

DE LA RECHERCHE À L'INDUSTRIE



# USE OF INTENSIVE SIMULATION SUPPORTING SFR UNCERTAINTY DRIVEN CORE DESIGN PROCESS : PRESENTATION OF MULTI-PHYSICS TRIAD PACKAGE

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# CONTENT

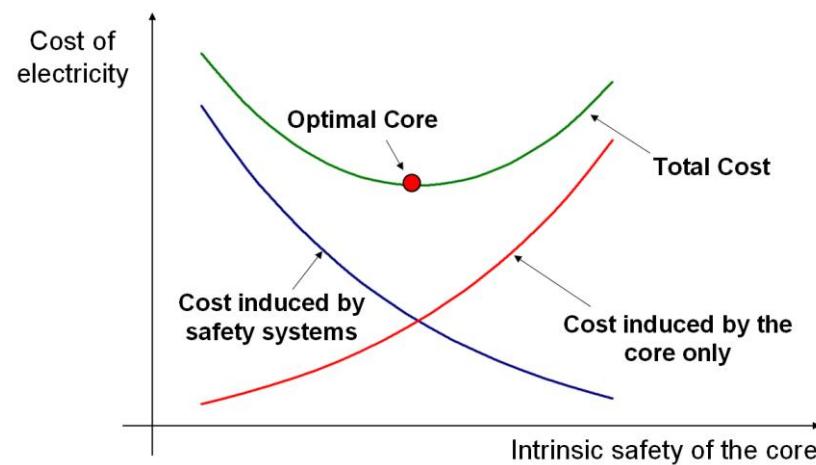
- Context
- Examples of core patterns
- TRIAD specifications
- Core optimization rationale:
  - Evaluation of core performance / uncertainties
  - Visualization of core viability zone
  - Display compromise & Select core configurations
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- Early stage development of ASTRID prototype
  - Preliminary specifications are underway in parallel with design studies
- Criteria and constraints are subject to regular changes
- At each stage, core designers should be able to provide:
  - An optimal solution panel
  - With transversal macroscopic indicators (for comparison sake)
  - Clear visualization of compromises to be made

Within a reasonable time frame...



## CONTEXT (2)

BUT !

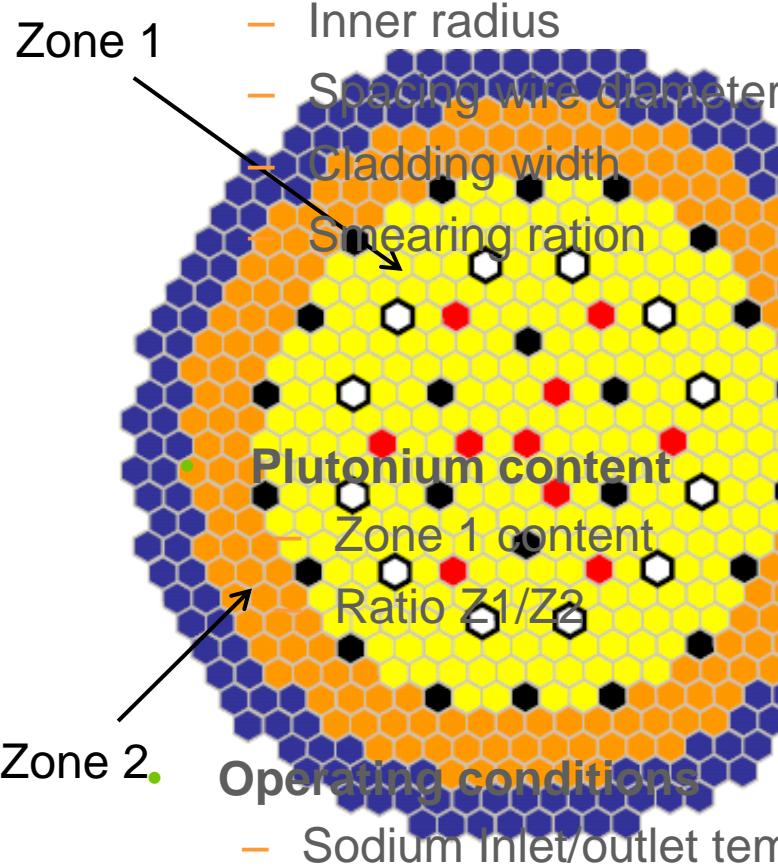
- Core Design is an iterative process between core physics disciplines...  
(Neutronics, fuel mechanics, hydraulics etc.) ...often performed by separate teams of experts
  - Possibly a lengthy process especially in the early stage of design
  - Sources of errors are increasing with interface number
- Design space can be very large (8-10 dimensions with millions of possible configurations) ...and design constraints very numerous
- Finding best compromises ?
- Possibility to miss non-intuitive solutions ?

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# EXAMPLE OF CORE DESIGN PROBLEM (SFR)

