



EGU 2010

# Spatially smooth regional estimation of the flood frequency curve (with uncertainty)

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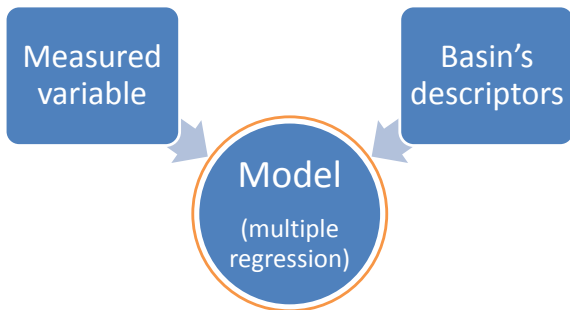
Politecnico di Torino, Italy

## Flood frequency curve estimation in ungauged basins

- Regional approach
- Ease of use
- Handle **short** records

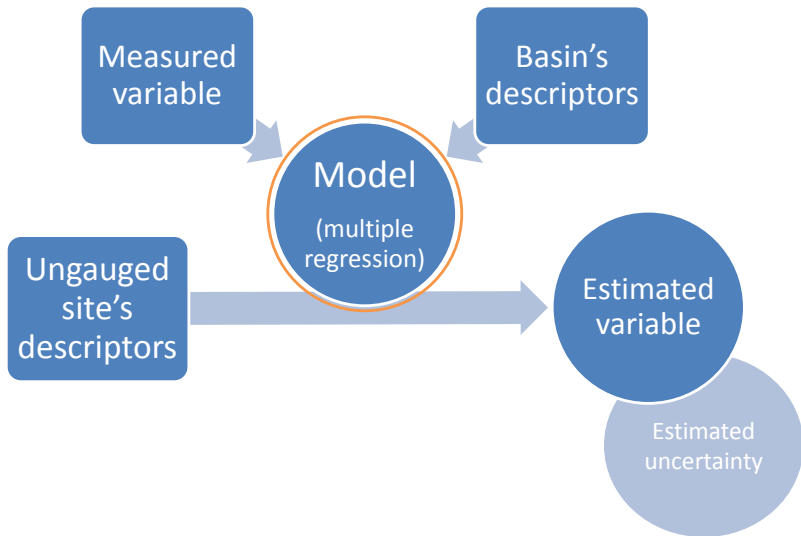
# Regionalization approach

Statistical regionalization through morpho-climatic basin-scale descriptors



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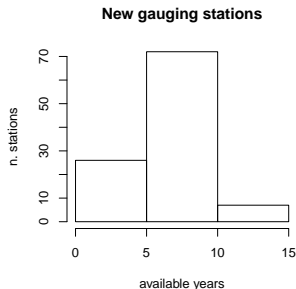
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**Suitable method for  
Northwestern Italy**  
(about 100 new stations)





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## Flood frequency curve

$$Q_T = Q_{ind} \cdot \mathcal{P}(T, L_{CV}, L_{CA})$$

$$\begin{cases} Q_{ind} \rightarrow \text{scale (index-flood)} \\ L_{CV} \rightarrow \text{dispersion} \\ L_{CA} \rightarrow \text{skewness} \end{cases}$$

# Which variable to regionalize?

## Usually: a priori choice of distribution

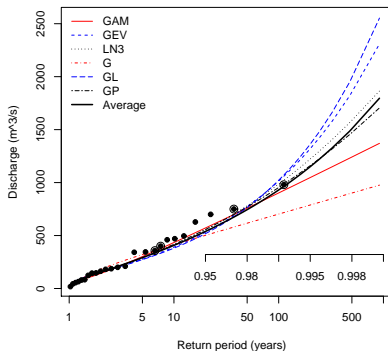
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10 – Chisone at S.Martino

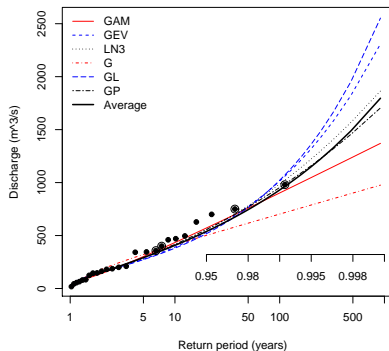


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## Distribution-free statistics

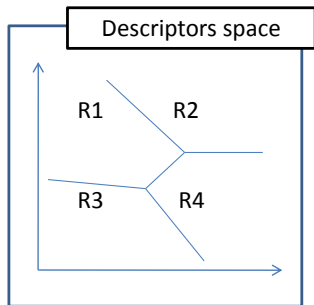
- *L*-moments regionalization
- A posteriori reconstruction of frequency distribution

