

# ***Contribution of Statistics to Human Exposure Assessment***

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# outline



I Introduction

II From determinist to statistical approach of the human RF Exposure

III Surrogate models in EMF exposure assessment

IV Conclusion



# Introduction

- Large numbers of users > 5 billions worldwide
- Versatile use surf, talk, play
- Larger and larger duration of use surf is increasing and <talk> is > 150min/month



- Risk perception about the EMF exposure.

Basic restrictions	Public	Workers
Whole body SAR (W/kg)	0.08	0.4
Local SAR (W/kg) Head - Trunk	2	10
Local SAR (W/kg) Limbs	4	20

- Protection limits exist
- Large efforts to check the compliance to limits but the risk perception is still important



Assess the real exposure is a key question for sanitary authorities as well as for industry

- Euro-barmoter 2010 :
- 70% say that mobile phone masts have some effects on health.
  - 67 % think that mobile telephones have some effects on their health.



# EMF Human Exposure

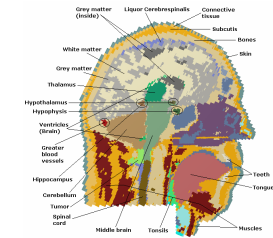
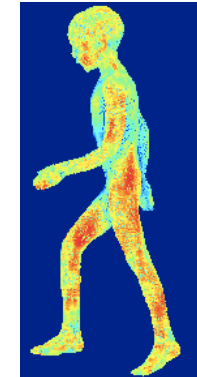
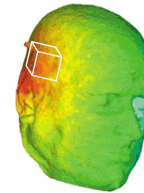
Fundamentally the exposure is link to the power absorbed.

The power absorbed per unit of mass characterize such exposure .

→ Specific Absorption Rate SAR

The SAR is often averaged over the whole body or over a small mass (eg 1 or 10 g)

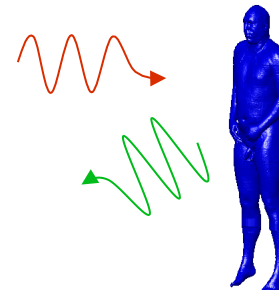
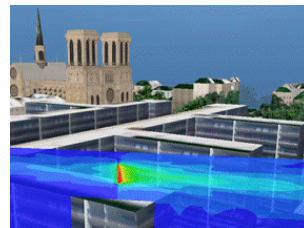
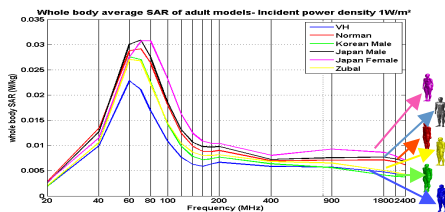
For the whole body the exposure is often discussed in v/m but the incident field and the whole body exposure are linked by a transfer function



$$SAR = \frac{d\left(\frac{dW}{dm}\right)}{dt}$$

$$SAR = \frac{\sigma E^2}{2\rho}$$

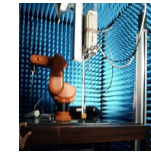
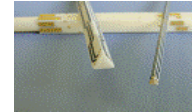
- The absorption depends on
  - Shape
  - Tissues
  - Frequency





# Large efforts dedicated to dosimetry since 20 years

- **Experimentally.** Probe, liquids, phantoms and protocols have been developed and implemented in standards



CENELEC



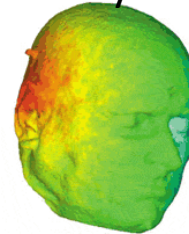
- **Numerically:** with HPC, GPU,.. simulations that can be achieved are larger and larger, faster and faster  
But is still facing limitation

30 years ago

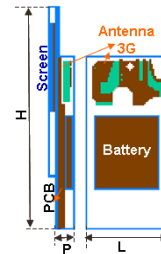


$$SAR = \frac{\sigma E^2}{2\rho}$$

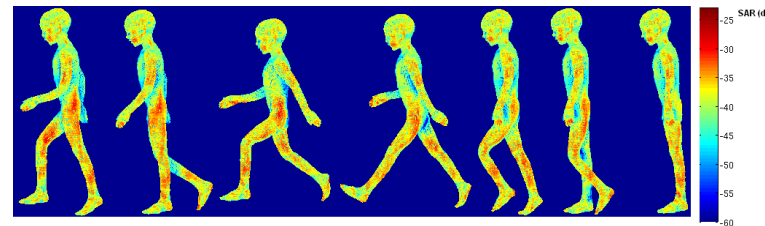
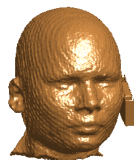
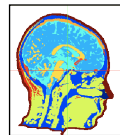
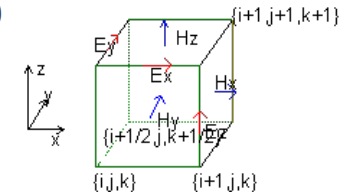
today



Whist lab & Orange



FDTD





# Numerical SAR assessment

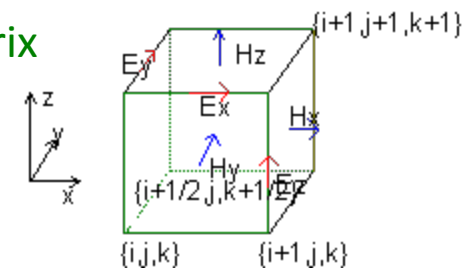
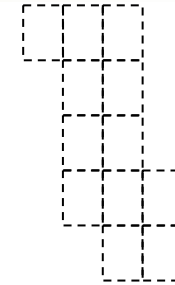
**In Bio-electromagnetism, the FDTD (Finite Difference in Time Domain) is the most popular method to solve the Maxwell PDE**

$$\text{rot} \vec{E} = - \frac{\partial(\mu_0 \vec{u}_r * \vec{H})}{\partial t} \quad \text{Solve the Maxwell PDE over an orthogonal grid}$$

$$\text{rot} \vec{H} = \frac{\partial(\epsilon_0 \vec{\epsilon}_r * \vec{E})}{\partial t} + \vec{\sigma} \vec{E} \quad \text{Explicit formulation does not require any matrix inversion}$$

