



# PREDICTION OF PIEZOMETRIC LEVELS AT THE ROCK CONCRETE INTERFACE CONSIDERING THE NON LINEARITY OF PERMEABILITY IN THE FOUNDATIONS

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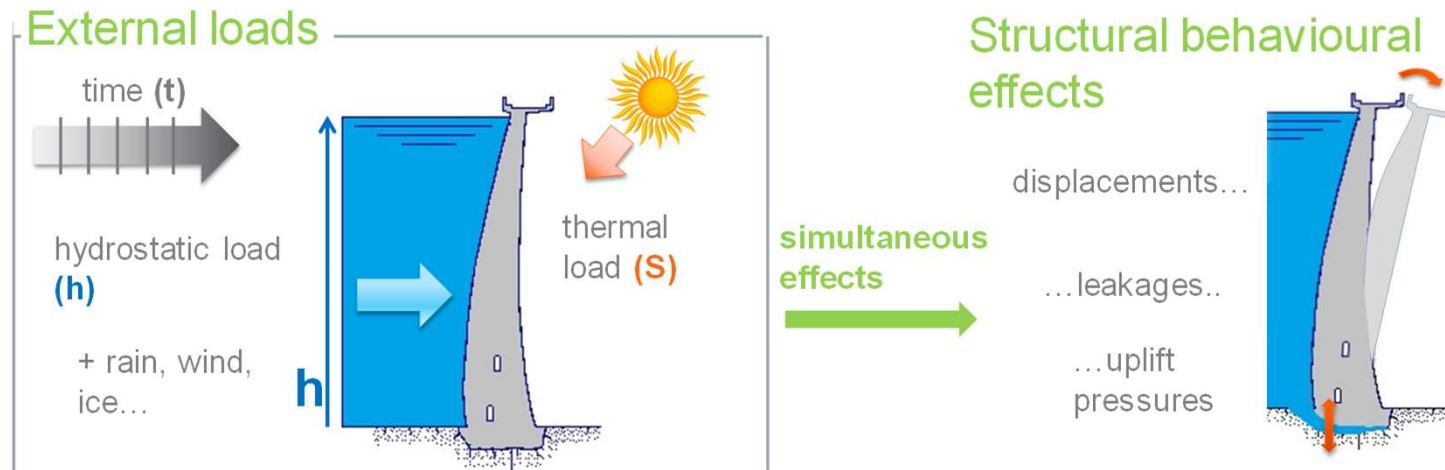
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# Context: dam surveillance



- Loads and effects are monitored and processed. **Raw times series are not easy to interpret.**
- **Physico-statistical models to analyse time series of measurements:**
  - Interpret the behaviour of the dam and assess its safety in real time
  - Understand the contribution of each external load
  - Follow the irreversible evolution of monitored phenomena, such as the **aperture of the rock-concrete interface**
  - ...

In this study: a **non linear formulation** is proposed to describe monitored time series of **piezometric levels (PL)** at the rock-concrete interface of a French arch dam. Results are compared to the classical **linear model** (HST).

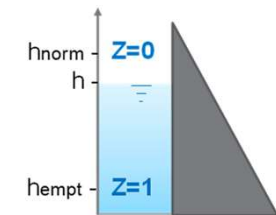
# Hydrostatic Season Time model (HST)

- **A multi-linear regression model:**

PL: time series of monitored piezometric levels

$$PL_i = b_0 + f_1(t_i) + f_2(Z_i) + f_3(S_i) + \varepsilon_i$$

	effect	Corresponding law	
Irreversible part	Time effect	$f_1(t) = b_1 t$	(1)
	Hydrostatic effect	$f_2(Z) = b_2 Z + b_3 Z^2 + b_4 Z^3 + b_5 Z^4$	(2)
Reversible part	Thermal (or seasonal) effect	$f_3(S) = b_6 \cos S + b_7 \sin S + b_8 \cos 2S + b_9 \sin 2S$	(3)



- $t$ : the day of the measurement
- $Z = \frac{h_{\text{norm}} - h}{h_{\text{norm}} - h_{\text{empty}}}$  the relative trough
- $S = 2\pi \cdot \left( \frac{t}{365.25} - \text{floor}\left(\frac{t}{365.25}\right) \right)$  the season, angle equal to 0 on the 1st of January and  $2\pi$  on the 31st of December

