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## Introduction

The GREAT-ER system is used to calculate the PEC (Predicted Environmental Concentration) of chemicals, together with its uncertainty and variability, which arise due to the uncertainty (lack of exact knowledge) and variability (natural changes over space and time) of inputs and parameters.

The objectives of this study were:

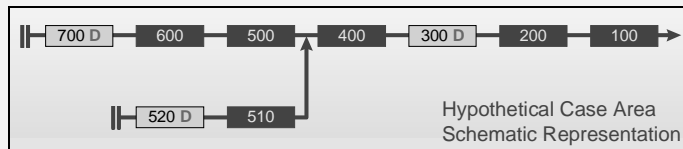
- to check the applicability of different uncertainty calculation methods
- to calculate the overall output uncertainty
- to calculate the amount of uncertainty coming forth from each independent variable (i.e., calculation of model sensitivity to each variable)

To approach these objectives three methods were applied: Monte Carlo simulation, First Order Analysis and Least Square Linearization.

## Case Study and Parameter Uncertainties

### Study Geography

hypothetical case area (each box = a river stretch, "D" = waste water discharge):

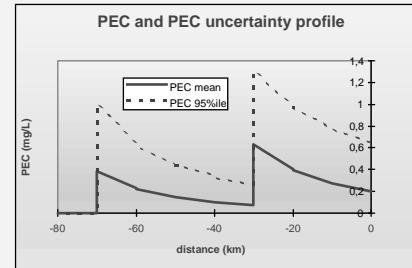


### Parameter Uncertainties

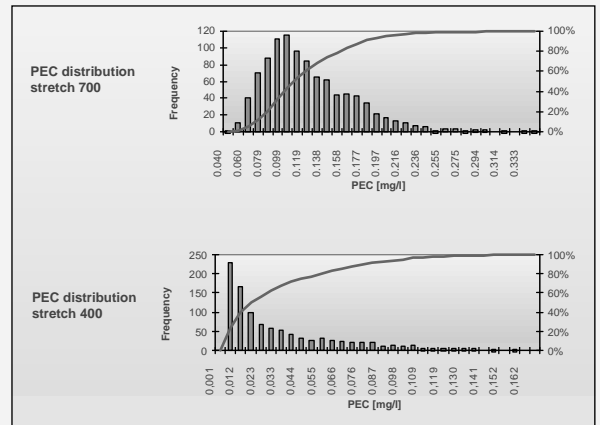
- fixed uncertainties for P (population), M (chemical consumption), W (water consumption), R (removal efficiency in WWTP), V (river velocity) predictions (regression parameters a,b,c) → NORMAL distribution
- variability of Q (river flow) → LOGNORMAL distribution
- uncertainty of in-stream-removal rate K:
  - series of simulation experiments: different K values, different uncertainties
  - mean values for K: varied from 0.01 to 0.8 h<sup>-1</sup>
  - range for uncertainty: set from 0 to 0.8 (in terms of standard deviation)
  - distribution types: UNIFORM, NORMAL, LOGNORMAL.

## Lumped Uncertainty: Monte Carlo

- Monte Carlo simulation: lumped predictive uncertainty of the model → probability distribution
- example of PEC uncertainty + variability profiles along the river:



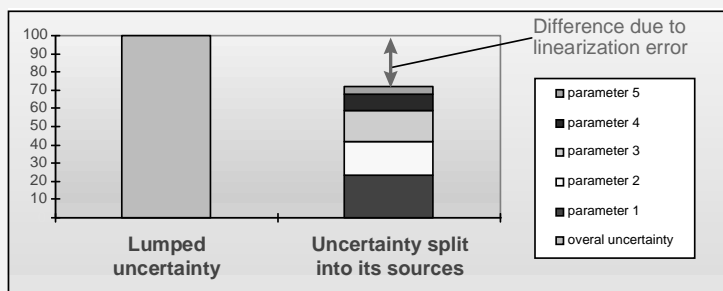
- coefficient of variation ( $\sigma/\mu$ ) along river varies strongly (can go up to 200%)
- simulations with no uncertainty for K → coefficients of variation up to 80% - 90% (distribution width = PEC<sub>95</sub> divided by PEC<sub>mean</sub>: 240% - 250%)
- coefficients of variation increase downstream, due to downstream propagation of the predictive uncertainty.



## Uncertainty Split into its Sources

to obtain the contribution of each variable to the overall uncertainty → two techniques were used, based on linearization.

Compared to Monte Carlo method, sum of uncertainties may be different due to linearization error:



### First-Order Analysis

failed (probably because parameter uncertainties were too big to be properly handled by this method)

### Least Square Linearization

= multilinear regression, conducted on results from Monte Carlo analysis

Sensitivity coefficients (for uniform distribution of K with 0.8 mean and +/- 0.8 deviation):

Segment ID	Q	a	b	M	P	W	f <sub>bypass</sub>	R <sub>WWTP</sub>	k	PHI <sub>up</sub>
100	3.1%	insign.	insign.	-	-	-	-	-	0.2%	96.6%
200	6.2%	insign.	insign.	-	-	-	-	-	2.2%	91.6%
300 D	13.3%	0.2%	0.4%	7.8%	1.0%	insign.	1.0%	0.5%	24.5%	51.3%
400	2.0%	insign.	insign.	-	-	-	-	-	0.3%	97.6%
500	4.5%	insign.	insign.	-	-	-	-	-	0.3%	95.1%
600	8.1%	insign.	insign.	-	-	-	-	-	16.7%	75.2%
700 D	9.0%	0.3%	0.8%	12.0%	1.3%	insign.	11.8%	6.7%	58.1%	-
510	2.7%	0.1%	0.1%	-	-	-	-	-	7.2%	89.9%
520 D	1.8%	insign.	insign.	2.1%	insign.	0.2%	-	-	96.0%	-

most stretches:

- main uncertainty due to downstream propagation (PHI<sub>up</sub> = upstream chemical flux)
- most sensitive parameters:
  - river flow (accounting for natural variability of the system)
  - degradation parameter K

'special' stretches:

- closest to discharge points: main source of uncertainty is K, and less Q
- with discharges: uncertainty also caused by emission parameters (product consumption, WWTP data)

## Conclusions

- This study was mainly conducted on a hypothetical case, and it should be regarded more as a gross estimation of what the uncertainty of the GREAT-ER model could be. Next, it was also a test polygon for the analysis methods.
- Monte Carlo proved to be straightforward for calculating the lumped uncertainty.
- In the hypothetical case the resulting distribution width was rather narrow: the 95%-ile value did not exceed the mean value more than 3.5 times.

- The uncertainty strongly propagates downstream, its main sources are the in-stream removal parameter and the natural system variability.
- To calculate uncertainty split into its sources, Least Square Linearization was found to be a very powerful method.