# How to regionalize?

## Usually: homogeneous regions

Difficult uncertainty estimation due to:

- regions creation
- regions border effects

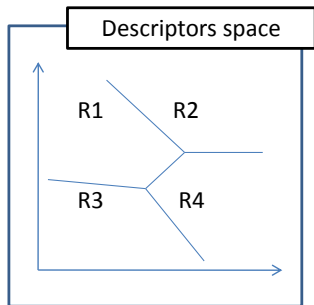


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## Smooth variability of $L$ -moments in the descriptors space

- No homogeneity required
- Easier uncertainty evaluation

# Regional model definition

- Multiple linear regression
- Error structure as in *Stedinger & Tasker (1985)*
  - Model error  $\mathbf{Y}_T = \mathbf{X} \boldsymbol{\beta} + \boldsymbol{\delta}$
  - Sampling error  $\mathbf{Y} = \mathbf{Y}_T + \boldsymbol{\eta}$



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GLS concurrent estimation of regression coefficients and model variance

$$\mathbf{Y} = \mathbf{X}\boldsymbol{\beta} + \boldsymbol{\varepsilon}$$

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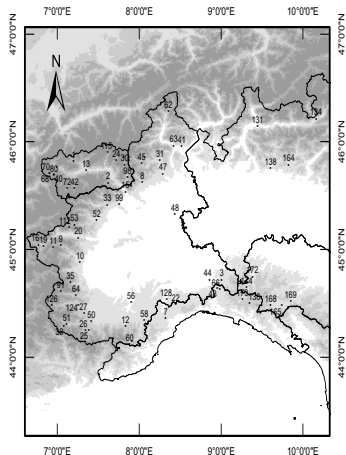
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Variance of prediction

$$VP = \sigma_Y^2 = \sigma_{\delta}^2 + \mathbf{x} (\mathbf{X}^T \boldsymbol{\Lambda}^{-1} \mathbf{X})^{-1} \mathbf{x}^T$$

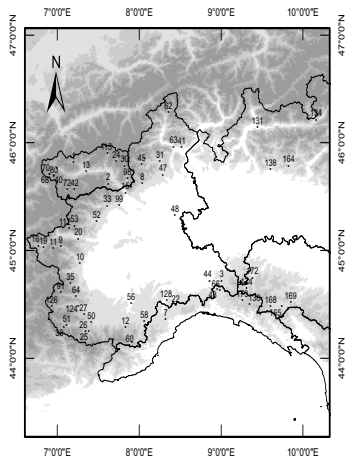
# Case study: 70 basins - 35 descriptors

**Application to a large descriptors set:** all the combination with 1 to 4 descriptors (+ intercept) are calculated



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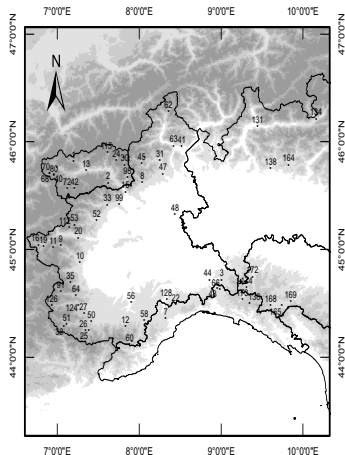
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- Model validation
  - Multicollinearity test
  - Student's test
  - Residuals check

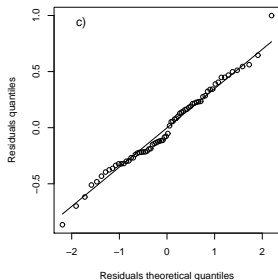
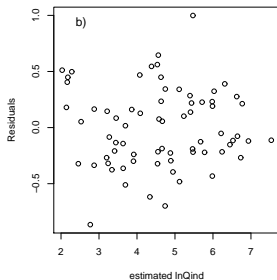
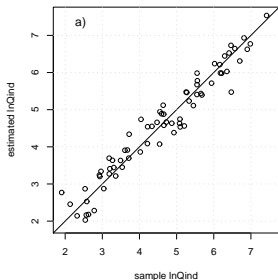
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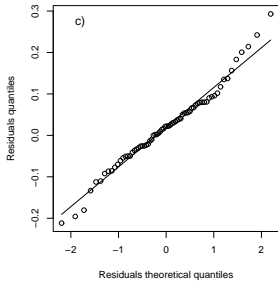
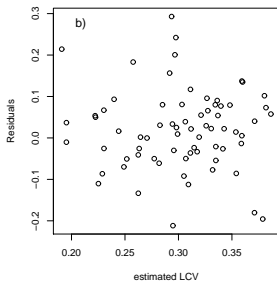
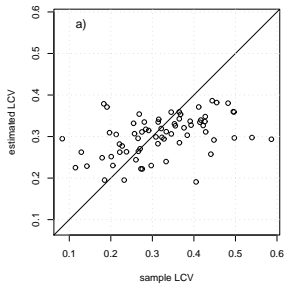
- Model validation
  - Multicollinearity test
  - Student's test
  - Residuals check
- Model selection (among all combinations)
  - Model variance  $\sigma_{\delta}^2$
  - Average variance of predictions (*AVP*)
  - Simplest model