- **Correcting measurements by removing the reversible effects:**  $CM_i = PL_i - f_2(Z_i) - f_3(S_i)$   
 $= f_1(t_i) + \varepsilon$

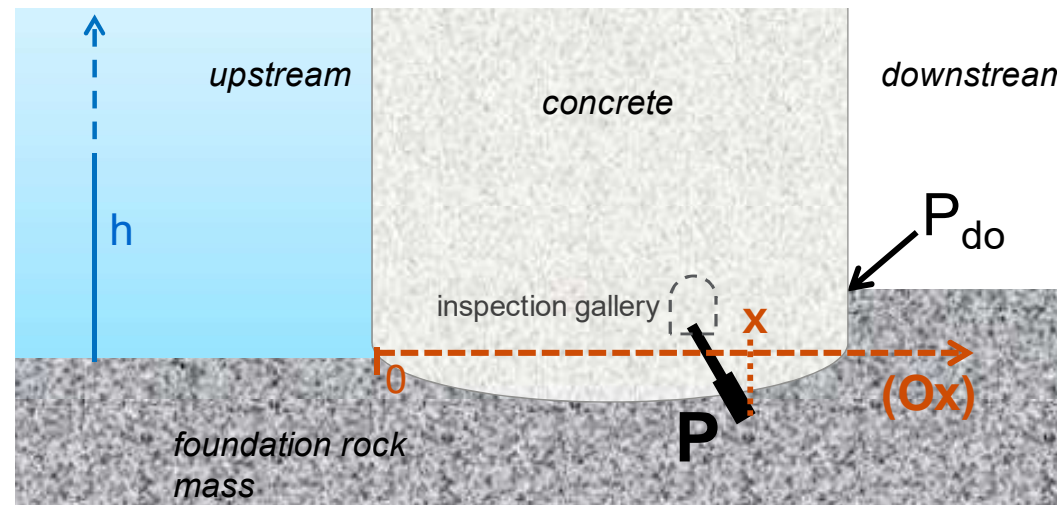
Identification of temporal effects, eventually abnormal evolutions → **key diagnostic tool**

Assumption 1: reversible laws = time-independent

Assumption 2:  $Z$ ,  $S$  have purely independent (additive) effects

# Introducing non-linearity: NL HST

**Aim:** describe the piezometry ( $P$ ) at the rock concrete interface by integrating the **non additive effects** of the loads, keeping **a high interpretability**



*Representation of the rock-concrete interface*

- $P$  the piezometry measured at the contact
- $P_{do}$  the piezometry at the downstream end
- $H_{load} = h - P_{do}$  the hydrostatic load
- $k(x)$  a dimensionless factor, written  $k$

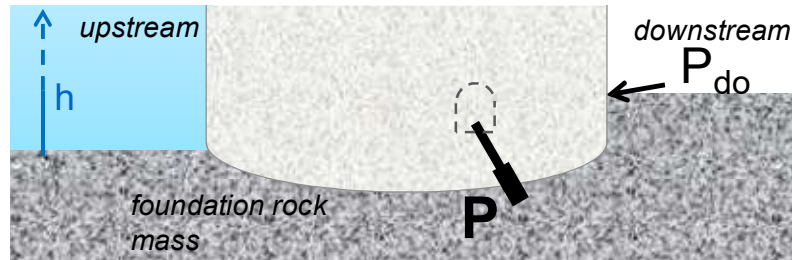
**Principle:**

$P$  at the interface = a fraction of the total upstream load

$$P = P_{do} + k \cdot H_{load}$$

# Introducing non-linearity

## Expression of $k$



$$P = P_{do} + k \cdot H_{load}$$

The permeability of the medium is not homogeneous nor isotropic  $\rightarrow k$  varies with external loads

