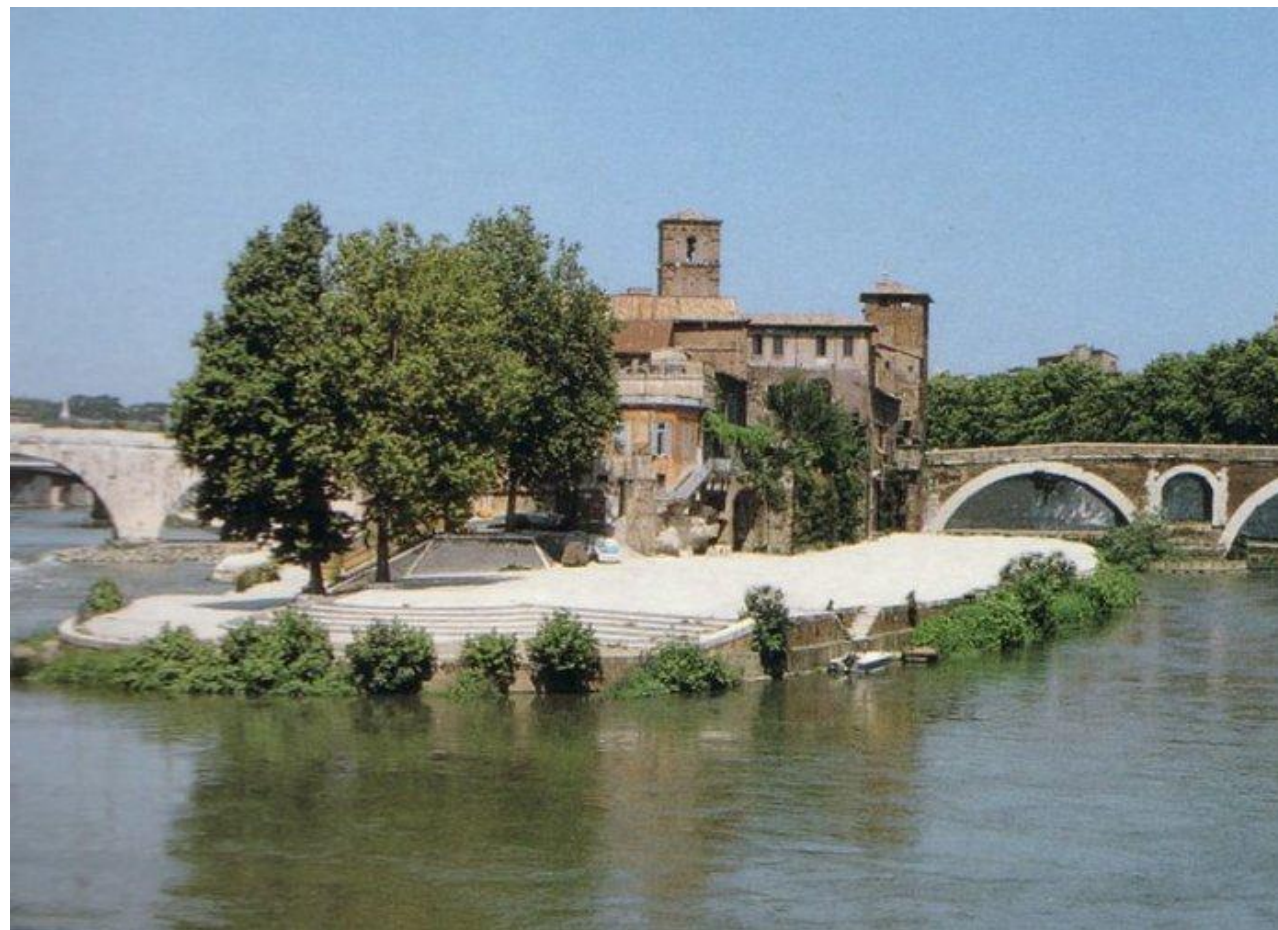




# STOCHASTIC RAINFALL DOWNSCALING role of RCMs

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E. Palazzi and A. Provenzale