- Geometrical parameters



Reflectors  
and shield

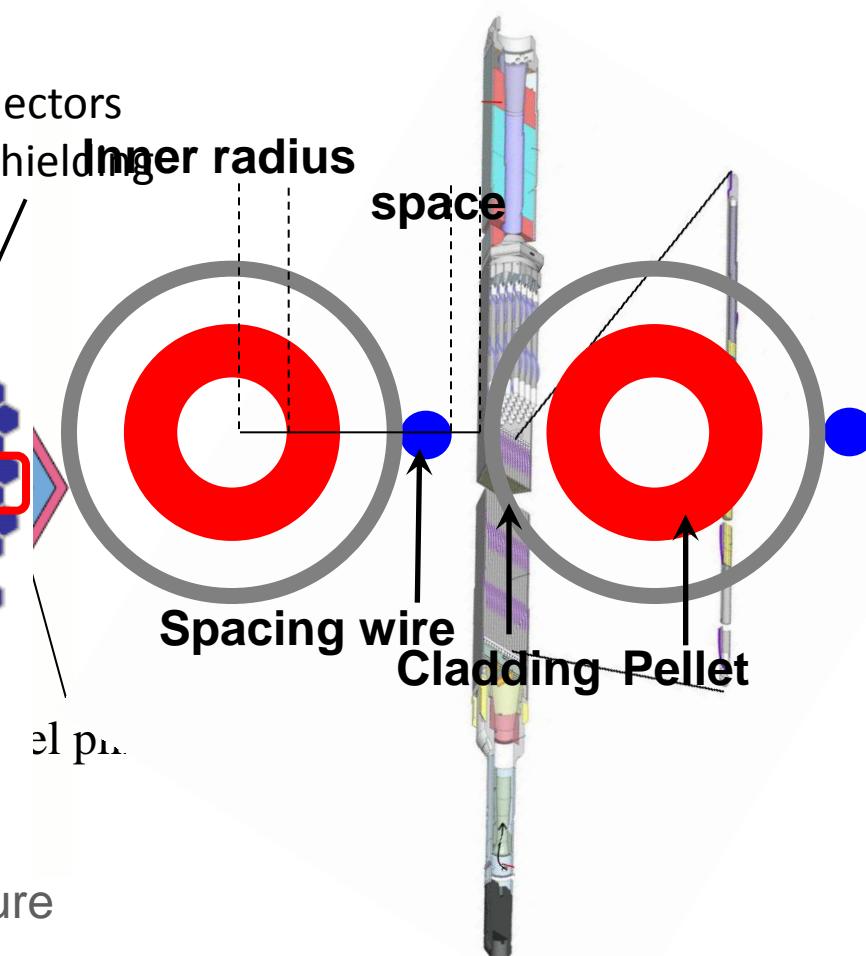
**Inner radius**

space

$\varepsilon_{1\text{ pl}}$

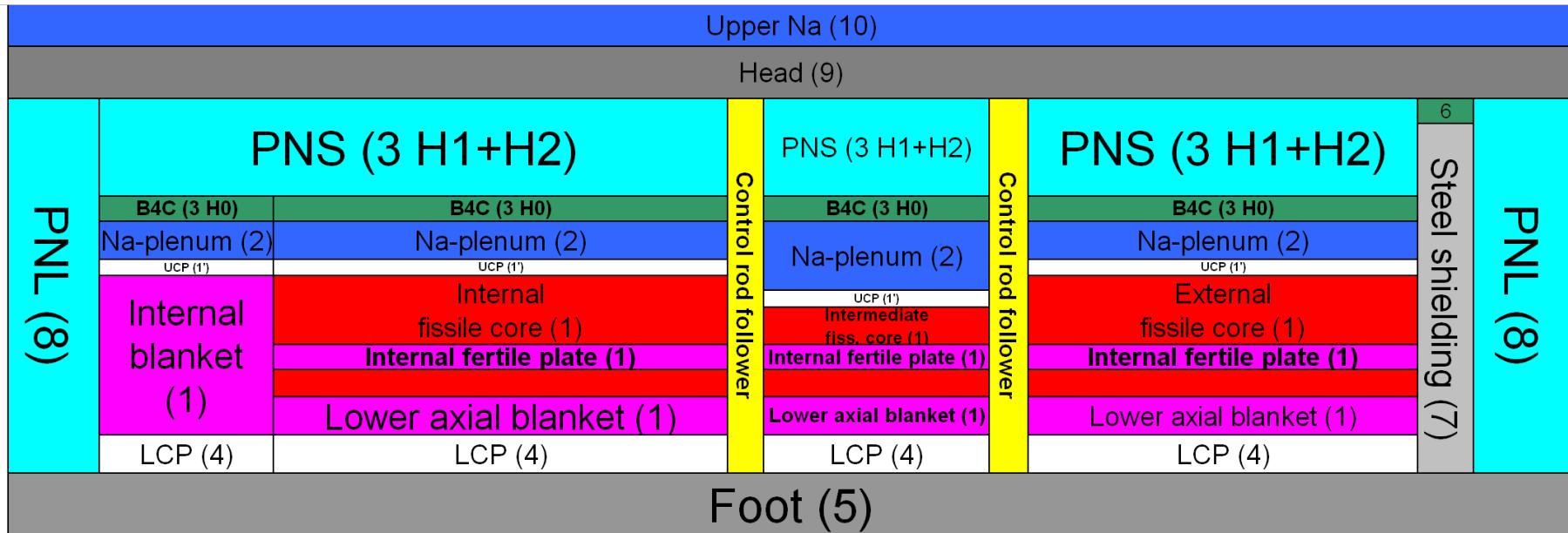
Spacing wire

Cladding Pellet



# A MORE COMPLEX EXAMPLE...

Rotation symmetry around this axis



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# TOOLS SPECIFICATION

- Inter-disciplinary design tools allowing « systematic » exploration of design parameter space
- Based on performing data processing software (URANIE, ROOT...)
  - Allowing super-computing application
  - With advanced sampling / optimizing tools
  - With complex problem vizualization capabilities
- Possibility to access either reference codes OR simple models
  - The objective is to evaluate one core performance within less than 1 second of CPU time !
  - Calculation Time vs precision trade-off is the key
  - Adapting meta-model type (polynoms, neural networks, kriging)
- With sufficient user-friendliness for all designers use