- **Variation of the rock-mass permeability**

External loads  $\rightarrow$  induce mechanical stresses on the structure  $\rightarrow$  mechanical strains in the foundation  $\rightarrow$  makes the permeability of the foundation vary

$$k = g(meca)$$

- **Effect of the mechanical stresses on the structure: additivity hypotheses**

$$meca = f_1(S) + f_2(Z) + f_3(t) + \varepsilon_i$$

- **Influence on the permeability:**

$$k = g_{non\ linear}(meca) \longrightarrow k = \tanh(meca)$$

**Validation:** vertical displacements recorded at the rock-concrete interface

# Introducing non-linearity

- Final expression:

$$P_i = P_{do} + [b_1 + b_2 \cdot \tanh(a_0 + a_1 \cdot \cos S_i + a_2 \cdot \sin S_i + a_3 \cdot \cos 2S_i + a_4 \cdot \sin 2S_i + a_5 \cdot Z_i + a_6 \cdot Z_i^2 + a_7 \cdot Z_i^3 + a_8 \cdot Z_i^4 + a_9 \cdot t_i)] \cdot [h_{norm} - Z \cdot (h_{norm} - h_{emp}) - P_{do}] + \varepsilon_i ; \quad i \in \{1;N\}$$

➤  $P_{do}$  is not precisely known ➔ optimize it as a regression parameter ➔  $P_{do} = b_0$

$$P_i = b_0 + [b_1 + b_2 \cdot \tanh(a_0 + a_1 \cdot \cos S_i + a_2 \cdot \sin S_i + a_3 \cdot \cos 2S_i + a_4 \cdot \sin 2S_i + a_5 \cdot Z_i + a_6 \cdot Z_i^2 + a_7 \cdot Z_i^3 + a_8 \cdot Z_i^4 + a_9 \cdot t_i)] \cdot [h_{norm} - Z_i \cdot (h_{norm} - h_{emp}) - b_0] + \varepsilon_i ; \quad i \in \{1;N\}$$

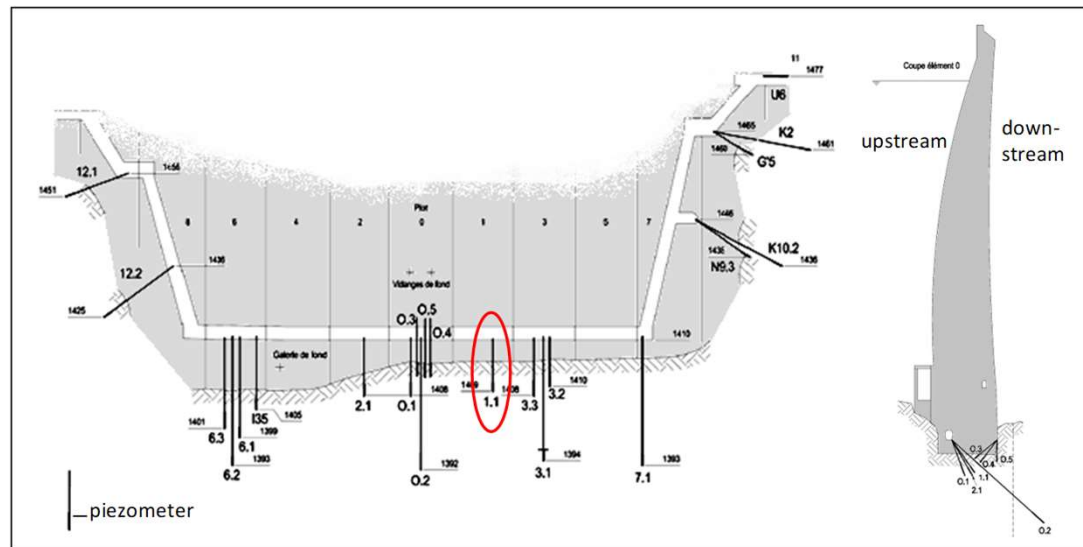
$b_1, b_2, a_0, \dots, a_9$  13 regression coefficients ➤ nonlinear least squares fitting, using the Levenberg Marquardt algorithm  
 $\varepsilon_i$  residuals

$$P = b_0 + \underbrace{(b_1 + b_2 \cdot \tanh(a_0 + f_1(S) + f_2(Z) + f_3(t)))}_k \cdot \underbrace{H_{load}(Z)}_{H_{load}} + \varepsilon$$

