

INSTITUT D'ÉLECTRONIQUE ET DE TÉLÉCOMMUNICATIONS DE RENNES



Reliability and Sensitivity Analysis of Extreme Electromagnetic Events by considering Uncertain Parameters

M. Larbi^{1,2}, P. Besnier¹, B. Pecqueux²

¹IETR, UMR CNRS 6164 – INSA de Rennes

²CEA, DAM, Gramat

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- I. Introduction
- II. Reliability analysis of a system
- III. Crosstalk problem
- IV. Estimation of probability of failure by reliability methods
- V. Conclusions about reliability methods
- VI. Outlook
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- Some structures studied in electromagnetism are described by factors which are sometimes poorly defined

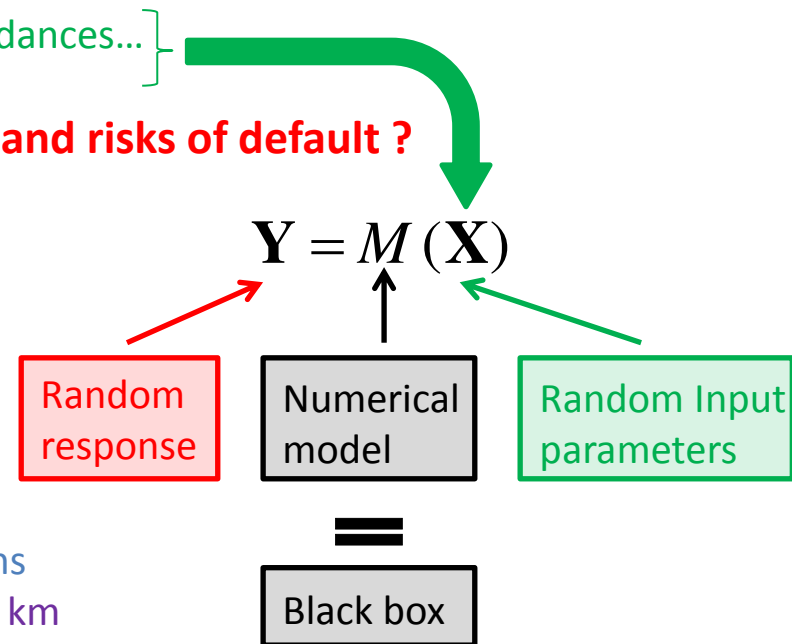
- Case of a cable bundle in an airplane
 - variability of this structure between two identical airplanes
 - imperfectly defined path, relative position of cables, impedances...

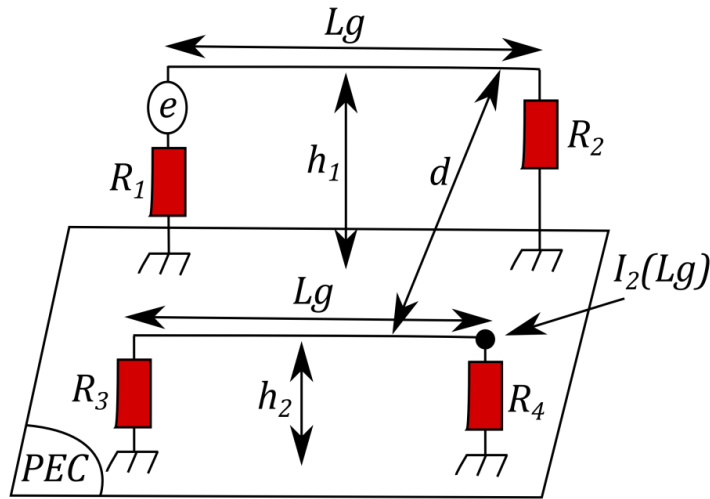
- **Problem: How to predict the levels of interference and risks of default ?**



Source: www.safran-group.com

The A380 contains for example 500 km of cables (SAFRAN).





Input variables
 uniformly distributed

$R_1 (\Omega) \in [1-10]$
 $R_2, R_3 (\text{k}\Omega) \in [10-100]$
 $h_1, h_2 (\text{cm}) \in [1.5-2.5]$
 $Lg (\text{m}) \in [9.5-10.5]$

Input
 parameters

$e = 1 \text{ V}$
 $R_4 = 10 \Omega$
 $d = 1 \text{ cm}$
 $\text{diamwire } 1 = 1 \text{ mm}$
 $\text{diamwire } 2 = 1 \text{ mm}$

Problem: Computing of the probability of failure: $P_f = P(\max_{\Delta f} I_2(Lg) \geq I_t)$

where I_t is an arbitrarily threshold, and $\Delta f = [5-10 \text{ MHz}]$ is a predefined frequency band.