# Modelling chain: bridging the gap

100-120 km

- Global Climate Models
- Global Reanalyses

10-30 km

Regional Climate Models

few km

High-resolution Climate  
Scenarios

Dynamical  
downscaling

Stochastic  
downscaling

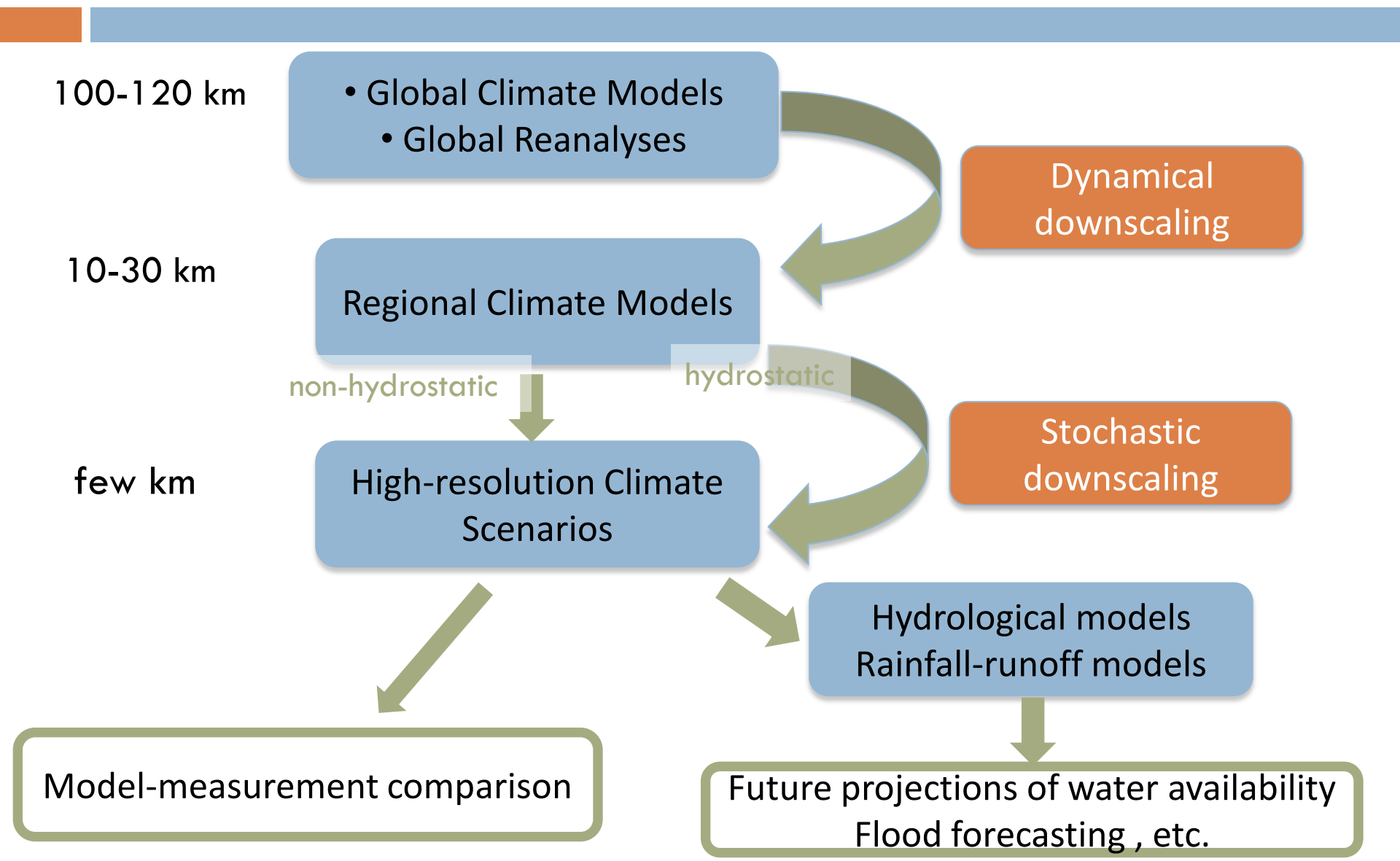
non-hydrostatic

hydrostatic

Hydrological models  
Rainfall-runoff models

Model-measurement comparison

Future projections of water availability  
Flood forecasting , etc.



# Upscaling: PROTHEUS vs averaged raingauge data


Spatially averaged over all model pixels (also true for each pixel)

	Average P (mm/day)	P intensity (mm/day)	Zeros (%)
Model data	3.7	7.0	46.8
Observed data	2.7	7.8	64.4

