

# IMAGE AND PERVASIVE ACCESS LAB

Since 1998 ...



[www.ipal.cnrs.fr](http://www.ipal.cnrs.fr)



Institute for  
Infocomm Research



UNIVERSITÉ  
JOSEPH FOURIER  
SCIENCES, TECHNOLOGIE, MÉTIÈRE



NUS  
National University  
of Singapore



INSTITUT  
Mines-Télécom





1998-2007

IPAL  
Image Processing and Application Lab  
EP 1956 & FRE CNRS 2339

Image Processing  
Image Indexing and Retrieval  
Image and 3D Perception  
Video Indexing and Retrieval

BUILDING CONFIDENCE



2007-2011

IPAL  
Image Perception, Access & Language  
UMI CNRS 2955

Content-Based Image/Information Retrieval  
Multilingual Access to Multimodal Images  
Mobile Information Access  
Medical Image Analysis, Indexing, Retrieval

BENCHMARKING AND INNOVATION



2011-2015

IPAL  
Image & Pervasive Access Lab  
UMI CNRS 2955

Biomedical Image Understanding  
Formal Methods and Model Checking  
3D Visual Objects Streaming  
Visual Memory Extension  
Ambient Assistive Living

EXCELLENCE AND IMPACT

# Our supporting Partners



- ▶ National University of Singapore (NUS)



- ▶ Institute for Infocomm Research (I<sup>2</sup>R) Agency  
for Science Research and Technology (A\*STAR)



- ▶ Centre National de la Recherche Scientifique (CNRS)



- ▶ Université Pierre et Marie Curie, Sorbonne Universités



- ▶ Institut Mines-Télécom



- ▶ Université Joseph Fourier, Grenoble I

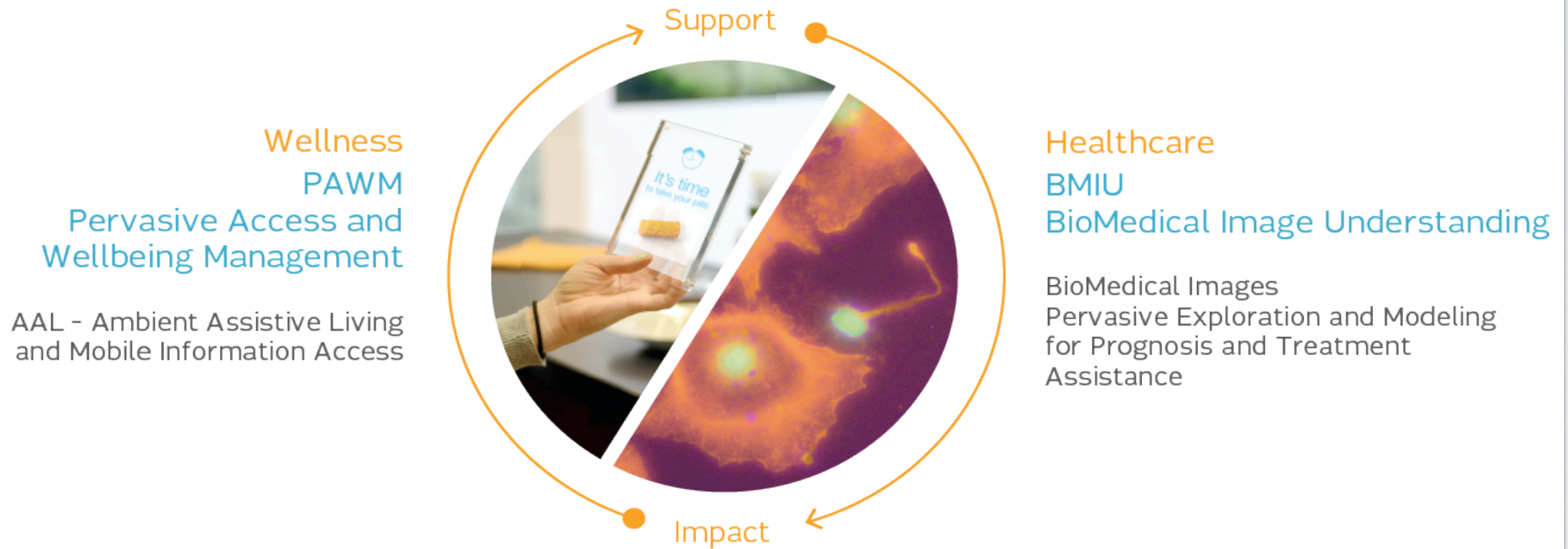
## Scientific bridge between Singapore / ASEAN and France / EU