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• Let $g(\mathbf{X})$ the *limit state function*:

$$g(\mathbf{X}) = \underbrace{S}_{\text{Threshold value}} - \underbrace{M(\mathbf{X})}_{\text{Computer code providing the interest response (e.g. induced current)}}$$

Threshold
value

Computer code providing the interest
response (e.g. induced current)

$D_f = \{\mathbf{X}; g(\mathbf{X}) \leq 0\}$ defines the failure domain;

$D_s = \{\mathbf{X}; g(\mathbf{X}) > 0\}$ defines the safe domain;

$dD = \{\mathbf{X}; g(\mathbf{X}) = 0\}$ defines the limit state surface.

• We define the probability of failure by

$$P_f = P(g(\mathbf{X}) \leq 0) = \int_{D_f} f_{\mathbf{X}}(\mathbf{x}) d\mathbf{x}$$

Joint probability density
function of \mathbf{X}

• Disadvantages related to the computation

- direct computation of this integral is difficult (since $g(\mathbf{X})$ is rarely analytical)
- Monte Carlo simulation but this method requires a large number of calls to the limit state function g , and therefore to the numerical model

➔ An approximation method **FORM** (*first order reliability method*) has been developed (Ditlevsen et Madsen, 1996) to compute P_f while reducing the computation cost model M .

The main steps of FORM:

- Using a transformation T from physical input random variables X_i to standard Gaussian random variables ξ_i by Rosenblatt or Nataf transformation.
 Standard Gaussian random variables \longrightarrow uncorrelated standard Gaussian random variables

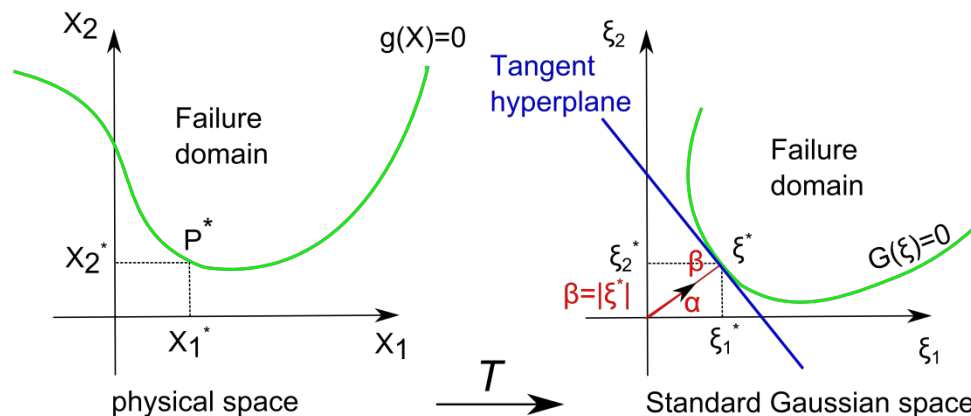
- Find the so-called design point ξ^* (or Most Probable Point (MPP) of failure), which is the point of the failure domain nearest to the origin in the standard Gaussian space (*i.e.* having the maximum probability density function)

- Carry out a linear approximation of the limit state function g at the design point ξ^* .

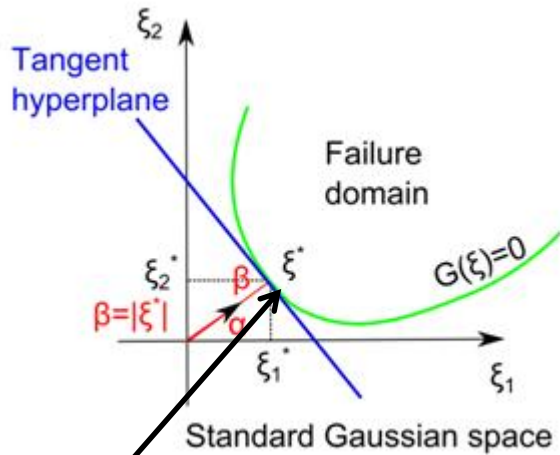
The failure probability is given by:

$$P_f \approx P_{f,FORM} = \Phi(-\beta)$$

Φ is the cdf of an unidimensional Standard Gaussian random variable.