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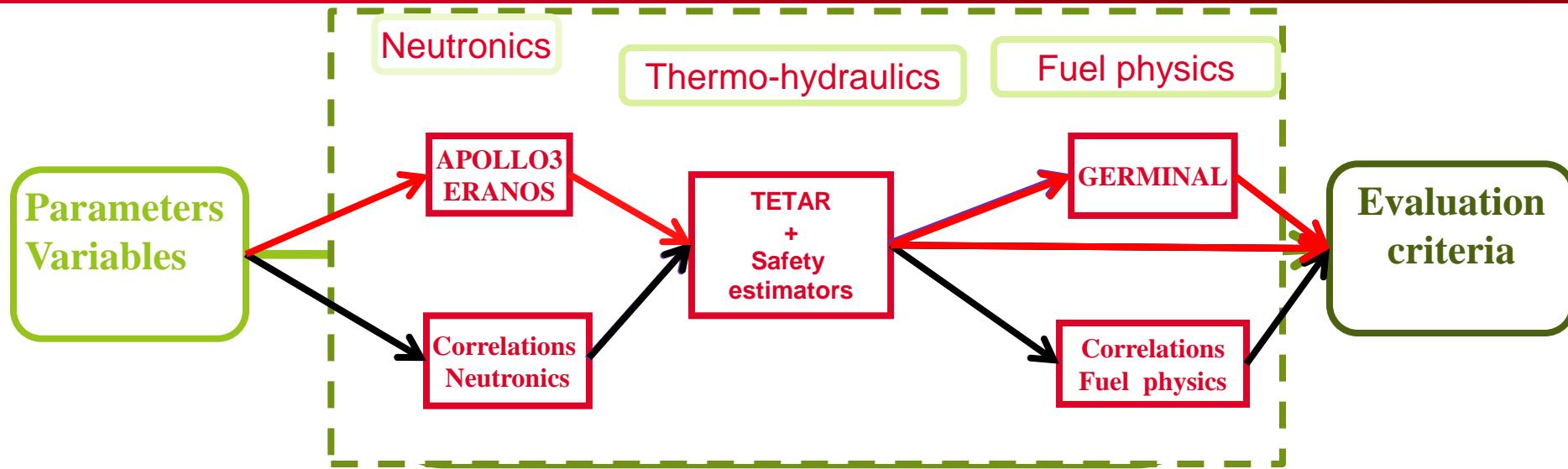
# OPTIMISATION RATIONALE

- Core performance evaluation
  - Create large data base using High Performance Computing (once and for all)
  - Use interpolation techniques (spline functions) or elaborate meta-models (Neural networks) to replace whole codes or fit complex phenomena (pellet – cladding heat transfret coefficient for example)
  - Define simplified models using data base as reference
- Visualization of feasibility zones
  - 3D mapping
- Selecting core configurations
  - Applying optimization algorithms using uncertainties
  - Use iso-values representation
- Display compromise
  - Multi-1D cobweb

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# CORE PERFORMANCE EVALUATION



## ■ Evaluation of core performance

- With « direct » indicators (Void coefficient, fusion margin)
- With indirect indicators « Safety estimators »
- Accounting for transient core configuration

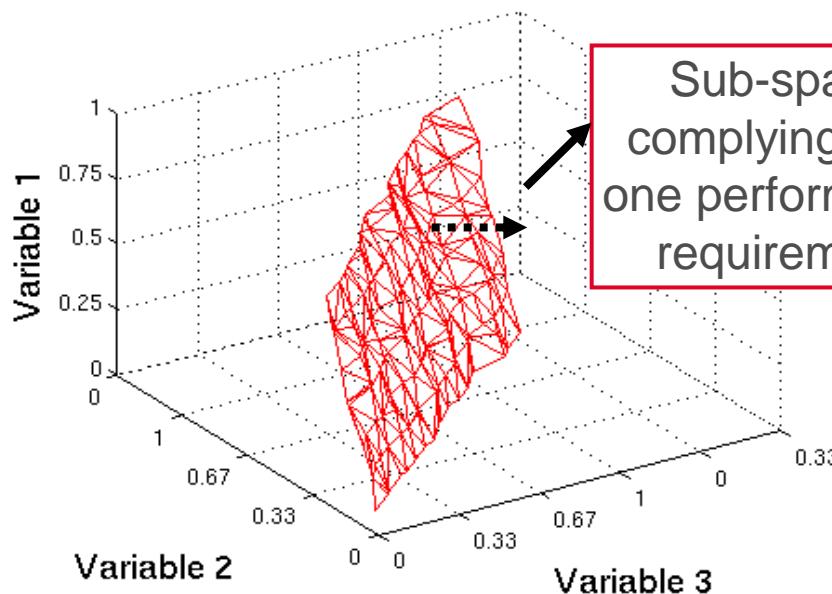
## ■ With various modeling accuracies :

- With fine tools (long but accurate, coupling codes requires dedicated platform)
- With correlations (calculated once and for all)
- With mixed accuracy (for certain disciplines or certain cores only)

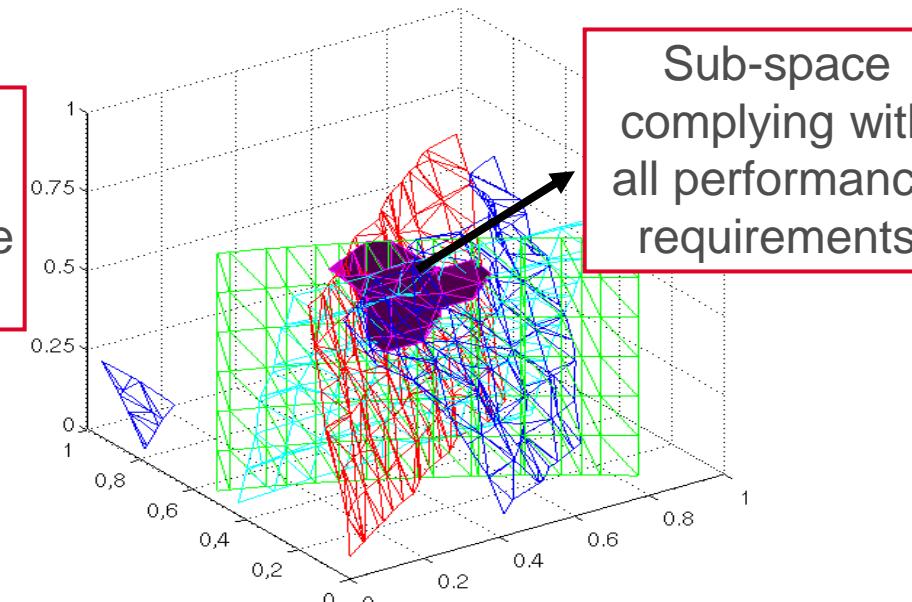
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# VISUALIZE « CORE VIABILITY » ZONE



