



*Laboratório para Aplicações da RMN e Petrofísica*  
Universidade Federal Fluminense



# Using computational heuristics to recover a variable surface relaxivity from tomographic images for NMR logging

1

Francisco J. Benavides Murillo

fbenavides@id.uff.br

PhD Candidate, Computer Sciences, UFFLAR laboratory

Universidade Federal Fluminense

Advisors: Dr. Rodrigo Bagueria, Dr. Ricardo Leiderman

2



*Laboratório para Aplicações da RMN e Petrofísica*  
Universidade Federal Fluminense

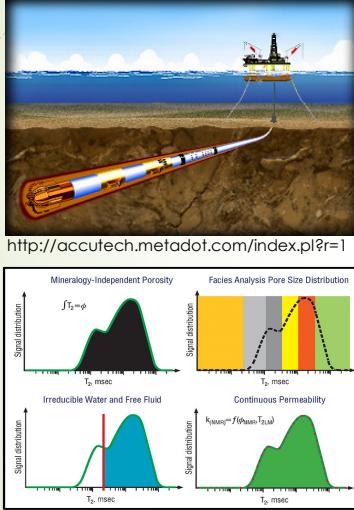


## Agenda

- ▶ NMR deliverables
- ▶ NMR simulation workflow
- ▶ Our problem
- ▶ Our proposal
- ▶ Software

3

**Laboratório para Aplicações da RMN e Petrofísica**  
Universidade Federal Fluminense



<http://accutech.metadot.com/index.pl?r=1>

[www.spe.org/jpt/article/10327-technology-update-24](http://www.spe.org/jpt/article/10327-technology-update-24)

**Formation evaluation by NMR**

- ▶ Deliverables
  - ▶ Mineralogy independent porosity
  - ▶ Pore size distribution
  - ▶ Irreducible water saturation
  - ▶ Formation Permeability
- ▶ Advantages
  - ▶ Does not need to wait for laboratory results
  - ▶ Continuous record of formation's rock properties
  - ▶ Available in logging while drilling (LWD)

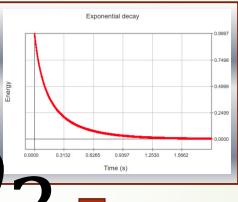
4

**Laboratório para Aplicações da RMN e Petrofísica**  
Universidade Federal Fluminense

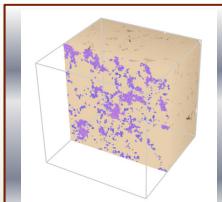
**NMR simulation to produce a PSD**

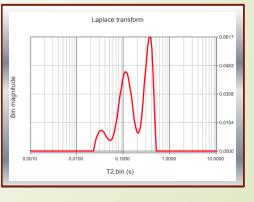
Digital rock 

$\rho_2$

NMR decay 

Pore size distribution  $\frac{1}{T_{2,S}} = \rho_2 \frac{S}{V}$

Random Walk 

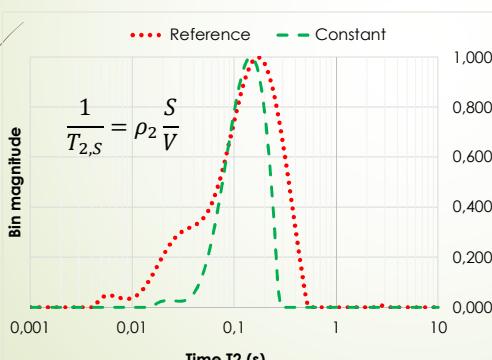
T2 Distribution 

5

  **Laboratório para Aplicações da RMN e Petrofísica**  
Universidade Federal Fluminense 

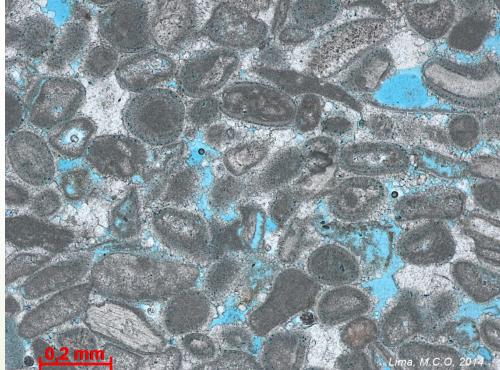
## Our problem

- A mismatch between laboratory measurements and simulated results (RW method)



$$\frac{1}{T_{2,S}} = \rho_2 \frac{S}{V}$$

Petrographic thin section



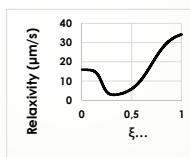
Lima, M.C.O. 2014

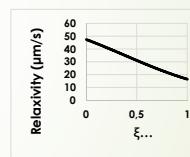
6

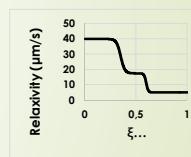
  **Laboratório para Aplicações da RMN e Petrofísica**  
Universidade Federal Fluminense 

