalies (500hPa)



Tailored
ensemble
selection

Relative
changes in the
frequency of
extreme cold
days and wet
days

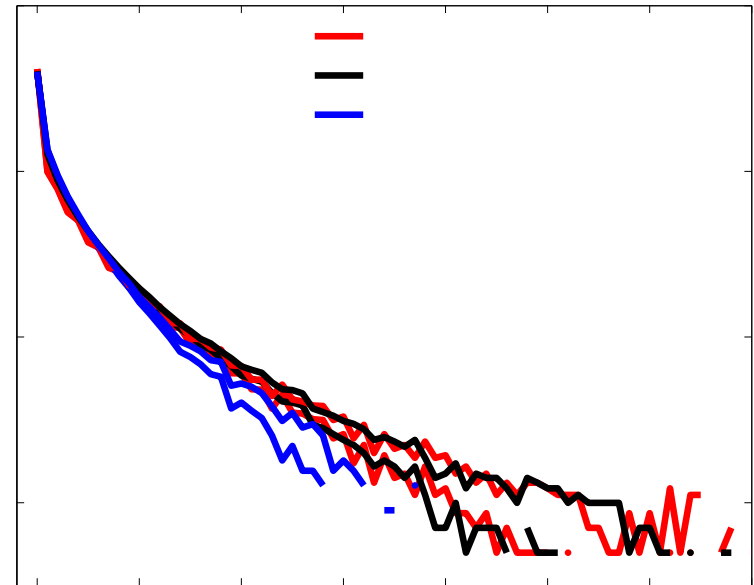
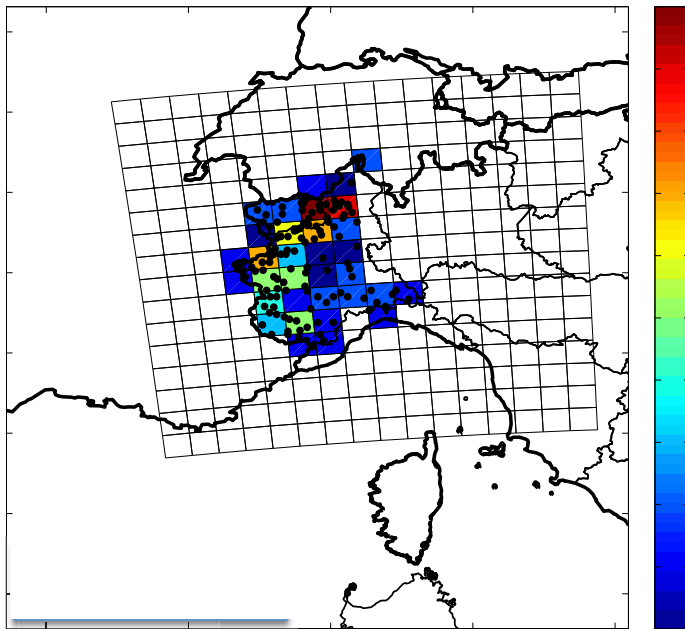


Stochastic downscaling

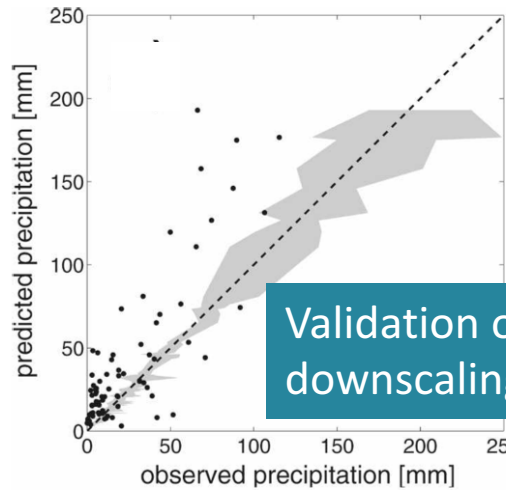
RainFARM (Rainfall Filtered Auto Regressive Model)

- 122 rain gauges
- 1958-2001
- Daily resolution
- Altitude max: 2526 m
- Altitude min: 127 m