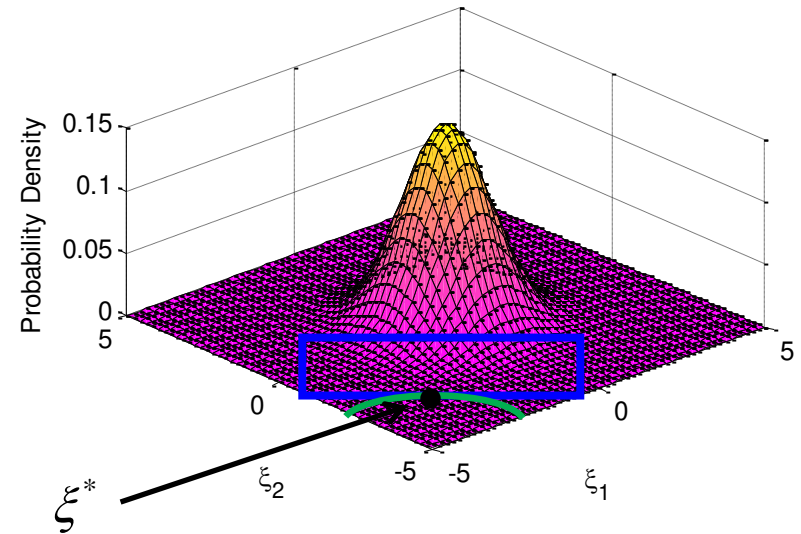


FORM (First Order Reliability Method)

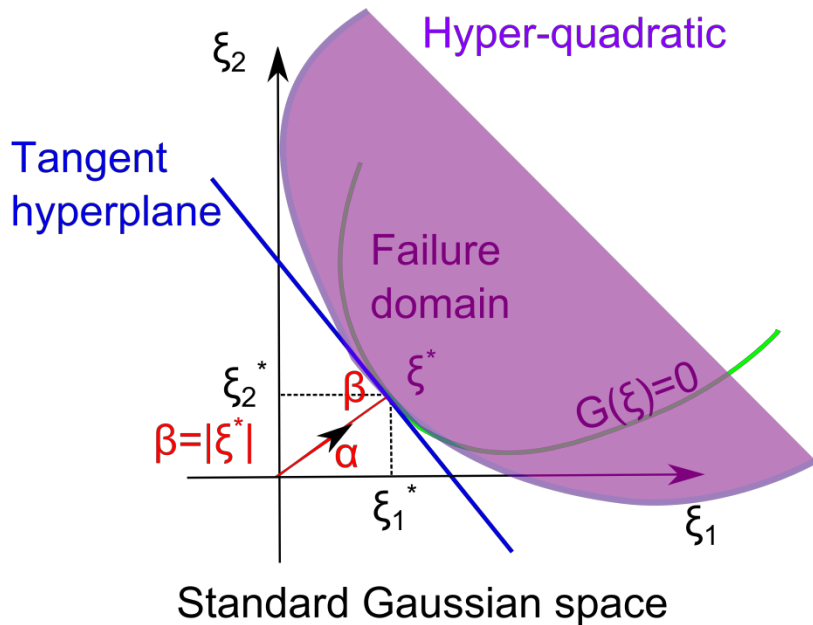


ξ^* is the design point

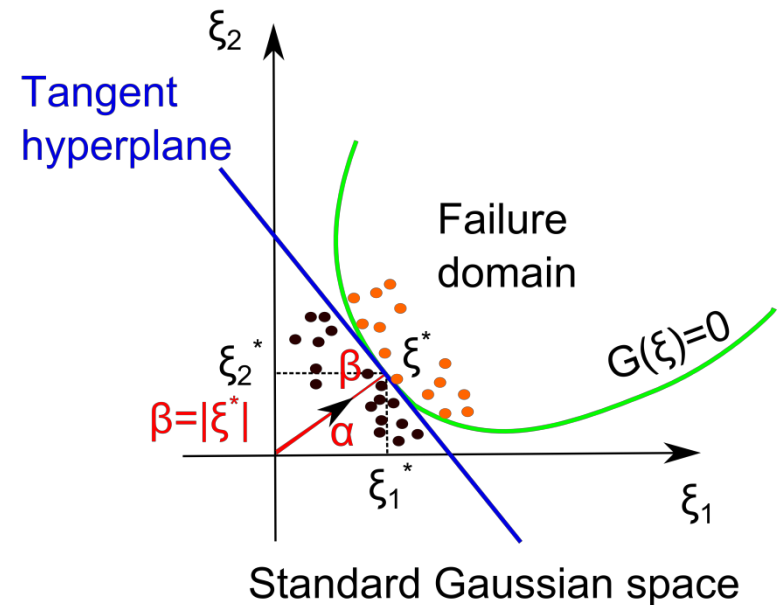
β is the so-called *reliability index*



SORM (Second Order Reliability Method)

