

Chair of Informatics and Computational Sciences



The Future of the Personalized Digital Patient

Nicholas Ayache

24 June 2014

Collège de France



The Personalized Digital Patient
Images, Medicine and Informatics



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Warning

« prediction is very difficult,
especially when addressing the
future »



Niels Bohr



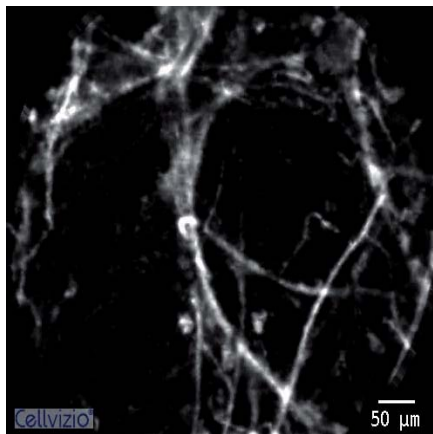
Woody Allen

1. More Images and Signals

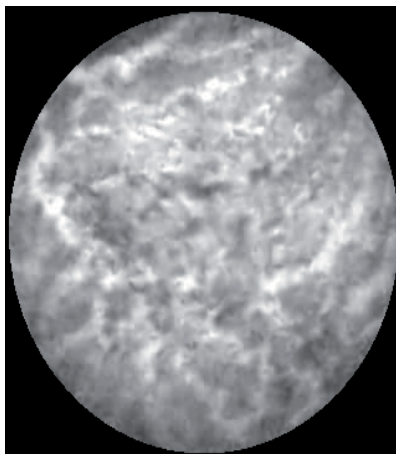
- Evidence based medicine
- Overflow of information
 - requires computer-assisted extraction of *clinically useful* information
- New modalities to be invented and to cover all scales (*nano-micro-meso-macro*)

Living Cells

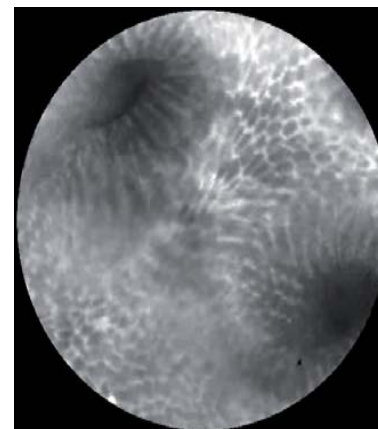
alveoli



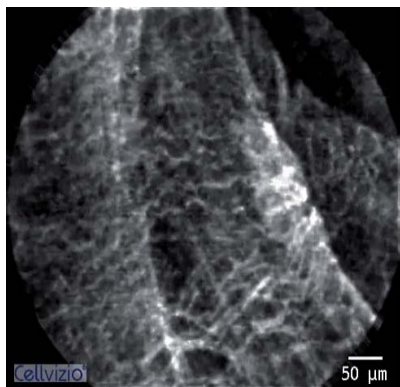
pancreas



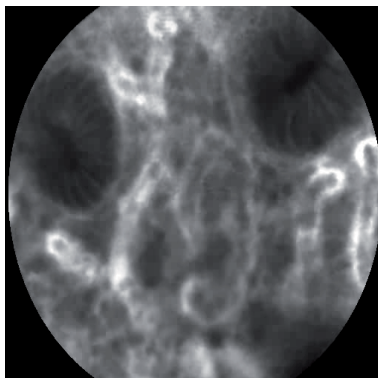
Stomach



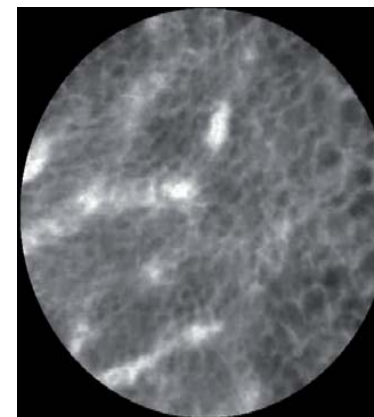
bronchi



small bowel



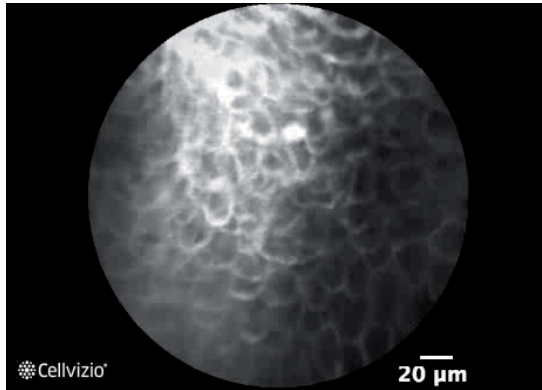
bladder



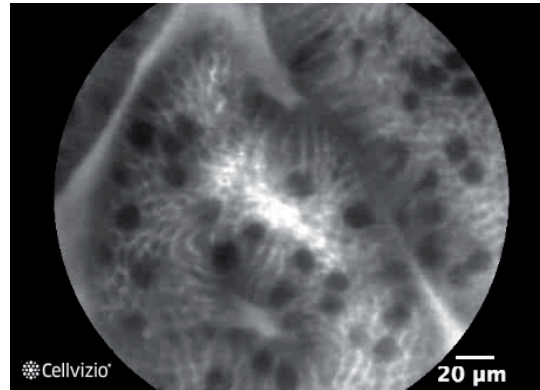
Cellvizio, Mauna Kea Technologies

Progression of Cancer

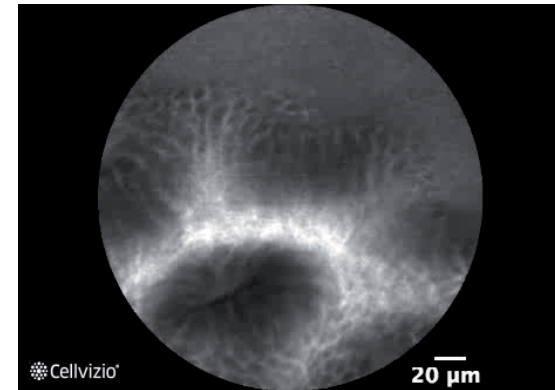
Barrett's esophagus



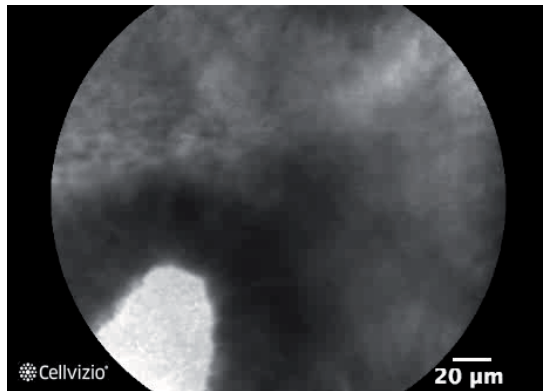
normal epithelium



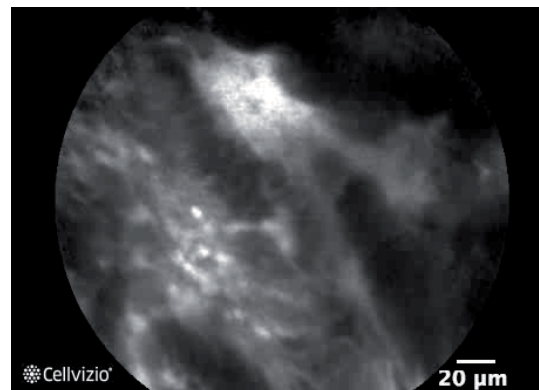
metaplasia



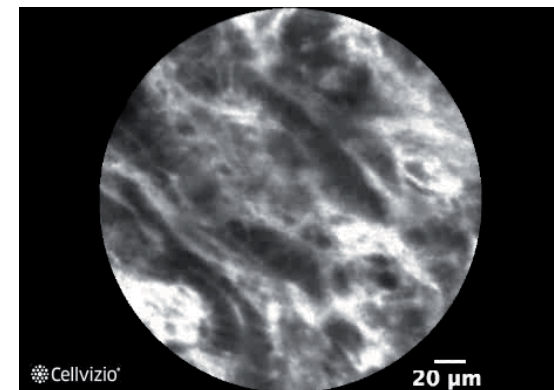
metaplasia



metaplasia



dysplasia



cancer

Cellvizio, Mauna Kea Technologies

More Images

- Confocal Endomicroscopy
- Optical Coherence Tomography
- Elastography (MRI, US, etc.)
- MRI
 - High field (3-12T), spectroscopy, thermometry, diffusion, perfusion, etc.
- Mapping electric/magnetic fields
- Theranostic imaging
 - HIFU (High Intensity Focused Ultrasounds)
 - Nano-vectors (contrast + drug)