Total precipitation

Precipitation  
intensity

Dry days


$$p_0 = 0.1 \text{ mm/day}$$

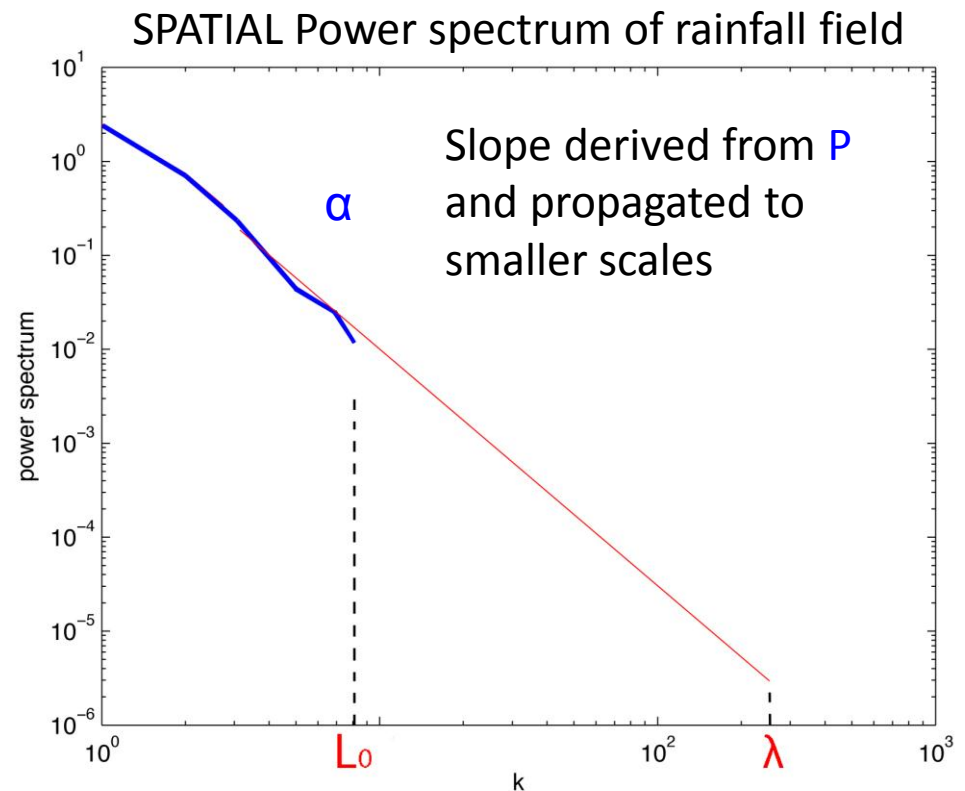
PROTHEUS overestimates the total precipitation but underestimates precipitation intensity and the number of dry days. **Precipitation in the model is more frequent than in the observations.** There is a strong correlation between the interannual variability of model data and observed data.

# RainFARM downscaling procedure

RAINFarm: Rainfall Filtered  
Auto Regressive Model

Belongs to the family of “Metagaussian models”, based on the nonlinear transformation of a linearly correlated stochastic field, obtained by extrapolating to small scales the power spectrum (i.e., the spatial logarithmic slope) of the original field (provided that the input field shows a approximate scaling behavior)

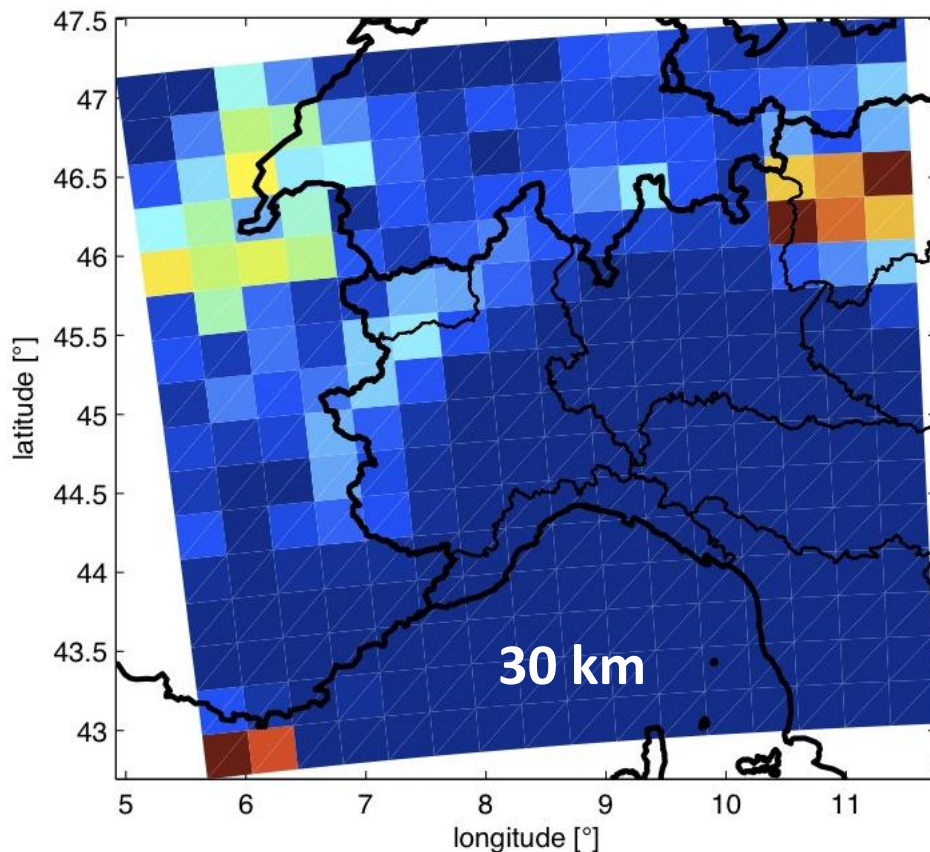
- $P(X, Y, T)$ , input field, reliability scales  $L_0, T_0$
- $r(x, y, t)$ , output field, resolution  $\lambda, \tau$