PROTHEUS: $\Delta x \approx 30\text{km}$

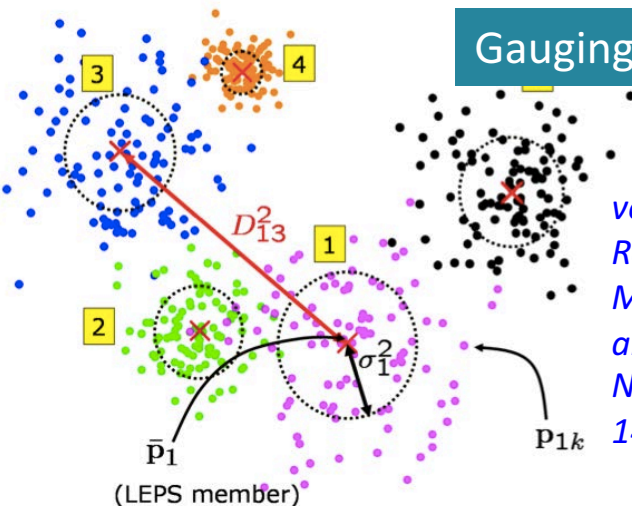


Applications of Stochastic Downscaling



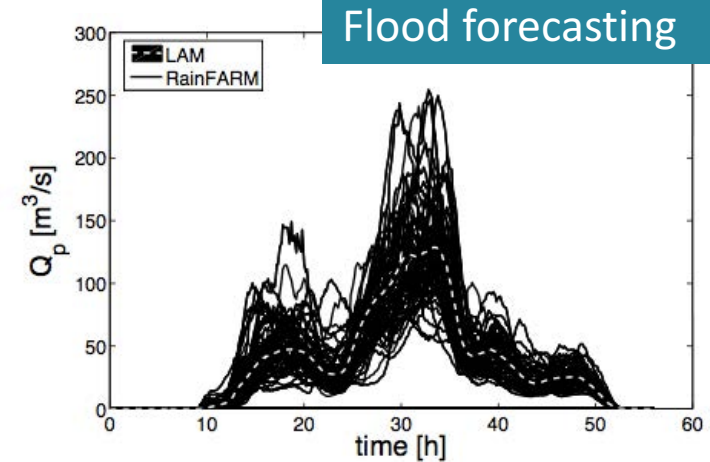
Validation of forecasts via downscaling

E. Brussolo, J. von Hardenberg, L. Ferraris, N. Rebora, A. Provenzale. Verification of quantitative precipitation forecasts via stochastic downscaling. Journal of Hydrometeorology, 9, 1084-1094 (2008)

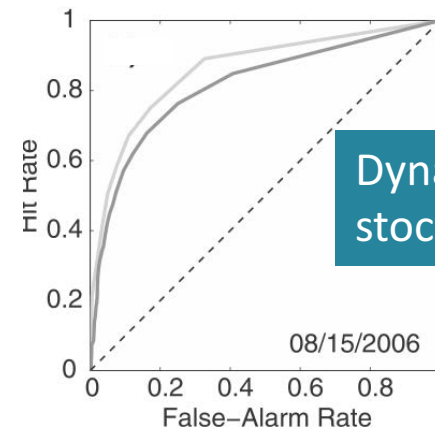


Gauging uncertainty

von Hardenberg J, Ferraris L, Rebora N, Provenzale A, Meteorological uncertainty and rainfall downscaling. Nonlinear Proc. Geophysics, 14, 193-199 (2007)



N. Rebora, L. Ferraris, J. von Hardenberg, A. Provenzale, Rainfall downscaling and flood forecasting: a case study in the Mediterranean area. NHESS, 6, 611-619 (2006).



Dynamical vs. stochastic ensembles

E. Brussolo, J. von Hardenberg, N. Rebora. Stochastic versus Dynamical Downscaling of Ensemble Precipitation. J. of Hydrometeorology 10(4), 1051-1061 (2009)

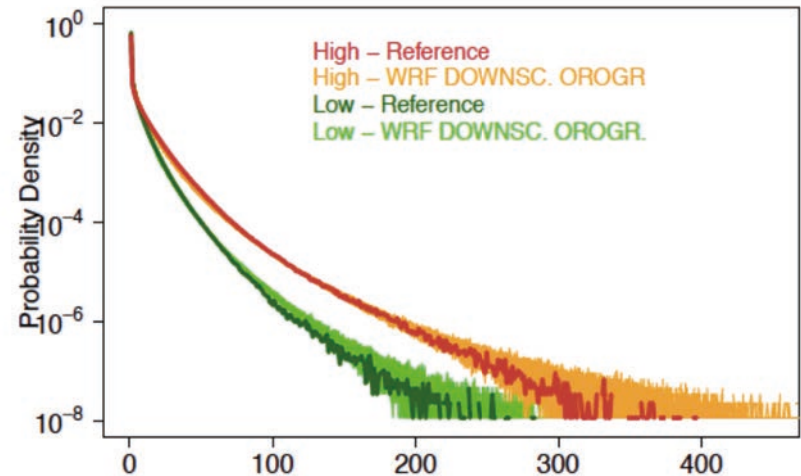
STOCHASTIC DOWNSCALING WITH OROGRAPHIC CORRECTIONS

In a perfect model scenario

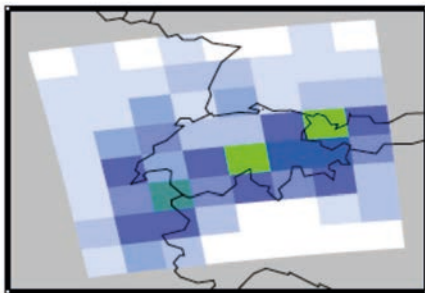
Development of an improved stochastic downscaling technique for RainFARM capable of reproducing a realistic small-scale precipitation climatology

