

# *Simple IDF Estimation Under Multifractality*

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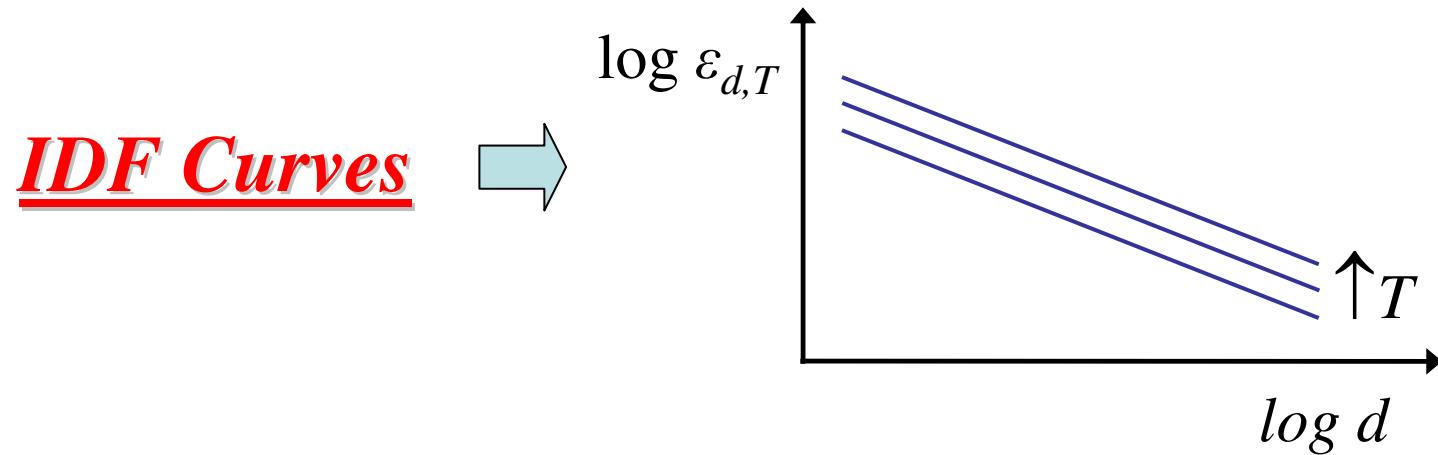
*European Geosciences Union General Assembly,  
15-20 April 2007, Vienna, Austria*

# IDF Curve Definition

$\varepsilon_d$ : average rainfall intensity over duration  $d$

$\varepsilon_{d,max}$ : annual maximum of  $\varepsilon_d$

$\varepsilon_{d,T}$ : value exceeded by  $\varepsilon_{d,max}$  with probability  $1/T$  (years)



# Methods of IDF Estimation

## 1) From annual maxima

- Separability assumption...

$$\varepsilon_{d,T} = b(d) \alpha(T)$$

*IDF value*      *empirical function*      *empirical function*

e.g.  $(d+\eta)^{-\delta}$    e.g.  $T^k, \log T$

From distribution of  $\varepsilon_{d,max}$       **or**      Koutsoyiannis *et al.* (1998)

- Estimate  $a(T)$  and  $b(d)$  from the annual maxima time series

## 2) From stochastic models of rainfall

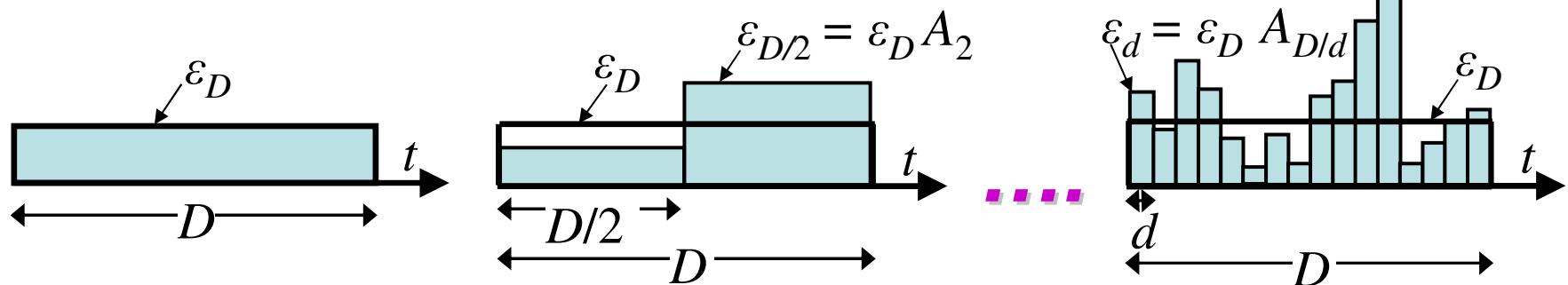
- Fit a model to the **continuous** rainfall record
- **Calculate IDF curves from model**  $\Rightarrow$  typically through MC simulation

# Multifractal Rainfall Models

## Definition:

Temporal *rainfall* is said to be *multifractal* (MF) if the *statistics* remain *unchanged* when the *observation axis is contracted by a factor  $r > 1$*  and the *rainfall intensity* is *multiplied* by some random variable  $A_r$ .