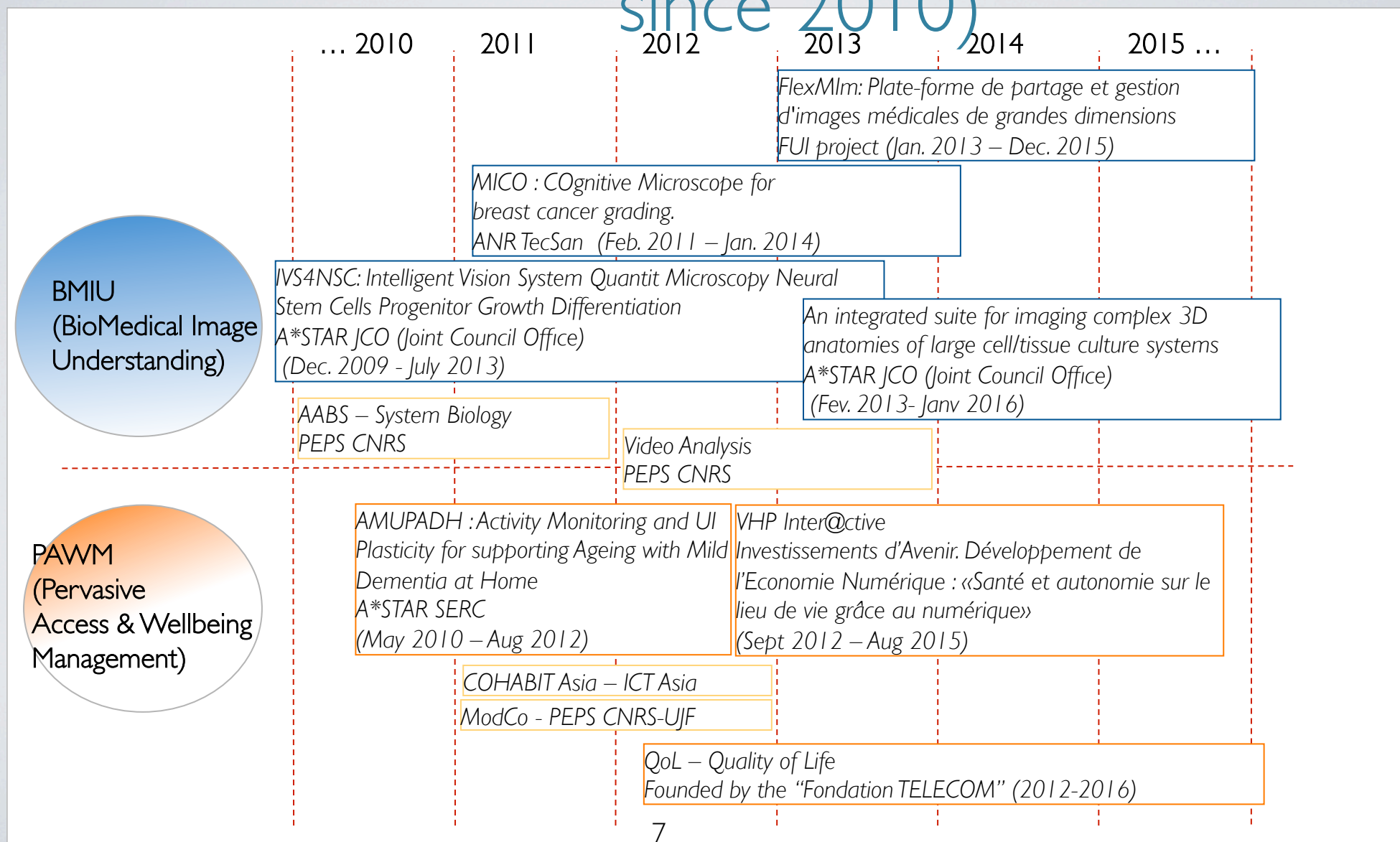


## MAJOR IMPACTS

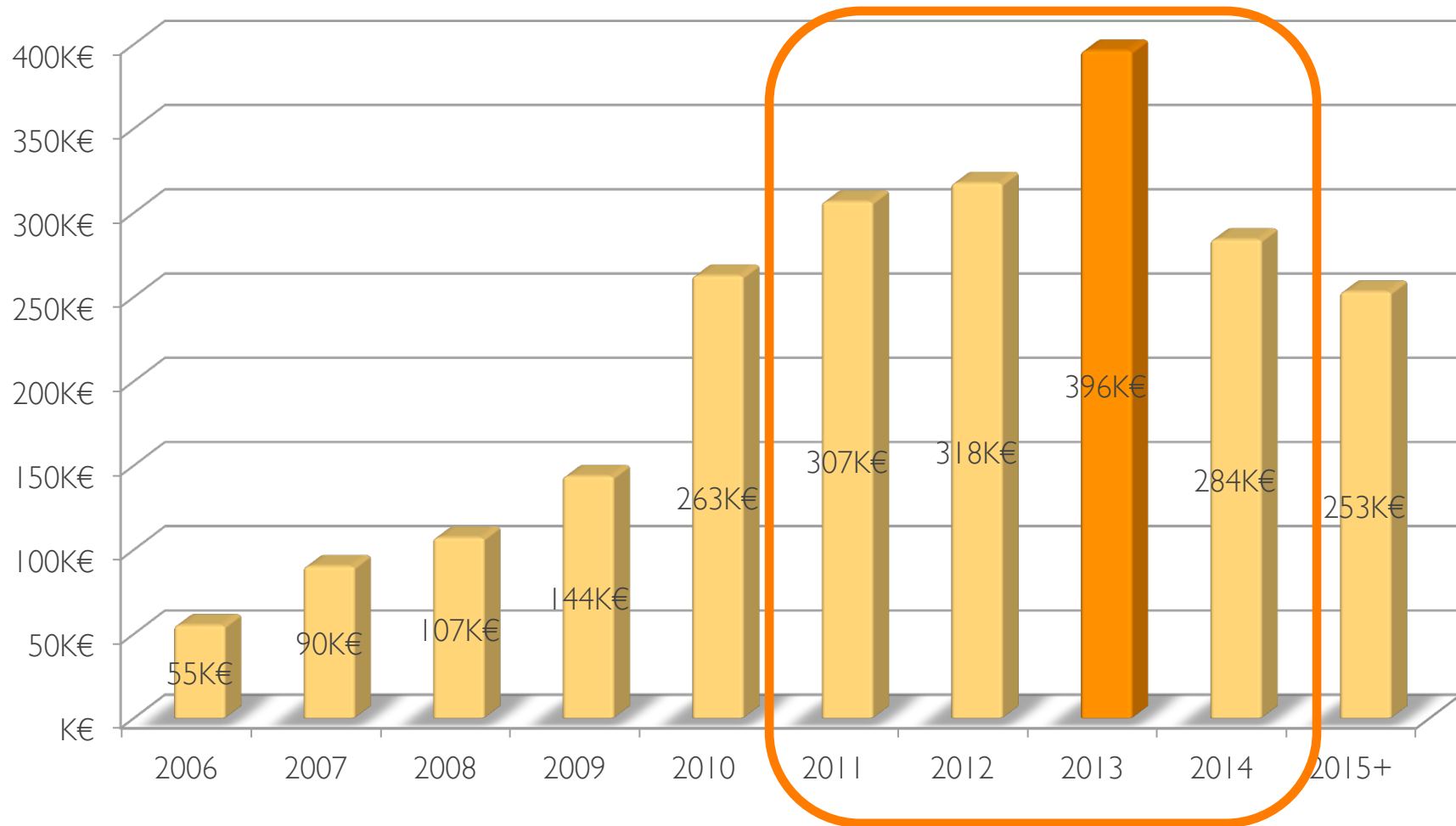
- ▶ Inspire **scientific breakthrough** by a new way of thinking : mixing Asian and European scientific research approaches
- ▶ **Research Incubation Unit** - future French/ASEAN sc. leaders
- ▶ **Research HUB** for French and ASEAN countries
- ▶ **Translational research** support for ASEAN emerging economies
- ▶ **Accelerate innovative technologies** maturation and deployment in a dynamic Singaporean and ASEAN environment
- ▶ Better **understand each-other** philosophy, culture, way of life