# Case study: studied dam



- composite structure comprising a gravity buttress which leans on a central **double curvature arch**
- maximal height: 150m
- total crest length: 804m
- **rock-concrete interface of the arch dam is open**



## Studied sensor:

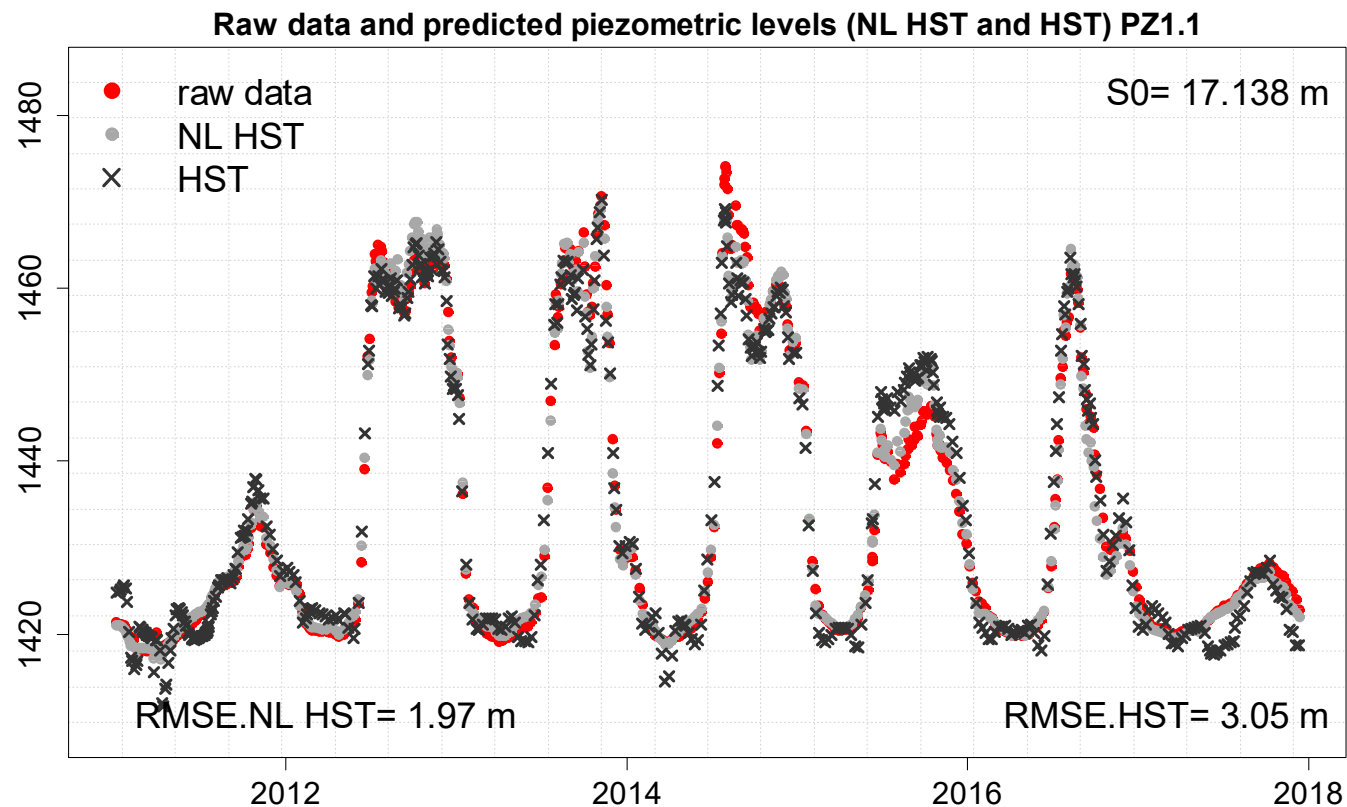
- Piezometer 1.1 → directly influenced by the **aperture** of the interface.