Sub-space  
complying with  
one performance  
requirement

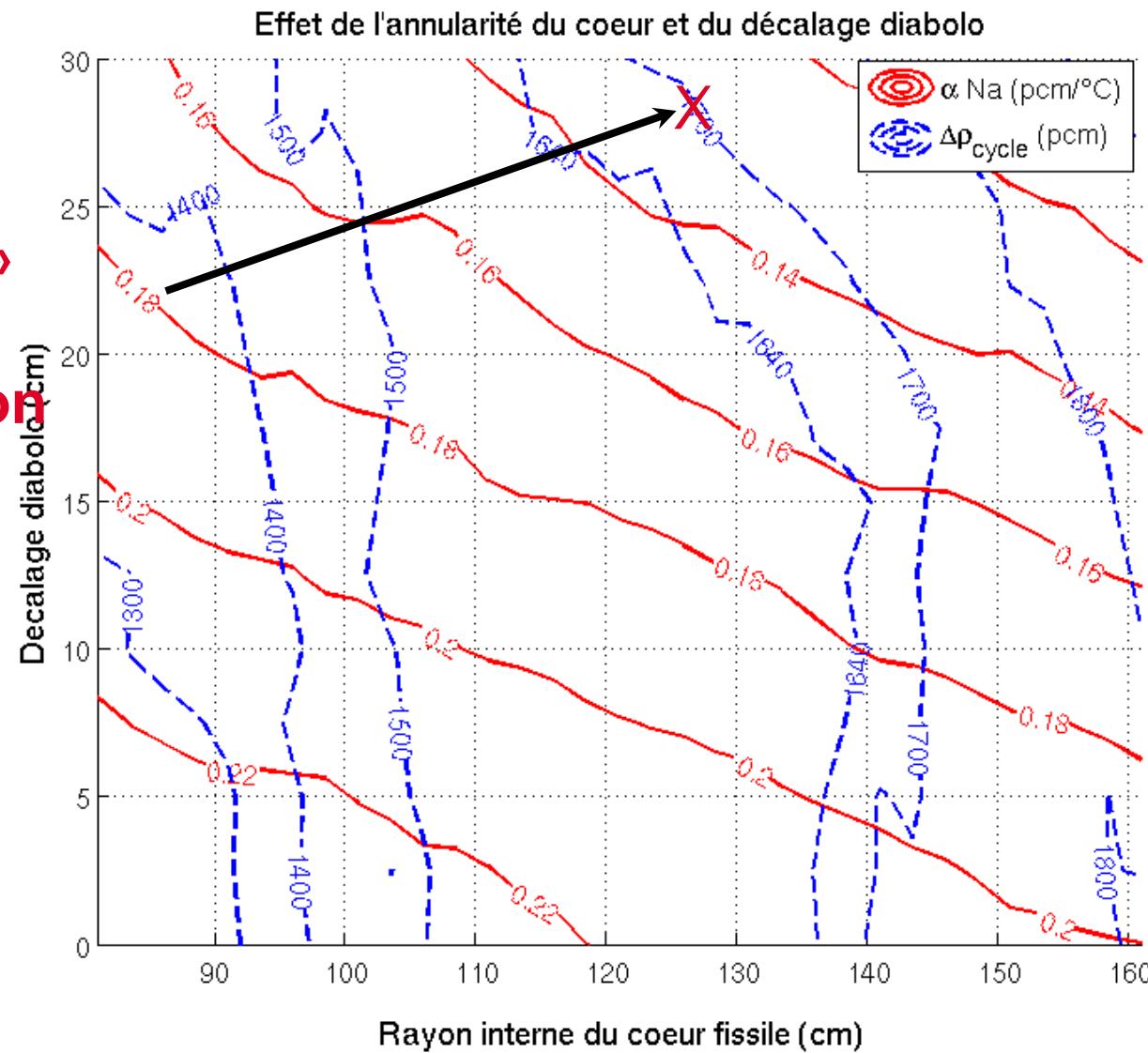


Sub-space  
complying with  
all performance  
requirements

- Possibility to visualize feasibility space reduction by adding design constraints
- Once sub-set is defined; optimisation of core performance within this space can be performed

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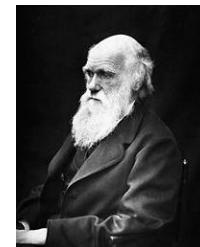
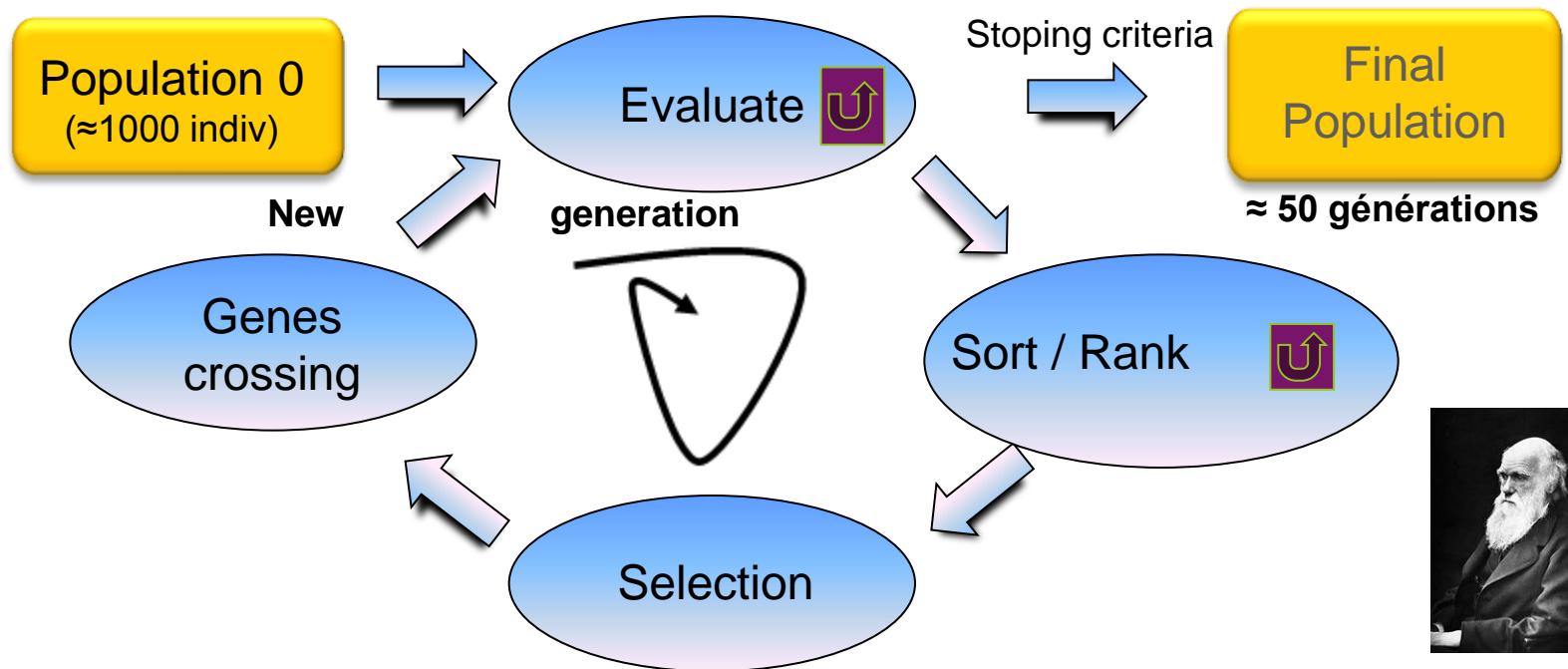
« Chosen »  
optimal  
configuration