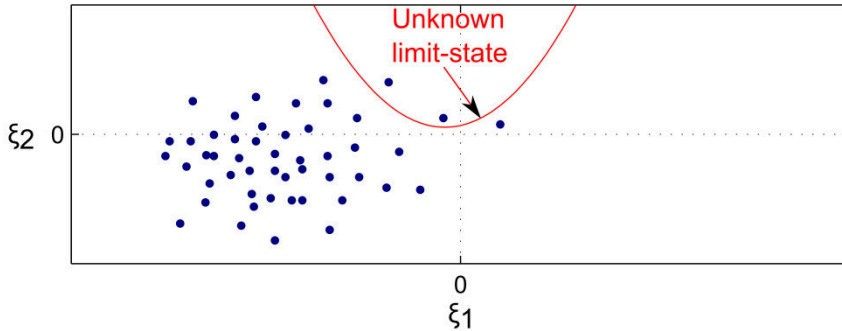


Importance Sampling (IS)

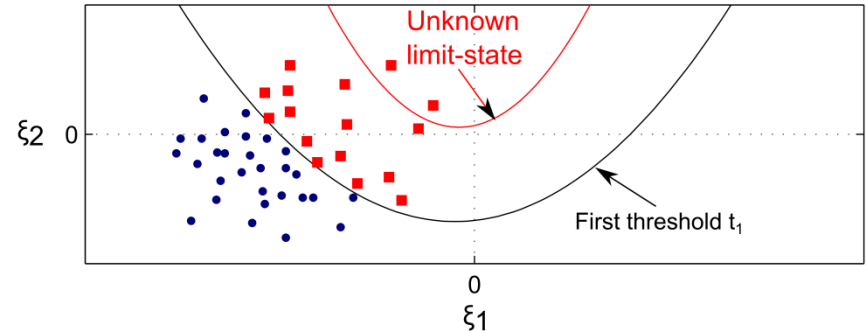


Subset Simulation (SS)

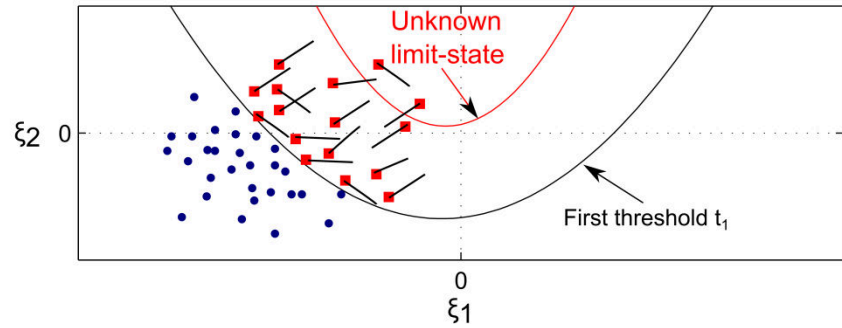
a. Initial MCS samples



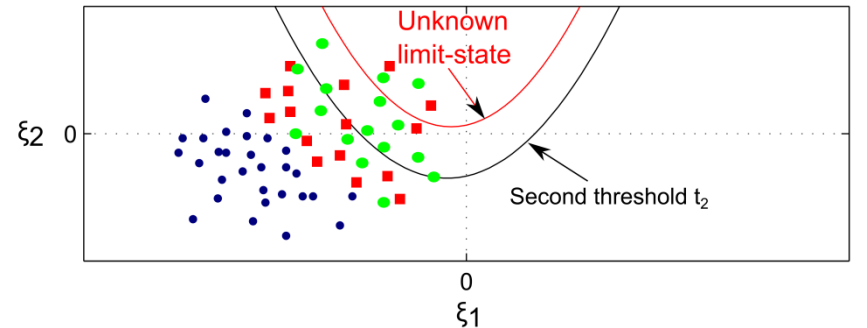
b. Selection of the first intermediate threshold