# Results

- Prediction performances

	HST	NL HST
Initial standard deviation (m)	17.14	
Root Mean Square Error (m)	3.05	1.97

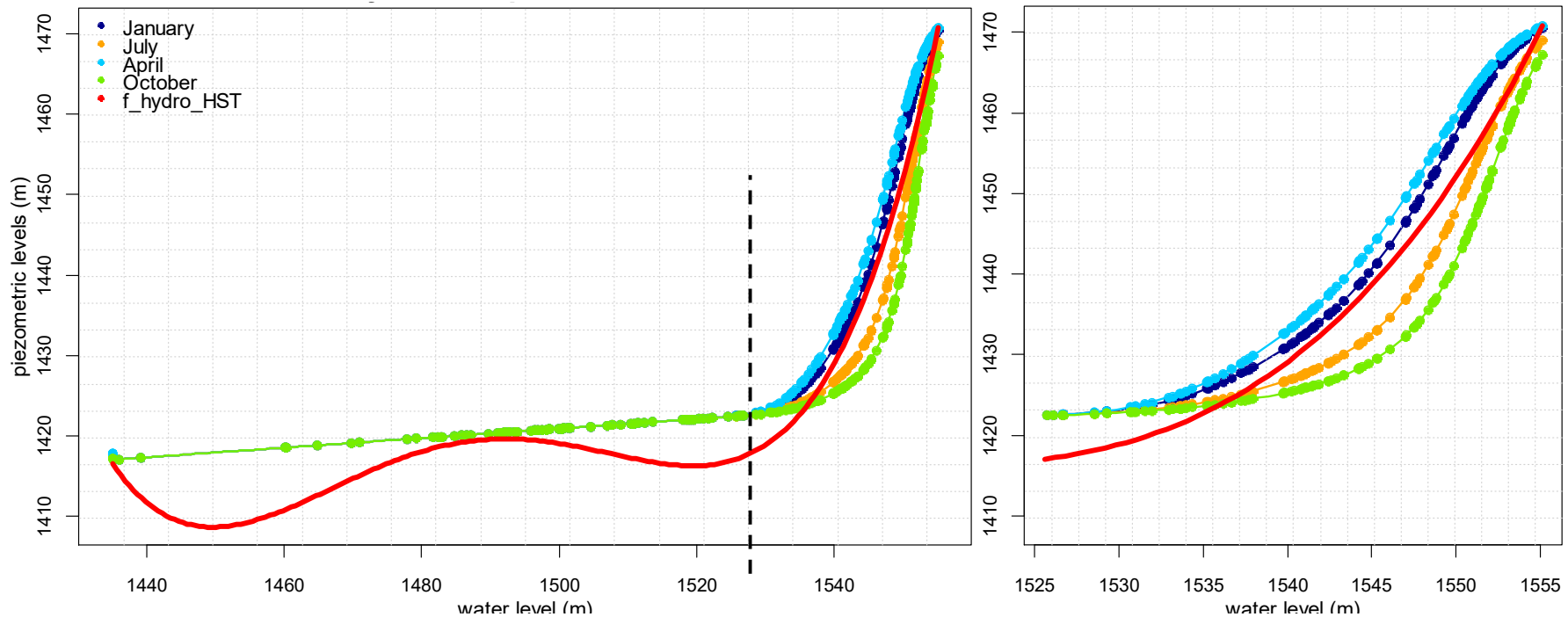
→ improves HST by 35.4%





# Results

- Reversible effects: hydrostatic effect



## NL HST:

1435m to 1528m: hardly any PL variation

Threshold: 1528m → increase of the PL → opening of the aperture, uplift pressures develop