## Finite Difference in Time Domain

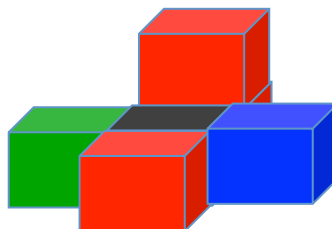
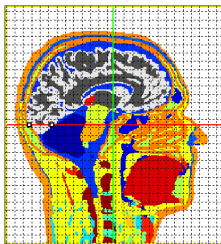
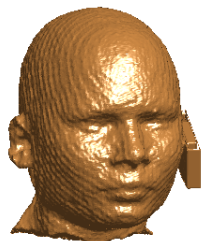
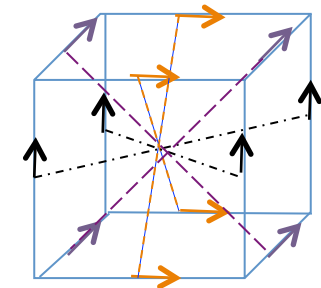
$$E_x^n(i-1/2, j, k) = E_x^{n-1}(i-1/2, j, k) + \frac{\Delta t}{\epsilon_0 \epsilon_r} \cdot \frac{H_z^{n-1/2}(i-1/2, j+1/2, k) - H_z^{n-1/2}(i-1/2, j-1/2, k)}{\Delta y} - \frac{\Delta t}{\epsilon_0 \epsilon_r} \cdot \frac{H_y^{n-1/2}(i-1/2, j, k+1/2) - H_y^{n-1/2}(i-1/2, j, k-1/2)}{\Delta z}$$



**Divide the resolution by 2  
the time computation by 2**

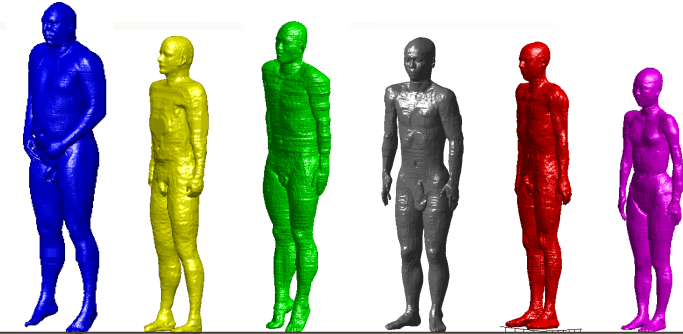
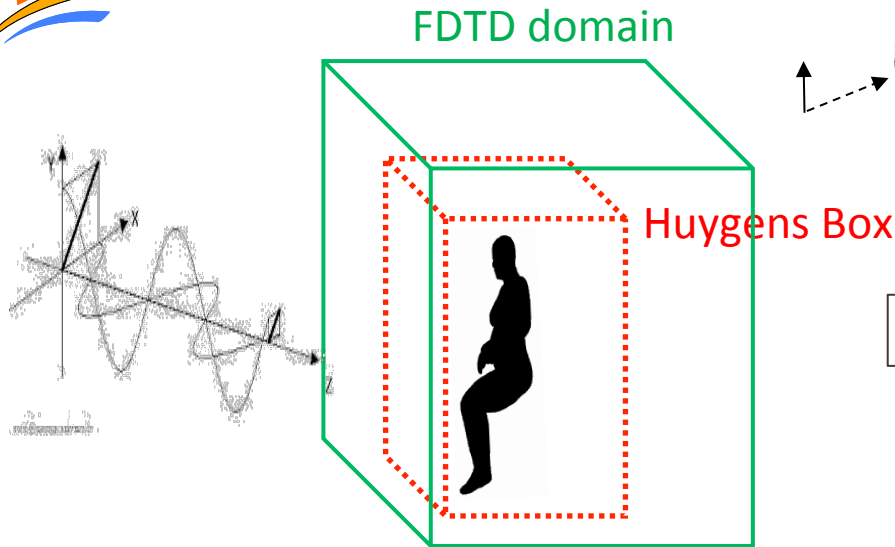
$$P_{abs} = \frac{1}{2} \iiint \sigma E^2 dv$$

$$SAR = \frac{\sigma E^2}{2\rho}$$

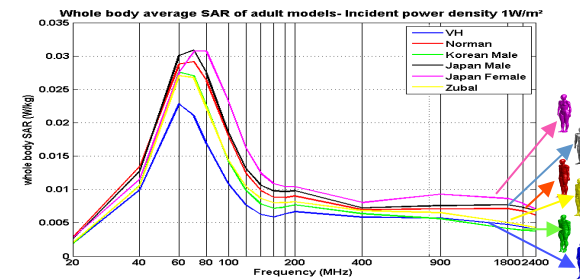




# Whole Body exposure from a far and close sources



Absorbed power divided by the weight vs frequency



**Huygens Box Principle**

- The exposure induced by the incident field can be performed using the equivalent principle
- With the E.P. only the incident field at the surface is required to assess the field inside the box.

The field radiated by a source can be expanded over

- plane waves
- spherical waves (that are an orthogonal base as the plane waves are)