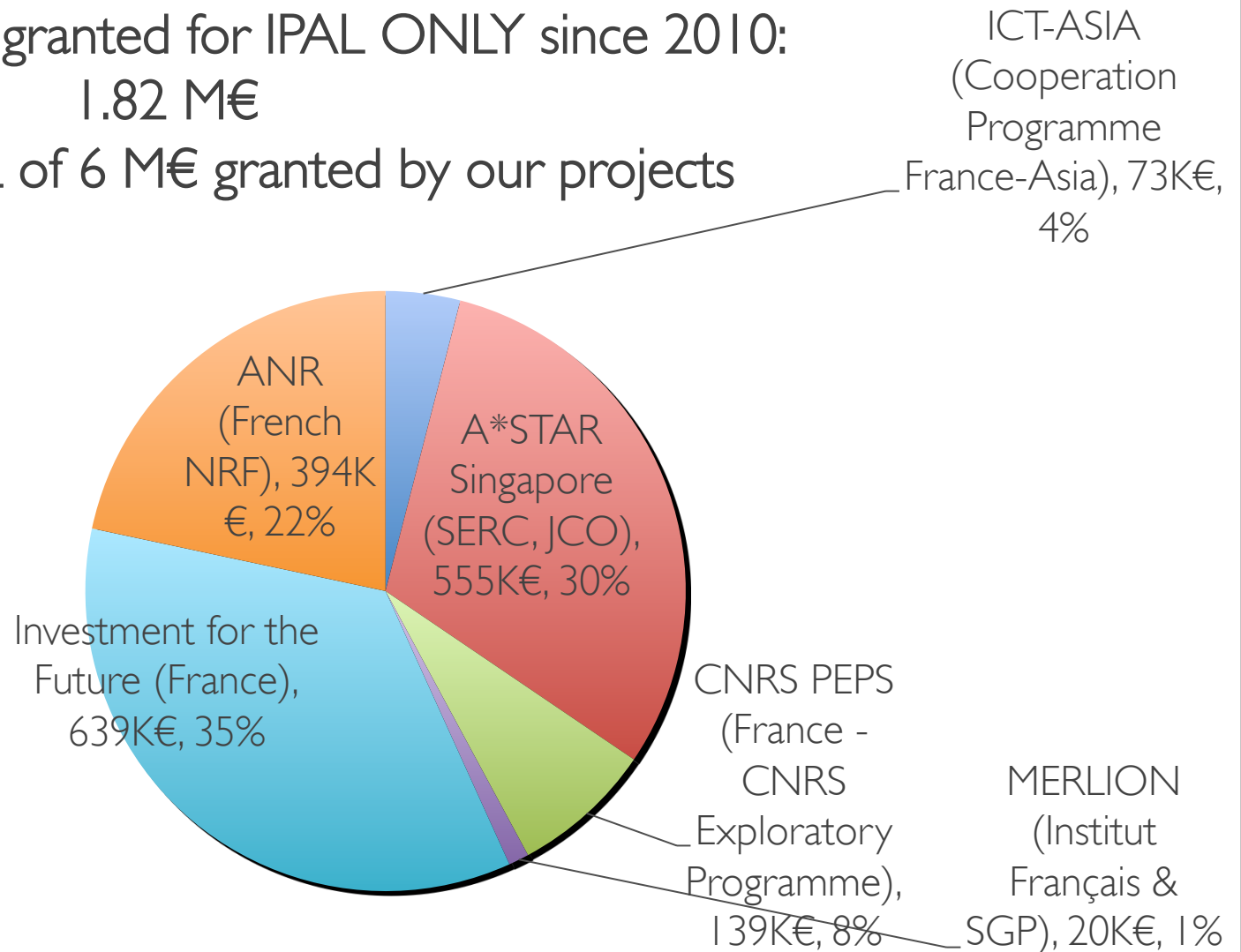
since 2010)



# IPAL external funding per year (since 2006)



Competitive budget granted for IPAL ONLY since 2010:  
1.82 M€  
out from a TOTAL of 6 M€ granted by our projects





