

The logo for IRSN (Institut de Radioprotection et de Sécurité Nucléaire) is displayed in a white box with a red border. The letters 'IRSN' are in a bold, sans-serif font, with 'IR' in red and 'SN' in blue.

INSTITUT  
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# Combining probability and possibility to respect the real state of knowledge on uncertainties in the evaluation of safety margins

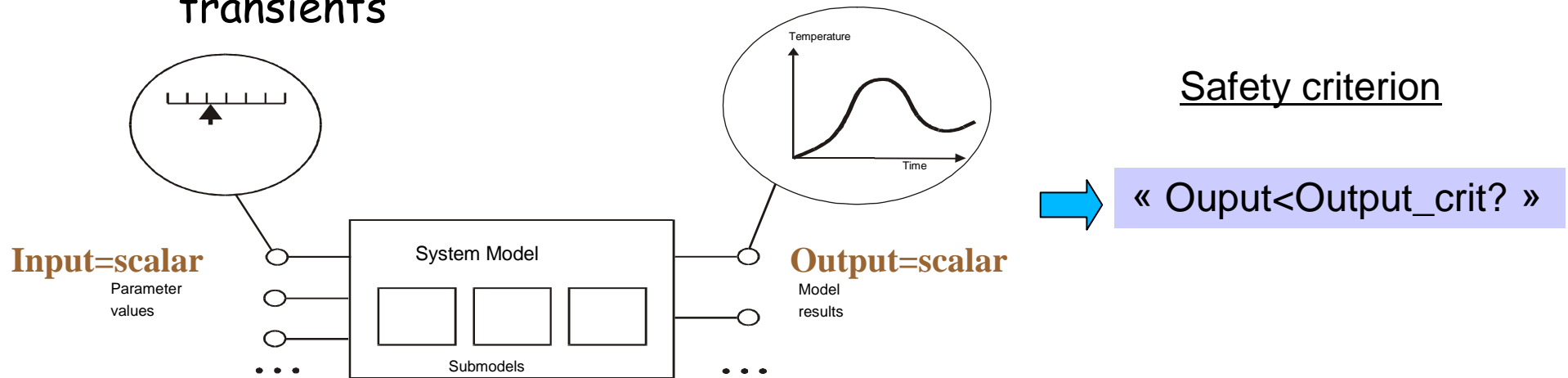
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# Uncertainty analysis: why?

- IRSN: expert in research and specialised assessments into nuclear and radiological risk serving french public authorities.
- Safety assessment: computer codes simulation of accidental transients



- Approximation of the physical reality
- Ill-known data (imprecision, uncertainty range)
- Conservative codes: penalizing results
- Best-Estimate codes: take into account uncertainty

## Classical probabilistic uncertainty analysis

- Uncertainty quantification by a PDF + specification of dependencies between uncertain parameters
- Uncertainty propagation through the computer code by Monte-Carlo simulations
- Statistical analysis
  - Likelihood of the code response to be above a safety limit
  - Uncertainty margin

Estimation of  $\alpha$ -percentile:  
( $\alpha=5\%,95\%$ )

$$y_{\alpha} \quad ? \quad P ( Y \leq y_{\alpha} ) = F_Y ( y_{\alpha} ) = \alpha$$



## Classical probabilistic approach

- Easy to perform
- Direct estimation of percentiles by order statistics + numerical accuracy due to the sample size : no response surface, no statistical tests,.....

But:

- Need to specify **an unique PDF** for each uncertain parameter + **dependencies** between parameters

➡ Not always available

➡ Solution in case of incomplete knowledge? Uniform law and independence between parameters

No knowledge about PDFS	≠	Equiprobability
No knowledge about dependencies	≠	Independence


## Sketch of the presentation

### 1) RAFU method and uncertainty analysis

- ❖ Hybrid-type methods

- ❖ RAFU approach: computational cost reduction strategy and integration of numerical accuracy

### 2) Application to the evaluation of uncertainty margins for a nuclear reactor



1-1) Uncertainty analysis  
based on hybrid-type  
methods

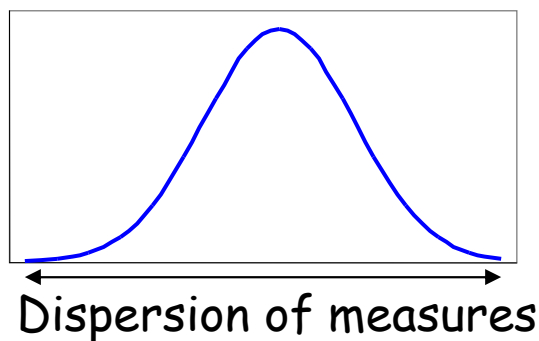
## (1) Modeling of uncertainty sources

- Variability (aleatory uncertainty)