## Our proposal

- Surface relaxivity varies with pores size
- Pore size is associated to the collision rate  $\xi$  of the fluid molecules saturating the porous media
- $\rho_2(\xi)$  can be expressed as a combination of sigmoid functions







- Pore size can be recovered from the collision rate

$$S_v(\xi) = \frac{4\xi}{\Delta}$$

7

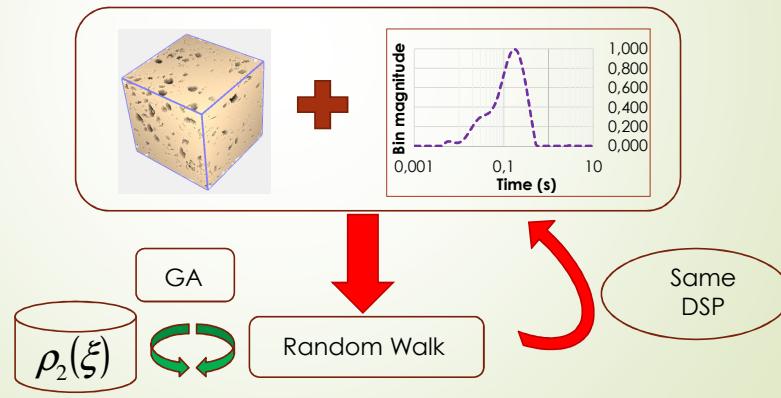


Laboratório para Aplicações da RMN e Petrofísica  
Universidade Federal Fluminense



## Iterative computational heuristics

- A genetic algorithm optimization
- A large set of RW simulations must be performed