Supersonic Imagine



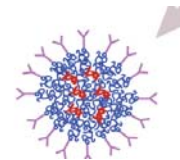
IHU Bordeaux



SiliconAngle

ECG, pression, oxygenation

T. Baumert



2. Progress of Technology

- Power of computers
 - Moore's law: x2 (18 months)
 - x1000 (15 yrs),
 - x1.000.000 (30 yrs)...
 - **2014** : **Tihane 2** : 35 millions of billions of operations/sec
 - 3 million times faster than Deep Blue (1997)
 - **2019** : exaflop : 1 billions of billions of operations/sec
 - **2034** : zetaflop : 1000 billions of billions of operations/sec

L. Alexandre, Le Monde 12 Feb 2014

Visualization



From Medical Images to
Computational Medicine

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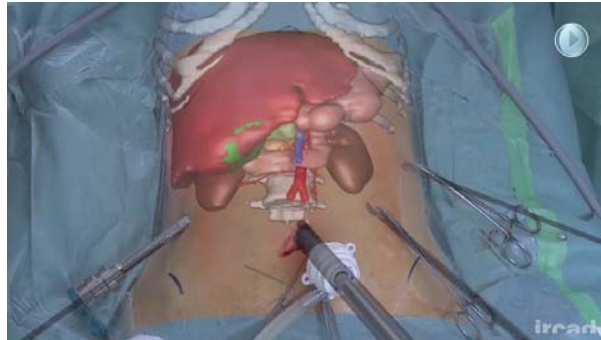
Robots