## *Illustration: Multiplicative Cascades*



## Advantages

- ❖ *Few parameters*
- ❖ *No need for Monte Carlo simulation*
- ❖ *No a-priori assumption on  $\varepsilon_{d,T}$*
- *Known asymptotic IDF scaling properties* for  $d \rightarrow 0$  and  $T \rightarrow \infty$
- *Use of the full historical record* (i.e. utilize information on the distribution of  $\varepsilon_d$  for  $d \neq D$ )

# Asymptotic IDF Behavior Under Multifractality

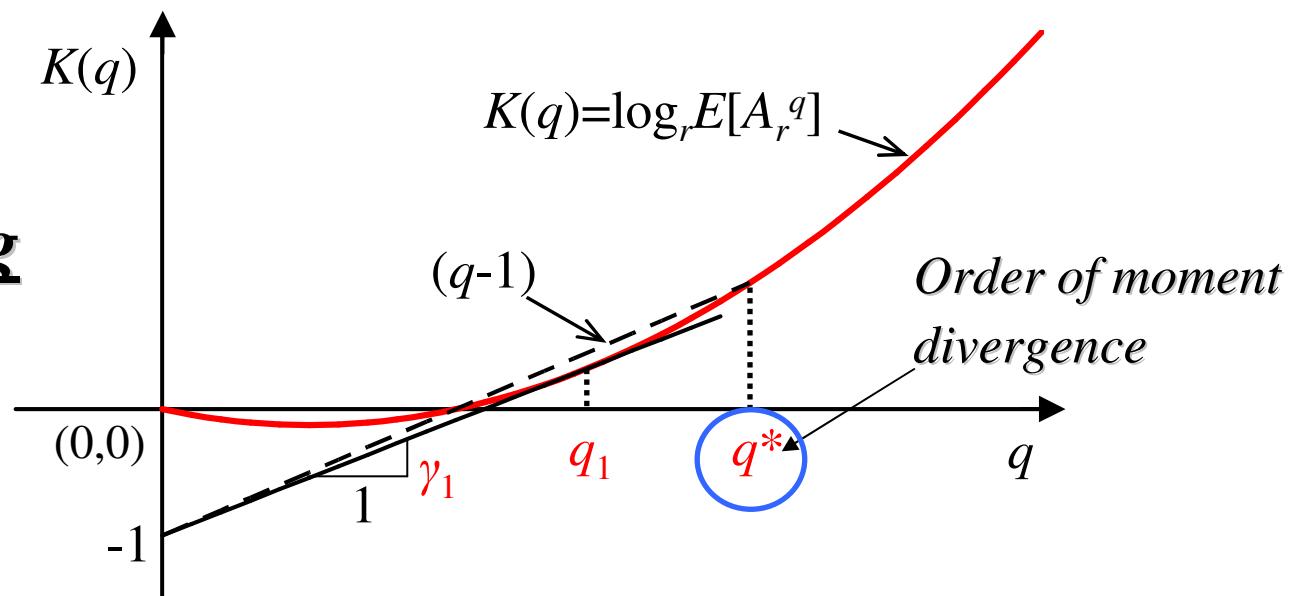
- ❖ *Multifractal models have known asymptotic IDF scaling properties*  
 (Hubert *et al.*, 1999; Veneziano and Furcolo, 2002)

$$\varepsilon_{d,T} \propto \begin{cases} d^{-\gamma_1} T^{1/q_1}, & \text{for } d \rightarrow 0 \text{ and } T \text{ finite} \\ d^{-1} T^{1/q^*}, & \text{for } d \text{ finite and } T \rightarrow \infty \end{cases}$$

➤ **Separability** holds for very small  $d$  or very large  $T$

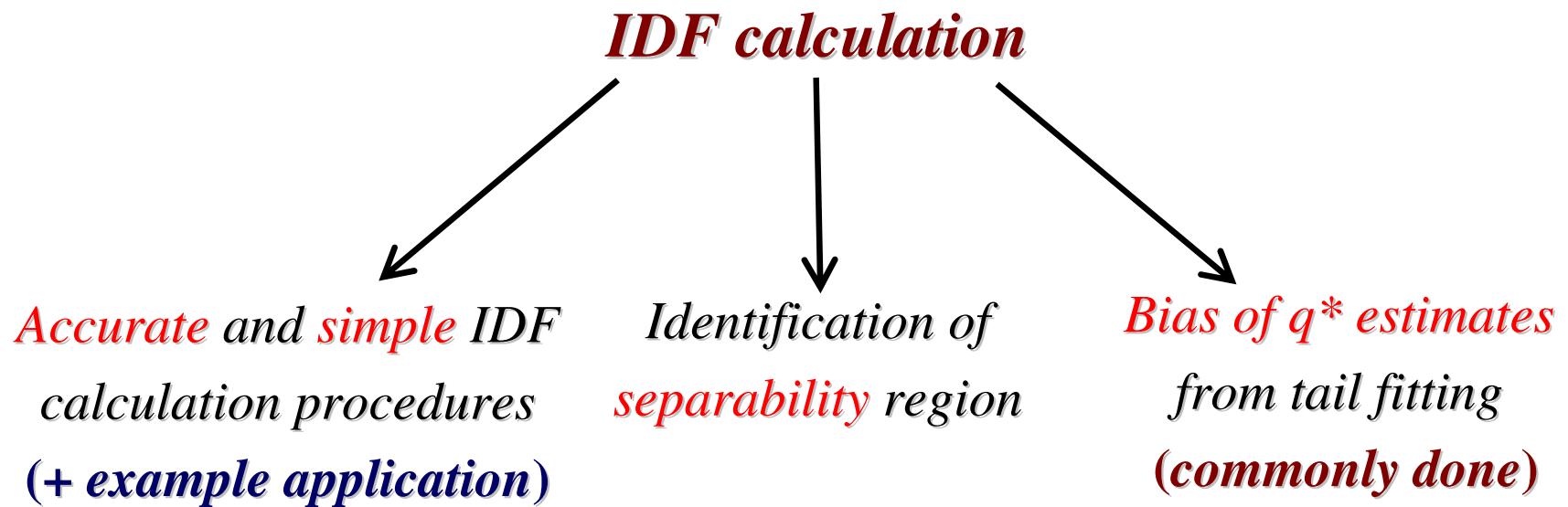
$$\varepsilon_{d,T} \sim T^k d^{-\delta}$$