# OPTIMISATION PROCESS : GENETIC ALGORITHMS

## Principle :

Approach optimal configuration with a natural selection process



Charles Darwin

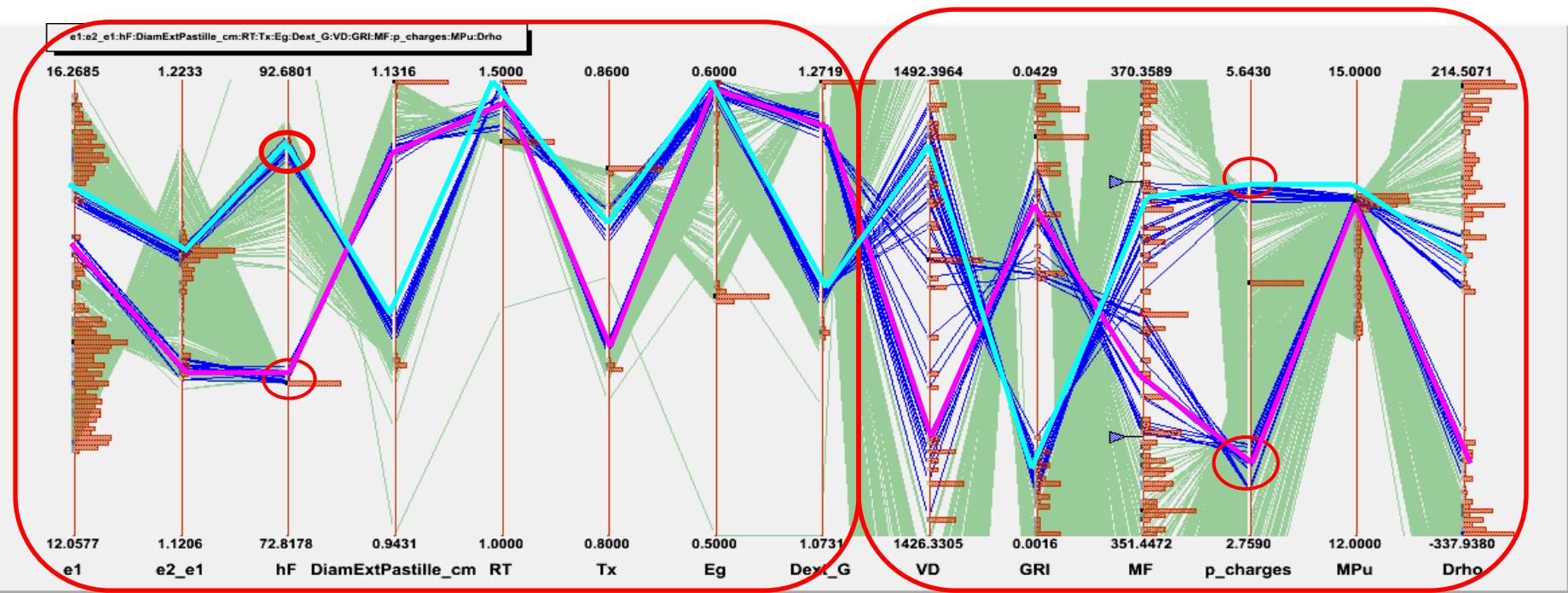
Advantages : Excellent exploring capacity on multi-criteria optimisation problems

Drawback : Requires many core performance evaluation

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# DISPLAY COMPROMISE (1)



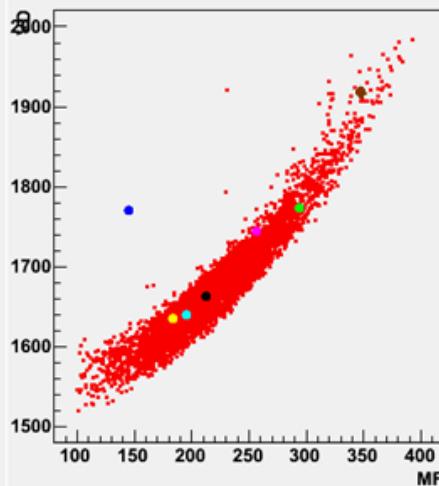
8 technological data

6 performances

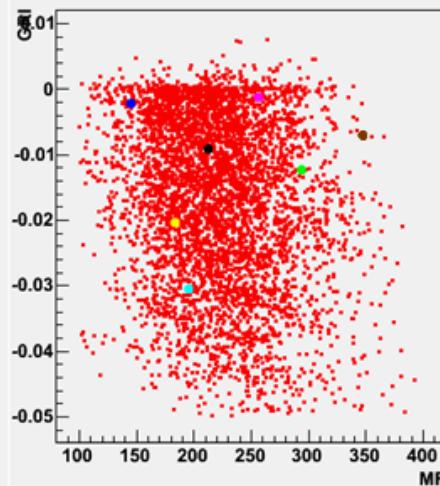
- Linking core performance and characteristics
  - One core (individual) = one broken line running from left to right
  - Each Vertical bar represents either a data (left) or a performance (right) with statistical dispersion
- Blue lines represent cores fulfilling similar constraints (Void coefficient and Margin to fuel melting)
- 2 possible technological paths with similar performance are showing :
  - Core with low pressure drop ( light blue)
  - Core with low diameter (purple)