$$\vec{E}(r, \theta, \varphi) = \sum_k Q_k \vec{F}_k(r, \theta, \varphi)$$

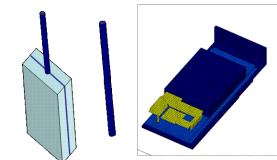
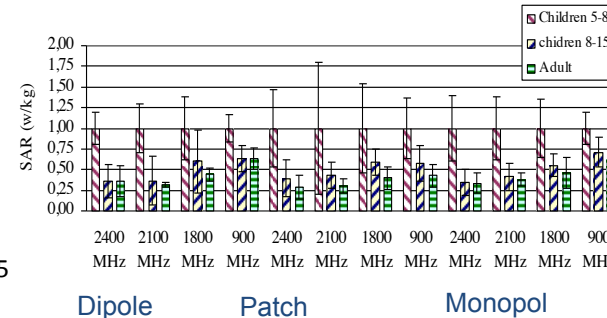
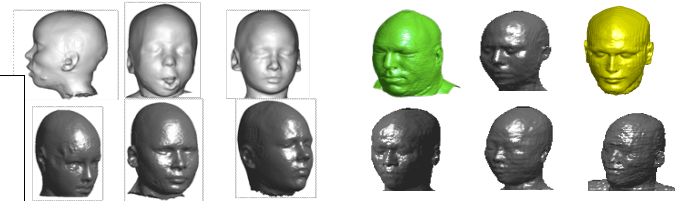
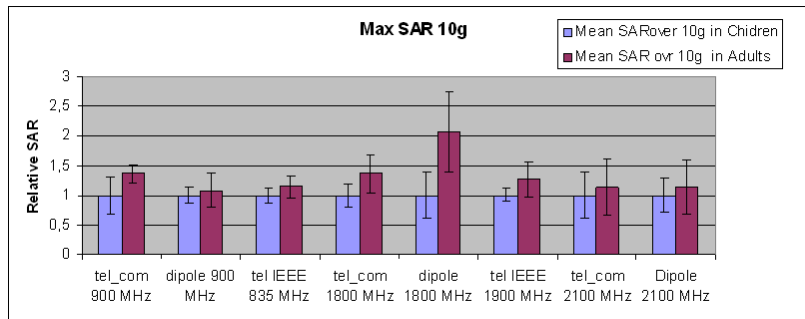
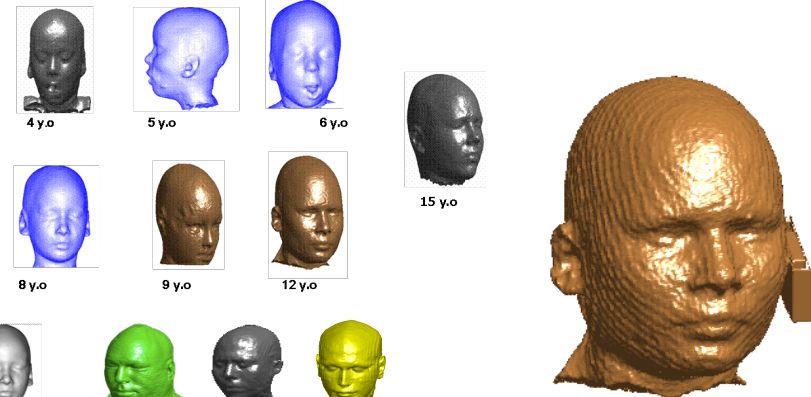

**Computational effort:**

- A single simulation (1 phantom, 1 fre) = 8 h
- 16 freq x 6 phantoms → 768 hours... 32 days...



# Children vs Adults exposure

- Head models, MRI based, have been developed
- Comparison between adult and child head models have been conducted .



Analysis of RF exposure in the head tissues of children and adults  
*J. Wiart, A Hadjem, M F Wong and I Bloch, Phys. Med. Biol. 53 (2008) 3681–3695*

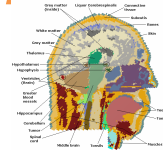
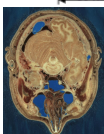
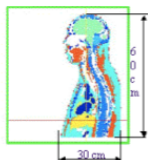
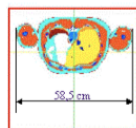
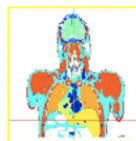
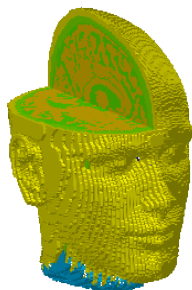
- Computational effort:**
- A single simulation (1 head phantom, 1 fre) > 0.5 h  
 → Computation time = 72 \* 0.5 = 36 h
  - Simulation preparation (put the phone close to the head) → 1 h ...  
 3 phones, 6 head → 18h



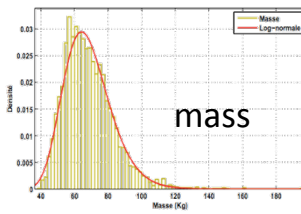
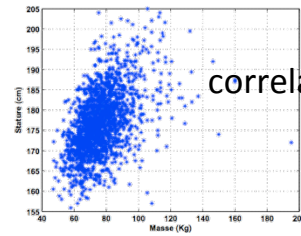
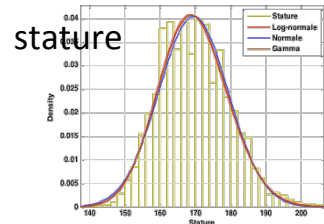
# The Human body structure: evolving, deformable, heterogeneous and dispersive..



## Heterogeneous

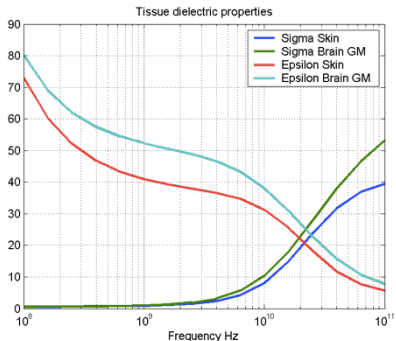


## Human variability



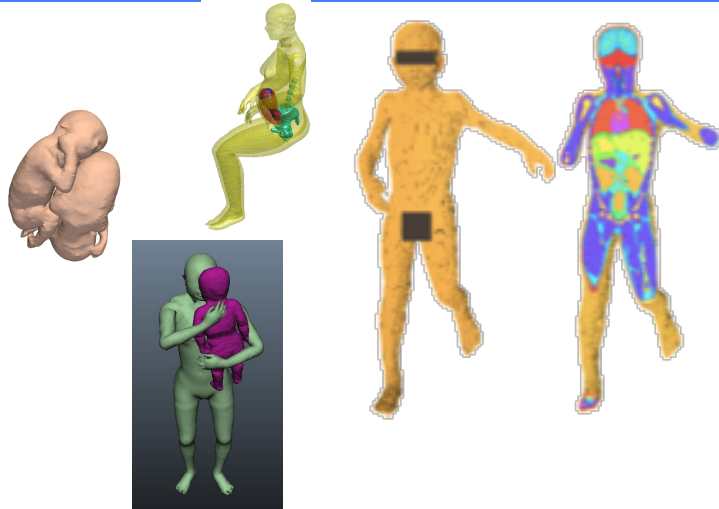
## Dispersive, Lossy and variable

e.g. at F= 900 MHz



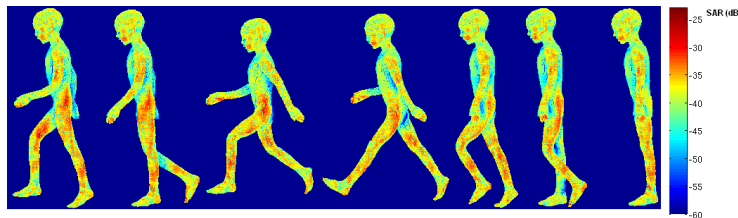
Tissue	Epsilon	Sigma
Blood	61.3	1.53
Bone_Cortical	12.4	0.14
Bone_Marrow_Infiltrated	11.2	0.22
Bone_Marrow_Not_Infiltr	5.5	0.04
Cartilage	42.6	0.78
Cerebro_Spinal_Fluid	68.6	2.41
Eye_Tissue(Sclera)	55.2	1.16
Fat	5.4	0.05
Grey_Matter	52.7	0.94
Muscle	55.0	0.94
Nerve(Spinal_chord)	32.5	0.57
Skin(Dry)	41.4	0.86
Skin(Wet)	46.0	0.84
Tongue	55.2	0.93
White_Matter	38.8	0.59

