

## Research areas of interest

- ❖ Medical Image Processing
  - Ultrasound Quantitative Tomographic reconstruction
  - Inverse problems in general
  - Ultrasound
  - Segmentation and classification
- ❖ Biomedical Signal Processing
- ❖ Biomedical systems modeling

Next pages show summaries of some projects:

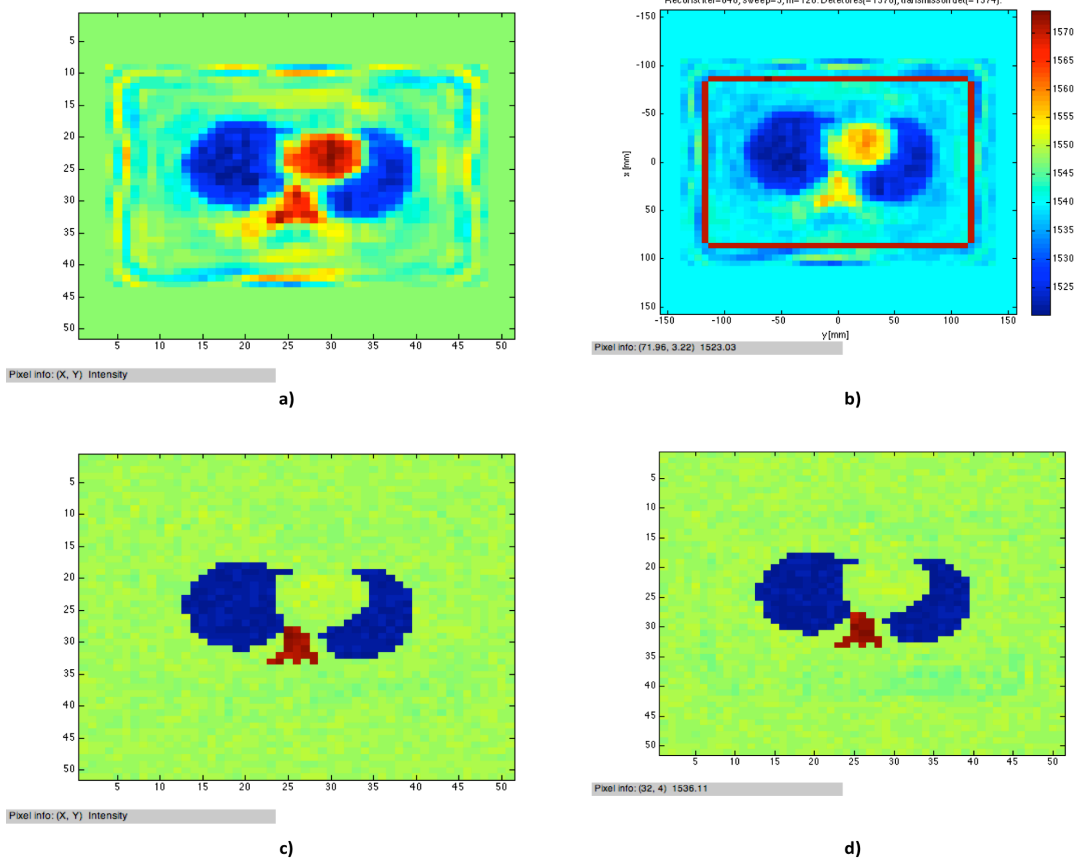
## On going projects in Medical Image Processing

### Diffraction tomography based on Ultrasound

The objective of this project is the research and development of quantitative tomography based on scattered ultrasound. Conventional B-mode ultrasound, used in most clinics, is basically qualitative, in the sense that it measures relative local difference of acoustic impedances. On the other hand, diffracted tomography is able to estimate material properties such as velocity of propagation and density that may characterize the local tissue.

Specific objectives are:

- Development of a framework for realistic simulation of ultrasound fields in order to investigate resolution, precision, accuracy and robustness of hardware and software approaches;
- Research, development and implementation of efficient hardware and reconstruction algorithms (2D and 3D) for diffracted tomography, aiming the reduction of image acquisition time and processing time;



**Figura 6.** Resultado da reconstrução por DBIM com disparos randomizados. a) baixo contraste ,sem ruído na entrada, inicialização com água, 640 iterações; b) baixo contraste ,com ruído na entrada, inicialização com água, 640 iterações; c) alto contraste, sem ruído, inicialização [-20;20] com 640 iterações; d) alto contraste, com ruído, inicialização [-20;20] com 640 iterações;

**Team:** S S Furuie, D A C Cardenas, PME (R Lima and colleagues) and PMR

## Quantitative elastography based on Ultrasound

**Objective:** investigation of quantitative elastography in deep tissues based on ARFI generated by 2D array transducers with large surface.

**Motivation:** Ultrasound elastography is an emerging imaging modality used to provide information about tissue elasticity. It is important because tissue mechanical changes often correlate with tissue pathological changes. Generation of shear waves requires some kind of tissue stimulation in order to induce local displacements. One of these stimulations is via acoustic radiation force (ARFI). There are several studies involving acoustic radiation force and its ability to image the mechanical properties of tissue. However, the application of this technique has been limited to depths smaller than 10 cm. This issue is caused by the inability of the transducer to focus the necessary amount of energy far from the transducer surface.