*No reduction of uncertainty margin by increasing the state of knowledge*

→ Variability inside a given population (weight)  
Time failures of some class of components

→ Modeling: **random variable**



## (1) Modeling of uncertainty sources

- Imprecision, lack of knowledge (epistemic uncertainty)

*Reduction of uncertainty margin by increasing the state of knowledge*

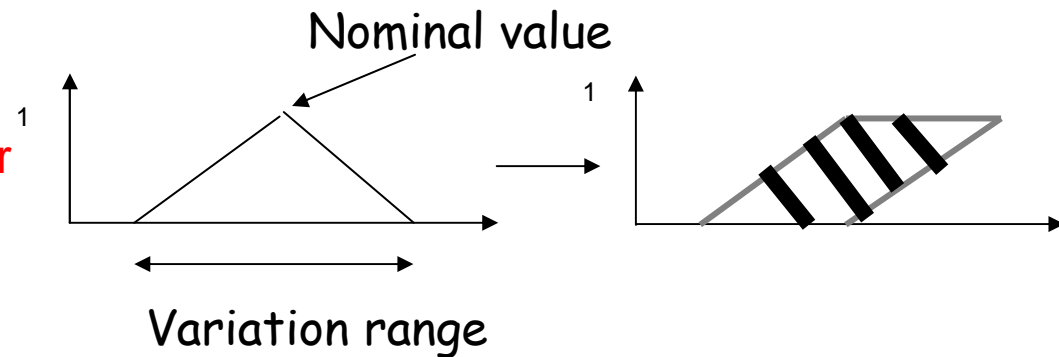
→ **Systematical error: measurement not fully reliable**