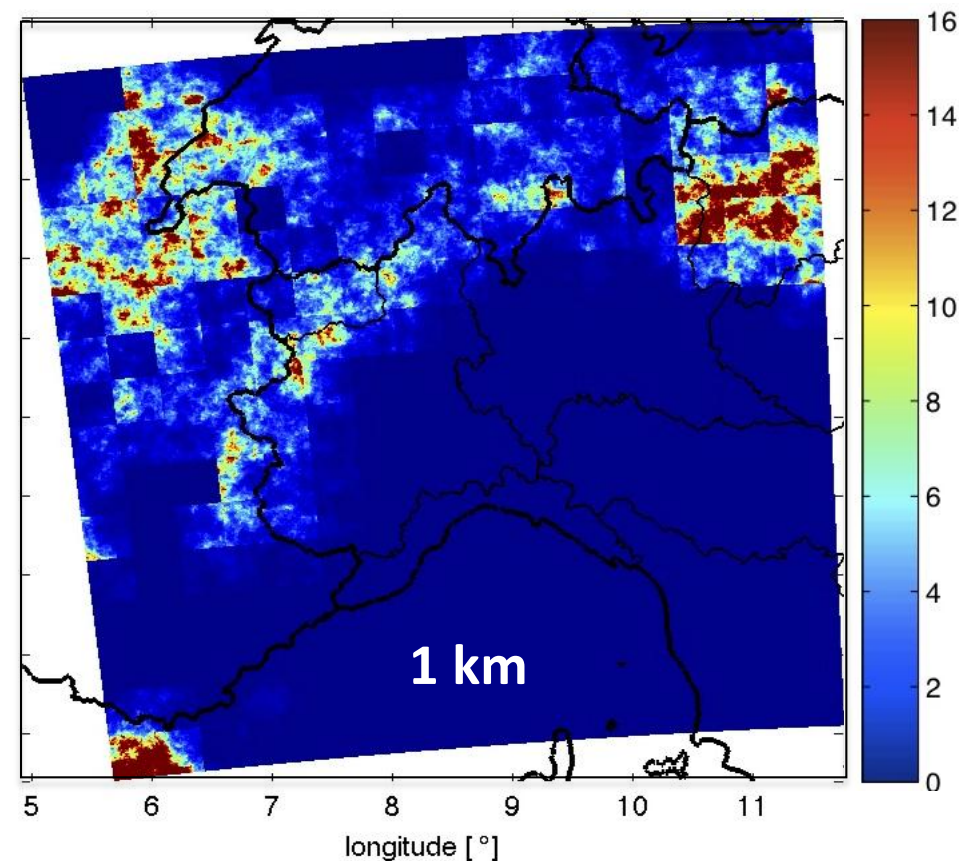


# RainFARM downscaling: example

Example SON 1958



Precipitation field from PROTHEUS

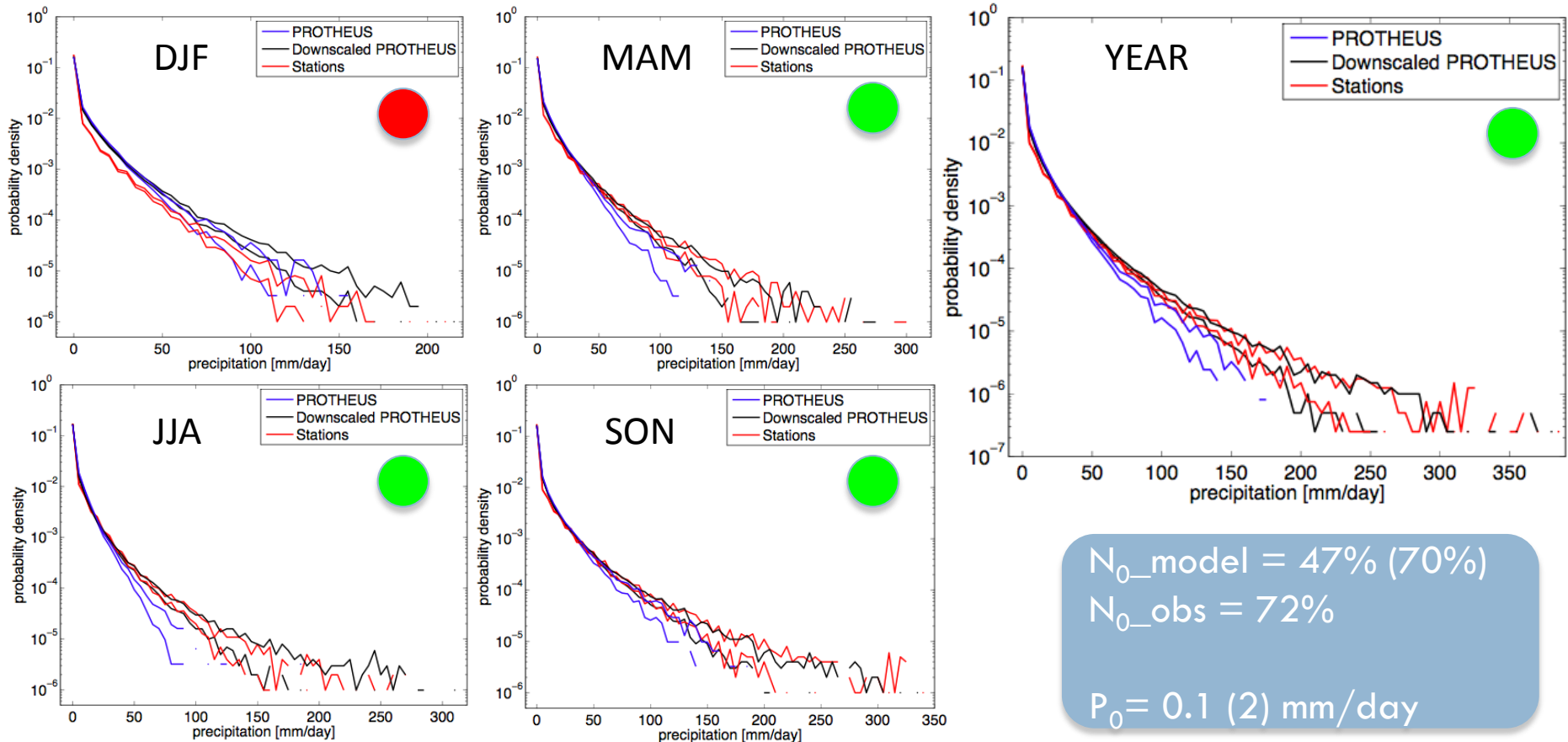


Stochastic realization of the PROTHEUS downscaled field, obtained with RainFARM

# Downscaling: Downscaled PROTHEUS vs individual raingauge