Surgical Robot



Da Vinci

Nicholas Ayache
24 June 2014



Augmented Reality



Imaging Robot



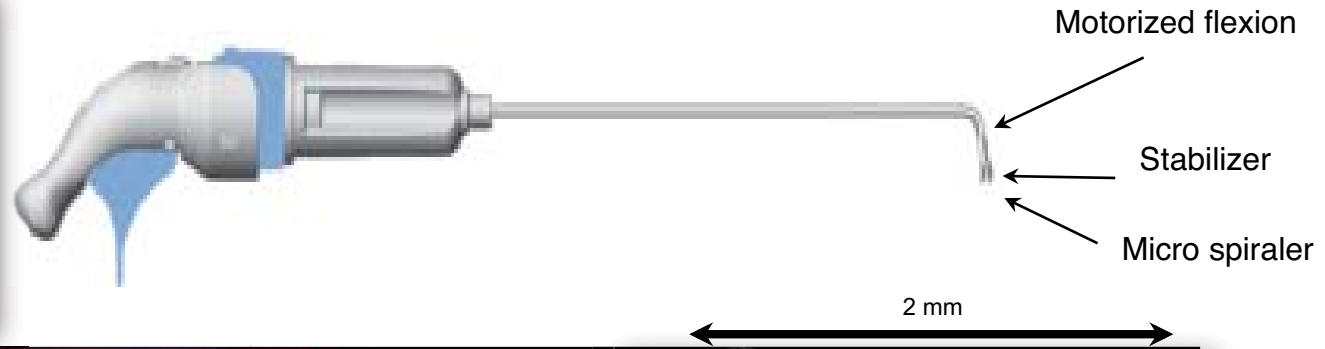
Zeego

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Robotized Fibroscope



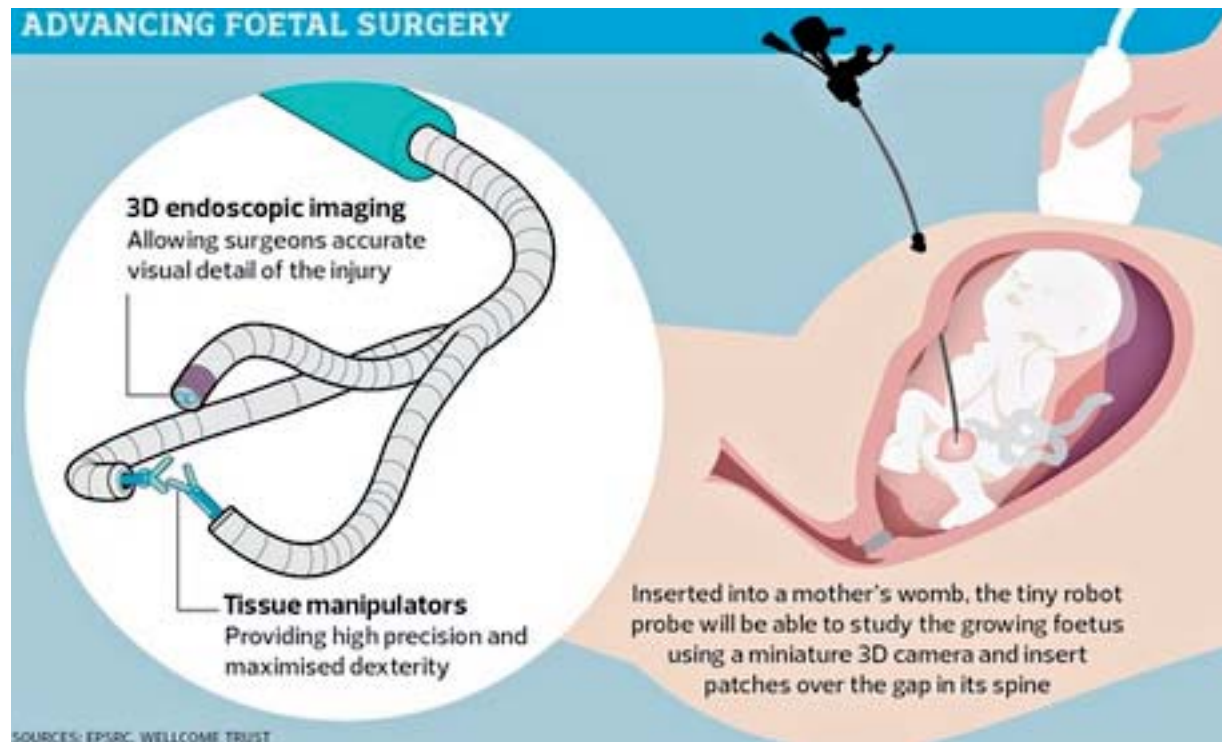
Perseus Project

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Computational Medicine



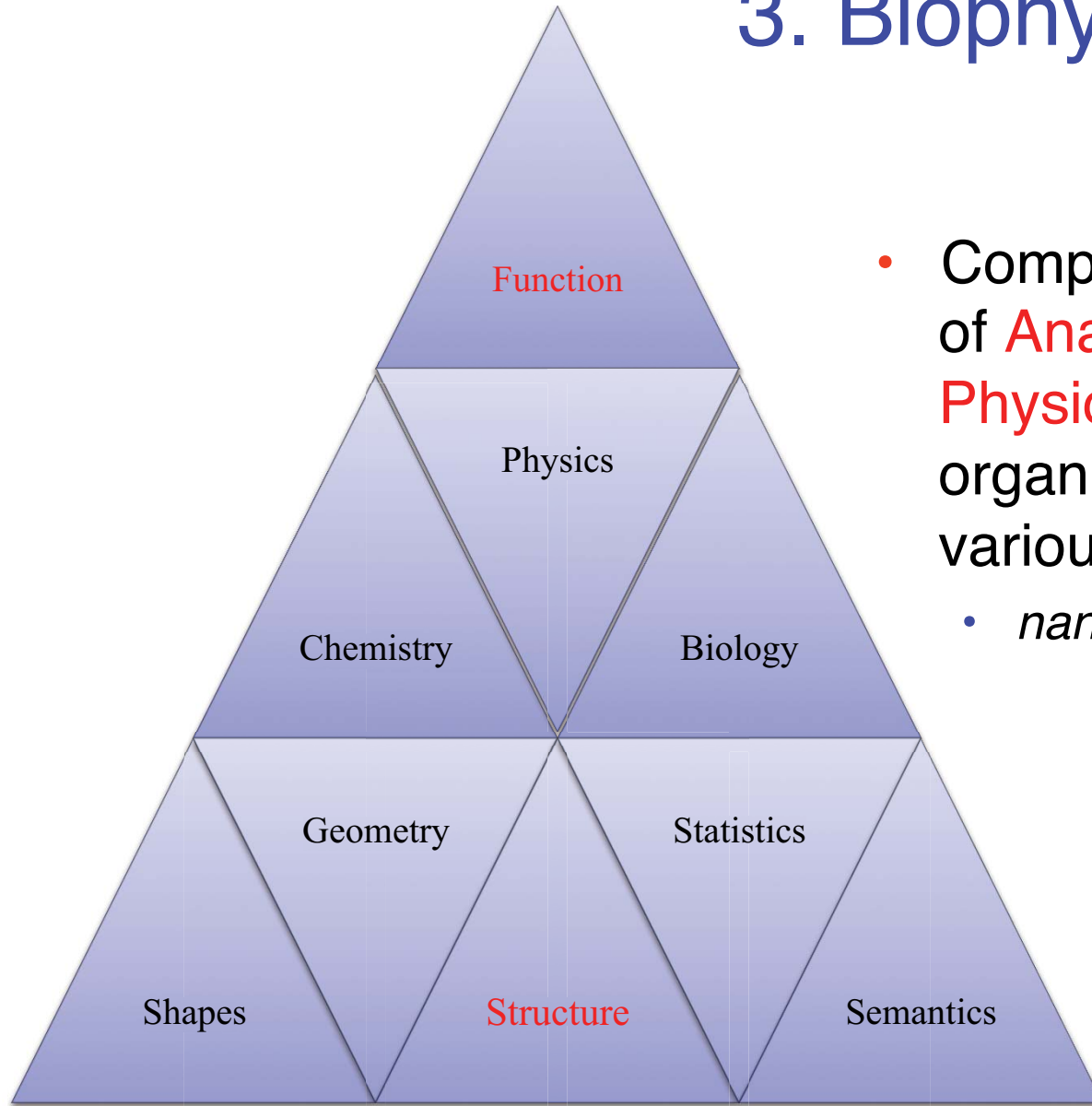
Robotized Fetal Surgery guided by endoscopic imaging



The Observer 31 May 2014

PI : Sebastien Ourselin (UCL)

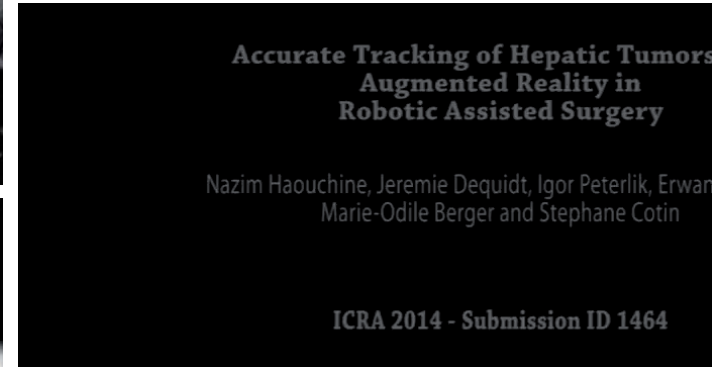
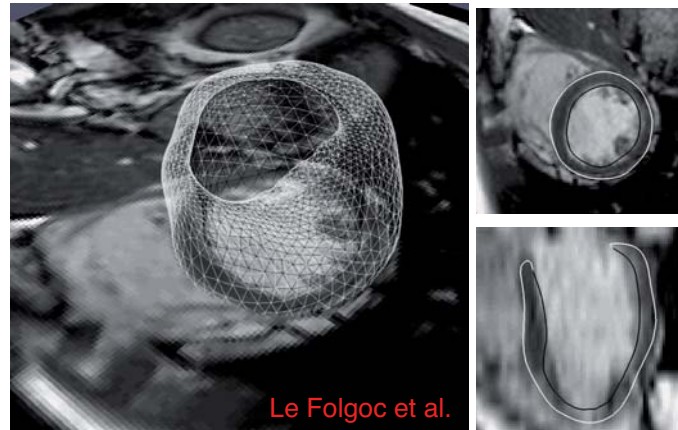
3. Biophysical Models



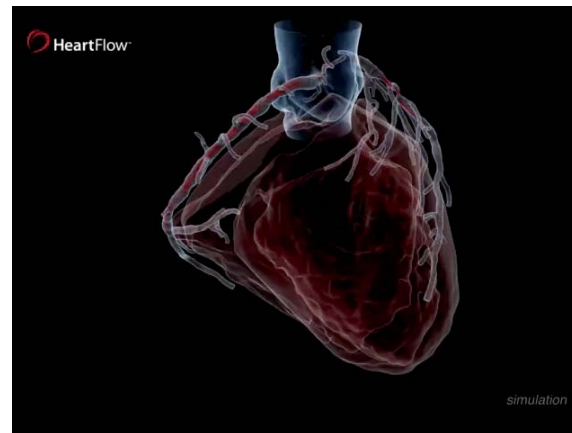
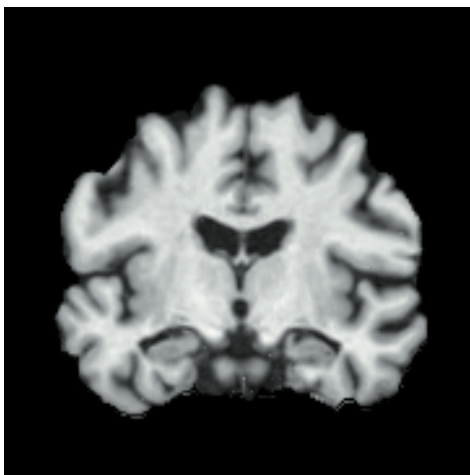
- Computational models of **Anatomy** and **Physiology** of the organ systems at various scales
 - *nano-micro-meso-macro*



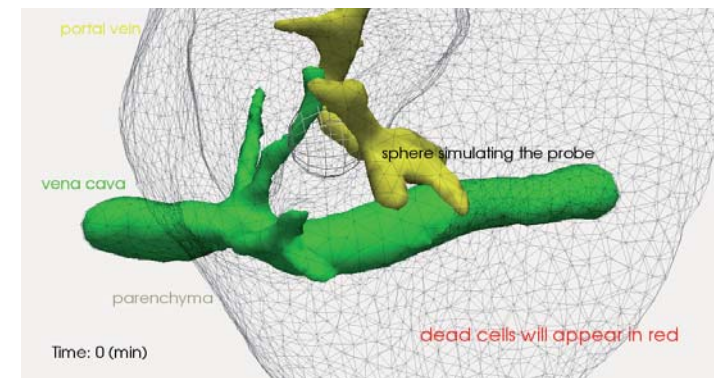
4. Personalization with Images and Signals



Cotin et al.



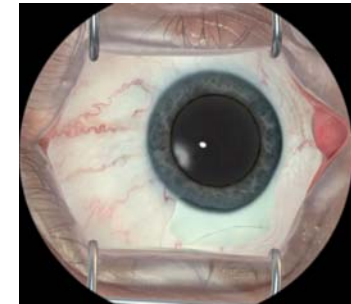
Lorenzi et al.



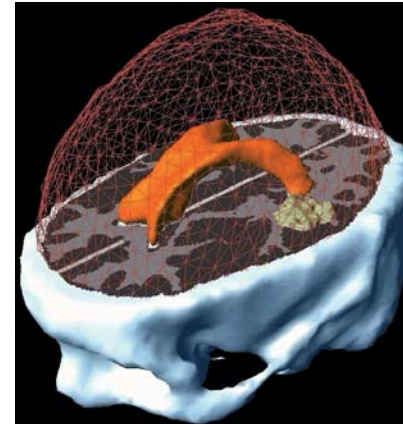
Audigier et al.