Based on the availability of a reference fine-scale climatology

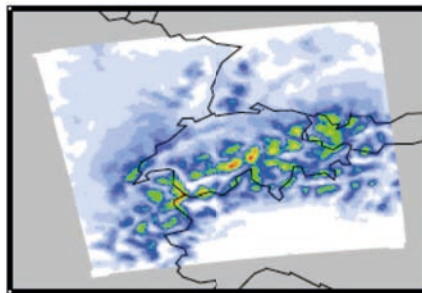
Rainfarm With Orographic correction



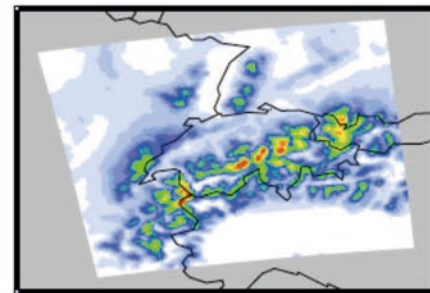
WRF at 0.64°



Downscaled

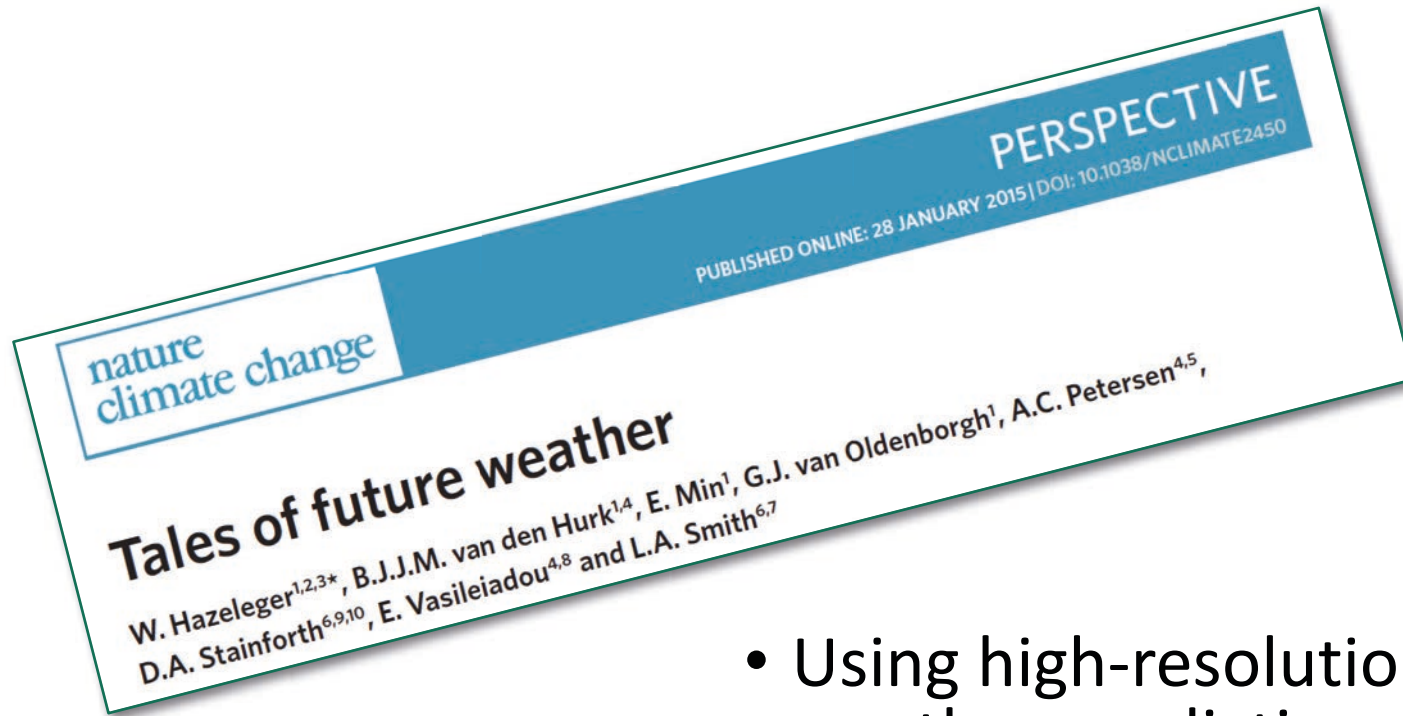


WRF at 0.04°



OTHER APPROACHES?

to a ensemble climate model projections-downscaling chain



- Using high-resolution numerical weather prediction models to explore high-impact weather events in a future climate
- Can be tailored for specific applications