## Deformable and evolving structure

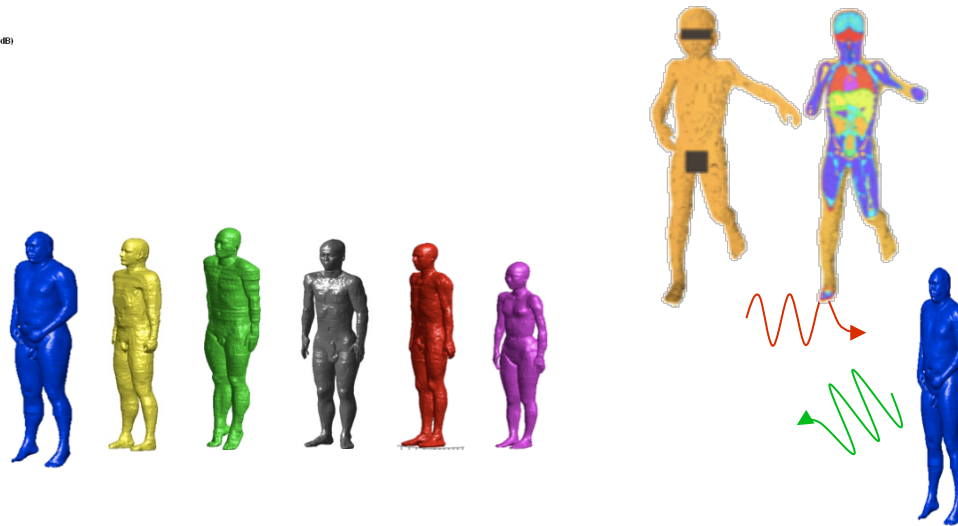




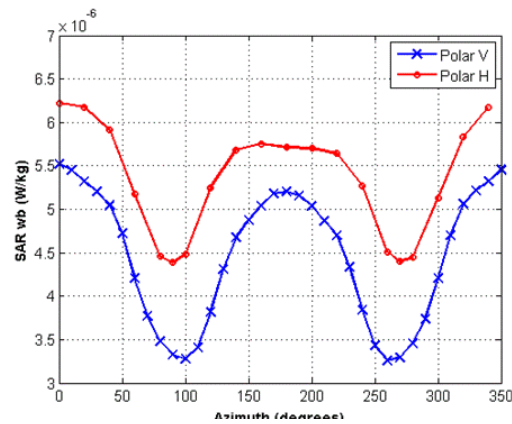
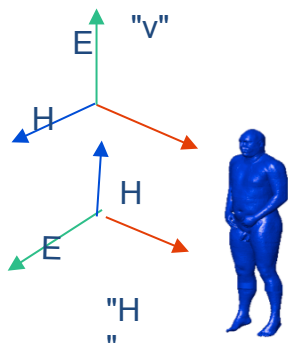
# Exemple of influence of morphology and posture



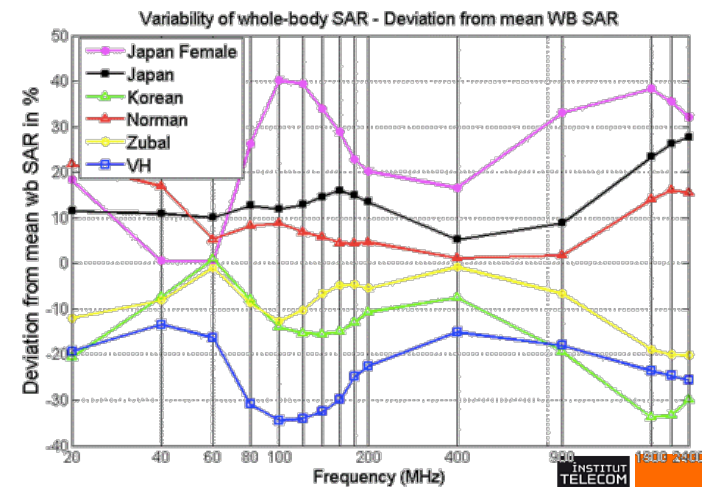
Total absorbed power divided by the weight



## Large Variability



2.1 GHz



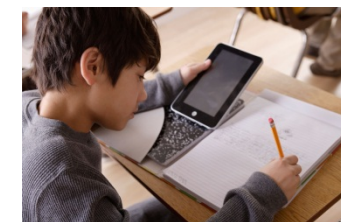
# Wireless technologies evolve. RF source are more and more complex. Usages are versatile



Complex and evolving technologies



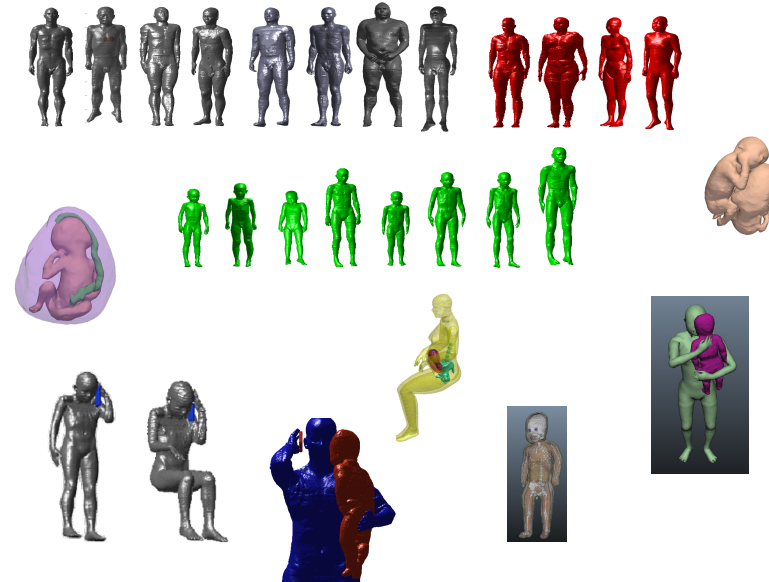
Versatile use





# And the time of consciousness has come.

Voxel body models and deformation methods have been developed



But

- What is the representativeness of these phantoms?
- What is the influence of posture on exposure ?
- What is the impact of uncertainties/variability on SAR distribution?
- What is the influence of versatile use with longer duration?
- What is the influence of multiple source, multiple networks, multiple questions



# From deterministic to statistical

For a specific person, age, posture, usage, phone....