5. Biophysical Simulation

- A new pillar for research
 - understand, predict
 - plan, optimize



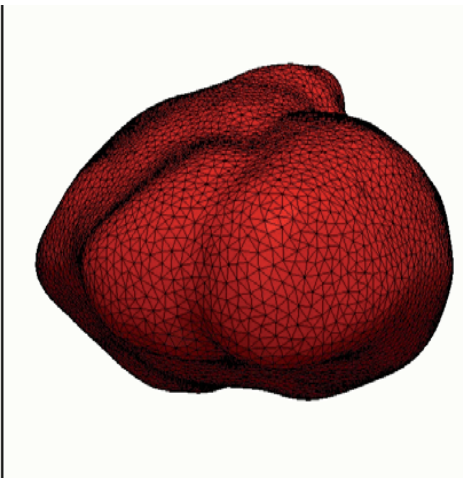
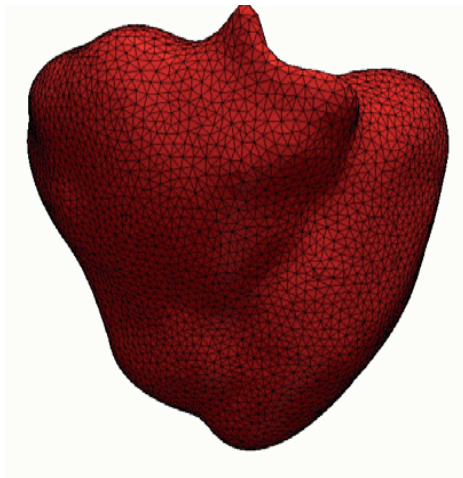
HelpMeSee



Clatz et al.



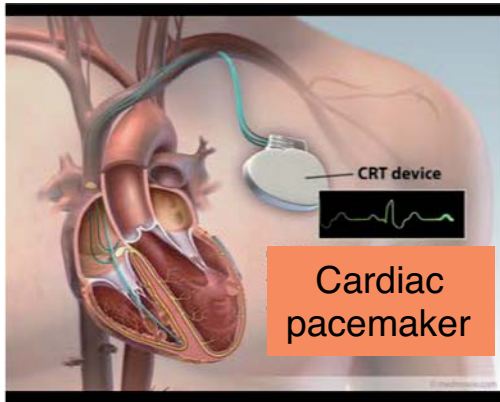
Forest et al.



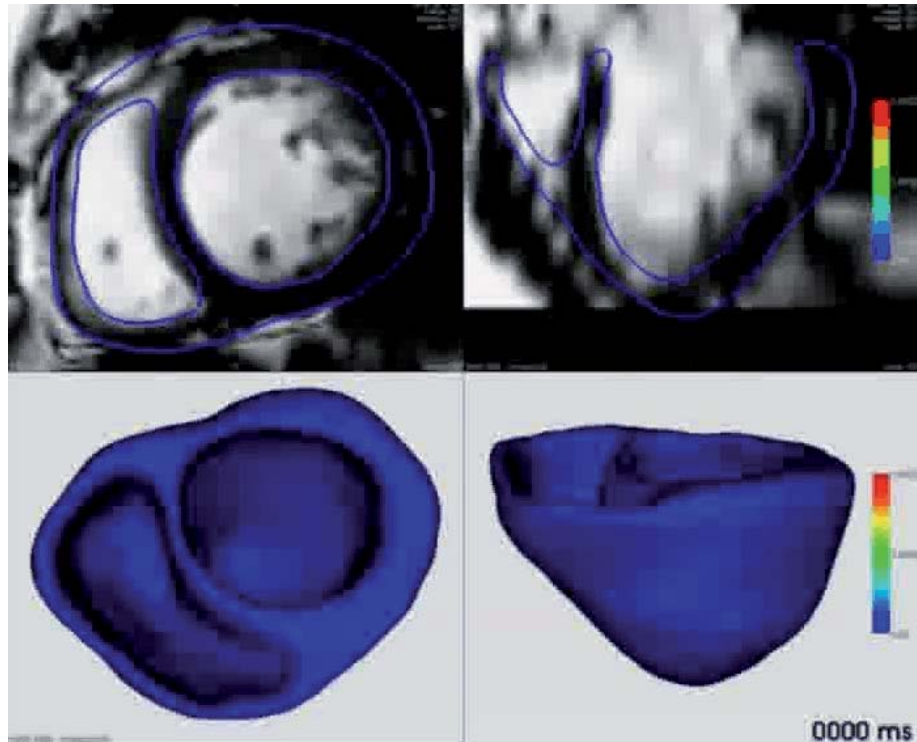
Marchesseau et al.