# COGNITIVE VIRTUAL MICROSCOPY FOR BREAST CANCER GRADING IN HISTOPATHOLOGY

## WHOLE SLIDE IMAGE EXPLORATION USING A SYMBOLIC COGNITIVE VISION APPROACH

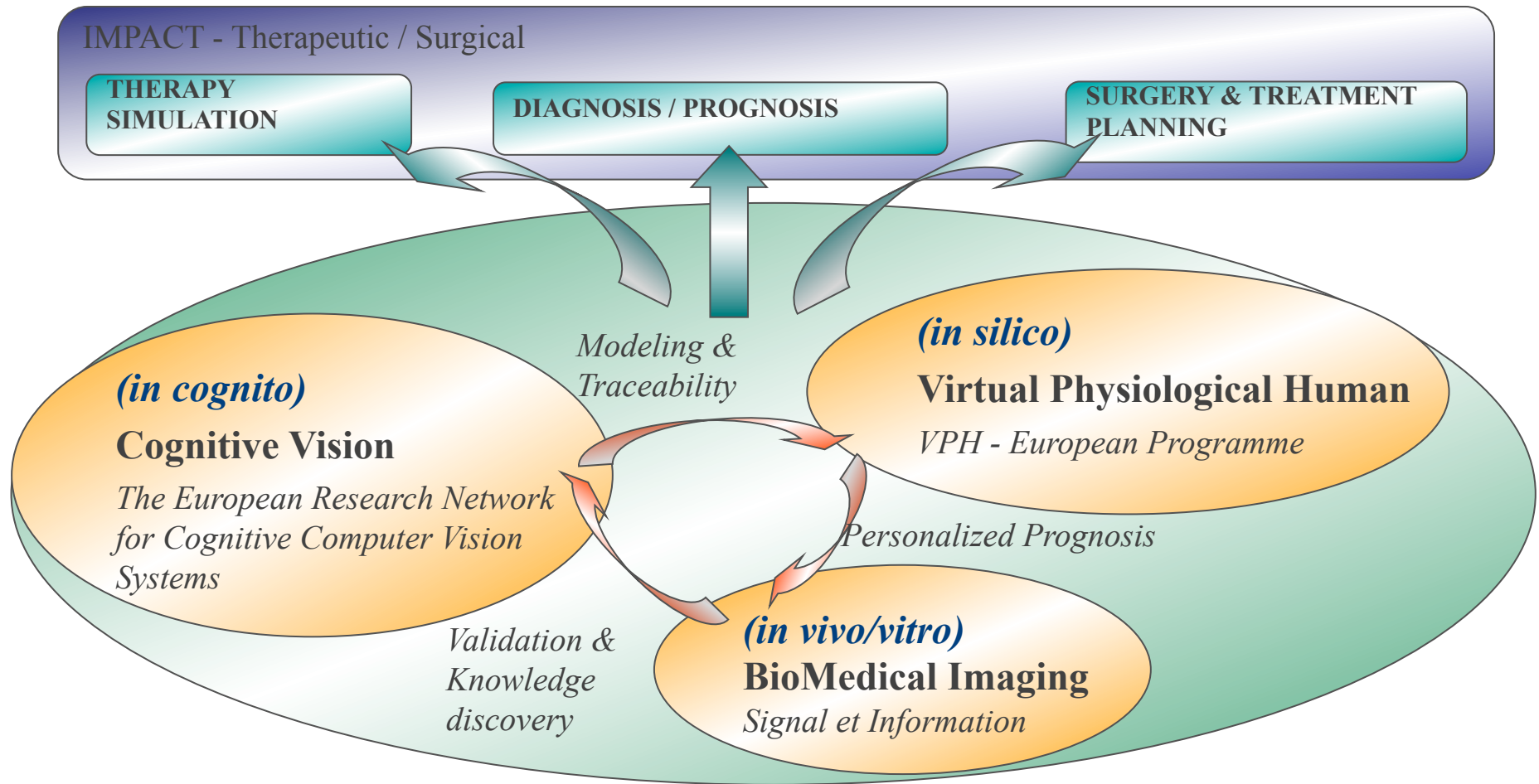
Daniel RACOCEANU

[http://www.comp.nus.edu.sg/~danielr/  
daniel.racoceanu@upmc.fr](http://www.comp.nus.edu.sg/~danielr/daniel.racoceanu@upmc.fr)

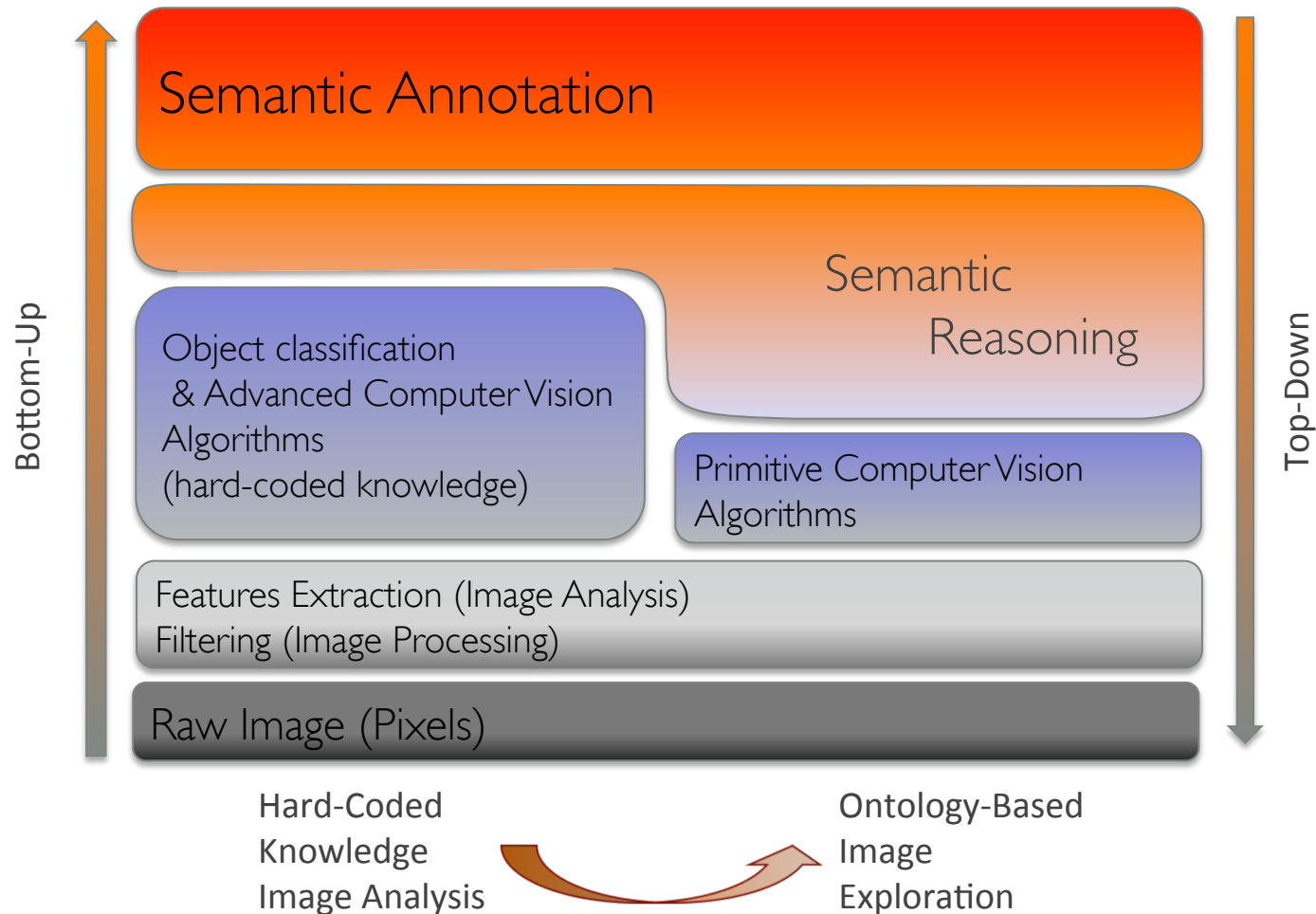
[www.ipal.cnrs.fr](http://www.ipal.cnrs.fr)