At a given time, the **relationship** between these parameters and **SAR is determinist**

$SAR = f(\text{sources [design, location, frequency technology..]}, \text{body [composition, geometry, posture,...]})$

In real word age, posture, usage, phone.... Can change, evolve ...

The SAR is dependent on a large number of **variable inputs  $x_i$**

$$SAR = f(x_1, x_2, \dots, x_i, x_{i+1}, \dots, x_n)$$

$$SAR(\omega) = f(x_1(\omega), x_2(\omega), \dots, x_i(\omega), \dots, x_n(\omega))$$

where  $\omega \in \Omega$  with  $\Omega$  the space of possibility

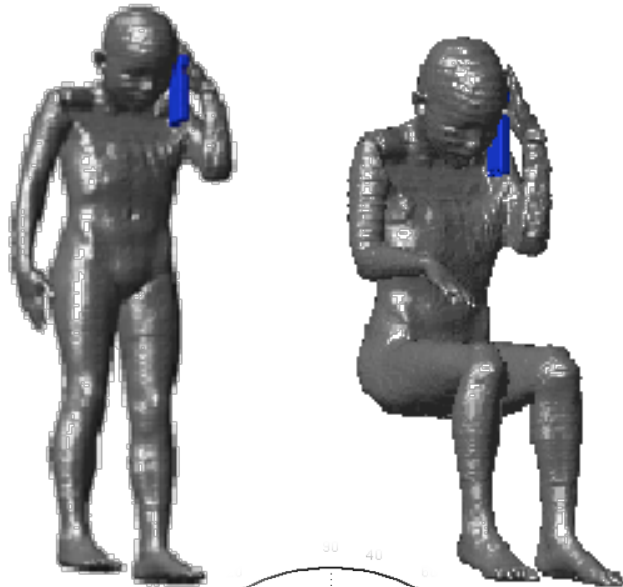
Large number of inputs:

- dielectric properties of tissues
- Posture description
- Source localisation
- ...

Stochastic dosimetry started in the 2000's



# Variable SAR induced by the variable gain of the couple mobile+user

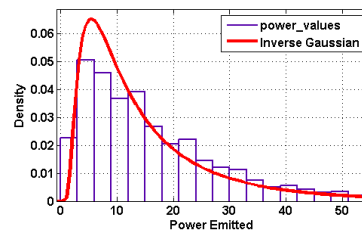
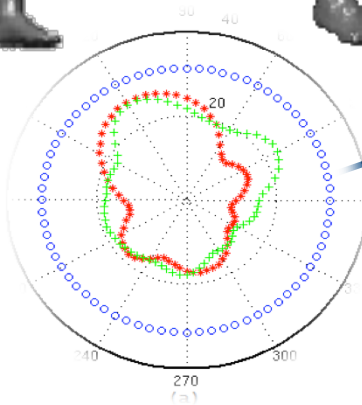


- The pattern antenna (gain) of « mobile +user » depends on the posture and location of the phone
- The human exposure (SAR) depends on the power radiated by the phone



$$P_e * G_e * \underbrace{PL * G_r}_{\text{constant}} = \underbrace{P_r}_{\text{fixed}}$$

$$P_e * G_e(\theta_{LOS}, \phi_{LOS}) = 1.$$



Considering  $P_e \times G_e$  known, what is the variation of SAR. In this case is the relative position of the phone is fixed so SAR depend only the power emitted:

$$P_e = \frac{1}{G_e(\theta_{LOS}, \phi_{LOS})}$$

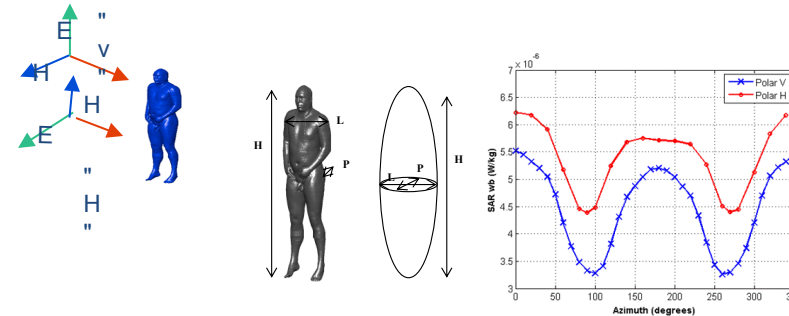


# Surrogate modeling first engineering approach



FDTD simulation cost does not allow large number of sampling, surrogate model is needed.

- In the RF domain there is no resonance, then the whole body SAR is proportional to the surface cross section
- Human body can be approximated using Ellipsoid



Based on simulations performed with VH  $P(W) = 0.72 * S(m^2) * DSP\left(\frac{W}{m^2}\right) \pm 5\%$

$$surface = \pi \frac{H}{2} \sqrt{\frac{L^2}{2} \cos(\theta)^2 + \frac{P^2}{2} \sin(\theta)^2}$$



Representativeness?

A method is needed to built the surrogate models

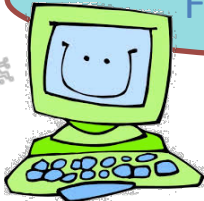


# Challenges of the stochastic dosimetry

$$\text{rot} \vec{E} = -\frac{\partial(\mu_0 \vec{u}_r * \vec{H})}{\partial t}$$

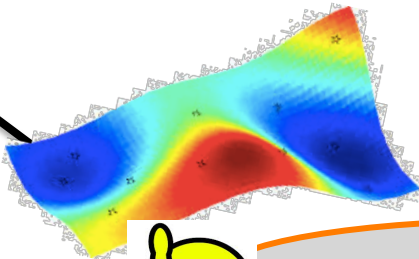
$$\text{rot} \vec{H} = \frac{\partial(\epsilon_0 \vec{e}_r * \vec{E})}{\partial t} + \vec{O} \vec{E}$$


FDTD : high cost



Vector of input variables  
 $x \in \mathbb{R}^M$

Vector of output variables  
 $y = M(x)$



Low cost surrogate model

- **User variables**
    - morphology
    - posture
  - **Usage variables**
    - devices
    - type of service
  - **Network variables**
    - load
    - type of cells
    - RAT
  - ...
- 

- **Surrogate model**
  - analytical model
  - **polynomial chaos**
  - **gaussian process**
  - kriging
  - ...