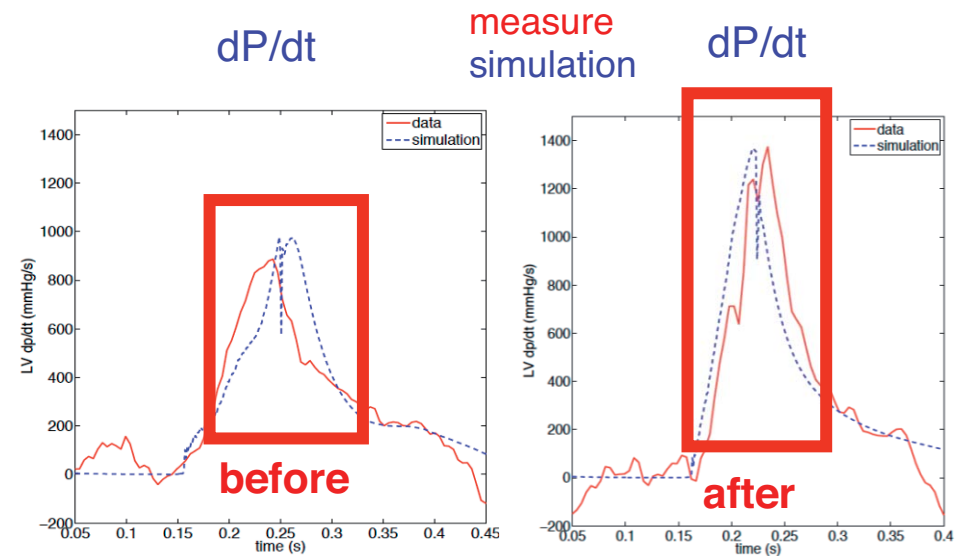
Talbot et al. 2014



Predicted Resynchronization



Left bundle branch block



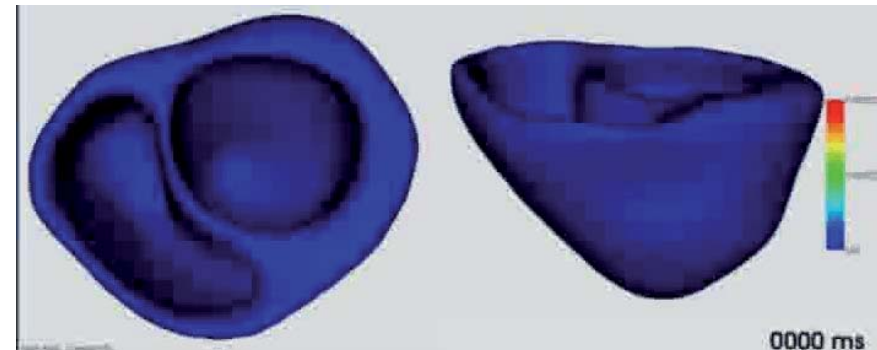
dP/dt

measure
simulation

dP/dt

before

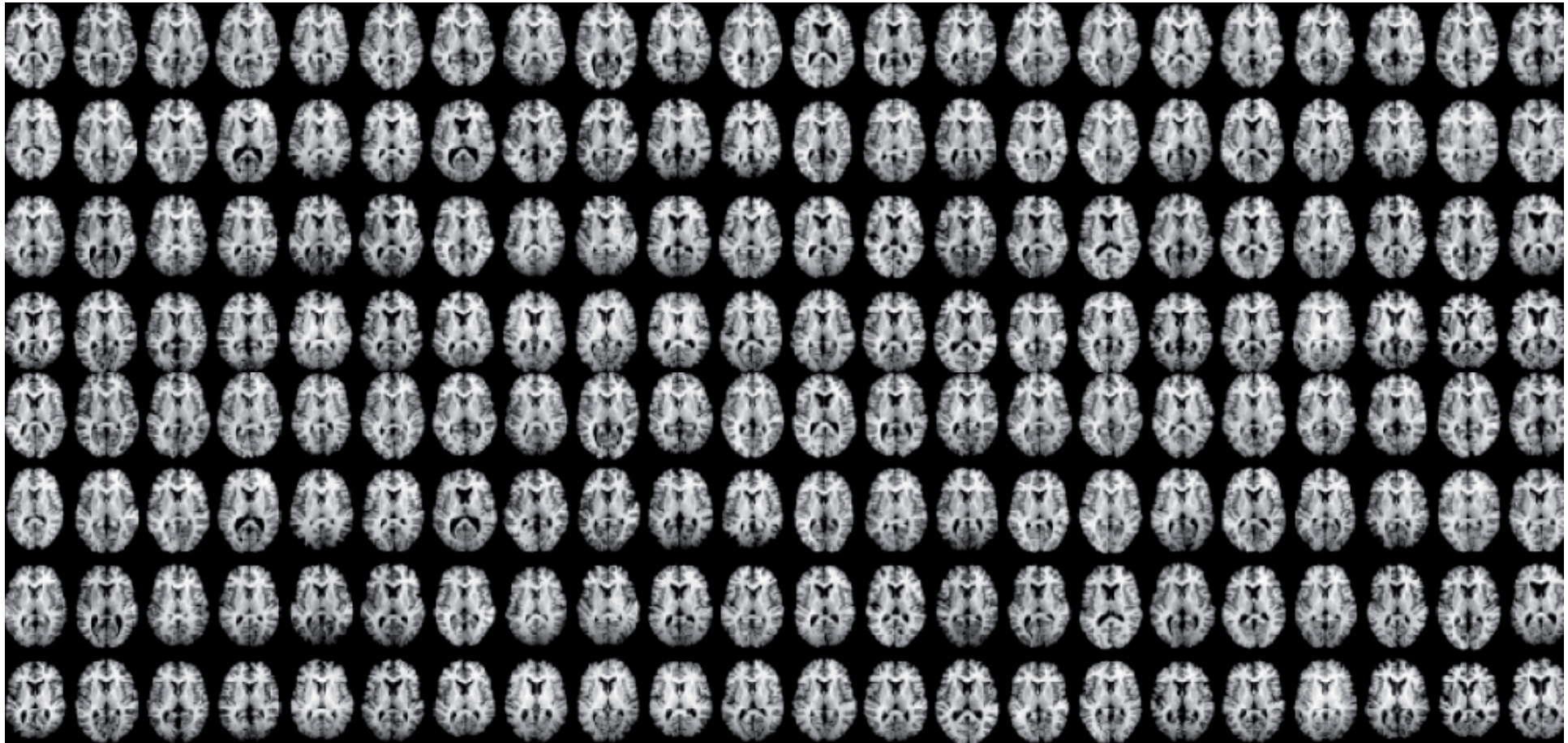
after



Simulated resynchronization

M. Sermesant, F. Billet, R Chabiniok, T Mansi, P Chinchapatnam, P Moireau, JM Peyrat, K Rhode, M Ginks, P Lambiase, S Arridge, H Delingette, M Sorine, A Rinaldi, D Chapelle, R Razavi, N Ayache, *Personalised Electromechanical Heart Model for Prediction of Acute Effects of CRT*, Medical Image Analysis 2012

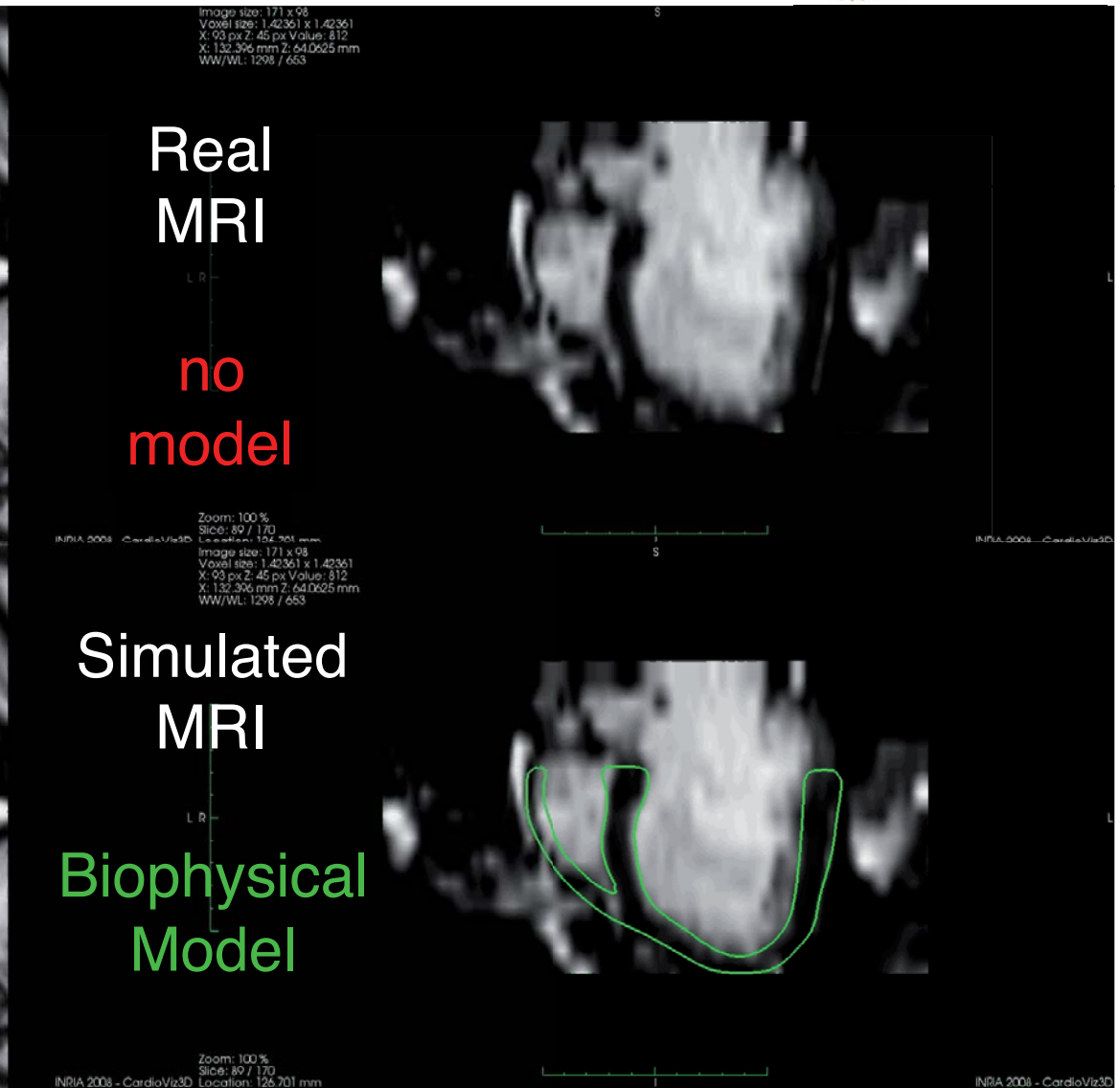
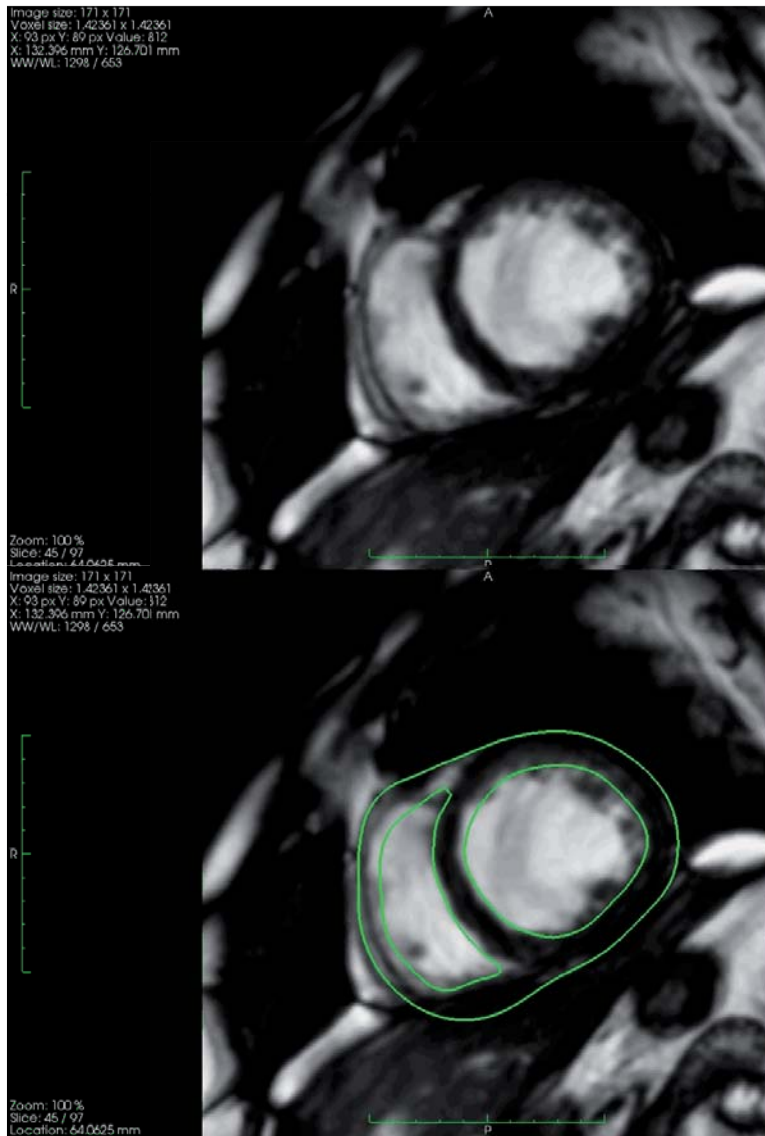
6. *Bigger Data*