Scientific Challenges

## BIOMEDICAL IMAGE UNDERSTANDING

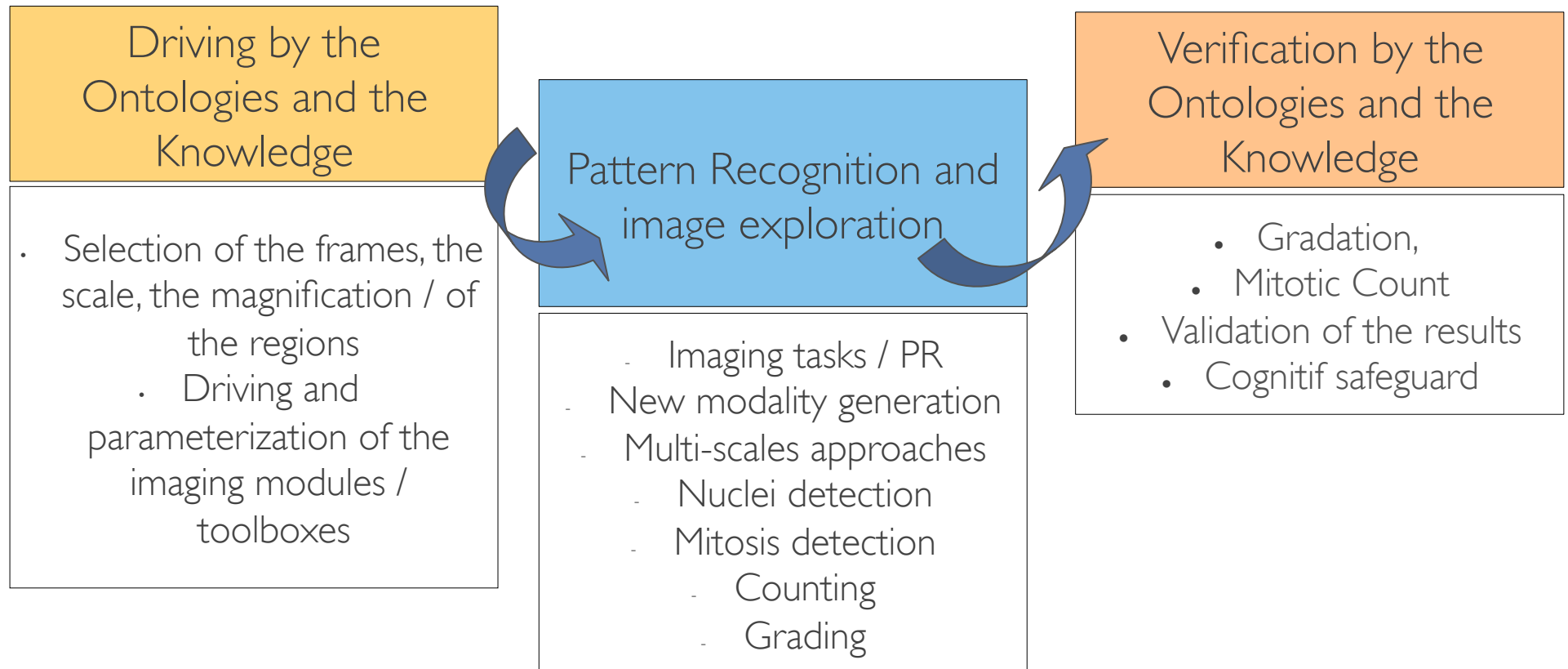


# Origin of the challenge: From Hard-Coded to Semantic-Based Image Exploration



## Coupling between knowledge and pattern recognition

- Role sharing and interaction between the AI and Pattern Recognition approaches



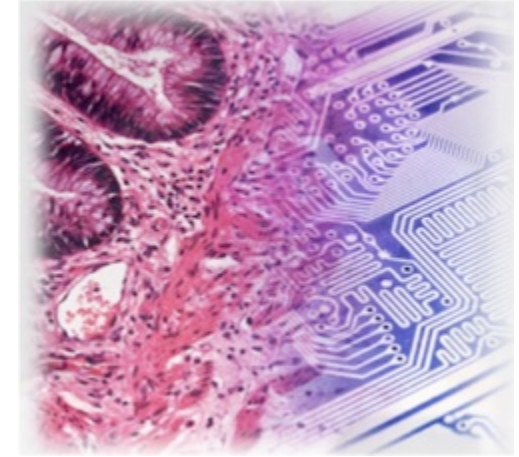


IPAL/BMIU

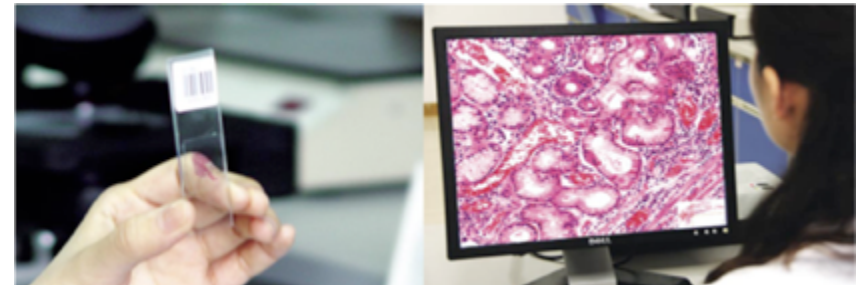
MICO (ANR TecSan 2011-2014)

COgnitive virtual Microscopy for digital pathology

- ▶ The future of the pathology will need to be
  - **Ethical**: traceability / reference / validation
  - **Dynamic**: predictability / morphogenesis
- ▶ The revolution of the digital pathology
  - The pathology is fundamentally cognitive  
(slides / signs reading / interpretation)
  - We need cognitive tools for digital pathology
  - New laws on the telemedicine / telepathology
  - Evolution of the DICOM standard (supplements 122, 145)
  - New generation of PACS