# Example: index-flood estimation



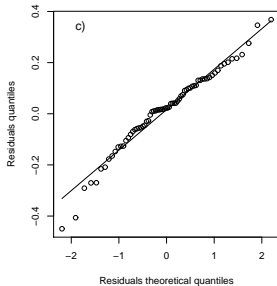
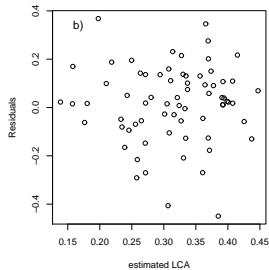
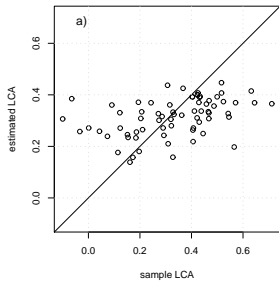
$$\log(Q_{ind}) = -8.76 + 7.99_{E-01} \cdot A + 1.09 \cdot IDFa \\ + 9.53_{E-01} \cdot MAP + 7.85_{E-01} \cdot perm$$

# Example: $L_{CV}$



$$L_{CV} = 6.44_{E-01} - 4.28_{E-07} \cdot X_C - 5.00_{E-04} \cdot P - 1.44_{E-04} \cdot H_{min}$$

# Example: $L_{CA}$



$$L_{CA} = 9.38_{E-01} - 1.40_{E-02} \cdot IDFa - 1.39_{E-01} \cdot P - 2.65_{E-04} \cdot H_{min}$$



# Quantile estimation

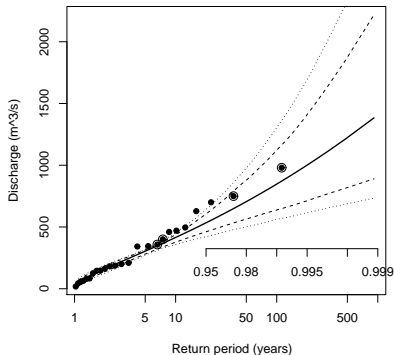
- $Q_{ind}$ ,  $L_{CV}$  and  $L_{CA}$   $\longrightarrow$  different suitable distributions
- Flood frequency curve as the average
- Confidence bands through Monte Carlo simulations (using also  $\sigma_{Q_{ind}}^2$ ,  $\sigma_{L_{CV}}^2$  and  $\sigma_{L_{CA}}^2$ )

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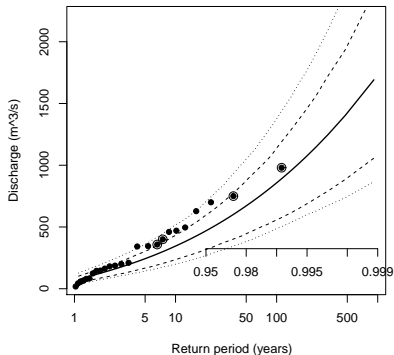
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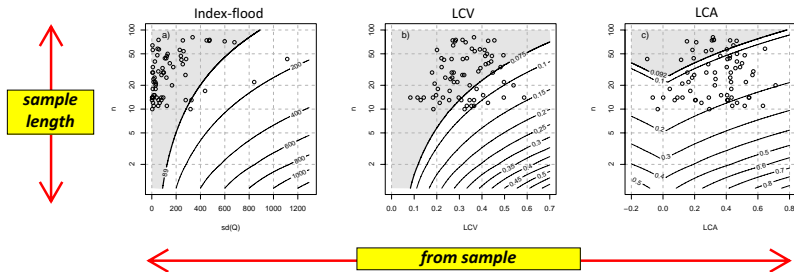
Sample estimation



Regional estimation



# Final remarks: a practical tool



**Shaded area = sample estimate with variance lower than regional one**