**Poor quantity of data**

**Subjective uncertainty: expert providing imprecise valued quantities**



**Modeling: fuzzy number**

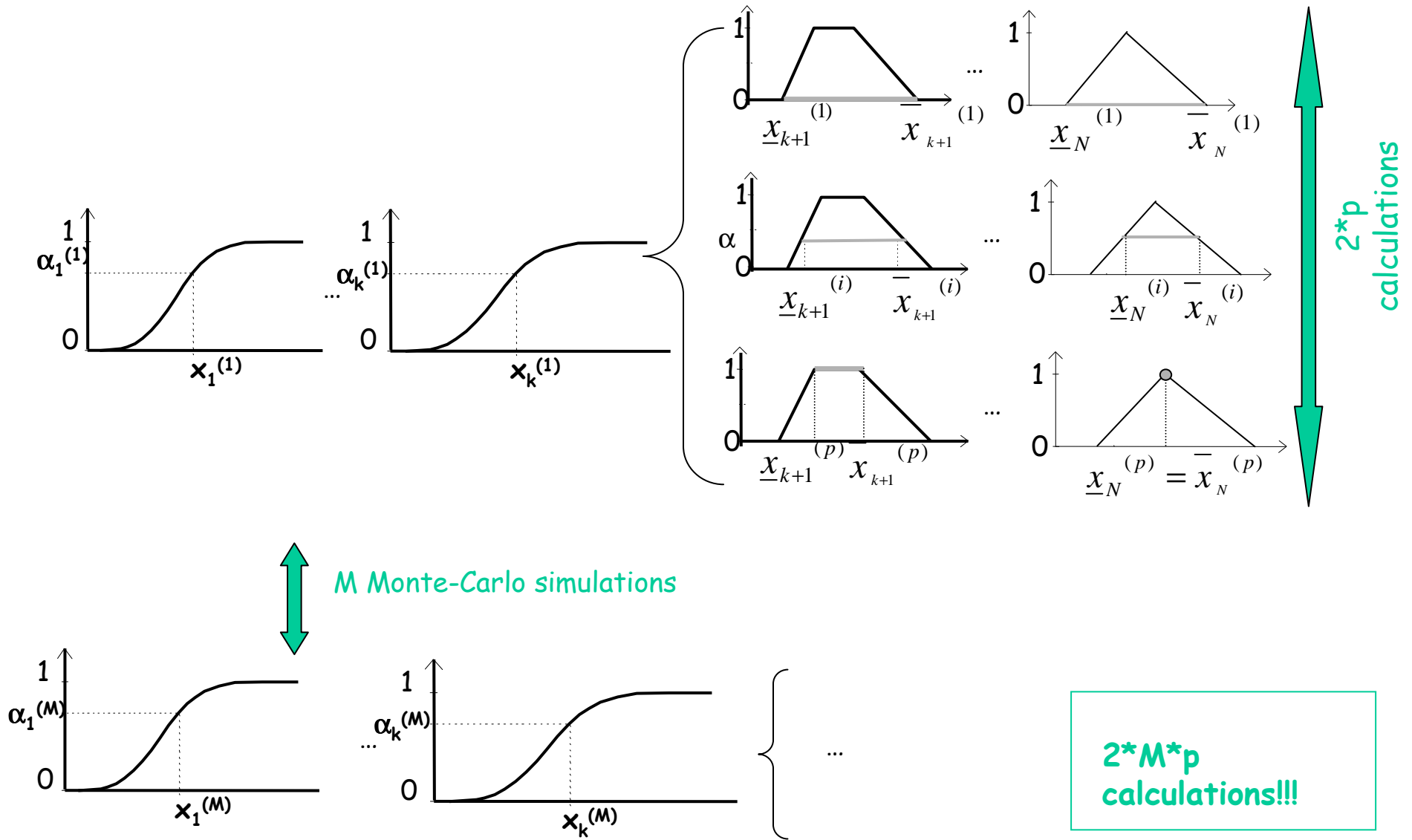


**Partial probabilistic modeling** (requires less information for its construction than the probabilistic one)

- Relax the assumption related to the choice of an unique PDF  
Random or fuzzy variable according to the available knowledge and to the nature of the information?

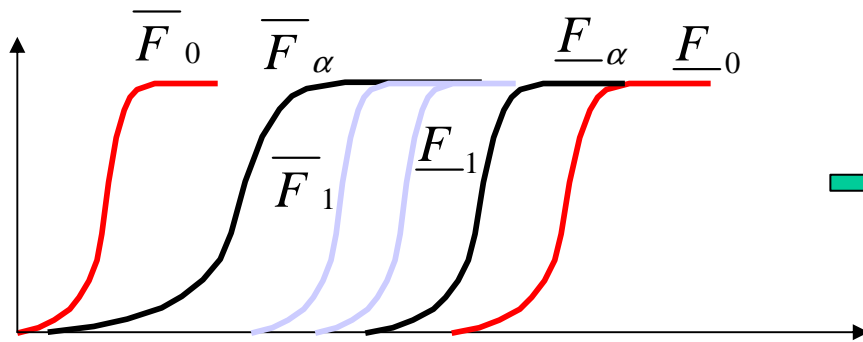


## (2) Propagation through computer code (sampling procedure)



### (3) Statistical analysis

- Pairs of cumulative distribution functions



Which  $[\bar{F}; \underline{F}]$  to choose as statistical summary?

Ferson *et al.*:  $\alpha=\{0,1\}$

Baudrit *et al.*:  $\alpha=\text{average}$

- Extension of classical statistical estimation techniques to hybrid-type framework:

→ Couple of lower and upper percentiles

- 2 Main drawbacks: - computational cost:  $2 \cdot M \cdot p$  calculations ( $p \sim 20$ ), not possible when using complex computer codes  
- requires interval calculations

## 1-2) RAFU method

## Main characteristics

RAFU method = RAndom/FUzzy method

- Hybrid-type method: combination of possibility and probability for uncertainty representation
- RAFU propagation:
  - Integration of a computational cost reduction strategy deriving the optimal sampling procedure (i.e. minimal #calculations) corresponding to the analyst's choices
  - Measure the sample size effect on the uncertainty margin estimation