data

## PDFs of total precipitation

● GOOD  
● LESS GOOD



$N_{0\_model} = 47\% (70\%)$

$N_{0\_obs} = 72\%$

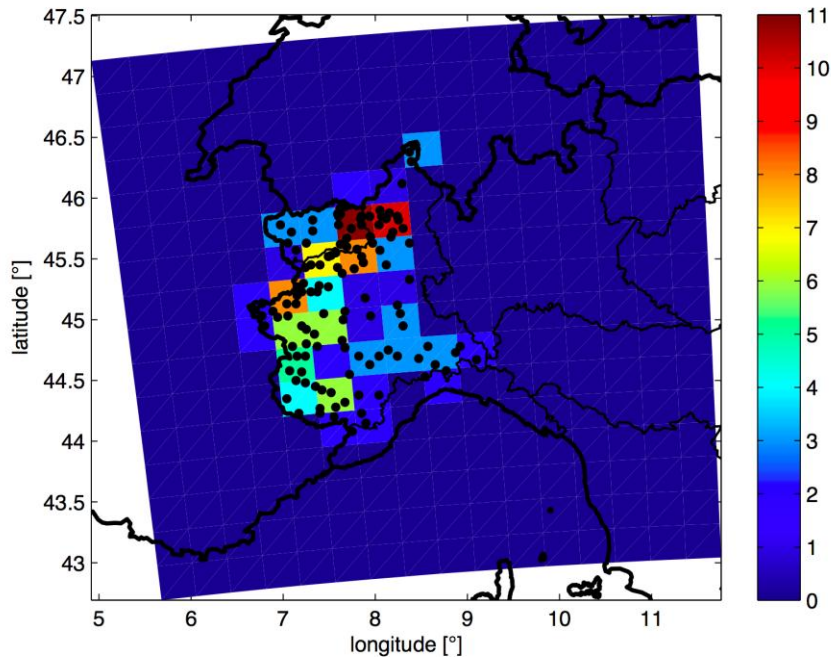
$P_0 = 0.1 (2) \text{ mm/day}$



# Rain-gauge network

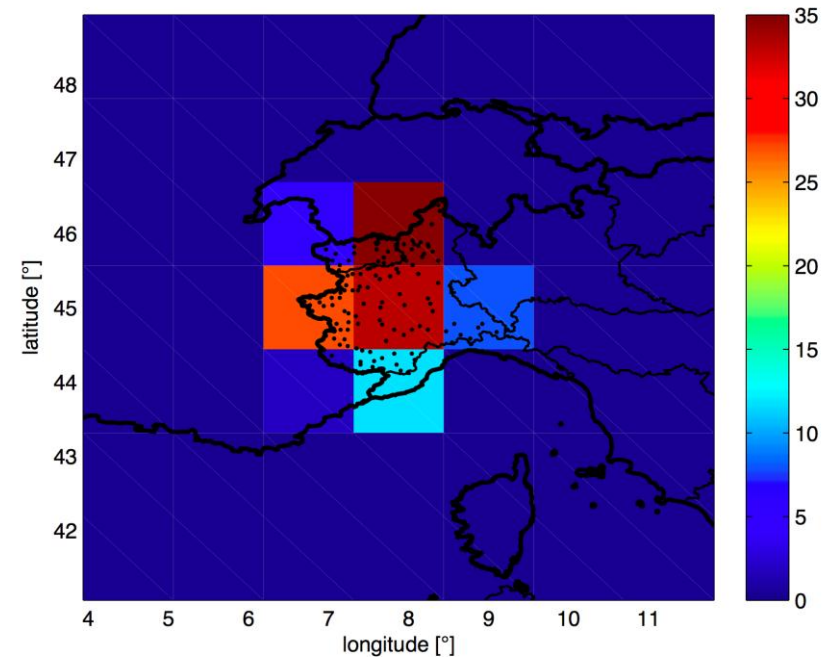
Ciccarelli et al., *Global and Planetary Change*, 2008