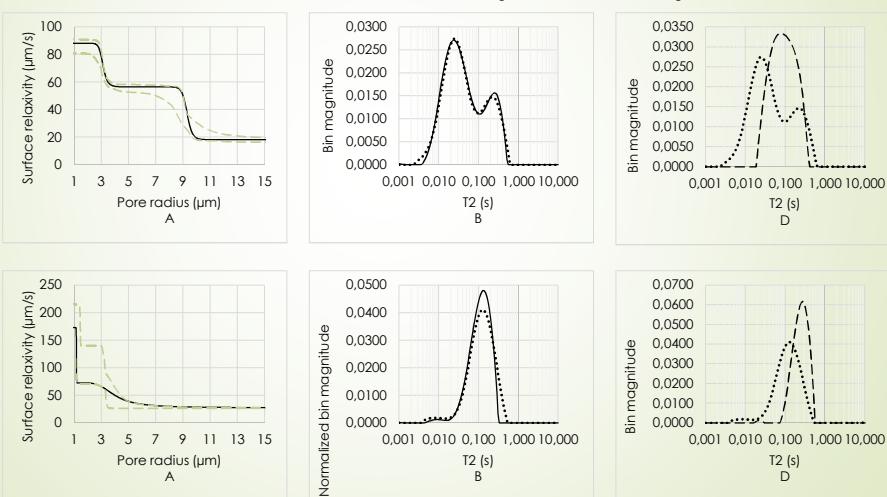
8

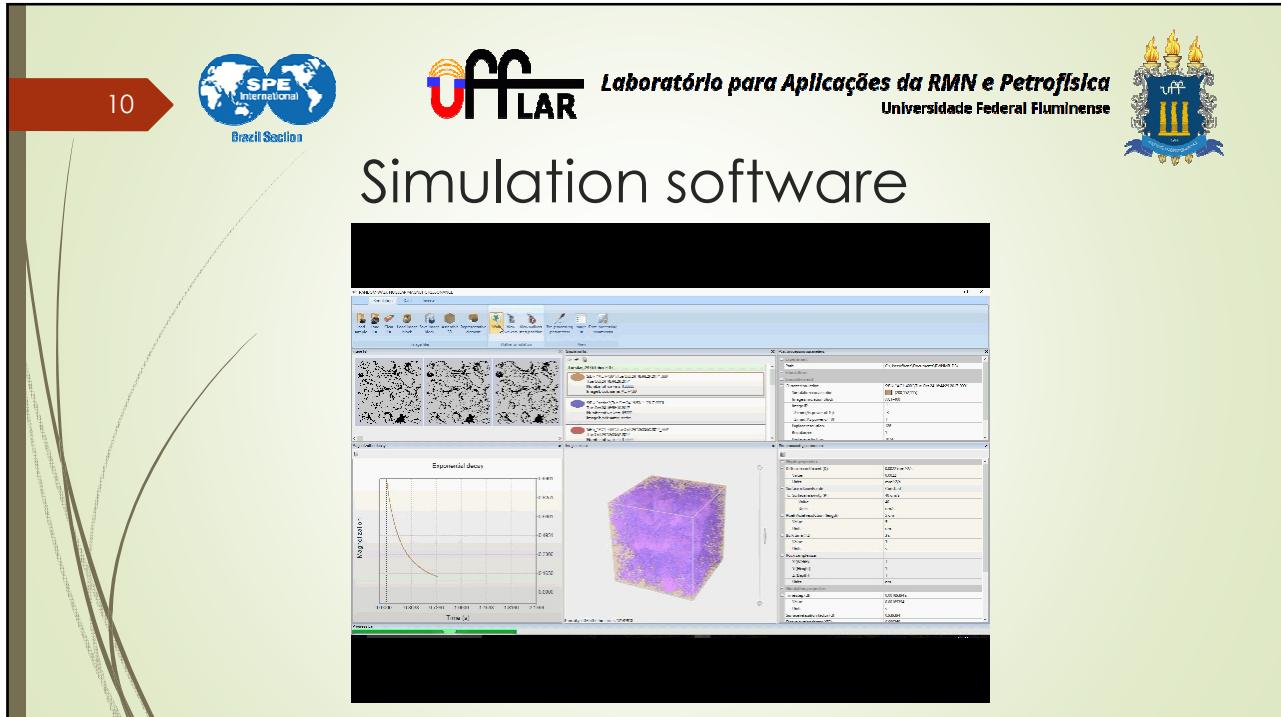
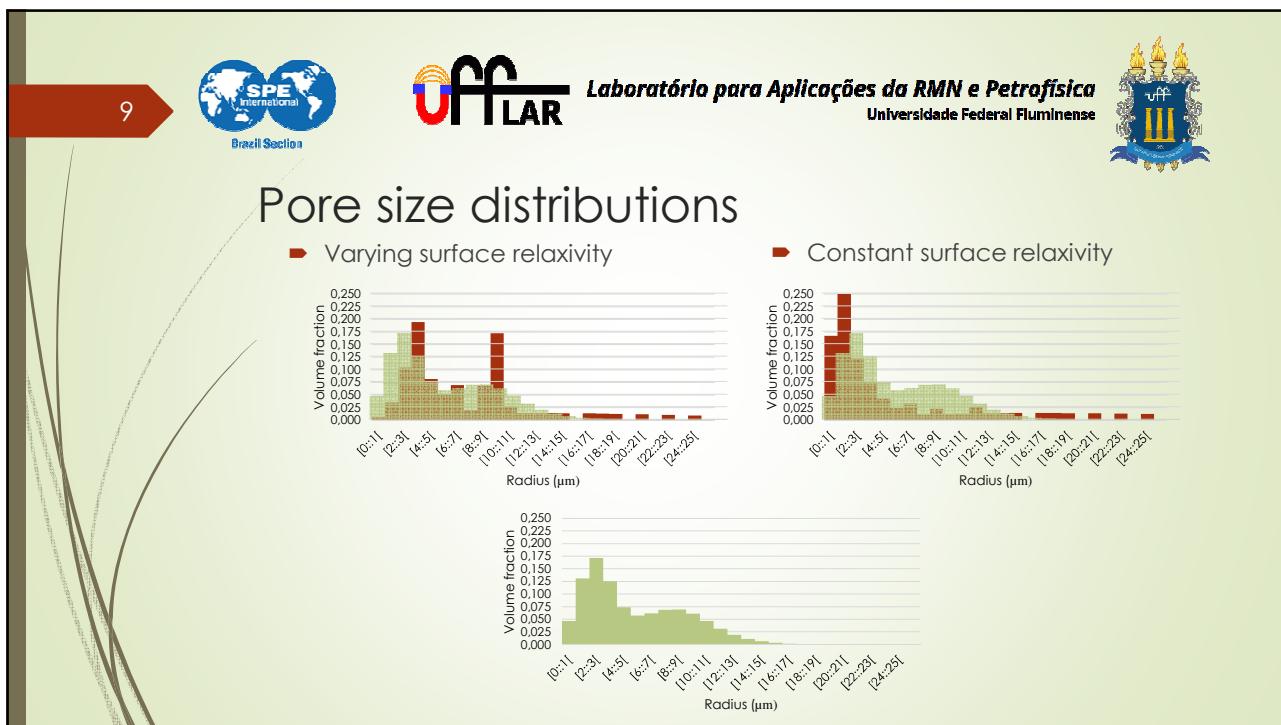