## RAFU propagation

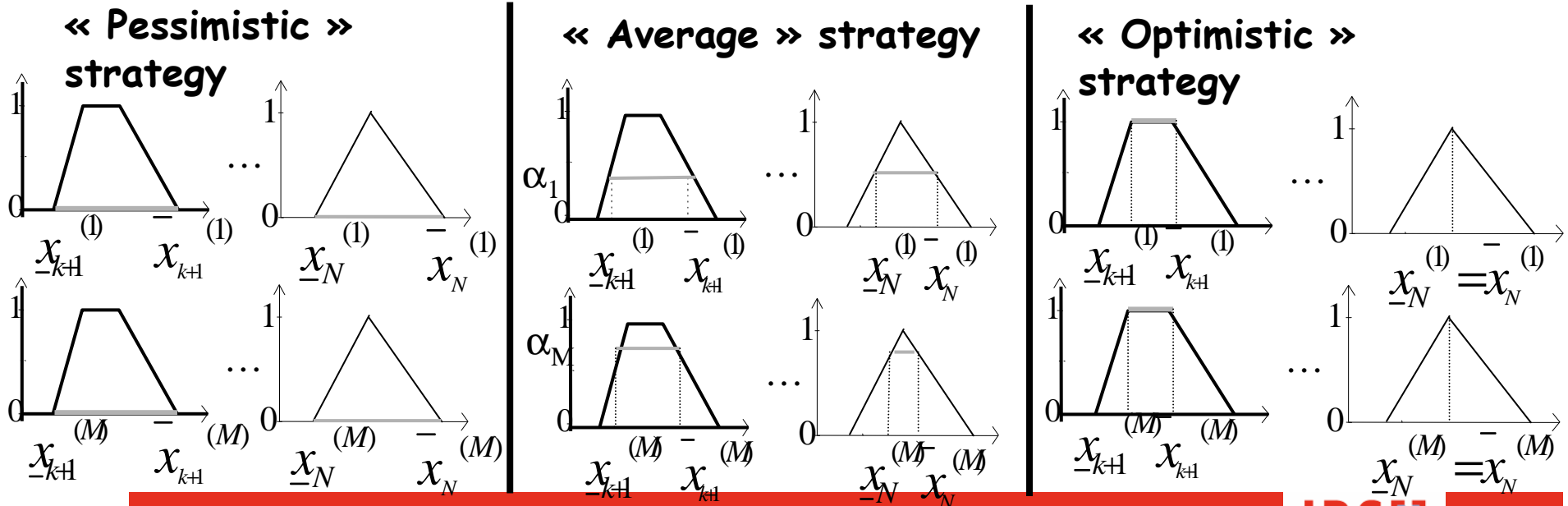
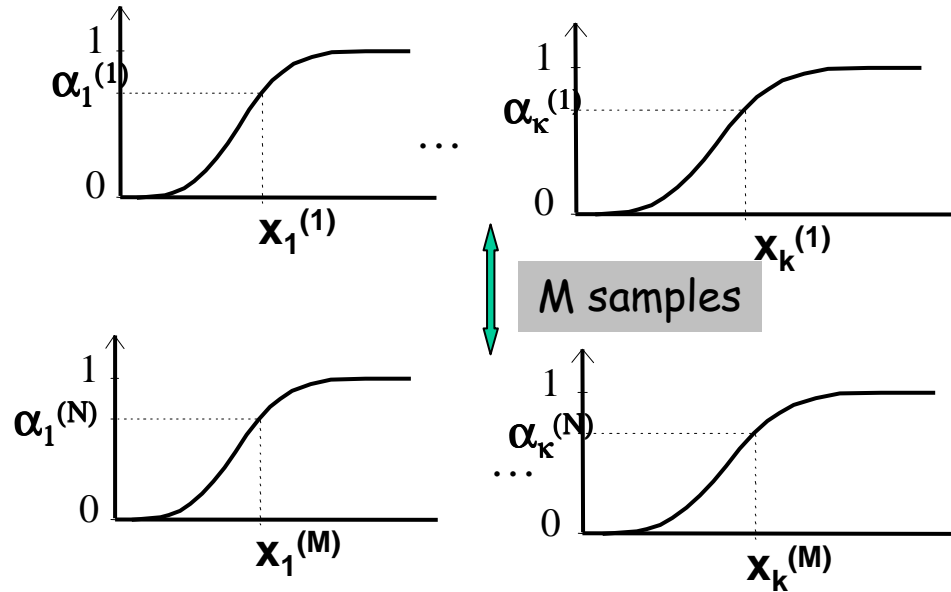
Set a decision step before propagating uncertainties

→ Selection of a triplet of parameters  $(\gamma_S, \gamma_E, \gamma_A)$  specified by the analyst:

- $\gamma_S$  (aleatory uncertainty): statistical quantity the analyst is interested in + dependence structure
  - Mean/variance of the code output:  
 $\gamma_S = \{\text{« mean »} / \text{« variance »}\}$
  - Given percentile:  $\gamma_S = \{q\%\}$
  - Probability of exceeding a given threshold  $x$ :  $\gamma_S = \{F(x)\}$