# DISPLAY COMPROMISE (2)

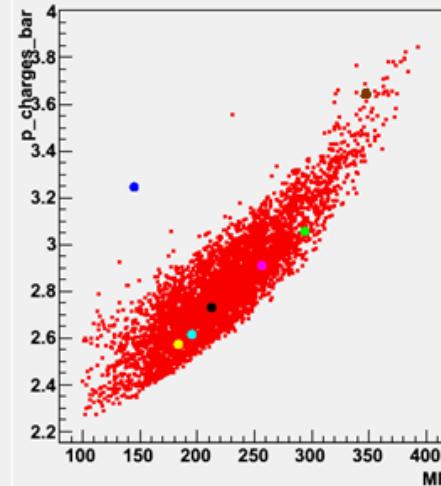
Scatterplot VD:MF



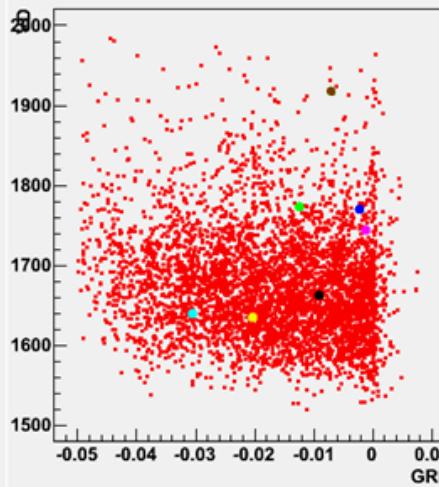
Scatterplot GRI:MF



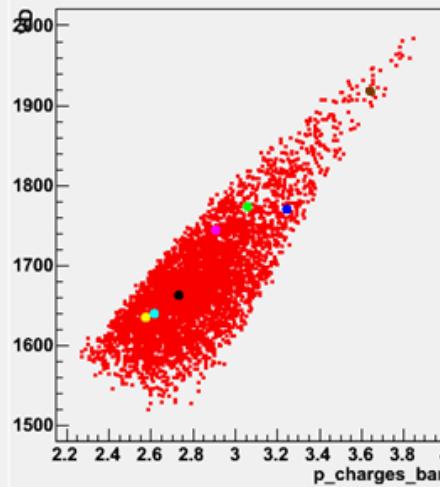
Scatterplot p\_charges\_bar:MF



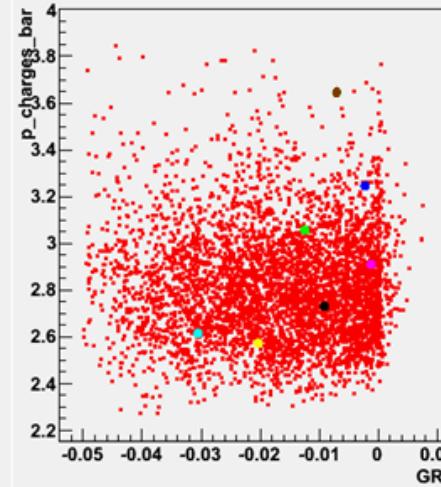
Scatterplot VD:GRI



Scatterplot VD:p\_charges\_bar



Scatterplot p\_charges\_bar:GRI



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# CONCLUSIONS (1)

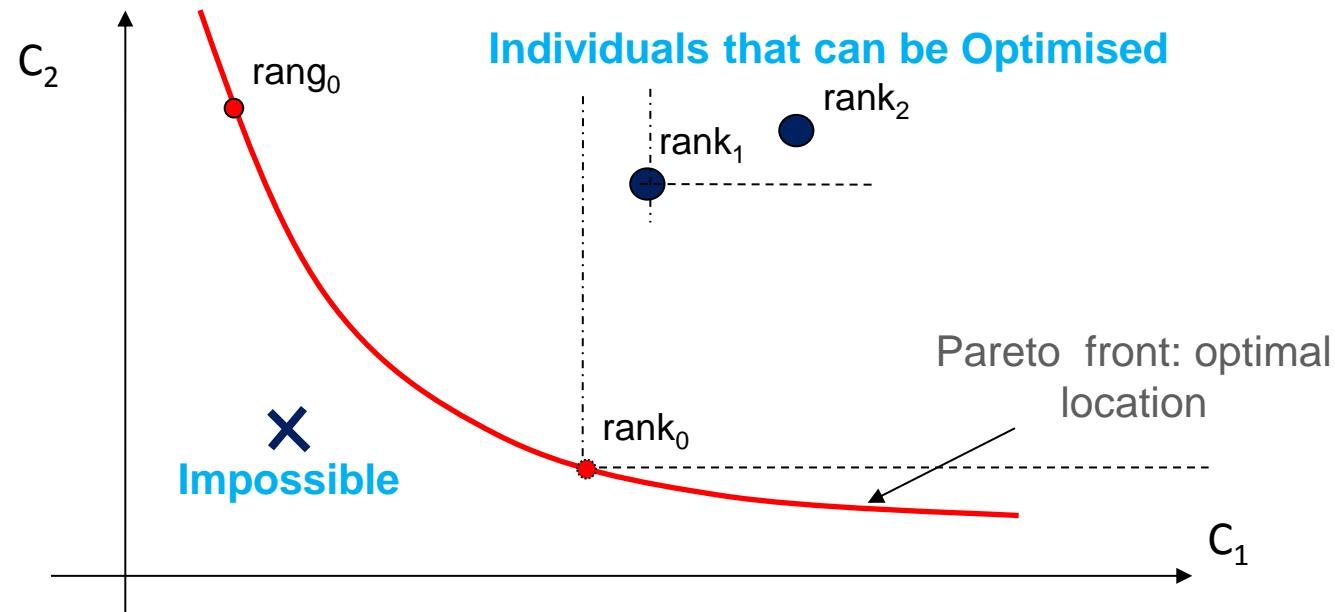
- TRIAD is an optimisation package for complex core design
  - Making the most of High Performance Computing
  - Using softwares dedicated to Large data Flow management (ROOT)
  - Using advanced visualization techniques for data mining
  - Implementing advanced algorithms accounting for uncertainties
- Defining best compromise (precision vs CPU time) for core performance evaluation is still a key issue
- Efficient Use of developed tools requires a thorough understanding of core design disciplines