**Moment scaling function**



# What's next...

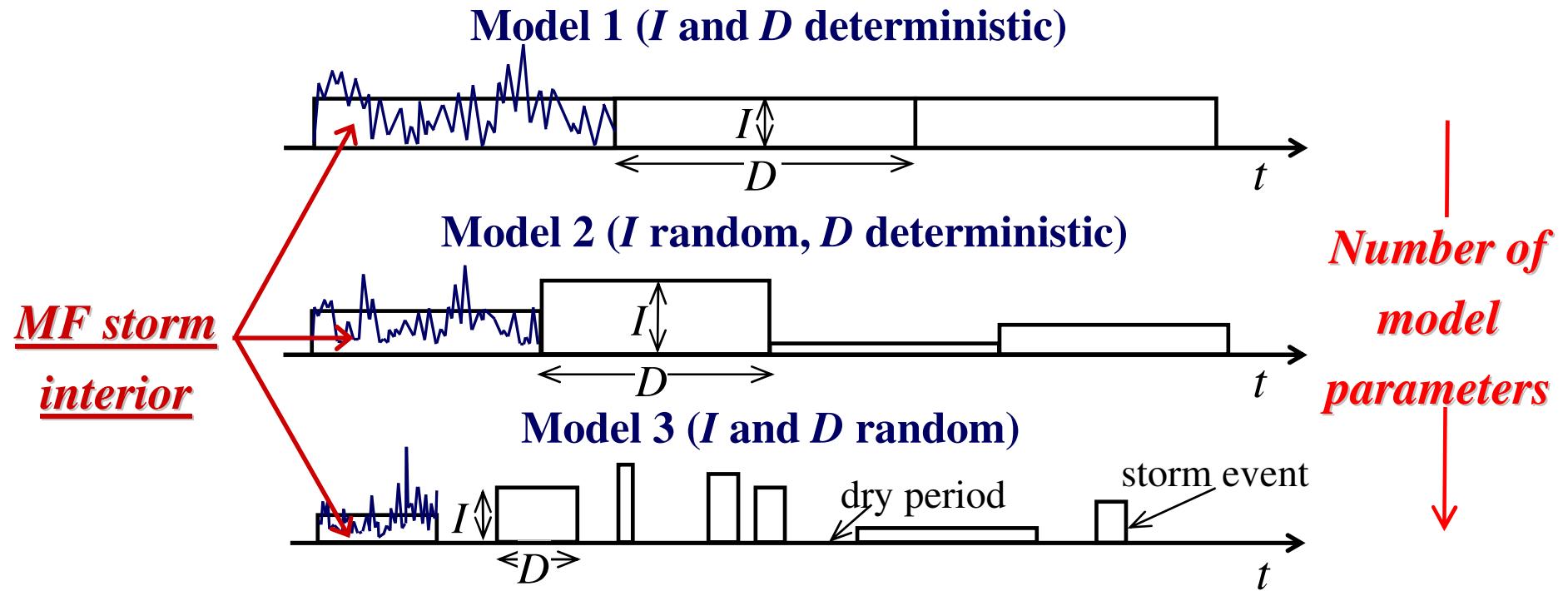
- ♦ *Multifractal rainfall models...*



- ♦ *Comparison of annual maxima and MF methods...see poster*

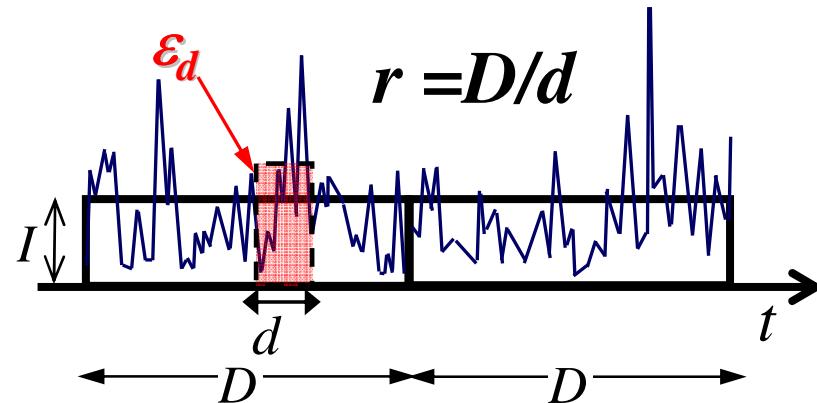
# Rainfall Models With MF Interiors

Langousis and Veneziano (2007):



# IDF Calculation Under Model 1

➤ Rainfall as a sequence of iid multiplicative cascades



$D$ : Upper limit of Multifractality  
(average “storm” interarrival time)