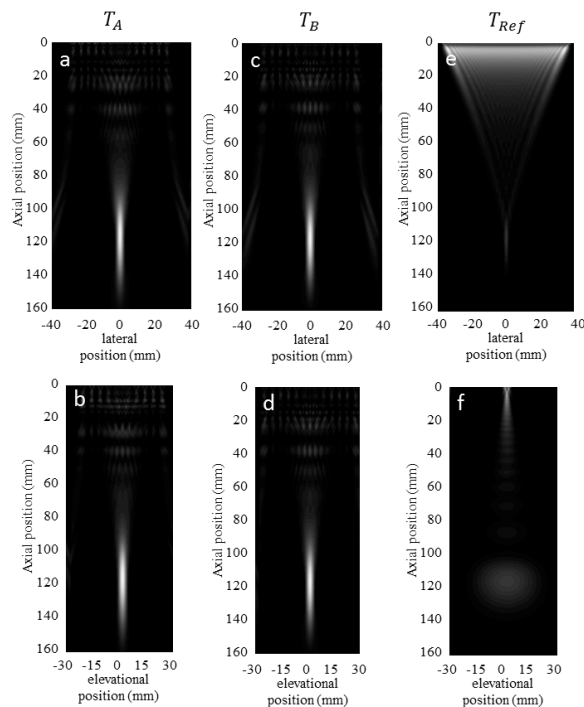
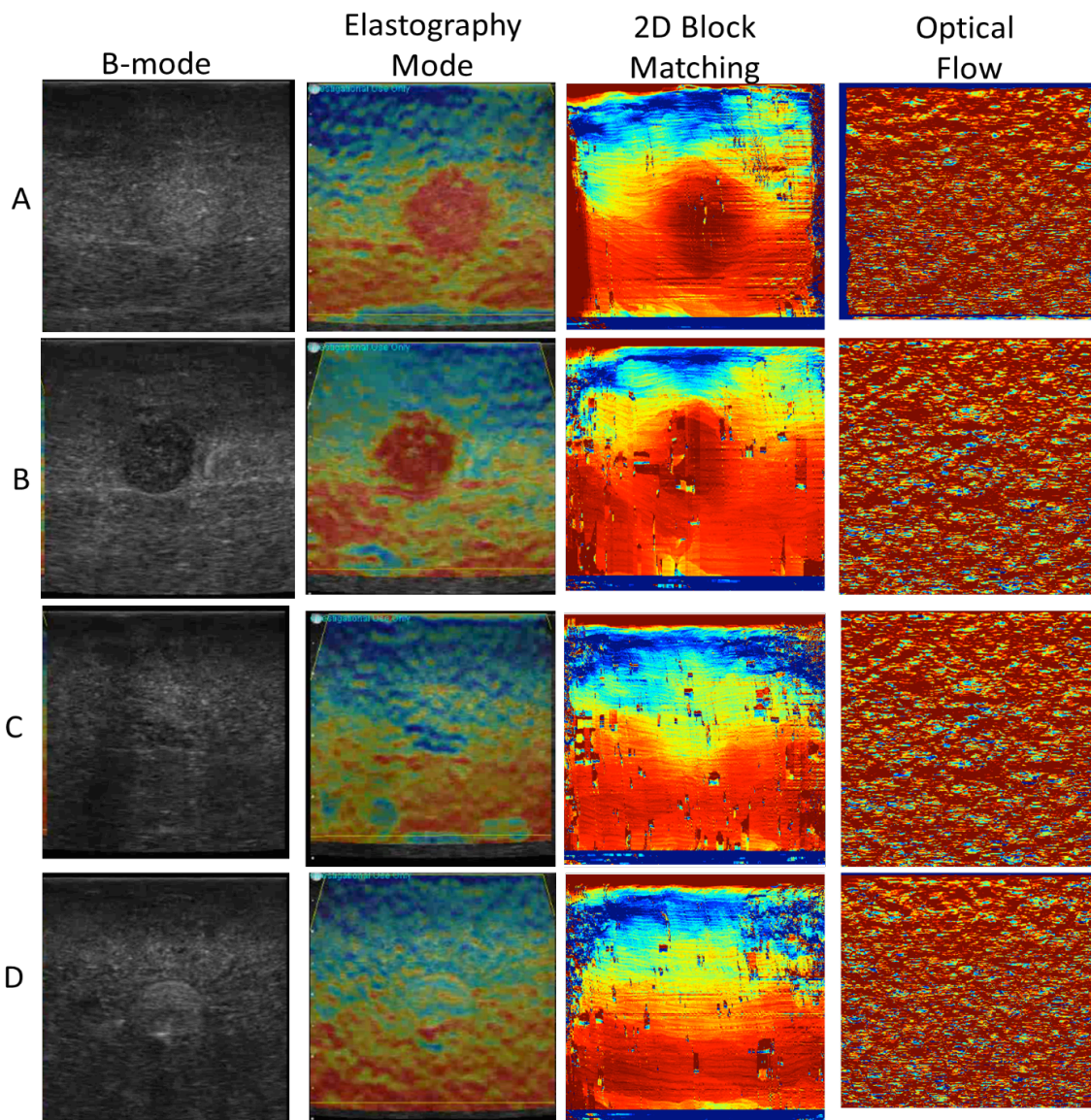


Figure 1: a, c and e illustrate the accumulated energy distribution in the lateral-axial plane of the simulation of  $T_A$ ,  $T_B$  and  $T_{Ref}$ , respectively, focused at 120mm depth. b, d and f depict the accumulated energy distribution in the elevational-axial plane of the simulation of  $T_A$ ,  $T_B$  and  $T_{Ref}$ , respectively, focused at 120mm depth.

## Elastography based on ultrasound: qualitative approach

**Objective** is to estimate elasticity in order to provide additional information about hardness of tissues and incorporation of mechanical properties, for instance elasticity, as new feature for lesion characterization.