## CONCLUSIONS (2)

- Progressive implementation of proper code chaining/coupling (via SALOME tool for example) of best estimate codes for data base creation (and optimizing?)
- Implementation of new performance « estimators » are under development (robustness to Loss of Flow transients etc.)
- Efforts to make these tools available to a wider core designer community is underway (GUI for TRIAD)

# PARETO FRONT

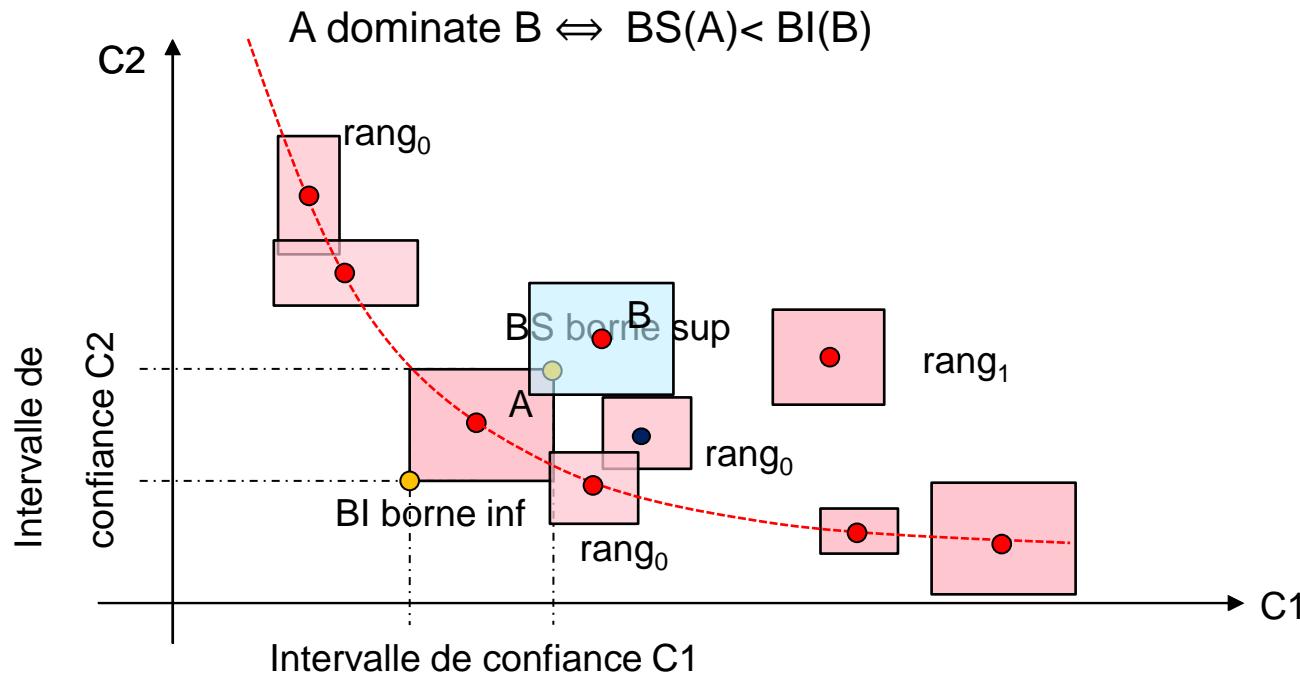
- Result of multi-criteria optimization is the so called Pareto front
  - when an « individual » (a core) is located on Pareto front, designer can not improve one of its performance without downgrading another.
- Pareto front individuals are considered as the best individual of their generation
  - Other individuals have less chance to breed...