6. *Bigger Data*

- Very large databases of images available on the web with attached expertise
 - *ADNI, OASIS, CATI, NIH, Creatis,...*
 - *Challenges MICCAI, etc.*
- Augmented by data simulated with biophysical models

Simulate Cardiac MRI



Prakosa, Sermesant, Allain, Villain, Rinaldi, Rhode, Razavi, Delingette, Ayache, IEEE TBME 2013

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24 June 2014

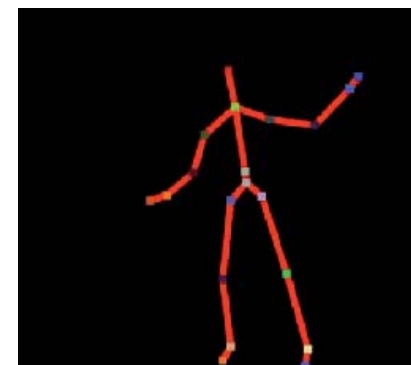
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7. More Machine Learning

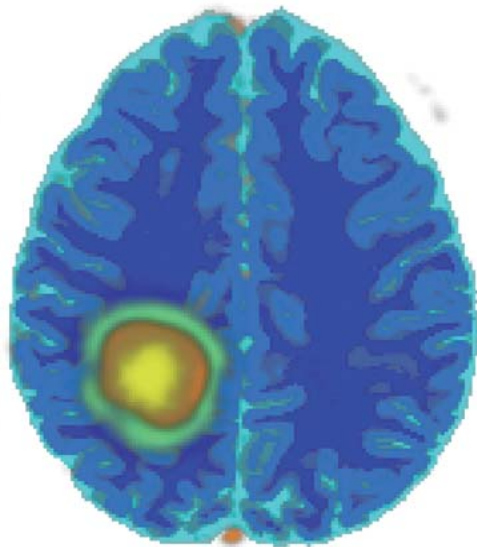
- Training on very large databases
 - Real and synthetic (cf. Kinect)



Shotton et al., 2011

Simulate, Learn & Predict

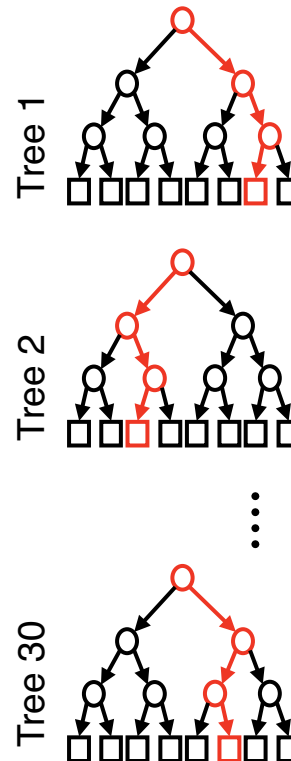
Simulated tumor growth



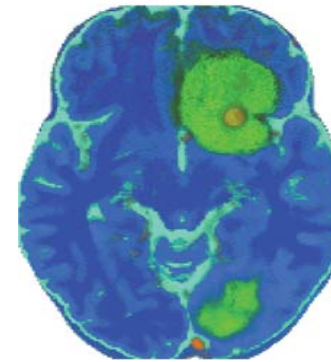
- Grey matter
- White matter
- LCR
- necrosis
- vessels
- œdema