$I$ : Mean rainfall intensity; Set it to 1

Mean 1 MF interior:  $A_r \sim (\beta\text{-LN})$

- ❖  $P[A_r = 0] = 1 - r^{C_\beta}$
- ❖  $(\ln A_r | A_r > 0) \sim N[(C_\beta - C_{LN}) \ln r, 2C_{LN} \ln r]$
- $C_\beta$ : Intra-storm dry periods
- $C_{LN}$ : Multiplicative fluctuations when it rains

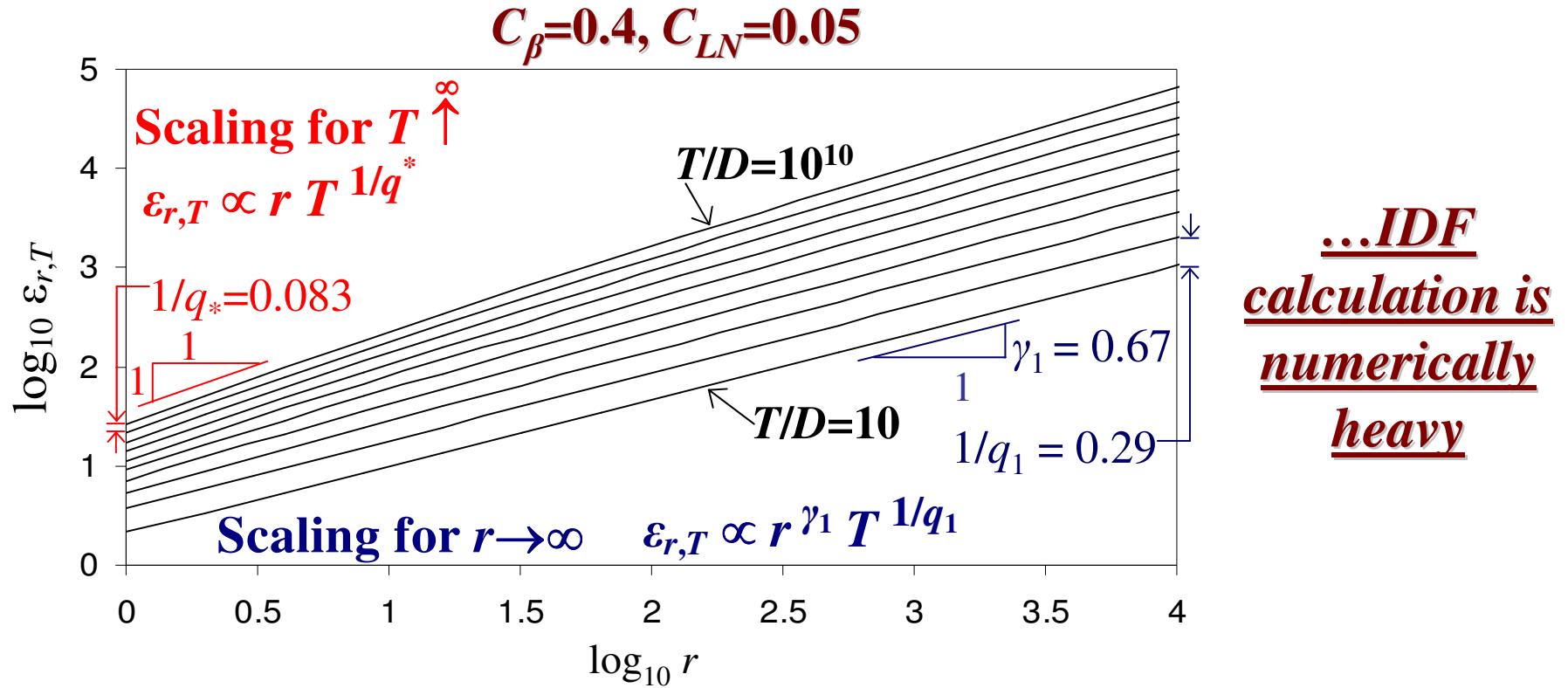
Asymptotic power law tail

$$\varepsilon_r = \varepsilon_{d=D/r} = A_r Z$$

$$\lim_{z \rightarrow \infty} P[Z > z] \propto z^{-q^*}$$

$$\lim_{\varepsilon \rightarrow \infty} P[\varepsilon_r > \varepsilon] \propto \varepsilon^{-q^*}$$