Exemple of 2D Pareto front,  $C_1$  et  $C_2$  criteria are antagonists

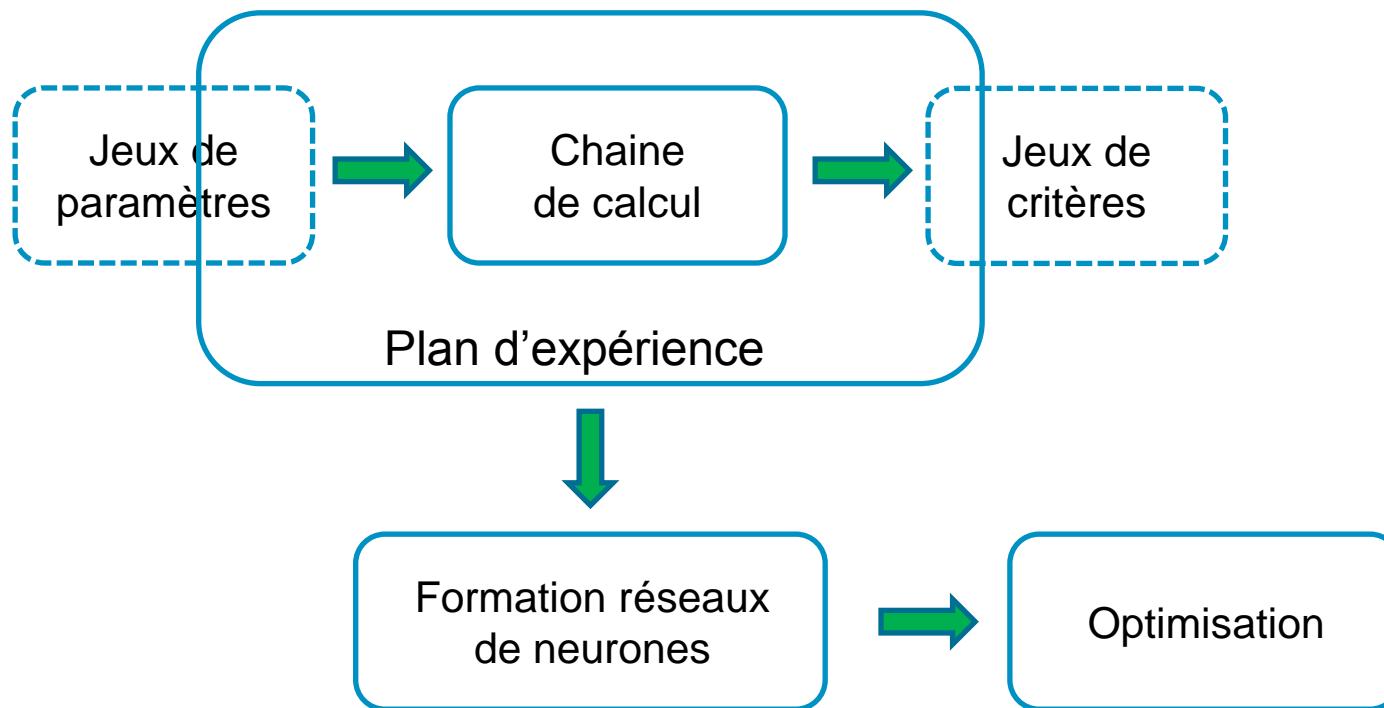
# OPTIMISATION WITH UNCERTAINTIES

- « Smartly » accounting for uncertainties within optimisation processes is still a hot R&D field
- A prerequisite, of course, is to have a first estimation of uncertainties for each core design discipline
- Then those uncertainties can be used with PareBRO method (V. Baudouï) for example : generalization of ranking process



# I. OBJECTIF ET CONTEXTE

## ■ Démarche de TRIAD :



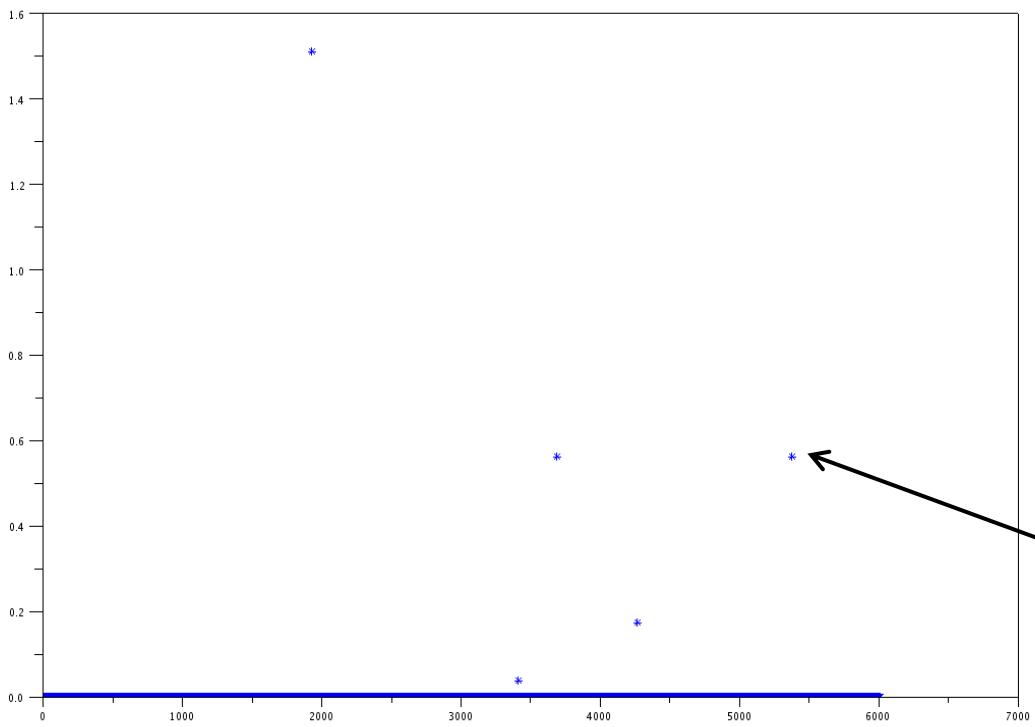
## II. UTILISATION D'URANIE

- Lanceur local et batch
  - Utilisation de la fonction de mise en donnée xml
- Analyse de sensibilité / Statistique
  - Morris
  - Sobol
  - Krigeage (via longueur de corrélation)
- Méta-modèles :
  - Réseau de neurones
  - Krigeage (en cours)
- Algorithmes génétiques
- Qt-Root pour IHM d'optimisation

# ANALYSE STATISTIQUE : DÉTECTION D'INDIVIDU STATISTIQUEMENT ABERRANT

Méthode de Leave One Out :

1. On retire un point de la base support
2. On compare la prédiction du Krigeage avec la valeur du code
3. **Si le delta code / krigeage > 5sigma on vas voir si le code à correctement fonctionné**



Courbe :

$$\text{si } Y_{\text{code}} - Y_{\text{krigeage}} < 5\sigma_{\text{krigeage}} \\ f(y) = 0$$

Sinon :

$$f(y) = \sigma(Y_{\text{code}} - Y_{\text{krigeage}}) - 5\sigma_{\text{krigeage}}$$

Probabilité d'avoir une erreur dépassant  
5 sigma :

1 individu pour 1,744,278

Erreur de code :

- Porosité négative
- Matrice singulière
- Maillage dégénérer....