

# PRACTICAL SESSION - USING THE MYSTIC FRAMEWORK

Merlin Keller - Jérôme Stenger

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## 3 DIFFERENT OPTIMIZATION METHODS

- Auxiliary files
  - Model.py: Contains the hydraulic physical model and the cost function that calculates the p.o.f of the quantity of interest.
  - Solver\_Simulated\_Annealing.py: Contains our personal implementation of a simulated annealing solver. 4 schedules are available.
  - Cross\_Visualisation.py: Visualisation of the results imported from the three script files.
- Script files
  - Script\_Simulated\_Annealing.py: Optimization of the cost function using the simulated annealing solver.
  - Script\_Differential\_Evolution.py: Optimization of the cost function using a differential evolution solver.
  - Script\_Mystic\_Framework.py: Optimization of the p.o.f using the mystic framework.

# COST FUNCTION

- 4 parameters  $Q$ ,  $K_s$ ,  $Z_v$ , and  $Z_m$  bounded and constrained only by their mean.  $\mu_k = \omega_k \delta_{x_{1,k}} + (1 - \omega_k) \delta_{x_{-1,k}}$ ,
- Our cost function returns the CDF  $P(f(Q, K_s, Z_v, Z_m) \leq h)$ ,
- Parameterization with the position of the two Dirac masses constituting the support of the measure.

$$\begin{aligned}
 f(x_{\pm 1,1}, \dots, x_{\pm 1,p}) &= \sum_{i_1 \in \{-1,1\}} \cdots \sum_{i_p \in \{-1,1\}} P(G(x_{i_1,1}, \dots, x_{i_p,p}) \leq h), \\
 &= \sum_{i_1 \in \{-1,1\}} \cdots \sum_{i_p \in \{-1,1\}} \omega_{i_1,1} \dots \omega_{i_p,p} \mathbf{1}_{\{G(x_{i_1,1}, \dots, x_{i_p,p}) \leq h\}}.
 \end{aligned}$$

Where  $x_{-1,k}$  et  $x_{1,k}$  belongs to  $[l_k, E(\mu_k)]$  et  $[E(\mu_k), u_k]$ .

## ROBUST QUANTIFICATION

The files provided treat the 1D case, the others parameters are set to their means:

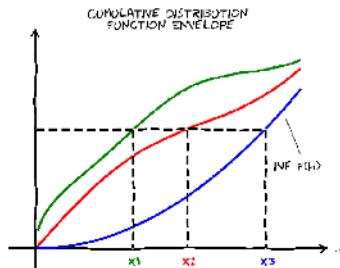
$$K_s = 30, Z_v = 05, Z_m = 54.5$$

The CDF is globally optimized:

$$\bar{q}(h) = \inf_{\substack{Q \in \mathcal{M}_1([160, 3580]) \\ E(Q) = 1870}} P(f(\mu) \leq h)$$

The plot shows the lowest CDF:

$$\bar{q} : h \mapsto \bar{q}(h)$$



# STOCHASTIC OPTIMIZATION

The following scripts optimize the cost function either with a Simulated Annealing solver or a Differential Evolution solver.

- `Script_Simulated_Annealing.py`
- `Script_Differential_Evolution.py`

The last script `Script_Mystic_Framework.py` also optimizes with a Differential Evolution solver ...

## THE MYSTIC FRAMEWORK

- Mystic allows a really easy implementation of constraints of any order, the framework is build for OUQ.
- We set the number of Dirac masses required for every measure. The cost function will depend on the position AND the weight.
- Every new point generated is transformed to respect the constraint evaluation in the solver:
  - Mean: it translates the measure. Variance-preserving.
  - Variance: Scales the measure, then re-adjust the mean. Mean-preserving.
  - And so on for higher moment orders.
- Mystic automatically calculates the p.o.f of our model.