## PROTHEUS



33 PROTHEUS pixels

## ERA40

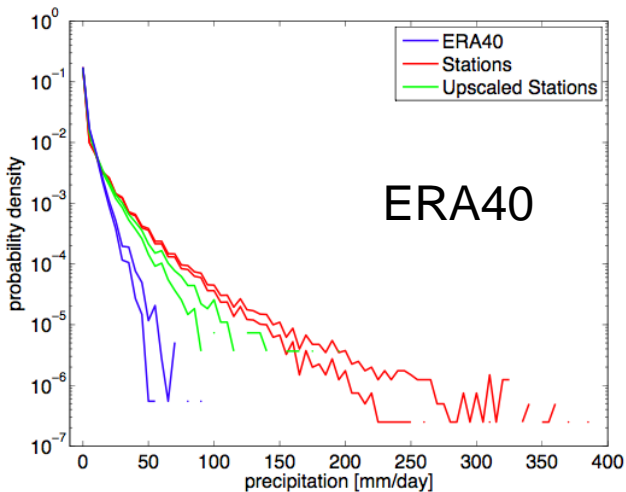
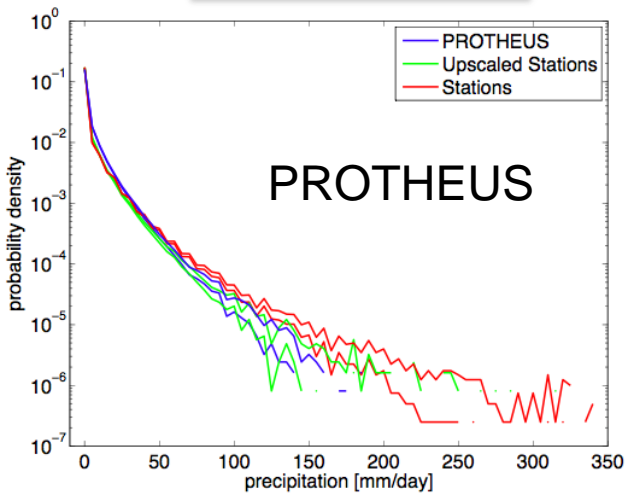


7 ERA40 pixels

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

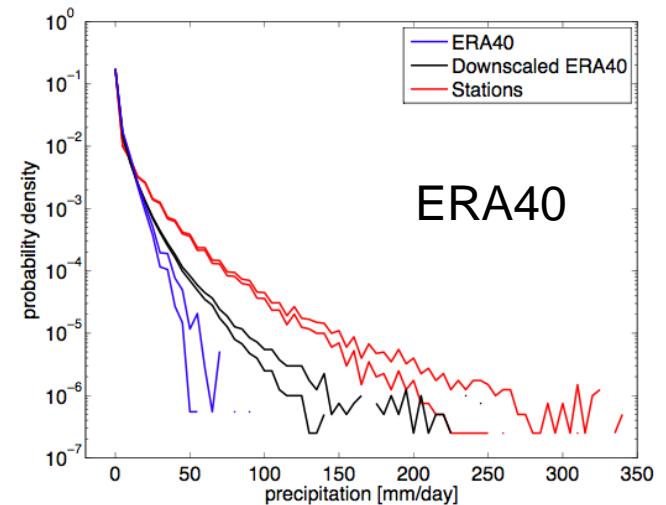
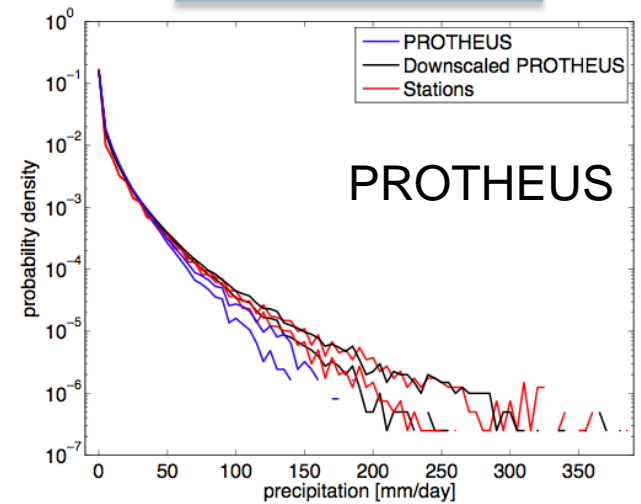
# PROTHEUS vs ERA40

## UPSCALING



Application to  
PROTHEUS (30 km res.)  
and to ERA40 (100 km  
res.): need for  
dynamical downscaling  
prior to further  
stochastic downscaling