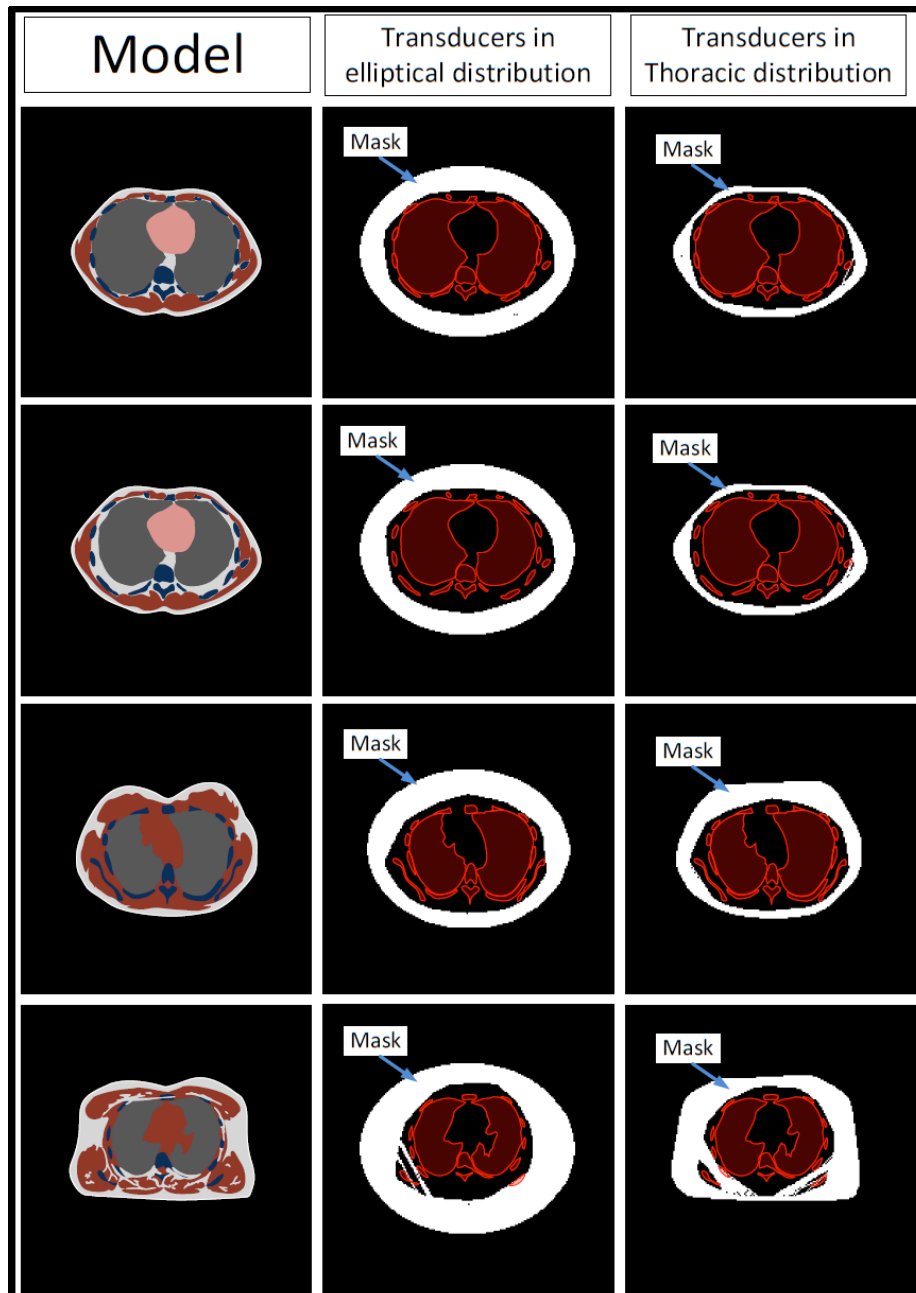
DsC Thesis, Fernando Mitsuyama Cardoso, "Estimation of elastic properties for tissue characterization based on ultrasound images" Programa de Pós-Graduação em Engenharia Elétrica da USP, EPUSP, 24/2/2015, 152 pgs.



## Delineation and detection of structures in distributed ultrasound

**Objective:** Delineation of structures such as lungs region based on distributed ultrasound transducers around the chest.

**Motivation:** improvement of the quality of EIT (*Electrical Impedance Tomography*) reconstruction and others devices that require prior information of internal structures.



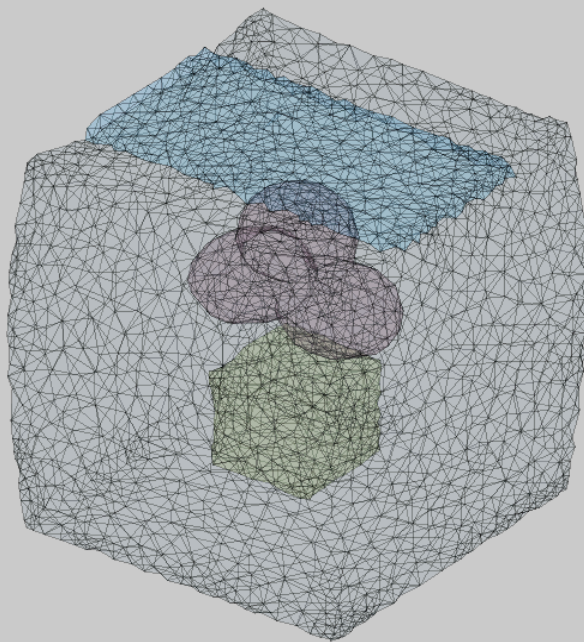
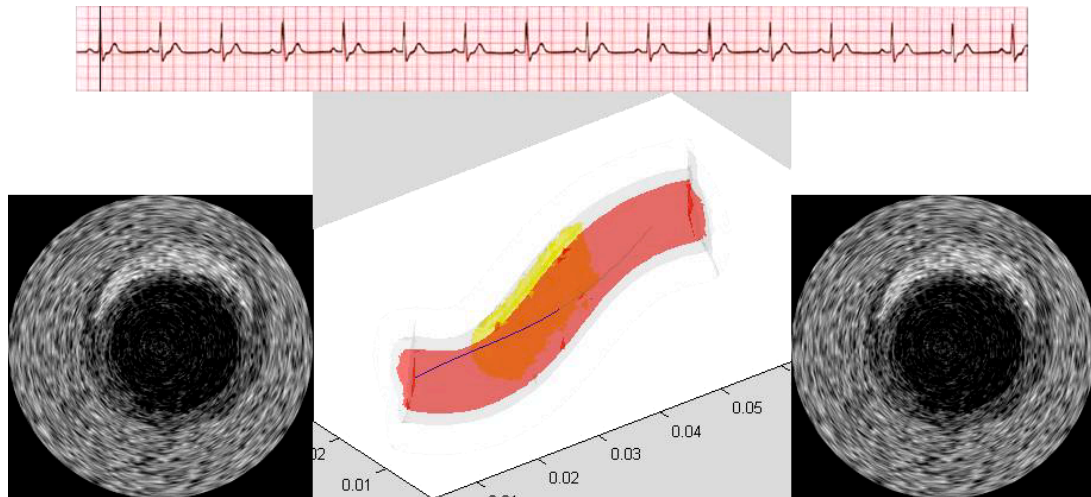
Figure; The white pixels represent a mask generated by our approach. The red regions are the lung and bones localization. The first column shows the simulated models

*Diego Armando Cardona Cardenas and Sergio Shiguemi Furuie. Delimitation of the lung region with distributed ultrasound transducers. Medical Imaging 2016: Ultrasonic Imaging and Tomography, edited by Neb Duric, Brecht Heyde, Proc. of SPIE Vol. 9790, 97901D1-6 · doi: 10.1117/12.2216811*

## Framework for Intravascular Ultrasound (IVUS) Simulation

**Objective:** development of a framework for creating 3D ultrasound numerical deformable phantoms based on Finite Element Method for intravascular applications.

**Motivation:** Intravascular Ultrasound (IVUS) phantoms are important to calibrate and evaluate many IVUS imaging processing tasks. Therefore, we present a framework for creating representative IVUS phantoms, for different intraluminal pressures, based on the Finite Element method and Field II. First, a coronary cross model is selected. Second, the coronary regions are identified to apply the properties. Third, the corresponding mesh is generated. Fourth, the intraluminal force is applied and the deformation computed. Finally, the speckle noise is incorporated. Moreover, the framework toolbox is freely accessible (<http://www.leb.usp.br/IVUSSim/>), and fully implemented in a single platform.