# Exact IDFs Under Model 1



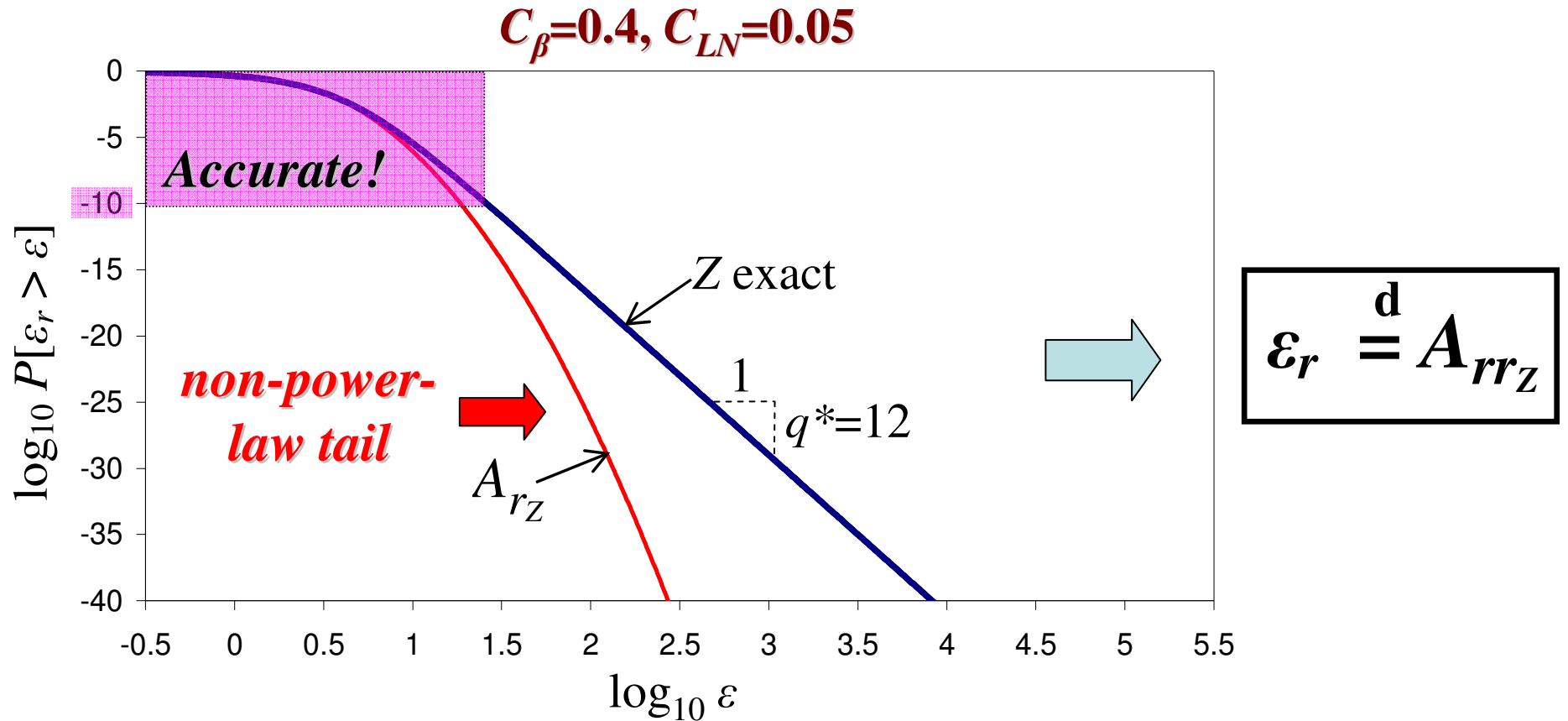
- Develop accurate but simple IDF calculation methods

# Approximation 1

## I) Replace $Z$ with $A_{r_Z}$

⇒ Calculate  $r_Z$  so that  $A_{r_Z}$  matches some moment order  $q'$  of  $Z$

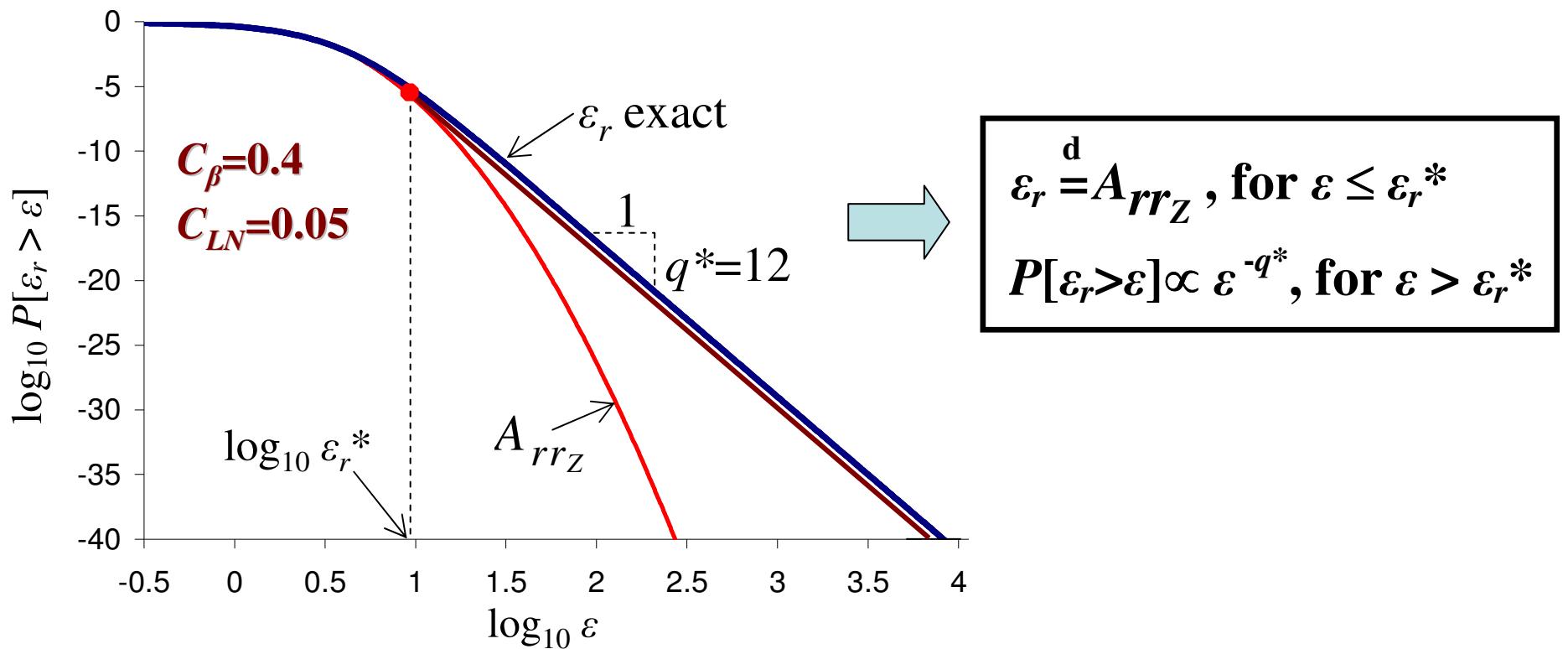
⇒  $q' \approx q^*/2 = (1-C_\beta)/2C_{LN}$  works well....