- Global variable whole body SAR
- Local variables
  - 10g SAR
  - brain SAR
  - ...
- ...

**First Challenge: Characterise the input**

**Main Challenge: built surrogate model with the minimum cost**





# surrogate modeling using Polynomial Chaos



$$Y = M(X) \quad \text{With} \quad E(Y^2) < \infty$$

$$Y = \sum_k \beta_k \Psi_k(X)$$

Where  $\beta_k$  are the coefficients of the polynomial chaos expansion

$\Psi_k$  are the basis of of the polynomial chaos.



# Projection and Quadrature approach to get the coef

$\Psi_k$  are orthogonal

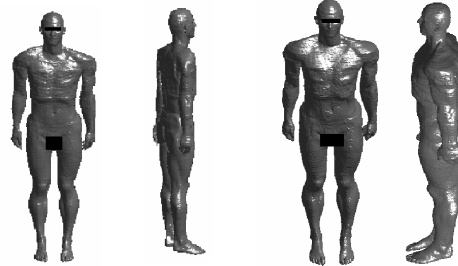
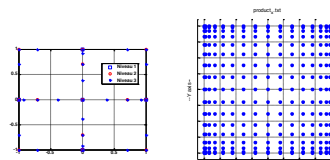
Modal description is often used in electromagnetism and therefore the projection can be considered as "natural" in dosimetry.

This approach is useful to assess accurately a coefficient but, in the human exposure domain, even with quadrature, in the human exposure domain the projection approach leads to have large number of FDTD simulations. (large number of input and quite large order of polynomial)

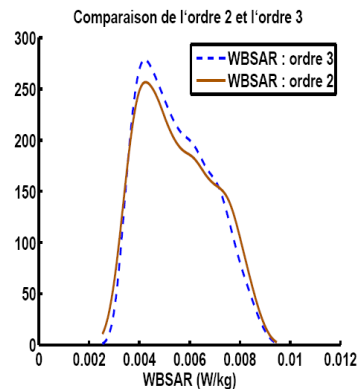
Sparse Quadrature : « Clenshaw Curtis » and Smolyak tensorisation

4 input parameters to create Morphed human models

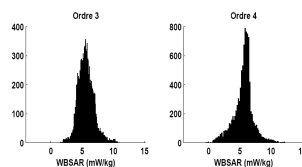
height, shoulders, chest size, Lap belt



	3 D	4 D
Ordre 1	7	9
Ordre 2	25	41
Ordre 3	69	137
Ordre 4	177	401
Ordre 5	441	1105



Phd A El Habachi  
 & Statistical analysis of whole-body absorption depending on anatomical human characteristics at a frequency of 2.1 GHz  
 A El Habachi et al 2010 Phys. Med. Biol. 55 pp 1875 -1887



Phs J Silly Carette  
 & Variability on the Propagation of a Plane Wave Using Stochastic Collocation Methods in a Bio Electromagnetic Application  
 Silly-Carette et al IEEE MWCL 2009



# Coefficients assessment using Regression



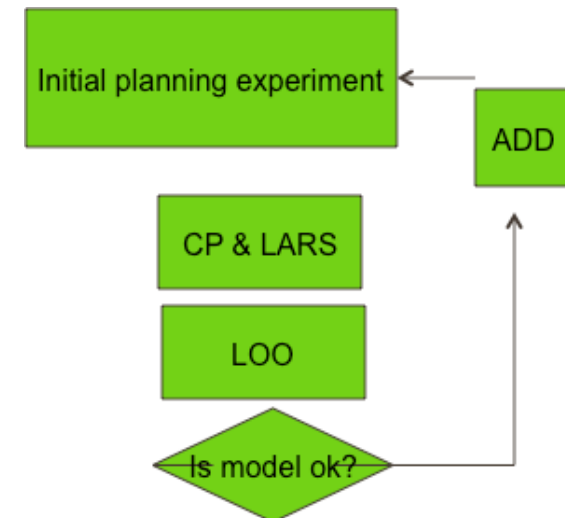
Regression and LOOCV seems to be more suitable for dosimetry

$$\hat{Y} = \sum_{k=1}^N \beta_k \Psi_k(X)$$

$$\hat{y} = \begin{pmatrix} \hat{y}_0 \\ \hat{y}_1 \\ \vdots \\ \hat{y}_P \end{pmatrix}$$

$$Z = \begin{pmatrix} \Psi_0(\xi^{(1)}) & \Psi_1(\xi^{(1)}) & \dots & \Psi_P(\xi^{(1)}) \\ \Psi_0(\xi^{(2)}) & \Psi_1(\xi^{(2)}) & \dots & \Psi_P(\xi^{(2)}) \\ \vdots & \vdots & \ddots & \vdots \\ \Psi_0(\xi^{(n)}) & \Psi_1(\xi^{(n)}) & \dots & \Psi_P(\xi^{(n)}) \end{pmatrix}$$

$$\hat{\beta} = (Z^T Z)^{-1} Z^T y$$



Leave one out to analyse the global accuracy of such model

*If the model is not as expected then a new experiment has be added*

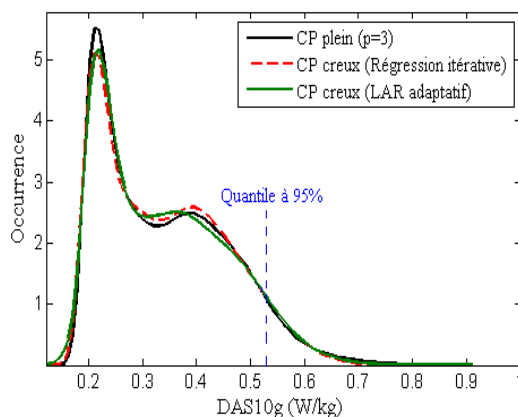
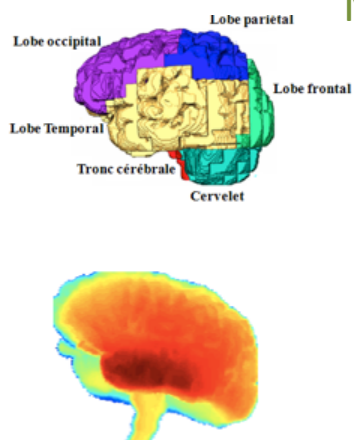
# Influence of the phone position closed to the head using Polynomial Chaos