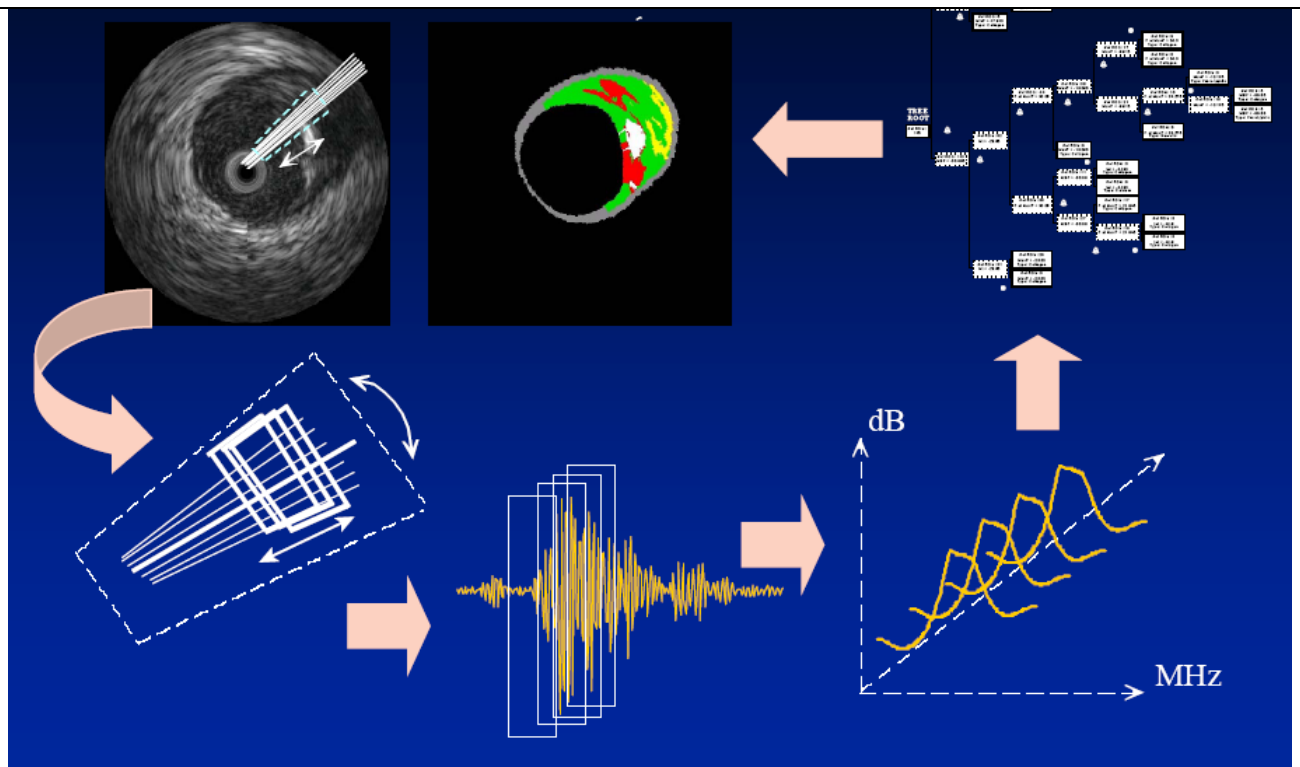
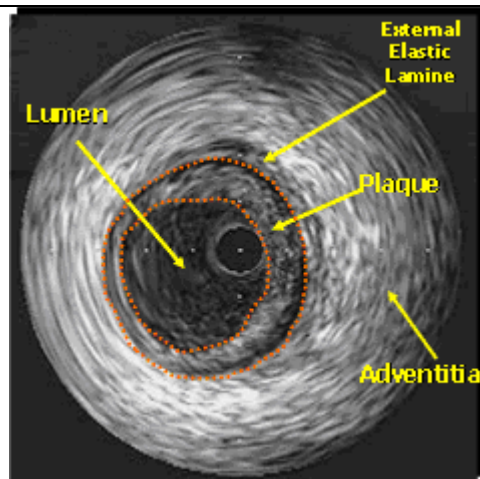


Fernando Mitsuyama Cardoso, Matheus Cardoso Moraes, Sérgio Shiguemi Furuie. Realistic IVUS image generation in Different Intraluminal Pressures, *Ultrasound in Medicine and Biology*, Vol. 38, No. 12, pp. 2104–2119, 2012 pii: S0301-5629(12)00469-3. doi:10.1016/j.ultrasmedbio.2012.08.005.

## Analysis and quantification of Intravascular Ultrasound images (IVUS)

The objective of this project is to characterize coronary lesions based on analysis of intravascular ultrasound (IVUS) images. It involves 3D segmentation of lesions, texture analysis and classification.

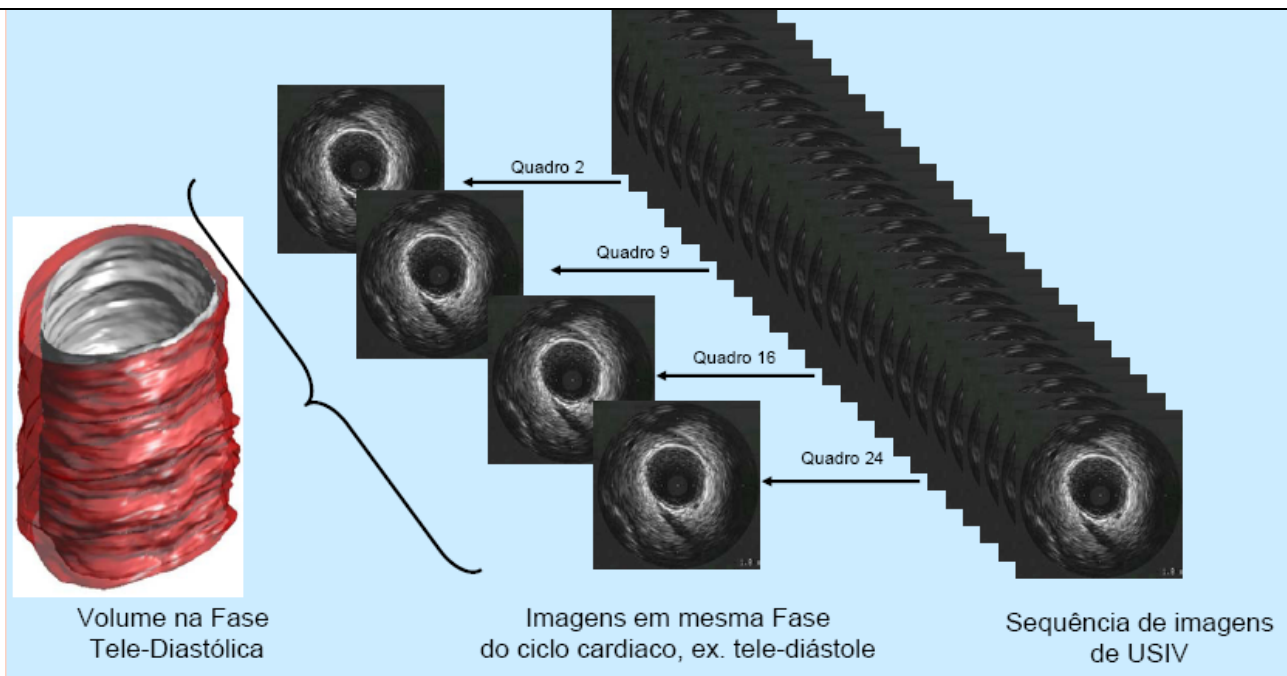
Intravascular structure characterization is the process of plaque composition inference. An approach using invariant features has been investigated. As the atherosclerotic plaque is a three-dimensional object, consecutive frame information are used in the plaque composition identification process. Current techniques are based only in-plane frame attributes.