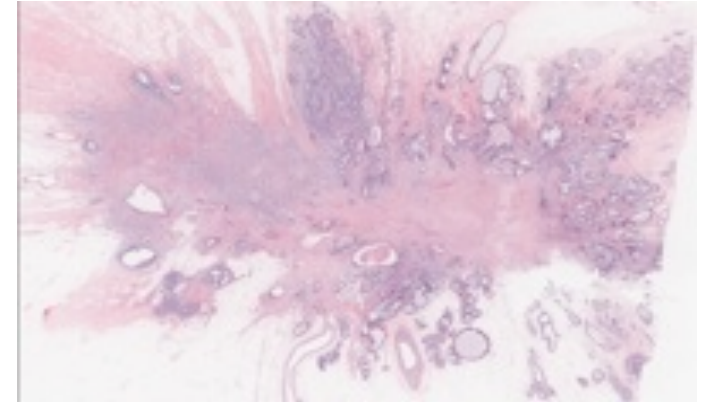
- ▶ Accompany the evolution towards the numerical pathology
  - **Augmented Microscopy**: cognitive exploration, traceability
- ▶ By the breast cancer, towards the cancer grading in histopathology
  - Acquire a methodology
  - Define a formalism
  - Effective efficient cognitive approach
  - Test, validate and integrate the technologies in clinical environment
- ▶ Augmented microscopy for high-content imaging
  - A generic challenge in biomedical imaging



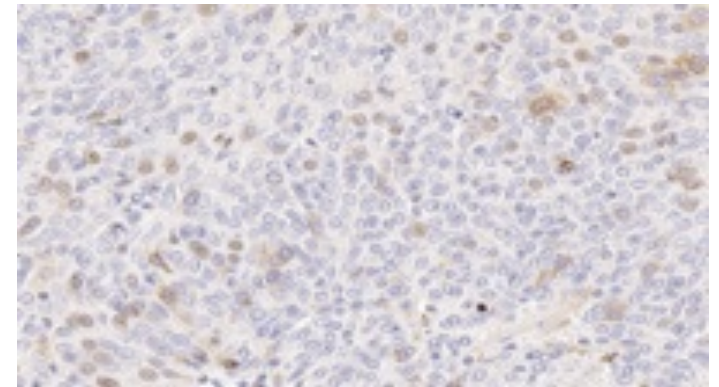
# Grading Process

## Breast Cancer – Canalar Carcinoma (80%)

- ▶ H&E staining - Hematoxylin-eosin staining
  - Architecture evaluation
  - Mitotic count
  - Nuclear polymorphism



- ▶ IHC – Immunohistochemistry – Analysis of Hormone Receptors
  - Nuclear labeling
    - KI-67 Proliferation Index
    - ER, Estrogen Receptor
    - PR, Progesterone Receptor
  - Cytoplasm and cellular membrane
    - HER2/neu, Epidermal Growth Factor Receptor





- ▶ Cognitive vision
  - Symbolic / Semantic
  - Connexionnist
- ▶ Our approach (ANR TecSan MICO project): **symbolic approach**
  - Close to the medical interpretation of the pathologist
  - Ontological references (SNOMED-CT / ADICAP



## ▶ Traceability

- MICO platform is aimed to help histopathologists to take decisions by providing statements about medical cases, its decisions should obviously provide traceability. **Semantic reasoning** takes place in a formal world, each inference is **proven**: each decision is proven.

## ▶ System understanding & Decision support

- Tedious and time consuming tasks. User in the loop.

## ▶ Flexibility and maintenance

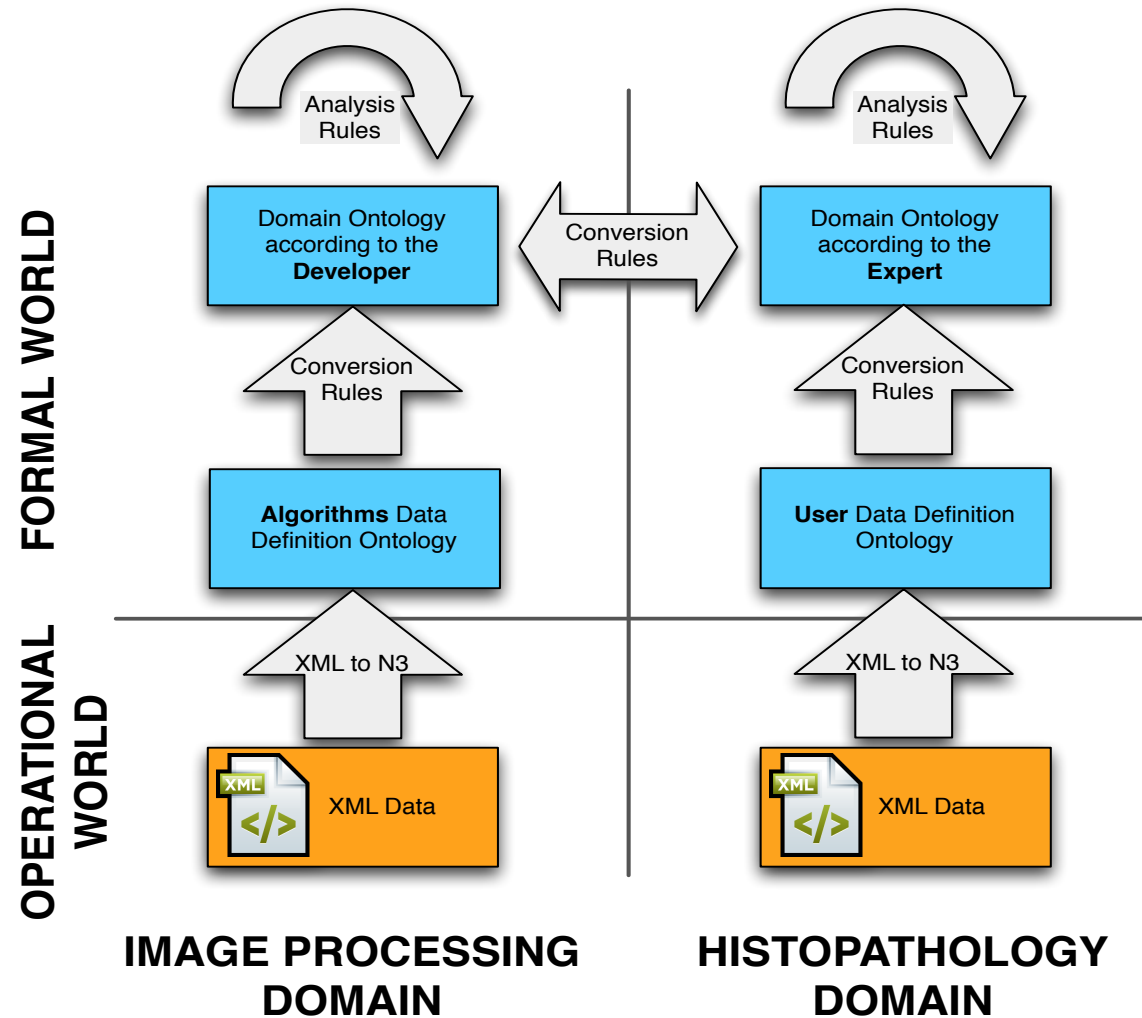
- With a **full semantic approach**, all the facts and processes are expressed in an open manner. They are also fully described and therefore easily understood. Compared to “hard coded” systems, semantic systems are more flexible and easier to maintain.