Univ Utah
Microsoft Research

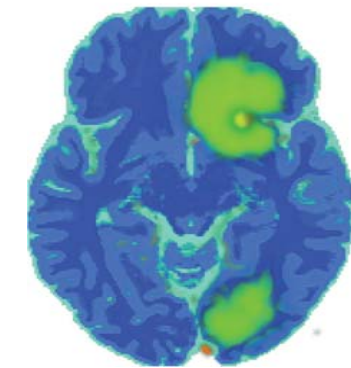
Statistical Learning



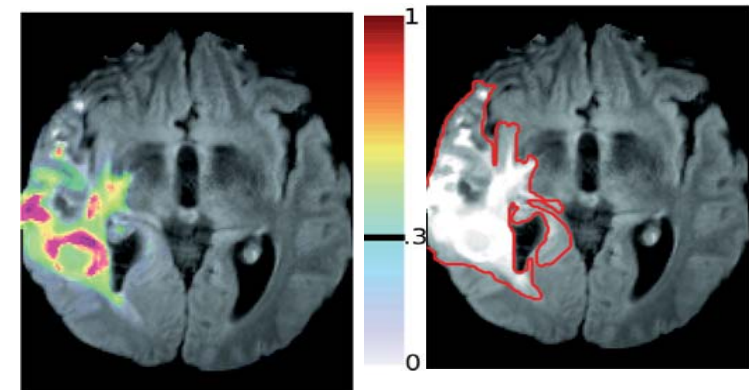
Tumoral cell density



prediction



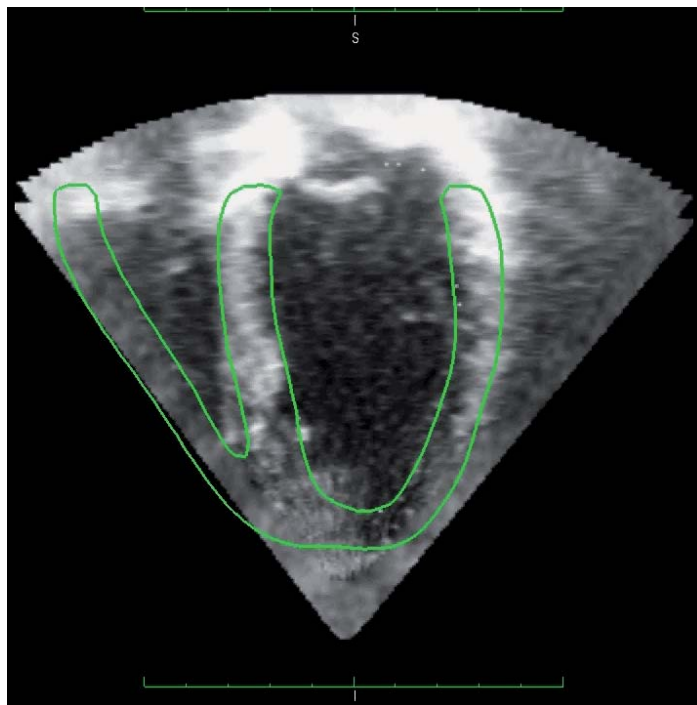
ground truth



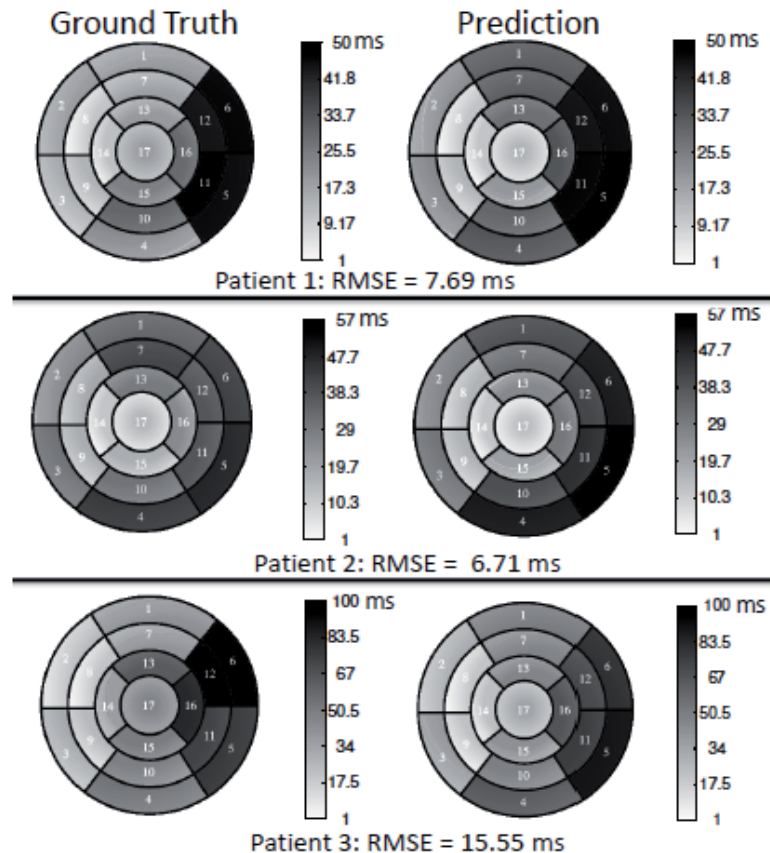
E Geremia, B H. Menze, M Prastawa, MA Weber, A Criminisi, and N Ayache. *Brain tumor cell density estimation from multi-modal MR images based on a synthetic tumor growth model*. In MICCAI Workshop on Medical Computer Vision, LNCS, 2012.

Simulate, Learn & Predict

- Predict depolarization time from observed motion in real and simulated images



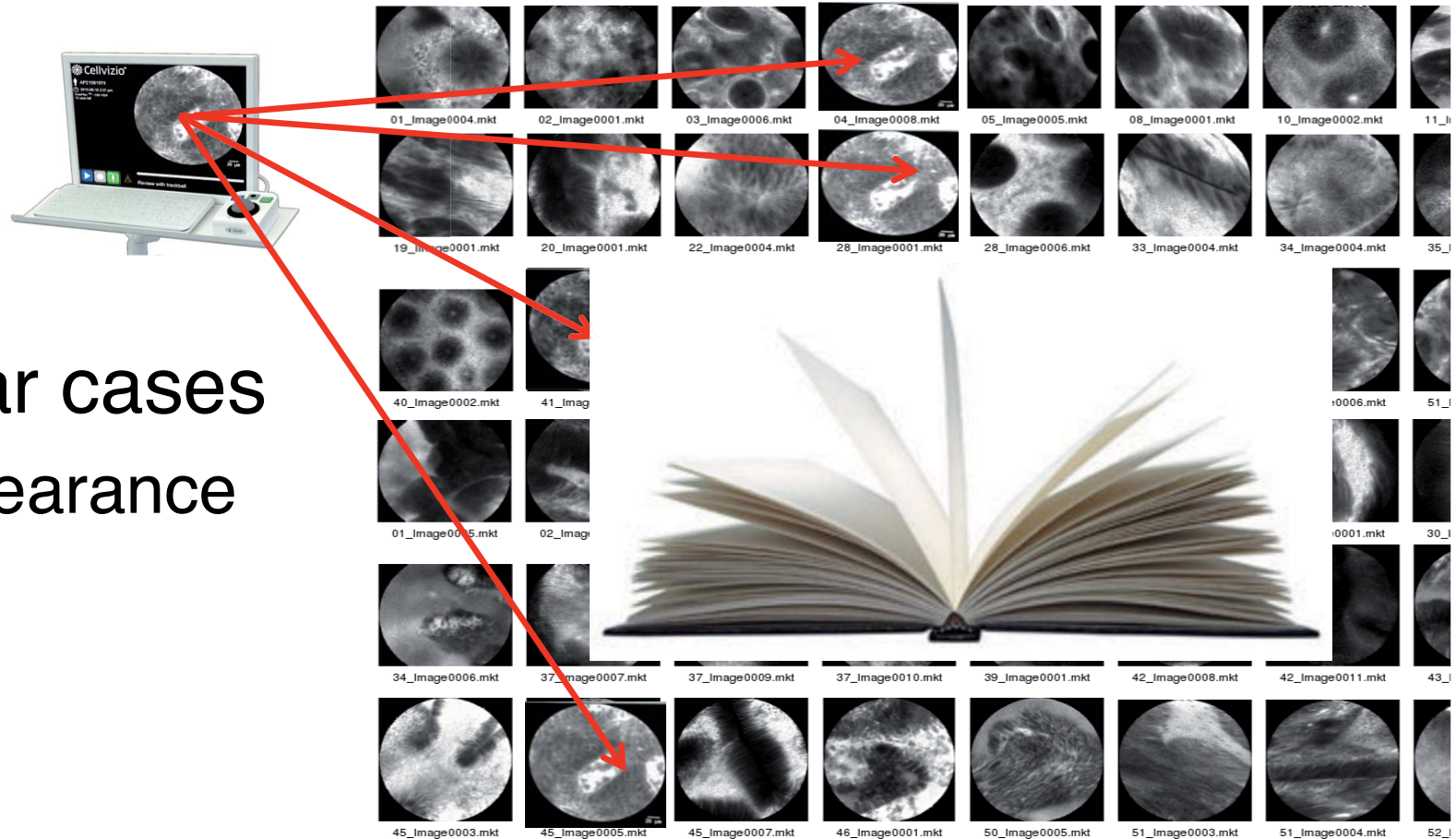
Depolarization time



A Prakosa, M Sermesant, P Allain, N Villain, C Rinaldi, K Rhode, R Razavi, H Delingette, N Ayache, IEEE Tr Biomedical Engineering 2013

8. Smart Atlases

Images & expertise

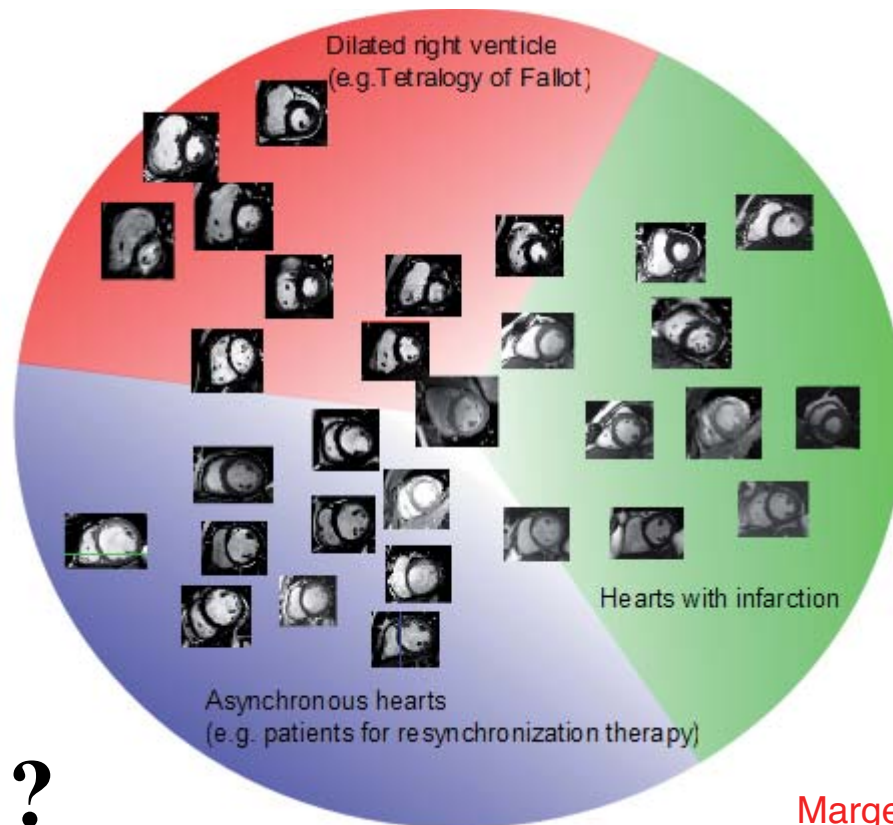
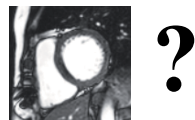