- $\gamma_E$  (epistemic uncertainty): how intervals are drawn from possibility distributions
  - Pessimistic strategy (conservative Decision-maker's behavior):  $\gamma_E=\{0\}$  (maximal imprecision)
  - Optimistic strategy:  $\gamma_E=\{1\}$  (minimal imprecision)
  - Average strategy (compromise between pessimistic and optimistic behaviors):  $\gamma_E=\{av\}$
- $\gamma_A$ : desired numerical accuracy associated to statistical estimation (sample size effect or numerical uncertainty) or maximal number of affordable code runs


# Derive the optimal sampling procedure according to $(\gamma_S, \gamma_E, \gamma_A)$



## Advantages of the RAFU method

- Reduction of the computational cost:  $M$  instead of  $M \cdot p$  interval calculations for a « pessimistic »/ « optimistic »/ « average » Decision Maker (useful when working with complex computer codes in nuclear safety)
  - Example: if  $M=200$ ,  $p=20$ :
    - With the classical hybrid method: 4000 interval calculations
    - With the RAFU method: 200 interval calculations (Baudrit *et al*) et 400 for Ferson *et al*.
- Integration of the numerical accuracy of the result (Effect of the sample size on the final uncertainty margin)

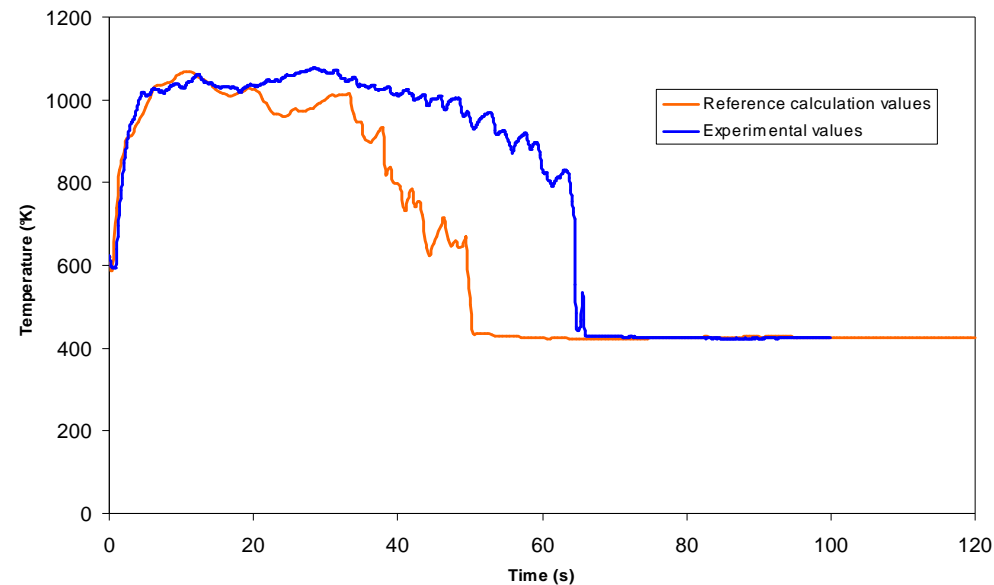




2) Application to the evaluation of  
uncertainty margins for a nuclear  
reactor

## Description of the test-case :

- Zion reactor, USA
  - Simulation with the thermohydraulical CATHARE code of a LB-LOCA (Large Break-Loss of Coolant Accident)
- First peak cladding temperature



## Numerical tests (CATHARE/SUNSET)

The 10 most influential uncertain input parameters (similar results for uncertainty margin estimation as in the case of 54, cf. IRSN results)

Name	Nom. Value	Variation Range
Liquid-wall friction	1	[0.8;1.9]
Fuel conductivity( $T_{fuel} < 2000K$ )	1	[0.9;1.1]
Vapour-wall heat transfer (forced convection regime)	1	[0.5;2]
Peaking factor hot rod	1	[0.95;1.05]
Heat transfer "flashing"	1	[0.05;1]
Initial Upper header mean temperature +10°K	1	[1;4]
Initial loop mass flow rate +/-4% (head pump)	1010	[810;1210]
Friction form loss in the Pressurizer line	1	[0.5;2]
Hot gap size hot rod	1	[0.8;1.2]
Initial Power +/-2% (power before scram)	1	[0.98;1.02]