# Approximation 2

## II) Improvement over $A_{rr_Z}$ for the upper tail region

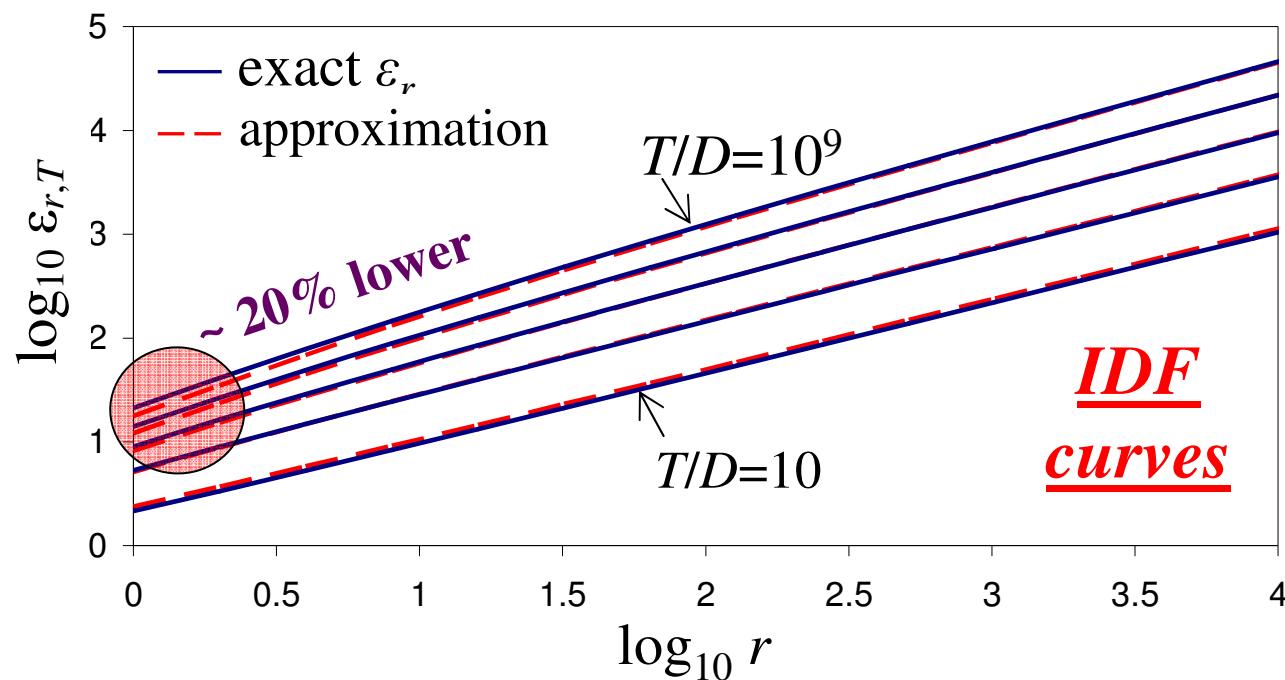
- ❖ Find the point  $\varepsilon_r^*$  at which the log-log slope of the distribution of  $A_{rr_Z}$  equals  $-q^*$
- ❖ “Graft” a  $q^*$  power law tail to the distribution of  $A_{rr_Z}$  above  $\varepsilon_r^*$