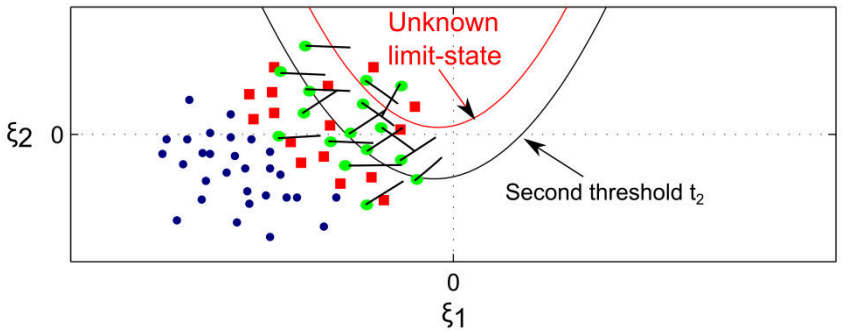
c. First MCMC simulation by MMH



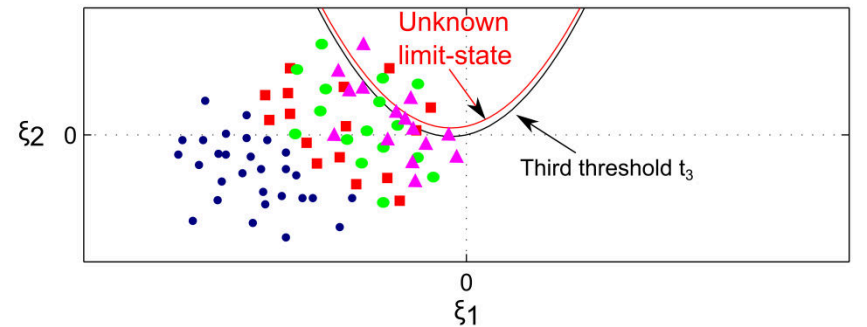
d. Selection of second intermediate threshold



e. Second MCMC simulation by MMH



f. Selection of third intermediate threshold



Two kinds of methods



based on the identification
 of the design point ξ^*

based on simulations
 tending towards the failure domain
 → no identification of the design point ξ^*

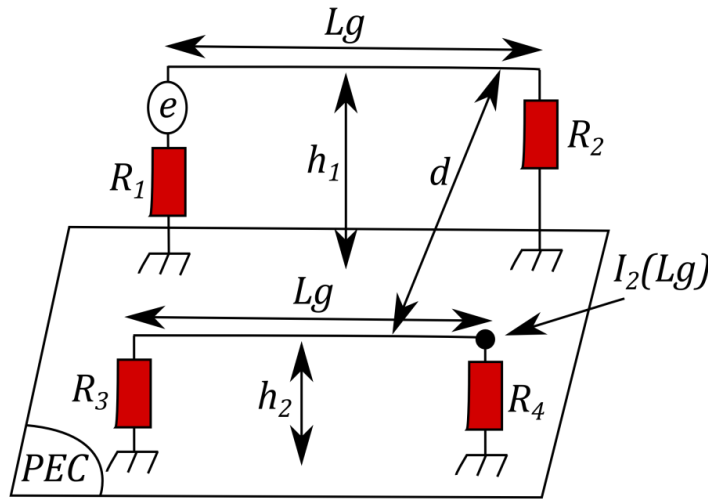
FORM

Subset Simulation

SORM

Importance Sampling

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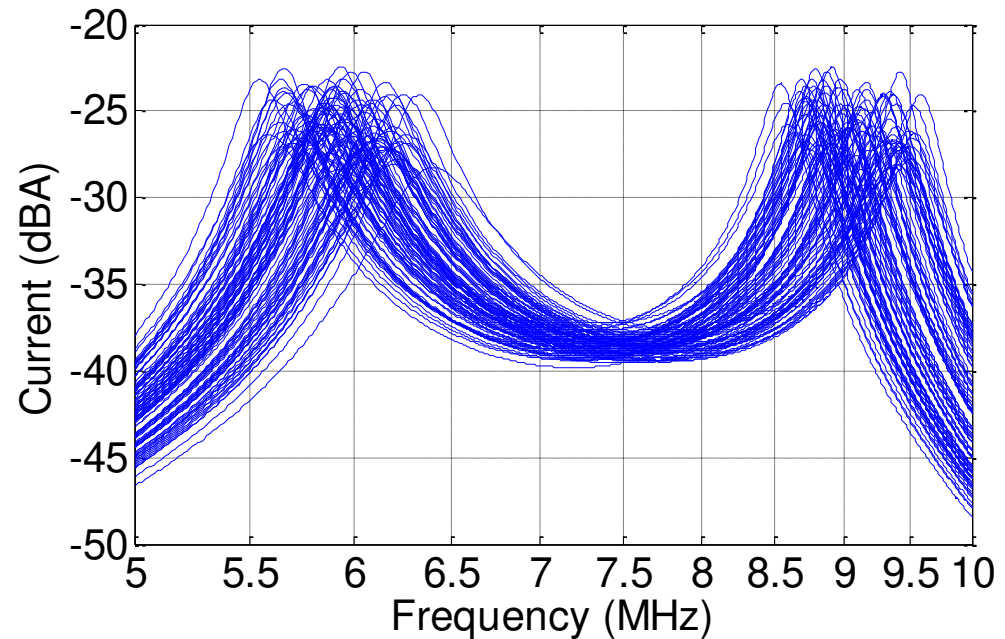
where I_t is an arbitrarily threshold, and $\Delta f = [5-10 \text{ MHz}]$ is a predefined frequency band.