## DOWNSCALING



# Summary & conclusions

- The **high-resolution** precipitation fields obtained by downscaling the PROTHEUS output reproduce well the seasonality and the amplitude distribution of the observed rain gauge precipitation during most of the year, including the **extreme events**.
- However, the RainFARM stochastic downscaling procedure cannot correct the model outputs at large scale, such as the disagreement in the frequency of precipitation events in PROTHEUS in winter.
- **Limits** of RainFARM: does not account for the **orography** (it can matter inside the box) and **does not correct biases**

# Contacts

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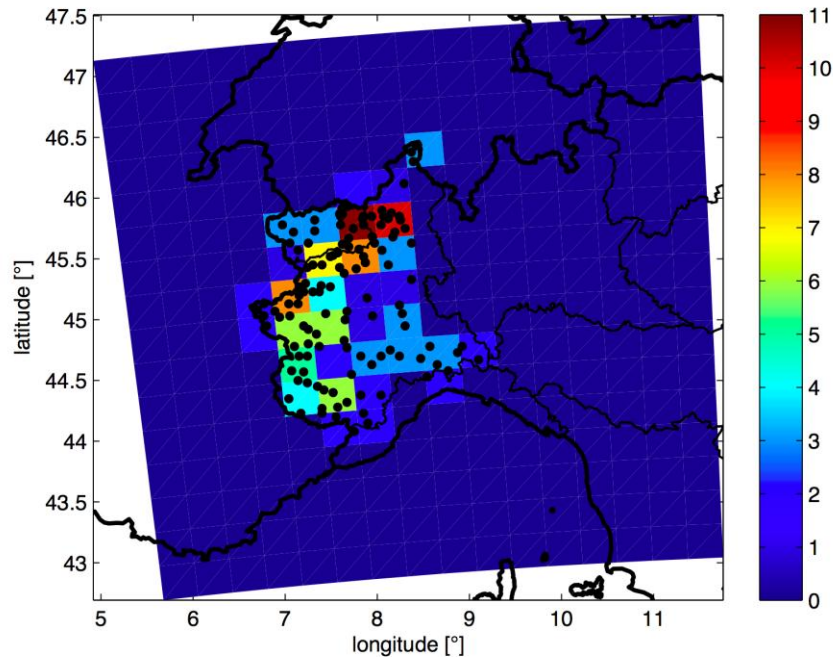
[paolo.ruti@enea.it](mailto:paolo.ruti@enea.it)



# Rain-gauge network

Ciccarelli et al., *Global and Planetary Change*, 2008

## PROTHEUS



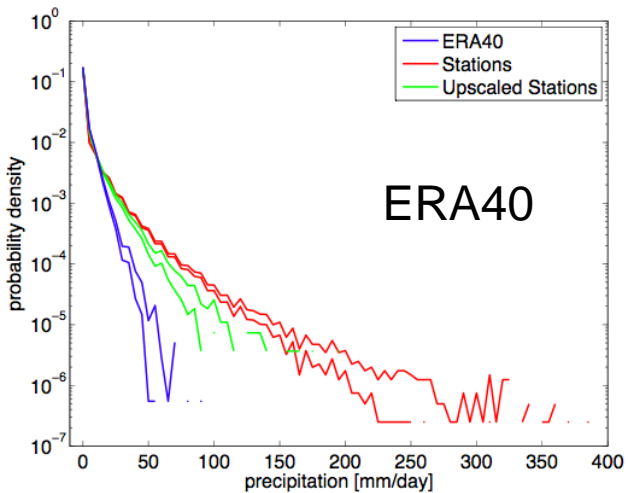
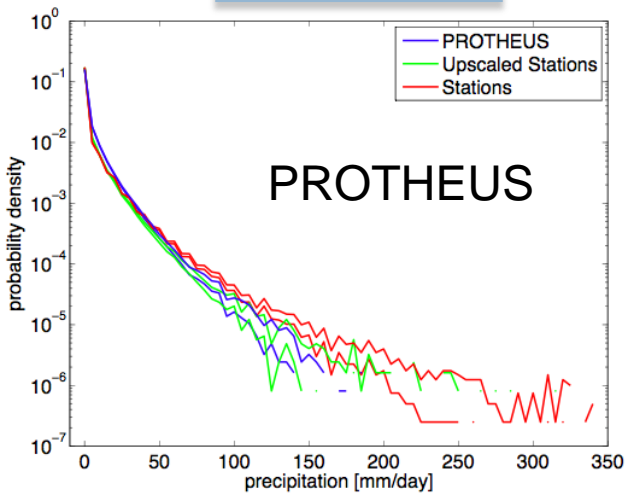
33 PROTHEUS pixels