Fernando J. R. Sales, Breno A. Falcão, João L. A. Falcão, Expedito E. Ribeiro, Marco A. Perin MD, Pedro E. Horta, André G. Spadaro, John A. Ambrose, Eulógio E. Martinez, Sergio S. Furuie, Pedro A. Lemos. Evaluation of Plaque Composition by Intravascular Ultrasound "Virtual Histology": Impact of Dense Calcium on the Estimation of Necrotic Tissue. *EuroIntervention Journal*, ISSN 1969-6213 – Print, v6(3):394-399

## Coronary contraction analysis based on 4D-IVUS

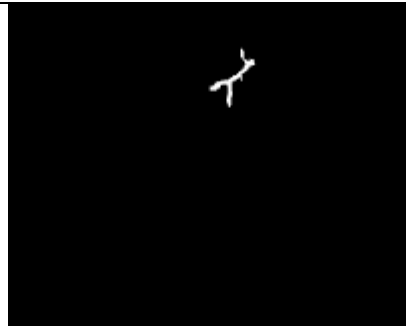
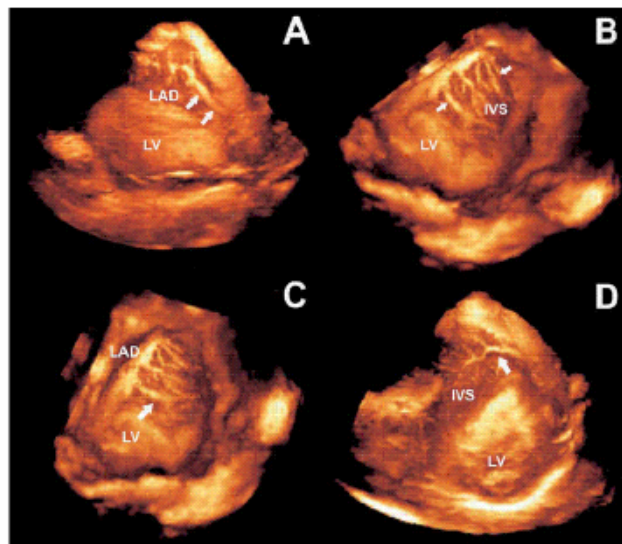
The aim of this project is the analysis of coronary contraction. Conventional IVUS (intravascular ultrasound) with continuous pullback provide 4D data, but without correct spatial localization. We propose to reconstruct tomographic IVUS image without heart movement artifact for different phases. Moreover, the time synchronization will depend only on the images, and will preserve 4D information. Thus it involves: a) determining images (3D structures) from IVUS sequence that belong to the same phase within the cardiac cycle; b) spatial registration of 3D coronaries; c) 3D interpolation; d) contraction analysis.



M M S Matsumoto, Fernando Mitsuyama Cardoso, P Lemos, S S Furuie "Coronary 3D reconstruction using IVUS images only: a numeric phantom framework." Medical Imaging 2010: Ultrasonic Imaging, Tomography, and Therapy, edited by Jan D'hooge, Stephen A. McAleavey, Proc. of SPIE Vol. 7629, 762915

## Visualization and segmentation of coronary arteries in microbubble contrasted 3D Echocardiographic images

The improvement in micro bubble contrasted images in three-dimensional Echocardiography has created new opportunities for non-invasive and relatively inexpensive exams. This objective of this project is the visualization of the 3D coronary tree in a simpler and non-invasive form. There are several challenges such as: a) high noise and natural degradation of the images; b) dynamic nature of the structures; c) poor contrast. The main approach is based on modified version of fuzzy connectedness algorithm.



**Team:** S S Furuie, J M Tsutsui (InCor)



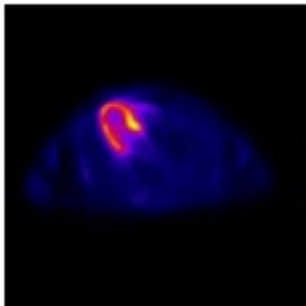
## Algorithms for tomographic reconstruction: optimization

The main objective of this project is to sum up efforts and knowledge of several groups that have been working with different aspects of tomography. The investigations basically include: a) practical and new optimized reconstruction algorithms; b) alternative image restoration algorithms; c) robust volume quantification and segmentation processes; and d) clinical applications.