Objectives :

- Compute the probability of failure by reliability methods
- R_4 is the input impedance of a specific device

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Representation of the induced current $I_2(Lg)$ with respect to the frequency band [5-10 MHz] (**resonance regime**) given by 100 Monte Carlo simulations depending on the uniform random variables: the loads R_1, R_2, R_3 , the heights h_1, h_2 and the length Lg of the wires. The impedance R_4 is fixed.



Computing of the probability of failure by reliability methods

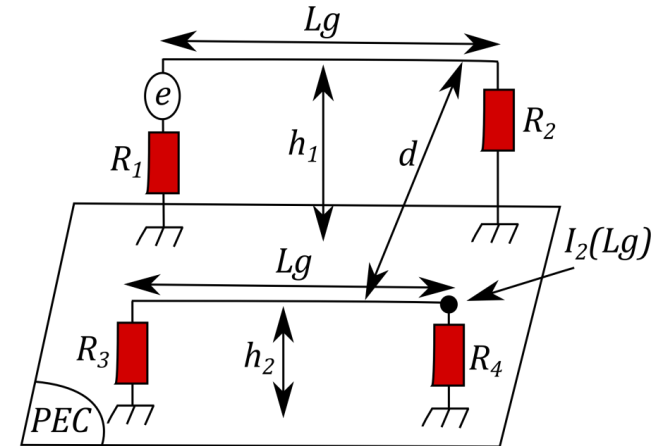
Selected threshold value: $I_t = 70 \text{ mA} = -23.09 \text{ dBA}$

	FORM	SORM	IS	SS	MCS
$P(\max_{[5-10\text{MHz}]} I_2(Lg) \geq 70 \text{ mA})$	0.14	0.08	$0.07 \pm 13 \%$	$0.09 \pm 17 \%$	$0.09 \pm 3 \%$
Number of calls to the numerical model	77	27*	200	200	10,000

* In addition to FORM

➤ Integration of failure device

- $R_4 = 10 \Omega$ is the input impedance of a specific device
- Devices may differ from each other due to manufacturing conditions
- Therefore, a set of devices could be represented by a probability density function (PDF) of failure



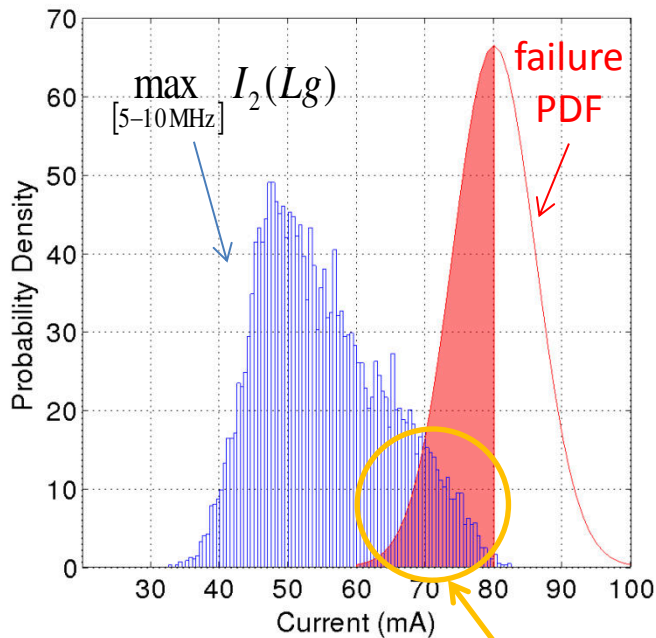
Thus, a reliability analysis of an electromagnetic system would consist in taking into account the **probability that the interfering current exceeds a certain threshold** and the **probability of having a device failure if the current reaches this threshold value.**

Input variables uniformly distributed

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$$h_1, h_2 (\text{cm}) \in [1.5-2.5] \quad Lg (m) \in [9.5-10.5]$$