Laboratório para Aplicações da RMN e Petrofísica  
Universidade Federal Fluminense



## Experimental results (AC, DP)





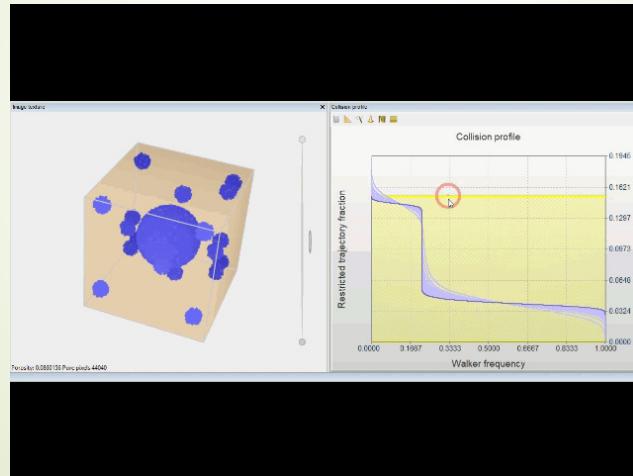
11



*Laboratório para Aplicações da RMN e Petrofísica*  
Universidade Federal Fluminense



## Collision rate distribution



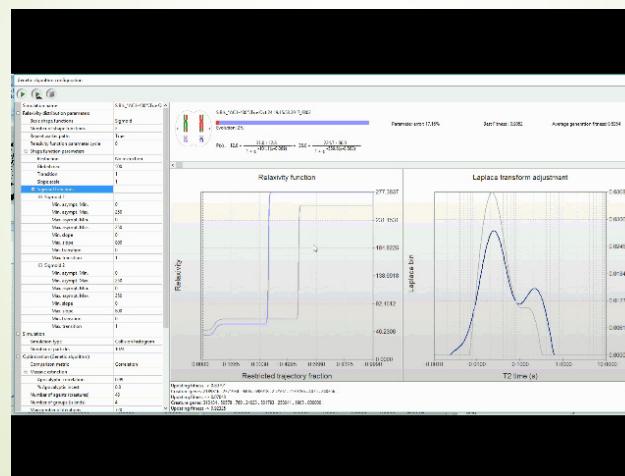
12



*Laboratório para Aplicações da RMN e Petrofísica*  
Universidade Federal Fluminense



## Computational heuristics



13




**Laboratório para Aplicações da RMN e Petrofísica**  
Universidade Federal Fluminense



Computers & Geosciences 106 (2017) 200–208

Contents lists available at ScienceDirect

**Computers & Geosciences**

journal homepage: [www.elsevier.com/locate/cageo](http://www.elsevier.com/locate/cageo)

Elsevier

Research paper

Estimating the surface relaxivity as a function of pore size from NMR T<sub>2</sub> distributions and micro-tomographic images



Francisco Benavides<sup>a,\*</sup>, Ricardo Leiderman<sup>a</sup>, Andre Souza<sup>b</sup>, Giovanna Carneiro<sup>b,c</sup>, Rodrigo Bagueira<sup>c</sup>

<sup>a</sup> Computer Science Department, Fluminense Federal University, Av. Gal. Milton Tavares de Souza, s/no, Niterói, RJ 24210-346, Brazil  
<sup>b</sup> Schlumberger Brazil Research & Geoengineering Center, Rua Paulo Emílio Barbosa, 485, quadra 7B, Parque Tecnológico do Rio de Janeiro, Rio de Janeiro, RJ CEP 21941-907, Brazil  
<sup>c</sup> Institute of Chemistry, Fluminense Federal University, Outeiro de São João Batista, s/no, Niterói, RJ 24020-141, Brazil

14




**Laboratório para Aplicações da RMN e Petrofísica**  
Universidade Federal Fluminense



## Conclusions

- A new varying surface relaxivity concept was introduced
- This approach produces a more precise PSD from a rock sample
- The oil industry can apply this approach on the formation evaluation by NMR
- A new Software Tool specialized in NMR:  
<https://www.youtube.com/watch?v=kR7FmL6KSII>

15

## Acknowledgements

- ▶ Advisors: Dr. Rodrigo Bagueira and Dr. Ricardo Leiderman
- ▶ Universidade Federal Fluminense
- ▶ Universidad Nacional de Costa Rica
- ▶ Sponsored by Shell, registered as ``Aplicação de técnicas avançadas de Ressonância Magnética Nuclear (RMN) assistidas por ferramentas computacionais na avaliação petrofísica de rochas carbonáticas`` (ANP 18999-3) under the ANP R&D levy as "Compromisso de Investimentos com Pesquisa e Desenvolvimento"