# Analytical Results

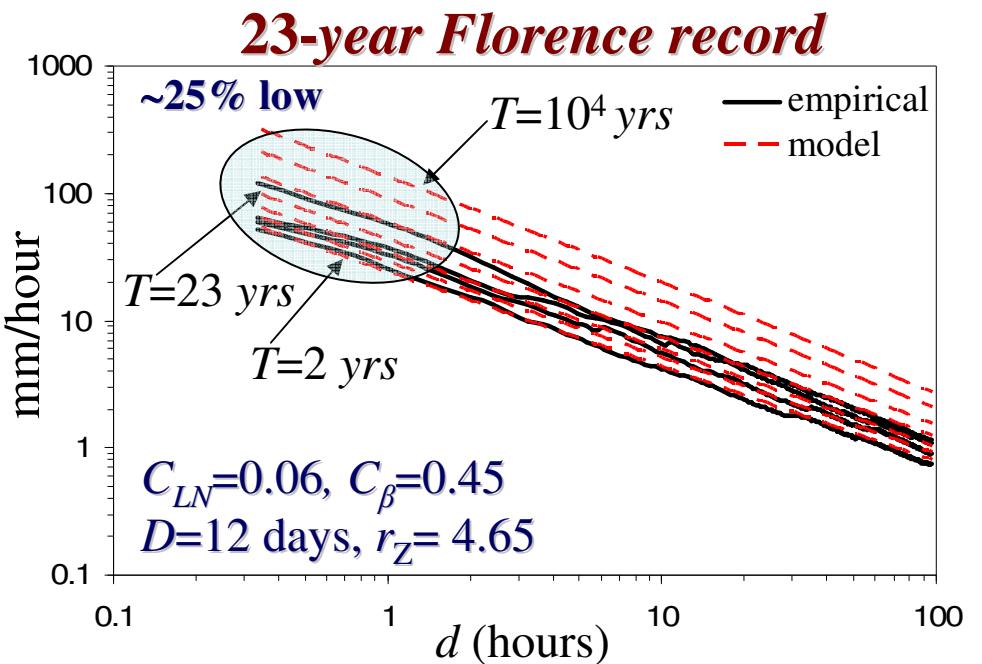
► Let  $\varepsilon = (rr_z)^\gamma$

$$T_{r,\gamma} \approx \begin{cases} \frac{D}{r} \left[ (2\pi) 2C_{LN} \left( \frac{\gamma - C_\beta}{2C_{LN}} + \frac{1}{2} \right)^2 \ln(rr_z) \right]^{1/2} (rr_z)^{C_{LN} \left( \frac{\gamma - C_\beta}{2C_{LN}} + \frac{1}{2} \right)^2 + C_\beta}, & \gamma \leq 2 - C_\beta - C_{LN} \\ \frac{D}{r} \left[ (2\pi) 2 \ln(rr_z) \frac{(1 - C_\beta)^2}{C_{LN}} \right]^{1/2} (rr_z)^{[1 + (\gamma - 1) \frac{1 - C_\beta}{C_{LN}}]} & , \gamma > 2 - C_\beta - C_{LN} \end{cases}$$

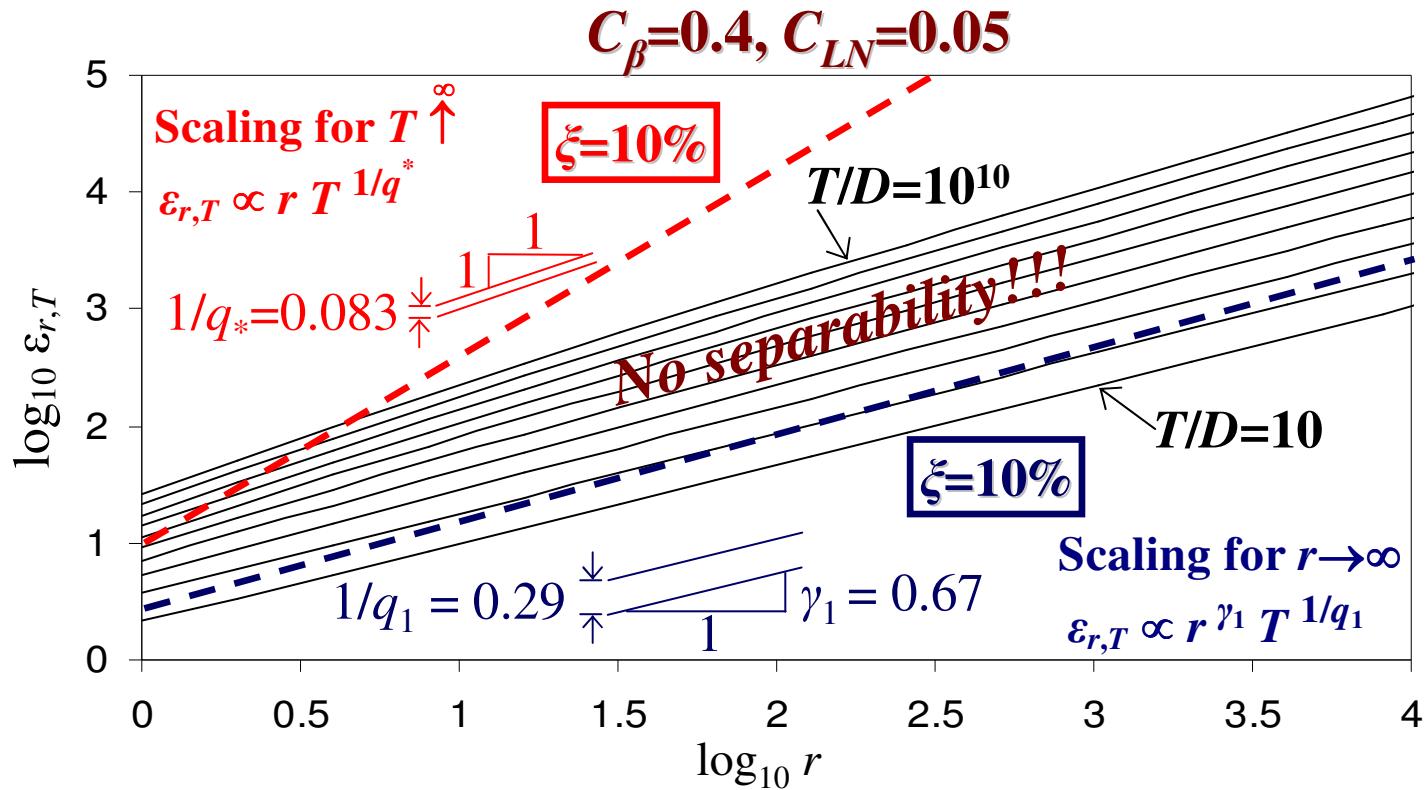


# Practical IDF Estimation....

- 1) Estimate the mean rainfall intensity  $I$  of the historical record.
- 2) Choose  $C_\beta$  and  $C_{LN}$  to match  $K(0)$  and  $K(3)$ 
  - $C_\beta = -K(0)$
  - $C_{LN} = [K(3) + 2K(0)]/6$
- 3) Calculate  $r_Z(C_\beta, C_{LN})$  from diagram
- 4) Set  $D$  such that the empirical moment  $E[\varepsilon_D^3]$  equals the theoretical value  $I^3 r_Z^{K(3)}$ .
- 5) Estimate the IDF values  $\varepsilon_{d,T}$  using the previous equation.
- 6) Multiply the calculated IDF values by the average rainfall intensity  $I$ .