➤ Integration of failure device



Failure domain

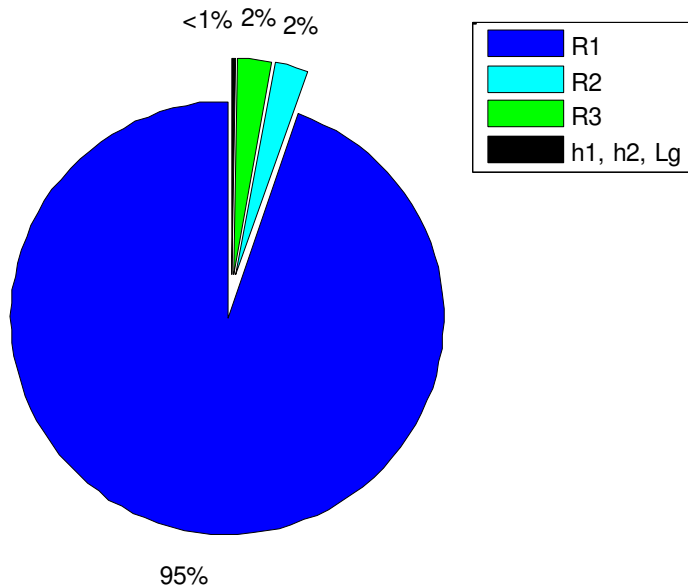
- In blue, 10,000 evaluations of the maximum of $I_2(Lg)$ obtained by Monte Carlo simulation
- In red, failure Gaussian Probability Density Function (PDF) of the device: $N(80, 6)$

	FORM	SORM	IS	SS	MCS
$P_{f,\text{system}} (\%)$	3.26	1.97	[1.67 - 2.11]	[1.66 - 2.36]	[2.00 - 2.19]
Number of calls to the numerical model	1113	135*	1100	1800	10,000

* In addition to FORM

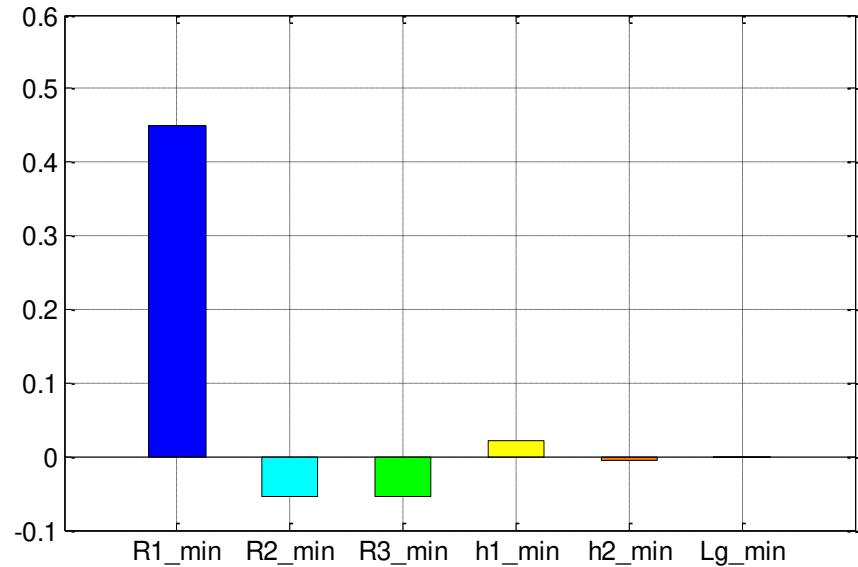
➤ **Local sensitivity analysis from FORM for the threshold value: $I_f = 60 \text{ mA} = -24.44 \text{ dBA}$**

Importance factors



- Importance factors show that R1 is the most important variable on exceeding 60 mA. Other variables are negligible

Elasticity of lower bounds of each random variable



- Elasticity of lower bounds of each random variable show that an increasing of the lower bound of R1 will cause a decreasing of the probability on exceeding 60 mA

➤ Integration of failure device

Input variables uniformly distributed

$$R_1 (\Omega) \in [1-10] \quad R_2, R_3 (\text{k}\Omega) \in [10-100]$$

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	FORM	SORM	IS	SS	MCS
$P_{f,\text{system}}$ (%)	3.26	1.97	[1.67 - 2.11]	[1.66 - 2.36]	[2.00 - 2.19]
Number of calls to the numerical model	1113	135	1100	1800	10,000

(e.g. $I_t = 60 \text{ mA} = -24.44 \text{ dBA}$: $P(\max_{[5-10\text{MHz}]} I_2(Lg) \geq 60 \text{ mA}) \approx 30\%$)