## ▶ Technology acceptance

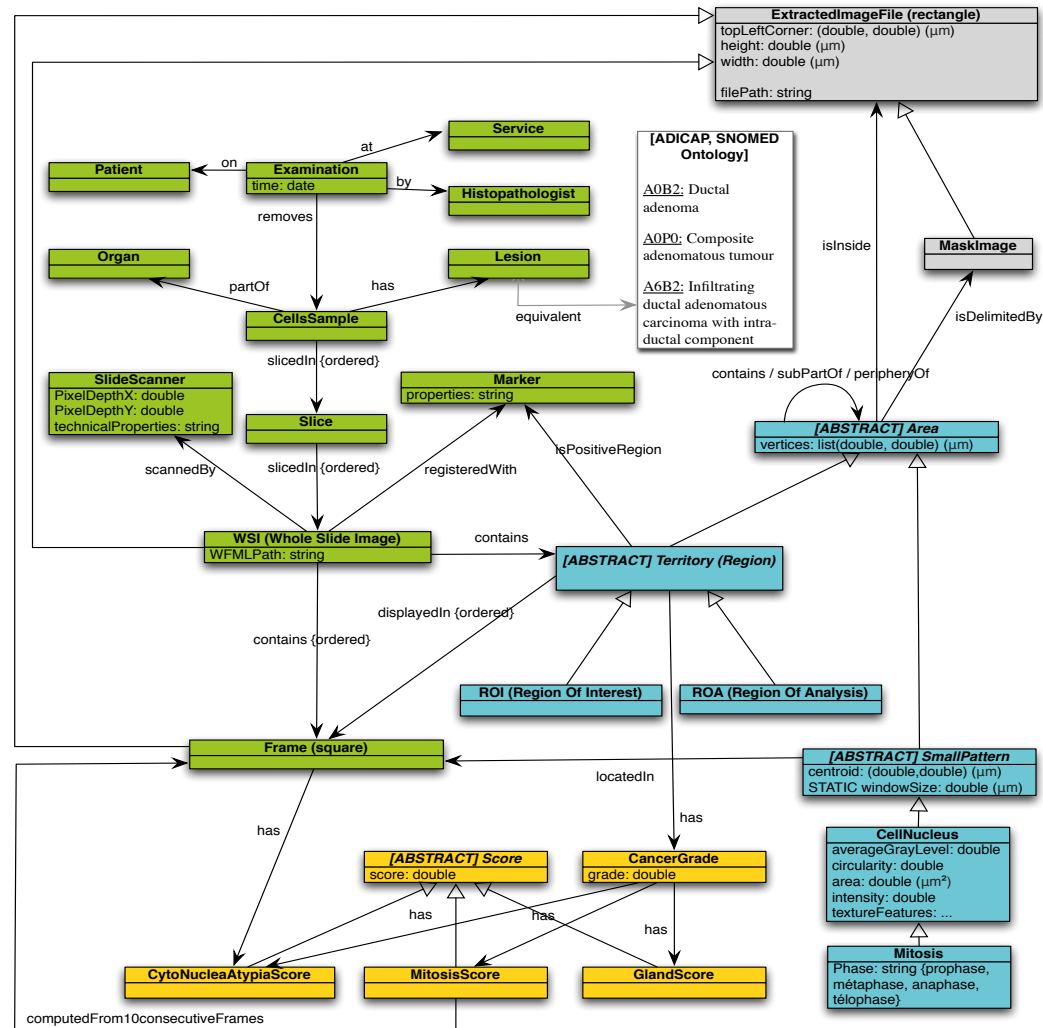
- Semantic web technologies helps the user to **understand what the system truly does**, and therefore increase its perceived ease of use. By increasing the system perceived ease of use and its perceived usefulness, this approach will probably help the user to accept technology.

## ▶ Improved image processing

- **Expert knowledge used to guide image processing algorithms**, target interesting spots in order to spare as much processing power as possible and to make the overall gradation faster. **ONTOLOGY AT THE HELM.**