## Numerical tests

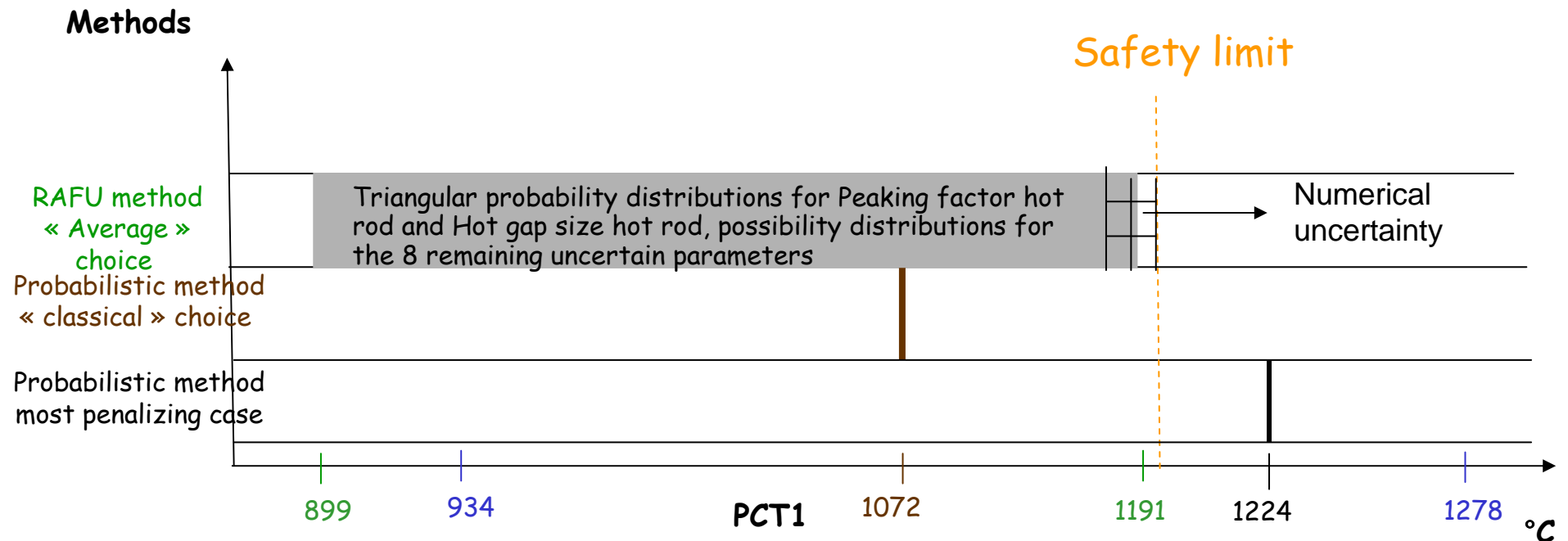
- Uncertainty modeling: knowledge = nominal value and variation range

Probabilistic method = «classical choice »	RAFU method = « real knowledge »
Triangular probability distribution Mode = Nominal value, Support = Variation range	Triangular possibility or probability distribution Mode = Nominal value Support = Variation range

- RAFU parameters ( $\gamma_S, \gamma_E, \gamma_A$ )

$\gamma_S$	95%-percentile
$\gamma_E$	« Average »/ « Reasonable » choice (similar to "independence" in probability theory)
$\gamma_A$	95%-accuracy #interval samples: 200

## 95%-percentile



- ➔ - Effect of pdf choices:  $\sim 192^{\circ}\text{C}$  for an "average" choice
- Effect of dependencies:  $\sim 152^{\circ}\text{C}$

➔ Computational cost reduction: 400 computer runs instead of 8000

➔ Numerical uncertainty is not negligible ; numerical uncertainty margin expected to be larger for smaller #samples.

## Conclusion

- Probabilistic methods: easy to perform (Monte-Carlo), direct estimation of percentiles with order statistics

→ Caution with the choice of an unique pdf and a dependence structure in presence of incomplete knowledge

→ Unjustified reduction of uncertainty margins, relevant decision-making process?

- RAFU method:

- Take into account the lack of knowledge and the nature of uncertainty + integrate a computational cost strategy respecting the analyst's choice and provide numerical uncertainty margin

- Extension of Monte-Carlo techniques (same statistical tools as in the probabilistic framework)

→ Larger but more relevant uncertainty margins (to integrate in an iterative process? Helpful to refine the knowledge on uncertainty sources?)

→ Interval calculations