After exploitation of Sensitivity Analysis from FORM

Input variables uniformly distributed

$$R_1 (\Omega) \in [2-10] \quad R_2, R_3 (\text{k}\Omega) \in [10-100]$$

$$h_1, h_2 (\text{cm}) \in [1.5-2.5] \quad Lg (m) \in [9.5-10.5]$$

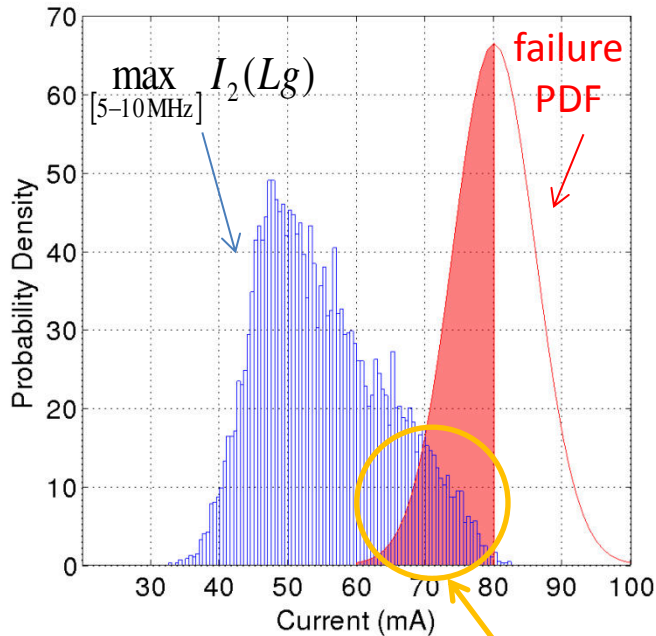
	FORM	SORM	IS	SS	MCS
$P_{f,\text{system}}$ (%)	1.36	0.74	[0.67 - 0.85]	[0.53 - 0.94]	[0.73 - 0.80]
Number of calls to the numerical model	984	108	900	1558	10,000

(e.g. $I_t = 60 \text{ mA} = -24.44 \text{ dBA}$: $P(\max_{[5-10\text{MHz}]} I_2(Lg) \geq 60 \text{ mA}) \approx 22\%$)

➤ Integration of failure device

When: $R_1(\Omega) \in [1-10]$

$$P_{f,\text{system}} \approx 2\%$$



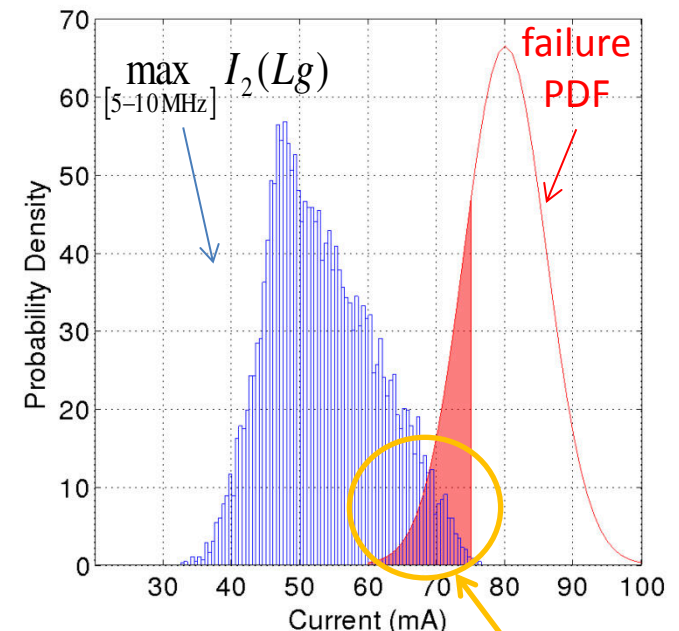
Failure domain

Sensitivity Analysis
from FORM



When: $R_1(\Omega) \in [2-10]$

$$P_{f,\text{system}} \approx 0.8\%$$



Failure domain

- In blue, 10,000 evaluations of the maximum of $I_2(Lg)$ obtained by Monte Carlo simulation
- In red, failure Gaussian Probability Density Function (PDF) of the device: $N(80, 6)$

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➤ Summary Table on reliability methods, +++ indicates a very efficient method contrary to - - -

Method	Efficiency (Accuracy / Computational cost)	Remarks
Monte Carlo simulation (MCS)	- - -	Can deal with any type of problem but the computational cost is too high
FORM- SORM	++	Requires a validation of the results since some non-linear case (resonance) can cause problems
Importance Sampling (IS)	+++	Requires a validation of the results since some non-linear case (resonance) can cause problems – More robust than FORM-SORM
Subset Simulation (SS)	+++	Simulation Method introduced for estimation of failure probability in high dimensions – More robust than IS

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- Reliability analysis (probability of failure)
 - Application to a real case more complex
(Increasing of the number of random variables for a 3D EMC problem:
interaction field/cables)

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- M. Lemaire, *Structural reliability*, John Wiley & Sons, 2010.
- B. Sudret, *Uncertainty propagation and sensitivity analysis in mechanical models – Contributions to structural reliability and stochastic spectral methods*, Habilitation à diriger des recherches, Université Blaise Pascal, Clermont-Ferrand, 2007.

Thank you for your attention



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