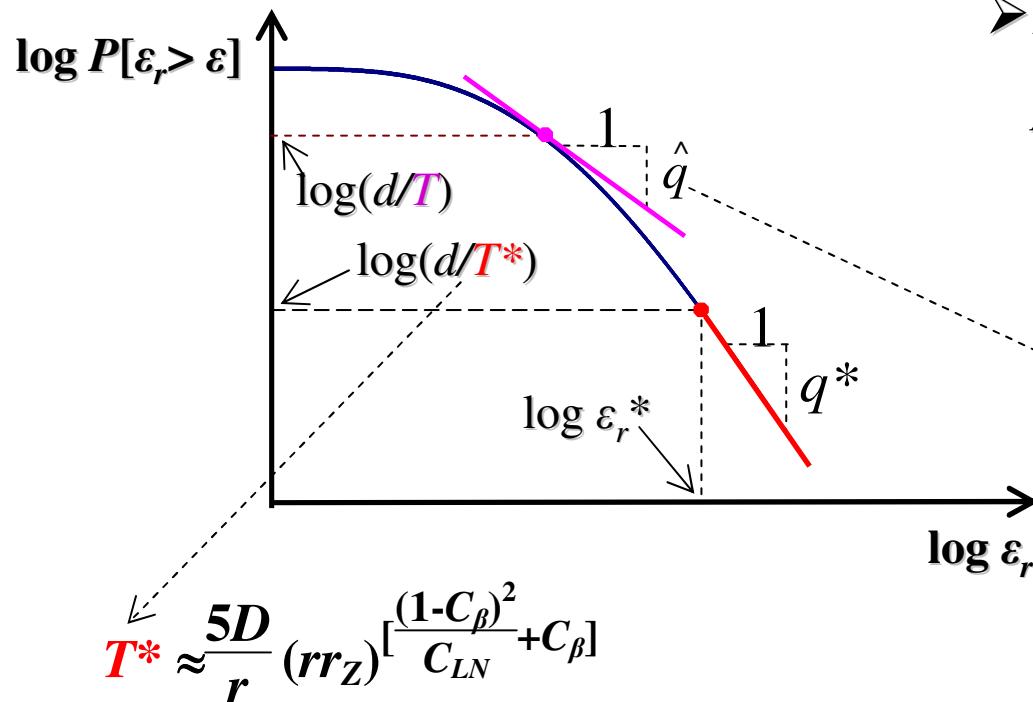
# Ranges of Approximate IDF Scaling



➤ Find regions where the **actual slope** and **spacing** are within  $\xi\%$  of the **asymptotic values**

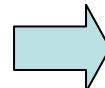
... analytical expressions for **boundaries** in Langousis *et al.* (2007)

# Bias in the Empirical Estimation of $q^*$



**Minimum record length to observe the  $q^*$  tail...**

**Example:**  
 $C_{LN}=0.06, C_\beta=0.45$   
 $D=12$  days,  $r_Z=4.65$



| $d$    | $r$ | $T^*$ (yrs)         |
|--------|-----|---------------------|
| 20 min | 864 | $1.2 \cdot 10^{16}$ |
| 1 hour | 88  | $8.5 \cdot 10^{13}$ |
| 1 day  | 12  | $5.4 \cdot 10^7$    |

► Many studies infer multifractal parameters ( $C_\beta, C_{LN}$ ) from the tail slope of the empirical distribution.

**Is there any bias?**

$$\hat{q} = \lambda q^*$$

$$\lambda = \sqrt{\frac{C_{LN} [\log_{rr_Z}(rT/5D) - C_\beta]}{1 - C_\beta}}$$

**Example:** ( $T=50$  yrs of data)

| $d$    | $\lambda$ | $\hat{q}$ | $q^*$ |
|--------|-----------|-----------|-------|
| 20 min | 0.45      | 4.1       | 9.2   |
| 1 hour | 0.47      | 4.3       | 9.2   |
| 1 day  | 0.56      | 5.15      | 9.2   |

... range found in literature

# Summary and Conclusions

- 1) We developed **IDF** estimation methods assuming multifractality of rainfall.
- 2) Simple **approximations** led to analytical expressions suitable for engineering practice.
- 3) We identified the **regions** on the  $(T,d)$  plane where the **IDF** curves are **separable** and **scaling** (common assumption in MF literature).  
⇒ Wide range of non-separability.
- 4) **Bias** when estimating the **power-law slope** of the distribution of  $\varepsilon_d$  (common procedure in MF literature).

➤ **Continuation...** (Poster: XY0569, tomorrow, Halls X/Y)

- ♦ **Comparison of annual maxima and MF methods**
  - Accuracy
  - Robustness
  - Sensitivity to outliers
- ♦ **Are actual **IDF**'s separable in  $d$  and  $T$  ?**
- ♦ **Modifications for non scaling rainfall**

*Thank you for your time!*