Latin hyper sampling

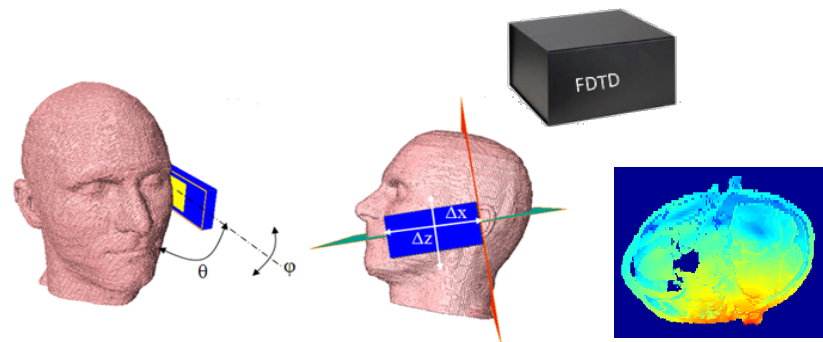
PC + LOO → 122 FDTD simulations

Maximum SAR over 10g in the head



Uniform

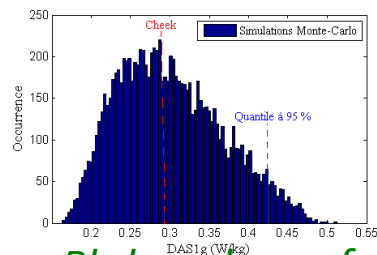
	$\theta$	$\Phi$	$\Delta x$	$\Delta z$
	[0 -30°]	[-15°+15°]	[5 - 30 mm]	[-10 +10mm]



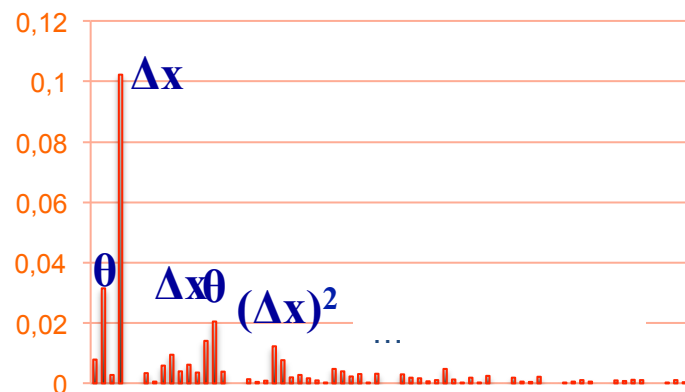
Sensitivity analysis

$$Y_i = SAR_i$$

Maximum SAR over 1g in the brain

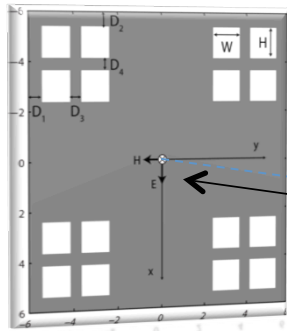


Phd works performed by A Ghanmi  
Supervisors O Picon and J Wiart





# Exposure from reflection on wall

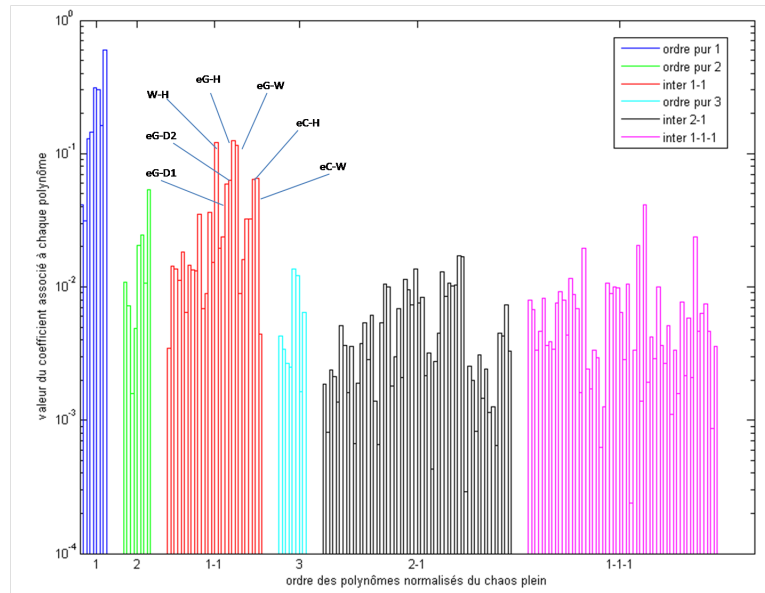


Sensitivity analysis

■ 9 inputs

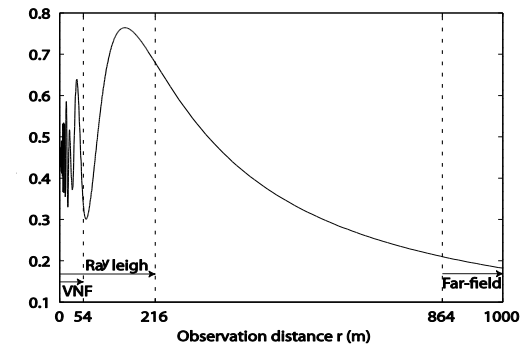
- concrete and glass permittivity
- height and width of windows
- distance between windows
- distance between windows and edges

- Physical analysis: observation of the most inflent polynomials
- Prevalence of some interaction terms compared to the corresponding pure order terms

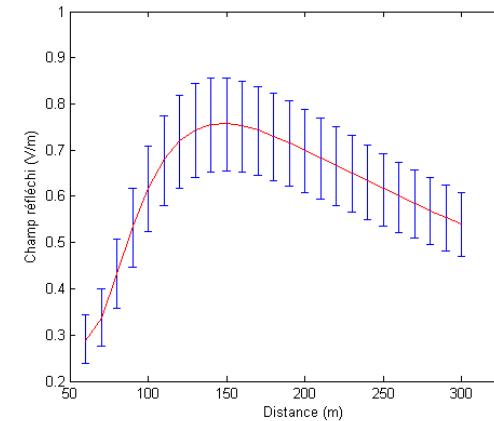


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Supervisors O Picon, S Mostarshedi, B Sudret and J Wiart