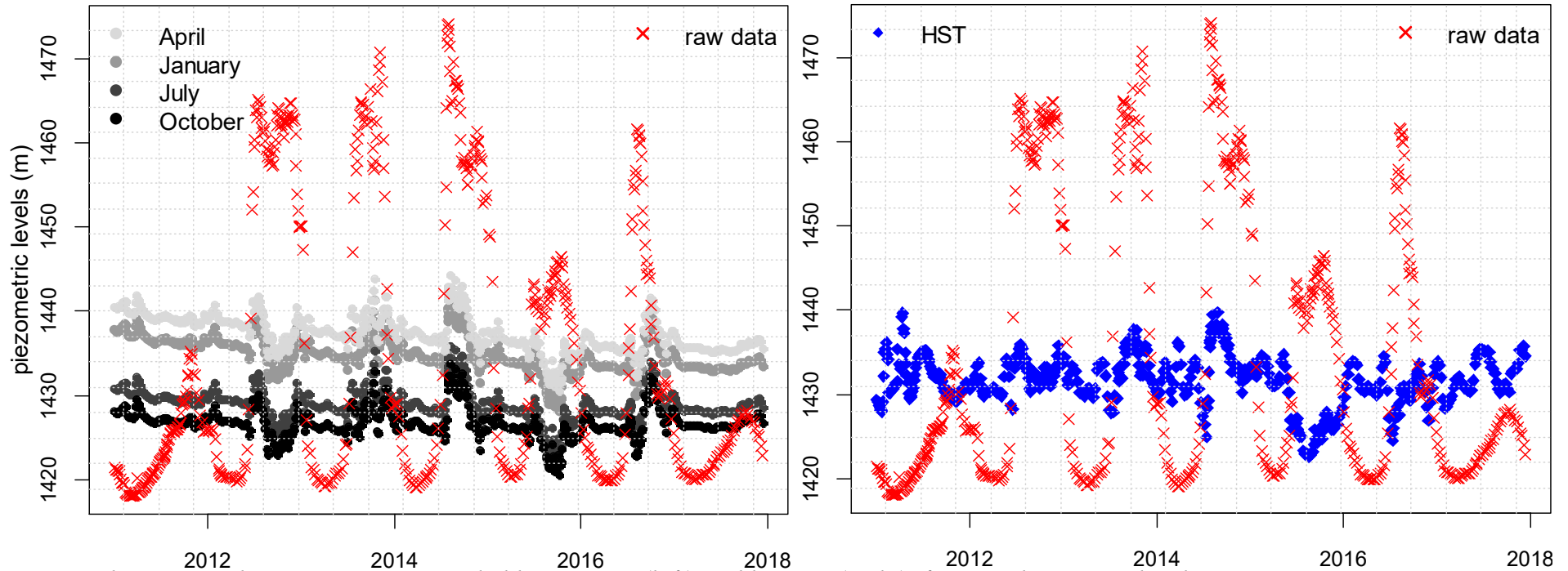
Above 1528m: **the thermal state controls the size of the aperture**

## HST:

oscillations (polynomial VS tanh), average effect (no coupling with S)

# Results

- Irreversible effect: corrected measurements



*The corrected measurements provided by NL HST (left) and by HST (right), for a median water level*

## NL HST:

low remaining scattering, precise irreversible trend → **improvement for monitoring purposes, diagnostic tool**

Temporal evolution: decrease → **gradual closing of the R-C aperture**

## HST:

No distinction between the thermal state → average response, seasonal aspect is conserved → no clear trend

# Conclusion

- Well adapted to monitoring purposes
  - ✓ Better accuracy than HST
  - ✓ Easy to implement
  - ✓ precise visualisation of the temporal evolution
- It permits to overcome the non additivity issue
  - ✓ Gives an account of the coupled effects of the loads
  - ✓ rich physical interpretation of the phenomenon (closing of the aperture, role of the thermal state)

## Possible improvement

- Could be adapted to leakage
- Could take into account real temperatures

Thank you for your attention



# Appendix: corrected measurements

- **aim:** reveal the temporal evolution of the phenomena.
- Linear model:  $\mathbf{CM}_i = \mathbf{PL}_i - \mathbf{f}_2(\mathbf{Z}_i) - \mathbf{f}_3(\mathbf{S}_i)$ 
  - Make very measurements comparable: observe measurements under « **identical conditions** »

$$\mathbf{CM}_i = \mathbf{f}_1(\mathbf{t}_i) + \boldsymbol{\varepsilon}$$

it corresponds to calculating the PL that would have been observed had  $\mathbf{f}_1(\mathbf{Z}) = 0$  and  $\mathbf{f}_2(\mathbf{S})=0$