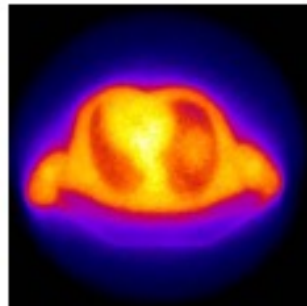
Specific objectives are:

- Research, development and implementation of efficient reconstruction algorithms (2D and 3D) for Nuclear Medicine, aiming the reduction of absorbed doses as well as the image acquisition and processing time;
- Research of methods for quantitative tomographic reconstructions in Nuclear Medicine dealing with correction/compensation and restoration of images;
- Research on truly 4D reconstruction algorithms for dynamic structures;
- Research, development and evaluation of the whole reconstruction process, including restoration and quantification, through physical and numerical simulation in 2D, 3D and 4D;

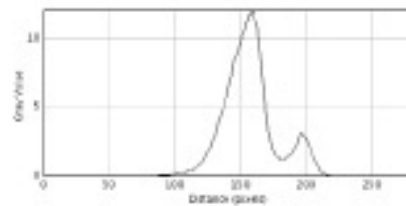
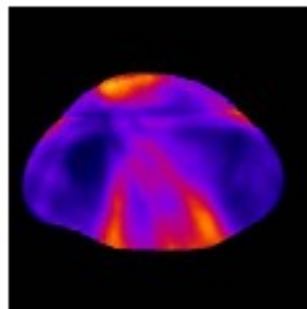
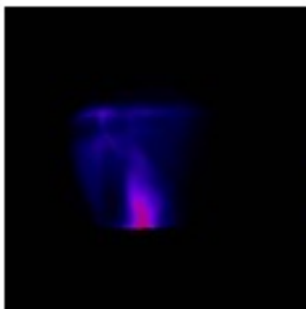
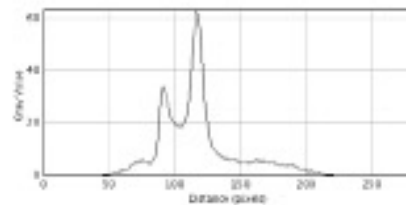
ATIVIDADE



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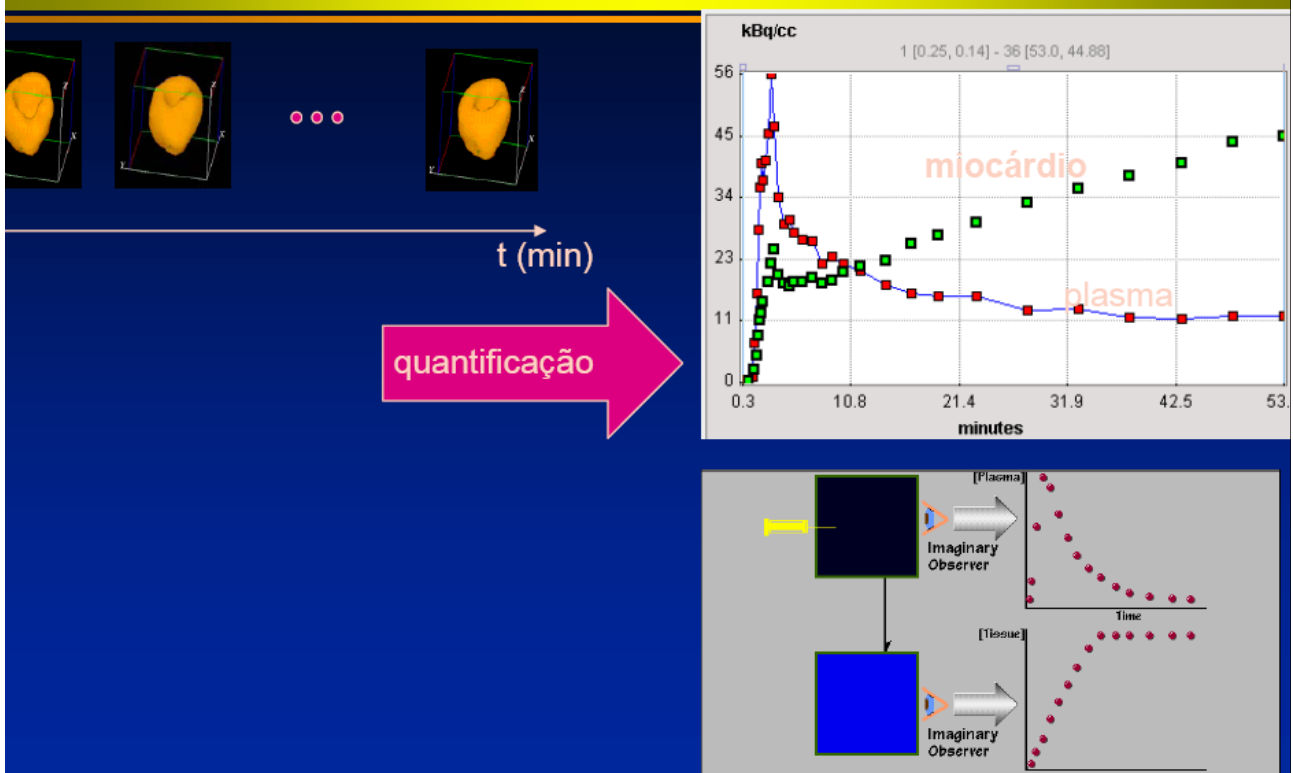
*Sergio S Furuie. SIMULTANEOUS ACTIVITY AND ATTENUATION RECONSTRUCTION IN PET: APPLYING PARTIAL KNOWN ATTENUATION. Medical Imaging 2009: Physics of Medical Imaging, edited by Ehsan Samei, Jiang Hsieh. Proc. of SPIE vol. 7258, 72582F-1 a 72582F-6. DOI: 10.1117/12.811041.*



## Model identification and analysis in dynamic PET

Analysis in dynamic PET (Positron Emission Tomography) deals with estimation and quantification of parameters for compartmental and non compartmental models. The main topics are related to: input curves, image derived input functions, myocardial metabolic rates of Glucosis, image processing and regions of interest. In a specific approach, an alternative way to assay a noninvasive input function using image derived input functions will be considered.

### Modelagem do comportamento dinâmico



$$C_1(t) = K_1 \cdot e^{-(k_2+k_3) \cdot t} \otimes C_a(t)$$

$$C_2(t) = \frac{K_1 \cdot k_3}{k_2 + k_3} (1 - e^{-(k_2+k_3) \cdot t}) \otimes C_a(t)$$

$$C_1(t) + C_2(t) = C_T(t) = \frac{K_1}{k_2 + k_3} [k_3 + k_2 \cdot e^{-(k_2+k_3) \cdot t}] \otimes C_a(t)$$

Edward Florez Pacheco, Henrique da Fonseca, Vani Vijayakumar, Sergio Shiguemi Furui. Framework to quantify the metabolic rate in the heart using Monte Carlo simulation and Compartment Modeling, *Computing in Cardiology 2015*; 42:349-352, ISSN 2325-8861, 6-9set 2015, Nice, France. DOI: 10.1109/CIC.2015.7408658

## IVOCT: neointima estimation

**Objective:** robust approaches to estimate neointima growth in coronaries, based on IOCT images (Frequency Domain Intravascular Optical Coherence Tomography).