## Deterministic approach



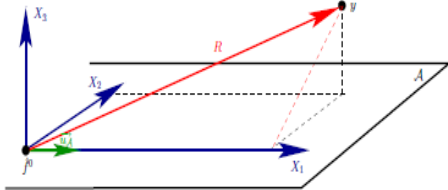
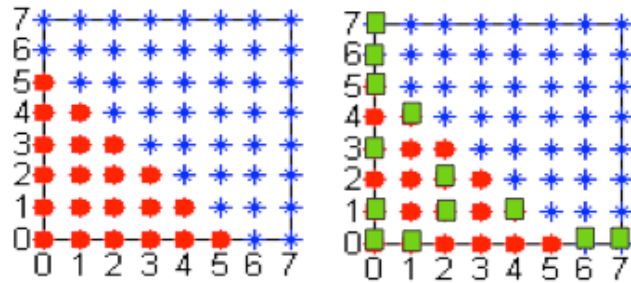
## With PC



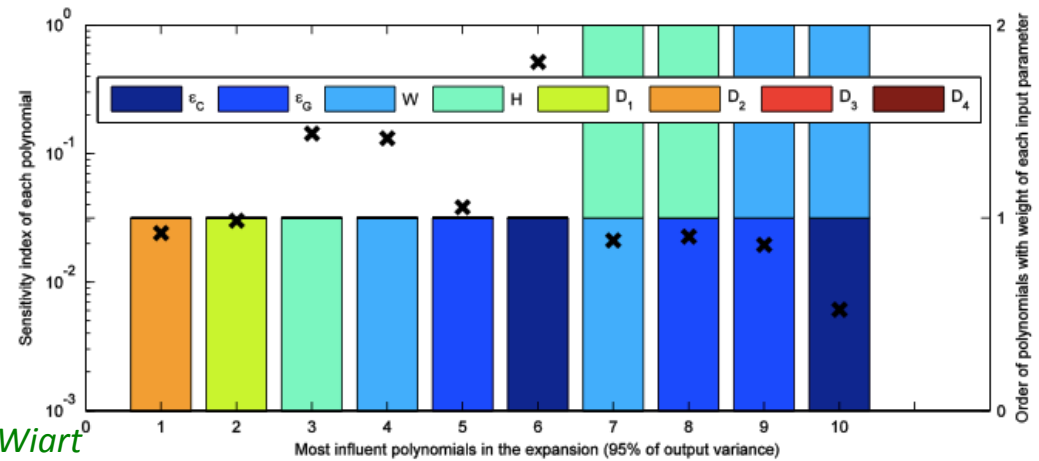
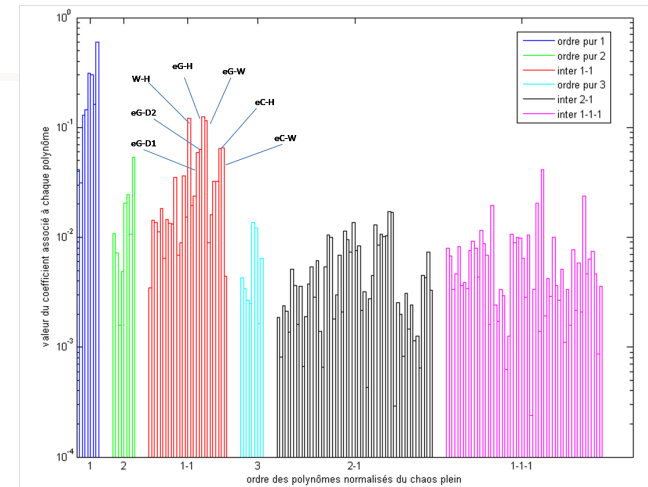


# Limit the computational effort

In Dosimetry Parsimony is not an option..  
How select relevant polynomials?



Phd works performed by P Kersaudy  
Supervisors O Picon, S Mostarshedi, B Sudret and J Wiart



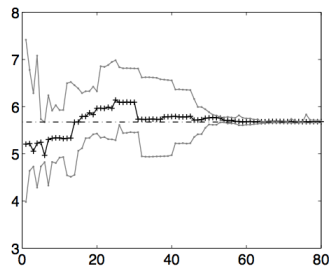
Least Angle Regression LARS  
Sparse LARS truncation gives a significant reduction of the requested number of simulations



# Next step : Parsimonious iterative experiment for quantile estimation

**Challenge :**  
Built an iterative process able to monitor the uncertainty of specific quantile

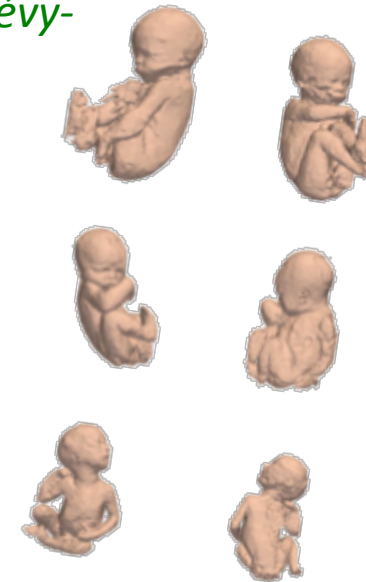
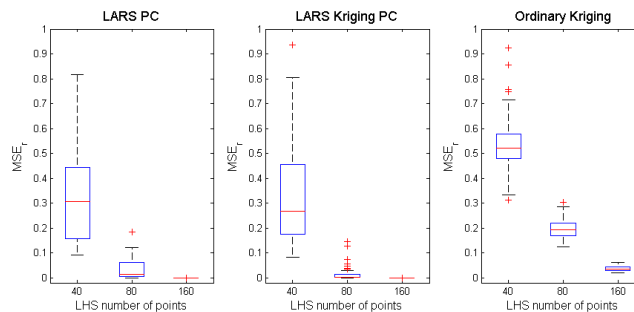
- **Quantile estimation using Gaussian Process Shrunken (GPS)**



*Phd works performed by M Jala  
Supervisors : E Moulines, CLévy-  
Leduc, E Conil and J Wiar*

- **Combination of Kriging with chaos polynomials**

**Result with  
Ishigami function**





# As Final Conclusion

Dans la confusion trouver la simplicité  
De la discorde faire jaillir l'harmonie  
Au milieu de la difficulté se trouve  
l'opportunité

Albert Einstein,  
*Trois règles de travail*