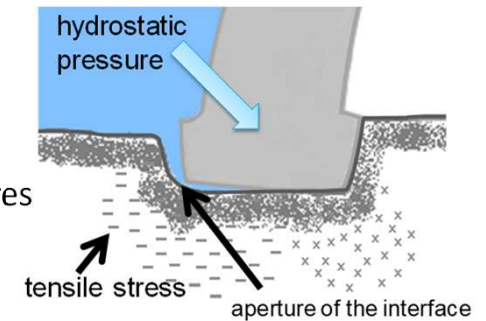
$$\{\mathbf{f}_1(\mathbf{Z}) = 0 \text{ and } \mathbf{f}_2(\mathbf{S})=0\} \Leftrightarrow \{\mathbf{Z}=0; \mathbf{S}=\mathbf{S}_{\text{average}}\} \Leftrightarrow \{\mathbf{Z}=\mathbf{Z}_{\text{ref}}; \mathbf{S}=\mathbf{S}_{\text{ref}}\} \rightarrow \mathbf{CM}_i = \mathbf{f}_1(\mathbf{t}_i) + \mathbf{f}_2(\mathbf{Z}_{\text{ref}}) + \mathbf{f}_3(\mathbf{S}_{\text{ref}}) + \boldsymbol{\varepsilon}_i$$

- Non linear model:  $\mathbf{PL} = \mathbf{f}(\mathbf{Z}, \mathbf{S}, \mathbf{t})$ 
  - the effects are no longer additive  $\rightarrow$  impossible to remove the effect of Z and S as simply as with HST
  - set Z and S to reference values to observe the measurements under **identical conditions**

$$\mathbf{CM} = \mathbf{f}(\mathbf{Z}_{\text{ref}}, \mathbf{S}_{\text{ref}}, \mathbf{t}) + \boldsymbol{\varepsilon}$$

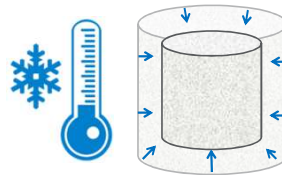
# Context: aperture of the rock/concrete interface

- Thin arch dams, large valleys
- state of compression, hydraulic conductivity of the foundations vary from upst. to downst.
- heel: hydrostatic load transmitted to the foundations, propagation of uplift pressures
- mechanical stresses  $\leftrightarrow$  state of aperture
- Characterization of the aperture: monitoring the **piezometric levels**

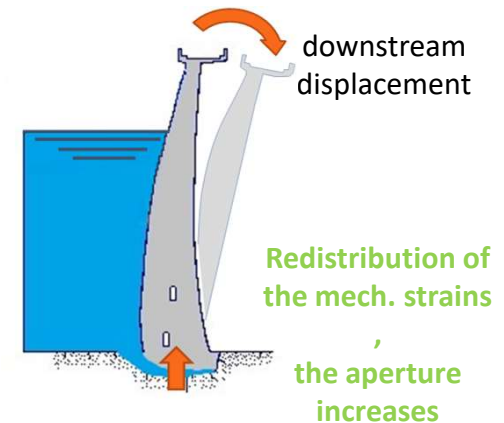
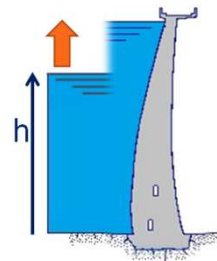


## Non-linear features:

- Effect of S Season: thermal sensitivity of concrete



- Effect of h (water level):