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



# PROTHEUS vs ERA40 downscaling

UPSCALING



# Additional: RAINFarm procedure

- $P(X, Y, T)$        $L_0 \leq (X, Y) \leq L_{max}$        $T_0 \leq T \leq T_{max}$       Input field
- $\hat{P}(K_x, K_y, \Omega)$        $(K_x, K_y) \leq \frac{\pi}{L_0}$        $\Omega \leq \frac{\pi}{T_0}$       Fourier spectrum
- $|\hat{P}|^2; \alpha; \beta$       -Space-time power spectrum (exponential behavior), with slopes  $\alpha, \beta$   
- extrapolation to small scales
- $\hat{g}(k_x, k_y, \omega) = |\hat{g}(k_x, k_y, \omega)| \exp(i\phi)$       Fourier spectrum,  $\phi$  are random phases  
 $|\hat{g}(k_x, k_y, \omega)|^2 = (k_x^2 + k_y^2)^{-\alpha/2} \omega^{-\beta}$
- $g(x, y, t)$        $\lambda \leq (x, y) \leq L_{max}$        $\tau \leq t \leq T_{max}$        $g$ : gaussian field obtained by inverting  $\hat{g}$
- $\tilde{r}(x, y, t) = e^{g(x, y, t)}$       Synthetic precipitation field, obtained by a nonlinear transformation of  $g$

# Additional: RAINFarm procedure

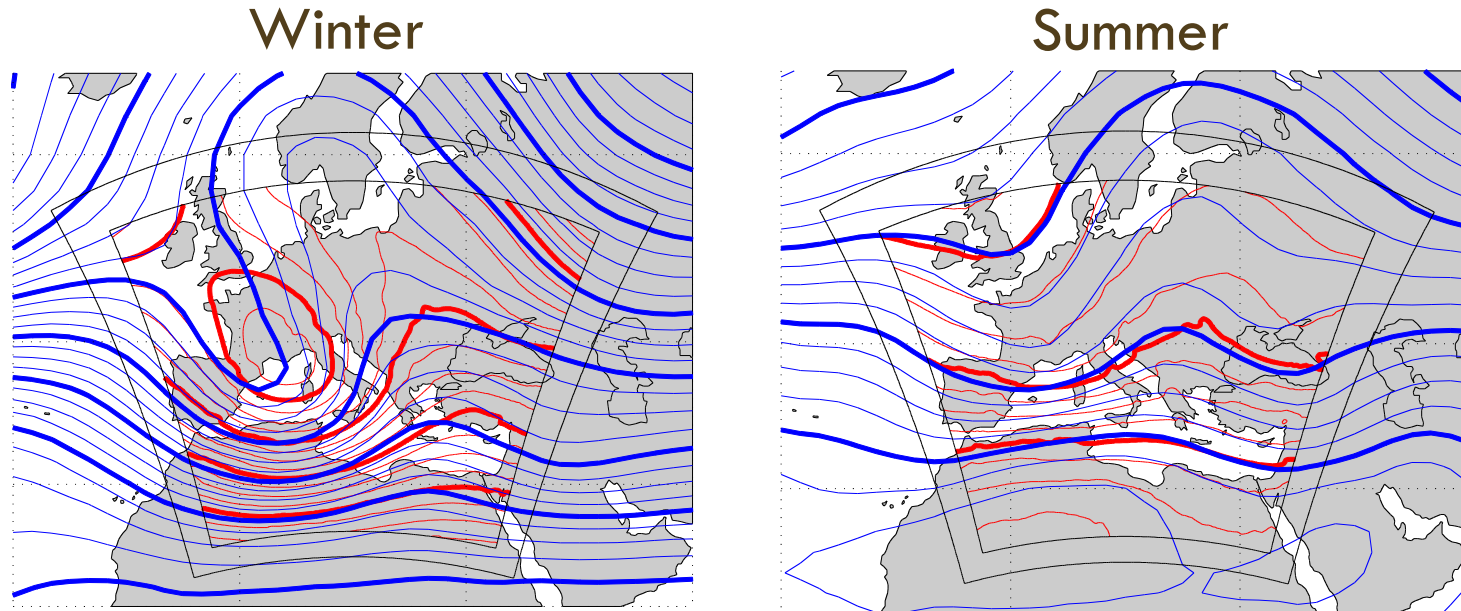
- The synthetic field is forced to be equal to the original field  $P$ , when aggregating on  $L_0$  and  $T_0$  scales  $\rightarrow$  creation of  $\tilde{R}$  so that:

$$r(x, y, t) = \tilde{r}(x, y, t) \frac{P(X, Y, T)}{\tilde{R}(X, Y, T)}$$

Aggregating on  $L_0, T_0$

$$R = P$$

# Additional: large scale bias



Composite 500hPa isobars during *intense rainfall* events at the weather station of Torino Caselle: ERA40 (blue) and PROTHEUS (red). *Intense rainfall* is defined as daily rainfall (observed) > 20mm.

The black boxes represent the PROTHEUS domain. The area between the inner and outer box is where PROTHEUS is nudged to the lateral boundary conditions.

# Methodology

The method used to bridge the scale gap between coarse-scale climate model outputs and point-scale observed data is are averaging (upscaling) the raingauge data at the scale of the model or, vice versa, interpolating the model to the gauge positions (downscaling).

- **Upscaling approach:** comparison between PROTHEUS/ERA40 and the raingauge data averaged over the PROTHEUS/ERA40 pixels (one observed time series for each pixel)
- **Downscaling approach:** comparison between the downscaled PROTHEUS/ERA40 and data from the individual raingauges