- Similar cases
 - appearance

M Kohandani, André et al., MICCAI 2014

Smart Atlases

- Similar cases
 - appearance
 - shape
 - motion
 - evolution

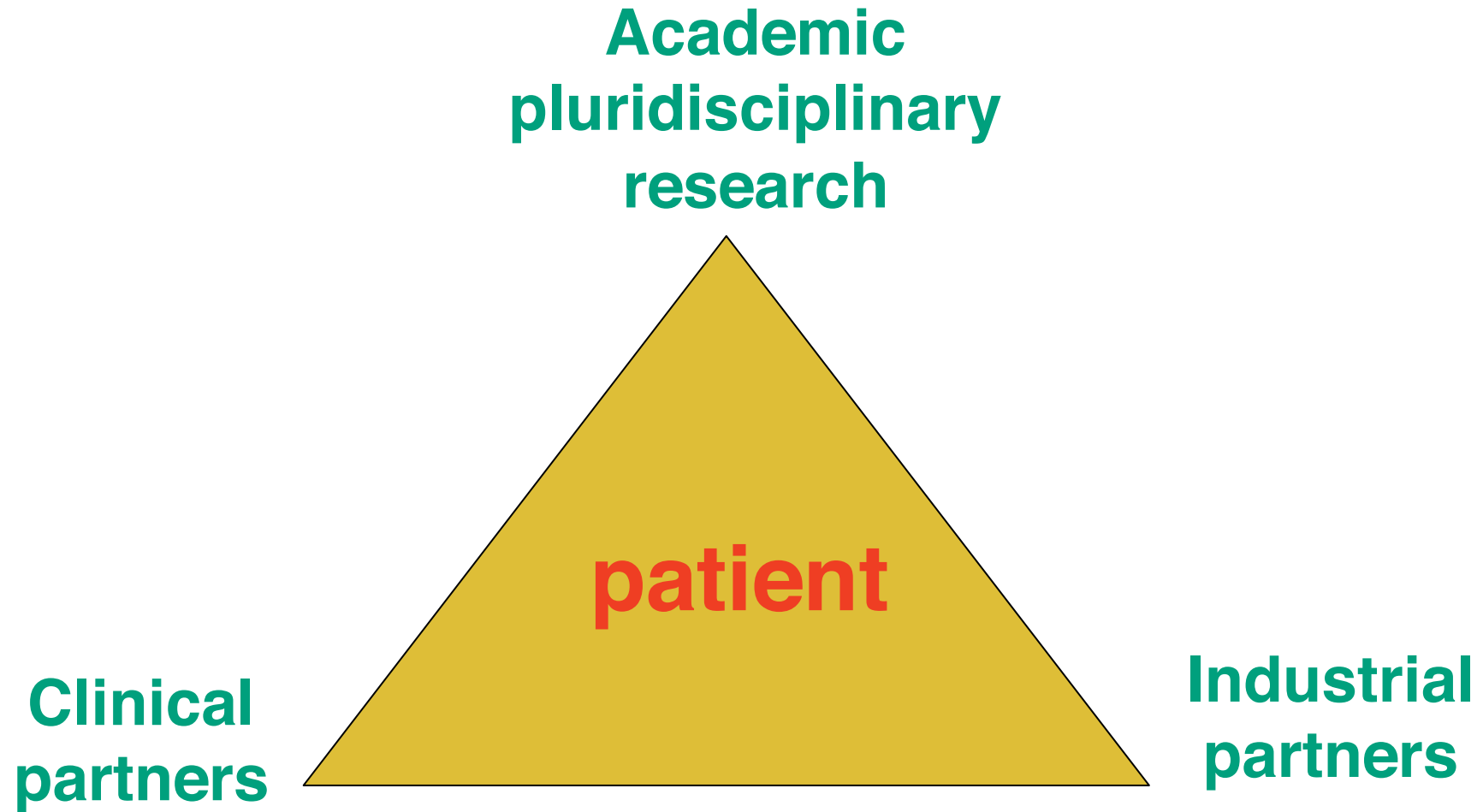


Margeta et al. MIU 2014
Le Folgoc et al. MICCAI 2014
Lombaert et al. MICCAI 2014

9. Closer links between scientific communities

- informatics and computational sciences
- mathematics, physics, chemistry
- biology et medicine
- databases, security, certification, etc.

10. Medical Image Computing & Computational Medicine



MICCAI Medical Image Computing and Computer Assisted Interventions



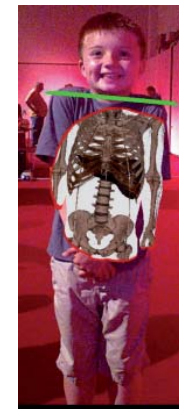
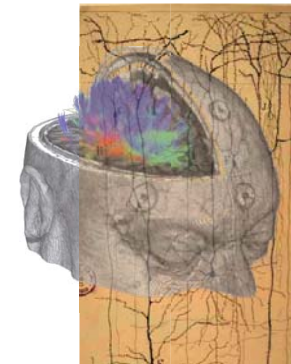
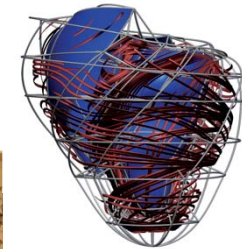
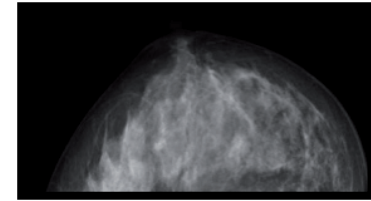
MICCAI 2012 NICE

A new
research field
supported by a
young research
community

Symposium

- 09h10** Biophysical Models for Cancer Imaging
Michael Brady, *University of Oxford, United Kingdom*
- 09h50** Learning Clinical information from Medical Images
Daniel Rueckert, *Imperial College London, United Kingdom*
- 10h30** Spatiotemporal Analysis of Brain Development and Disease Progression
Guido Gerig, *University of Utah, United States*
- 11h10** Break
- 11h20** Decision Forests in Medical Image Analysis
Antonio Criminisi, *Microsoft Research, United Kingdom*
- 12h00** Computational Physiology: Connecting Molecular Systems Biology with Clinical Medicine
Peter Hunter, *University of Auckland, New Zealand*

- 14h00 Introduction
- 14h10** Toward a Statistical Neuroscience
Olivier Faugeras, *Inria, Université de Nice Sophia Antipolis*
- 14h50** Model-Based Biomedical Image Analysis
James Duncan, *Yale University, United States*
- 15h30** Multi-Scale Image-Guided Interventions
David Hawkes, *University College London, United Kingdom*
- 16h10** Break
- 16h20** Augmented Reality in the Operating Room
Nassir Navab, *Tech. Univ. Munich, Germany & J. Hopkins Univ., United States*
- 17h00** Towards Image-Based Personalized Medicine
Dorin Comaniciu, *Siemens Corporate Technology, United States*
- 17h40 The Future of the Personalized Digital Patient
Nicholas Ayache, *Collège de France*
- 18h00 Open discussion



Acknowledgements

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