**Motivation:** quantitative follow up of accumulated tissue over the stent (neointimal tissue). It involves segmentation of the lumen and stented area, which is usually done manually by a specialist. We propose two optimal strategies (ellipse fitting algorithm and cylinder fitting algorithm) that are robust even with false positives and false negatives detection of stent struts.

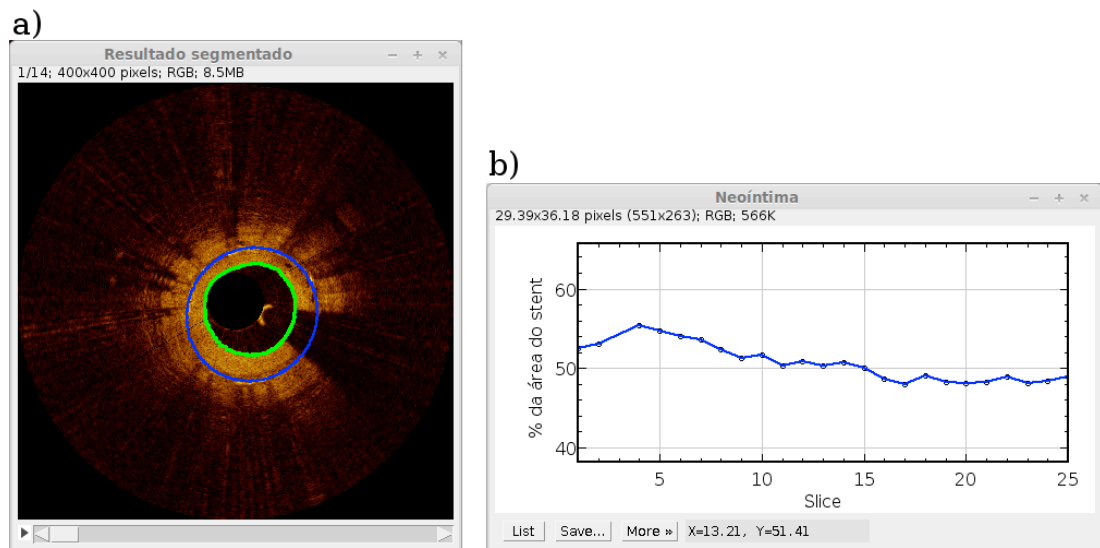
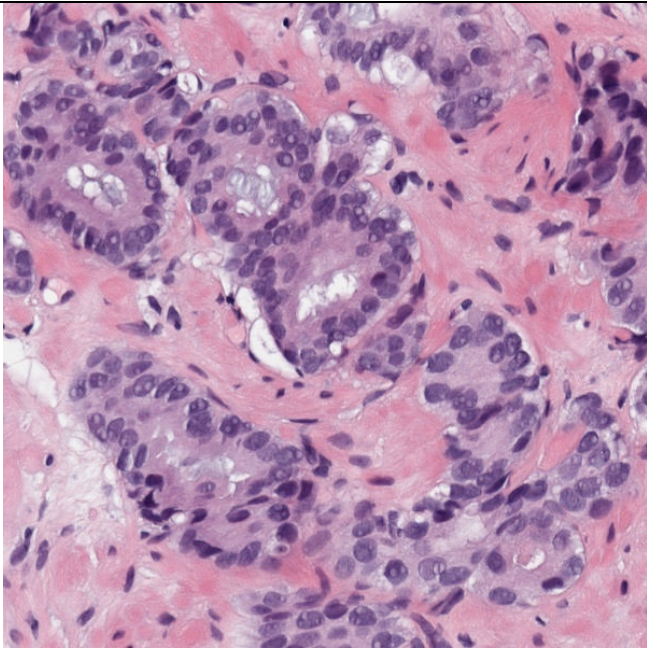


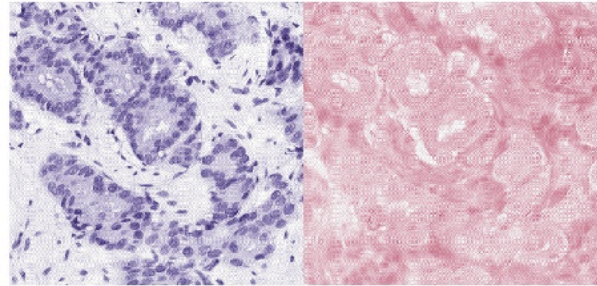
Figure: (a) Lumen contour in green and stent line estimation in blue. (b) Plot of neointima area percentage considering all slices of a set of 25 images.

## Evaluation of colour deconvolution in histological images with H&E

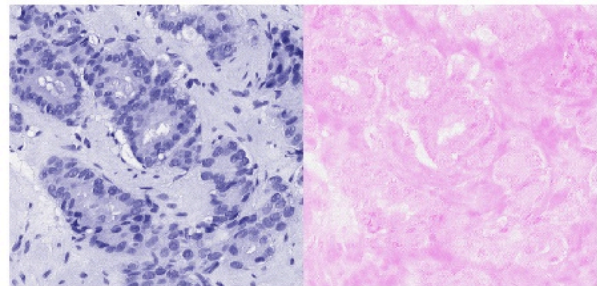
Implementar e comparar quantitativamente resultados de diferentes métodos de separação de corantes



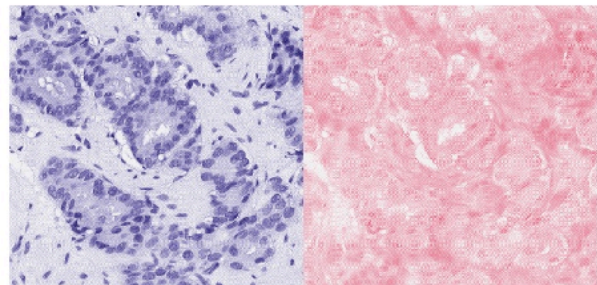
Macenko



Ruifrok



Rabinovich



*Juliana Cesaro, Sergio Shiguemi Furuie, Filippo Molinari. "Stain separation of histological slides". Anais do VII SIIM/VI SPS (Simpósio de Instrumentação e Imagens Médicas / Simpósio de Processamento de Sinais), Campinas, 21 a 23 de outubro de 2015*

## Restoration and calibration of images in teledermatology

**Objective:** image quality restoration for teledermatology.

**Motivation:** Due to the major expansion of information systems and the utilization of photographic cameras, teledermatology has become a growing option, especially in places of difficult access. However, the increase in its range is hampered by the low fidelity of the acquired image in relation to an in-person consultation. In this manner, a system comprised of a physical device and a software was developed in order to calibrate perspective and colors, in addition to correct possible resolution problems in skin images. An improvement in 85% in colors was obtained, with average values under the limit of visual perception, besides approximately 12% of improvement in resolution using the 1-SSIM metric.