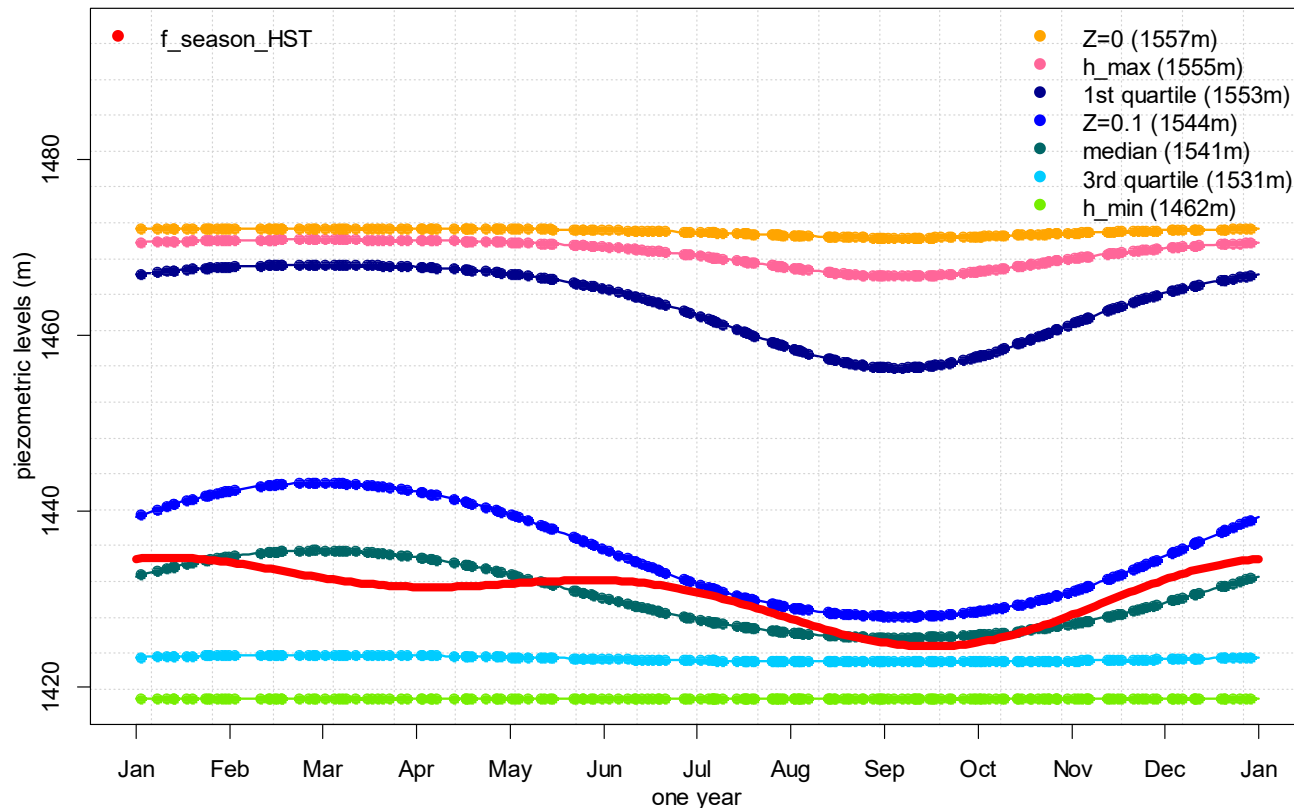
➔ not independent ➔ **need to include non-additive relationships between effects**

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# Results

- Reversible effects: seasonal effect



## NL HST:

Min (resp. max) in October (resp. April) → thermal sensitivity of concrete

Threshold between 1462m and 1531m

## HST:

Two minima (April and Oct) → limit of the additivity hypothesis. HST artificially separates the effects of S and Z

# Interpretability: method

- **Reversible and irreversible effects:**

Analogy with HST

Identification of the contribution of each load  **simulation of the PL, one input vary at a time**

Variables are no longer independent **→ parameter**

$$P = b_0 + (b_1 + b_2 \cdot \tanh(a_0 + f_1(S) + f_2(Z) + f_3(t))) \cdot H_{load}(Z) + \varepsilon \quad \Longrightarrow \quad P = f(Z, S, t)$$

➤ **Reversible effects:**

- **hydrostatic effect:**  $P_{hyd} = f(\mathbf{Z}, S_{ref}, t_{ref})$   
parameter  $S=(S_1, S_2, S_3, S_4)$  (Jan, Apr, Jul, Oct)
- **seasonal effect:**  $P_{seas} = f(Z_{ref}, \mathbf{S}, t_{ref})$   
parameter  $Z=(Z_1, ..., Z_7)$  (quartile values and extrema)

➤ **Irreversible effects :**

- **corrected measurements:**  $CM = f(Z_{ref}, S_{ref}, \mathbf{t}) + \varepsilon$