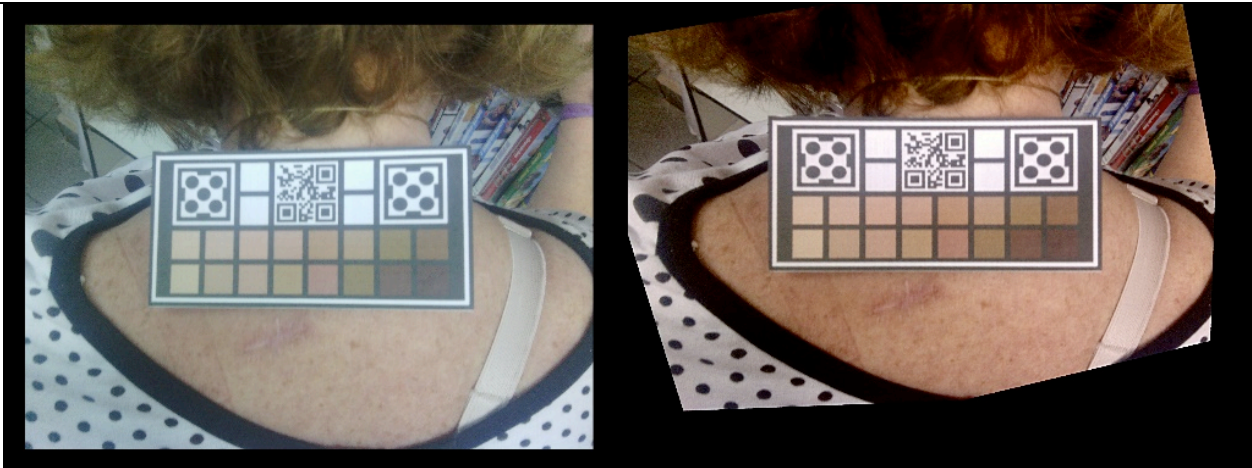
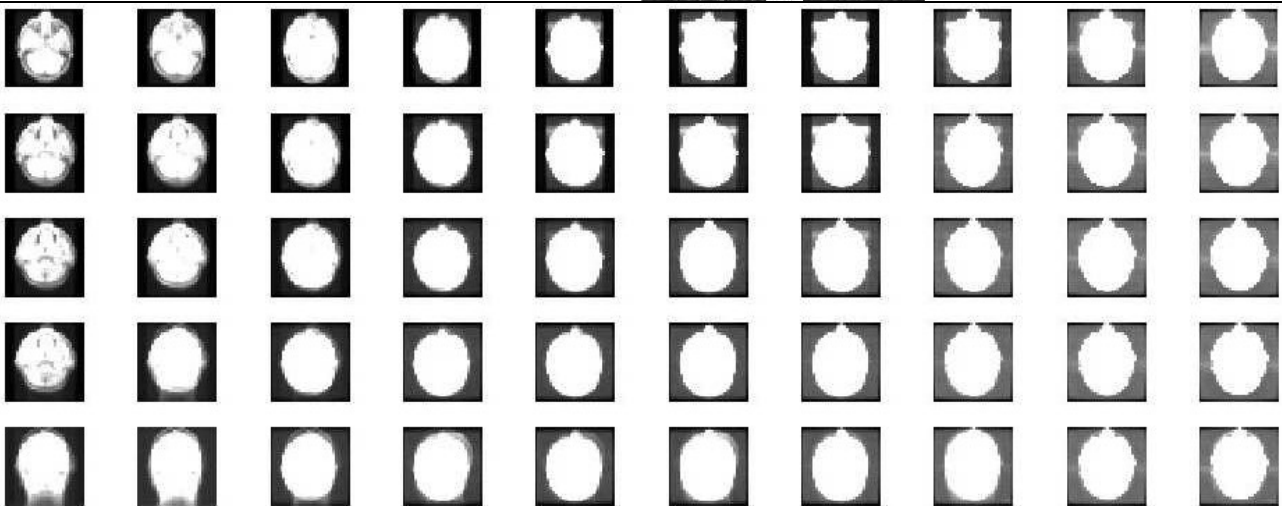
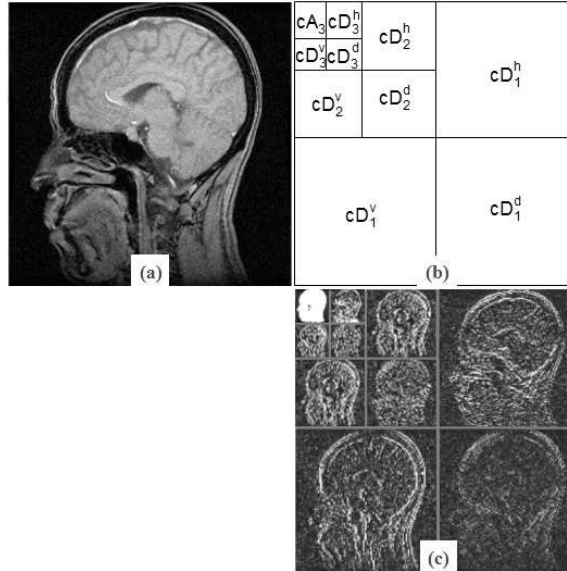


Figure. Left, acquired image with calibration device; right, restored image.

*Y. V. Tessaro, S. S. Furuie. METODOLOGIA PARA CALIBRAR E RESTAURAR IMAGENS EM TELEDERMATOLOGIA . XXV Brazilian Congress on Biomedical Engineering – CBEB 2016, pg. 983-986*

## Medical image categorization based on wavelet transform and self-organizing map

Images are fundamental data source in modern medicine. These can support doctors and students in diagnostic decisions and provide research and didactic material. The images stored in a database according with categories are an important step for data mining and content-based image retrieval (CBIR). This work addresses a CBIR methodology involving: a) discrete wavelet transform to characterize images; b) Self-Organizing Map (SOM) neural networks to cluster the classes; c) and SOM classification of medical images. This datamining methodology can be used in categorization and diagnostic decision aid.



**Team:** S S Furuie, R A Moreno (InCor), E Del-Moral-Hernandez (EPUSP).