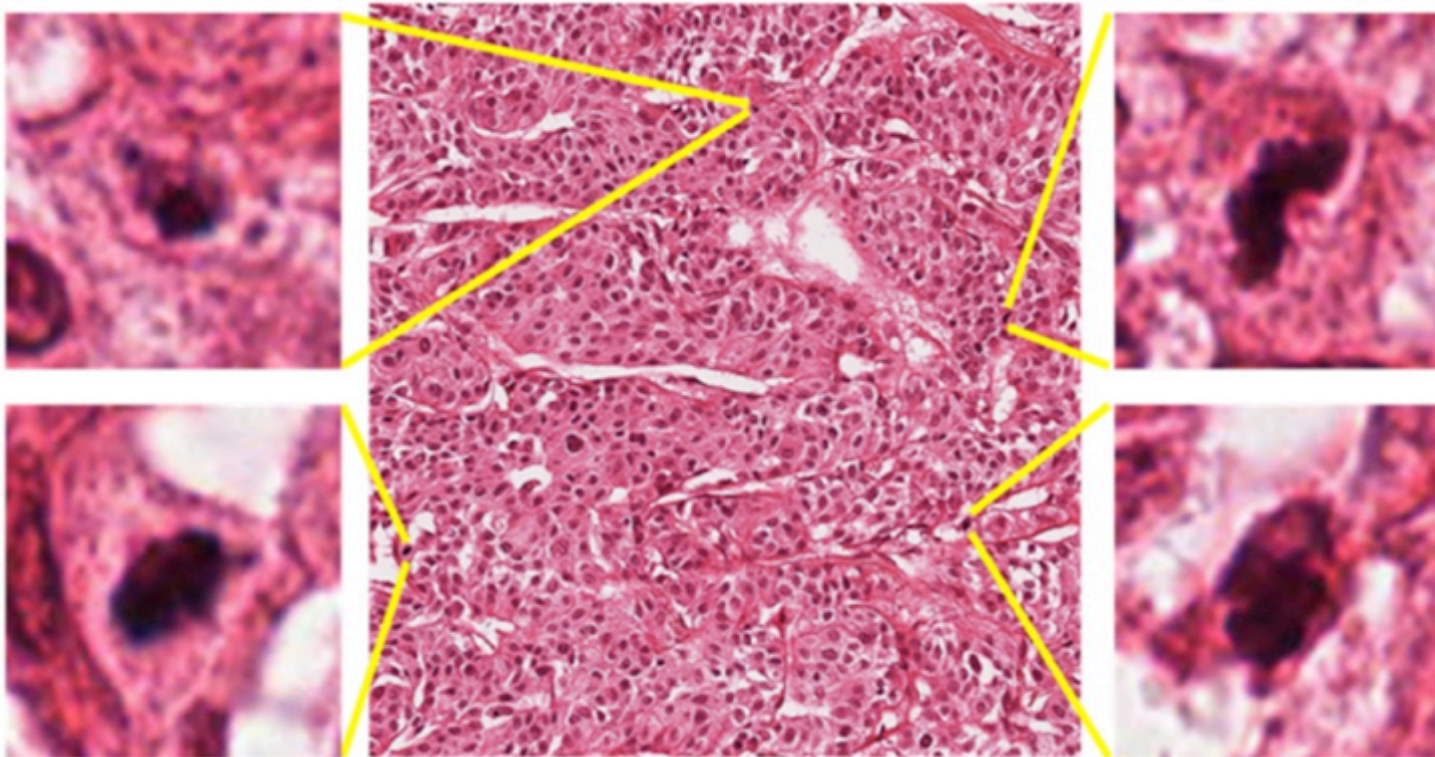


# MICO conceptual graph



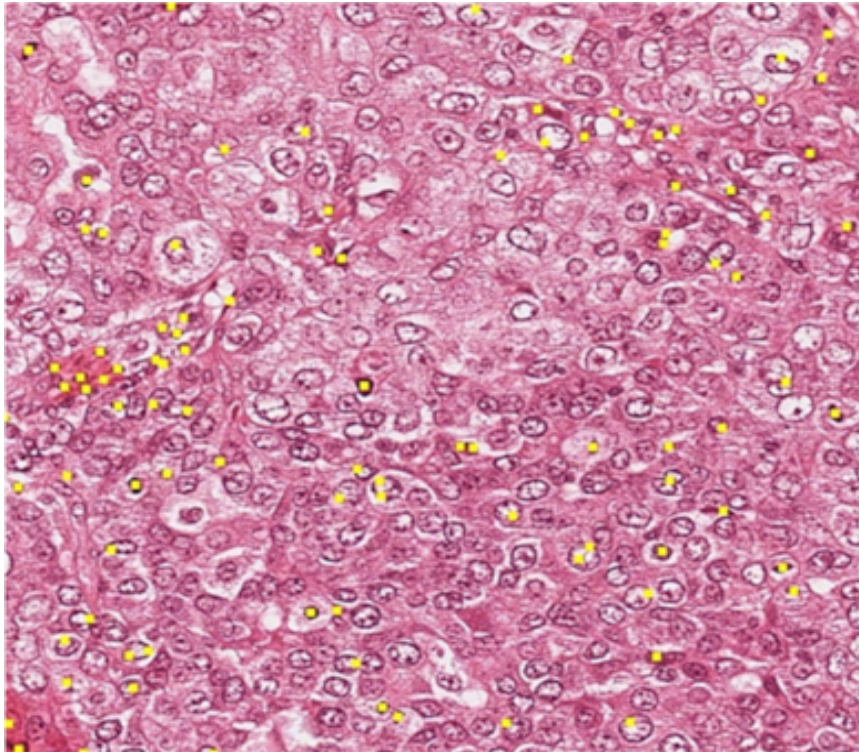
# Challenge of the Automatic Mitotic Detection

- ▶ Variation in shape and size,
- ▶ Variation in pixel intensity,
- ▶ Few mitosis per frame,
- ▶ Similarity with other types of objects ( e.g., apoptosis, necrosis, dust particles, lymphocytes, etc)

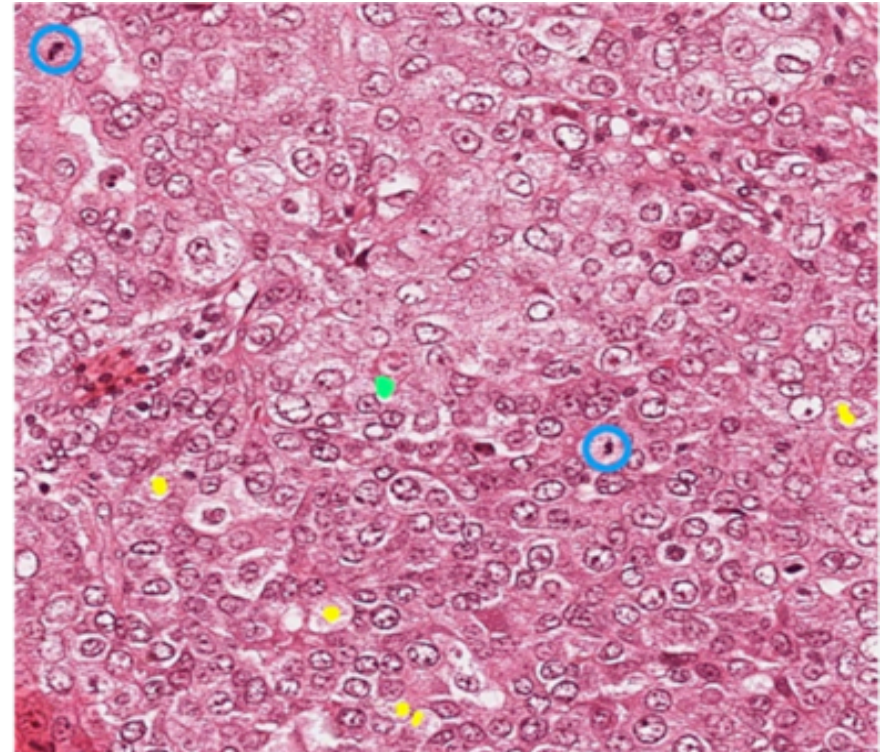




# Mitotic Detection Results



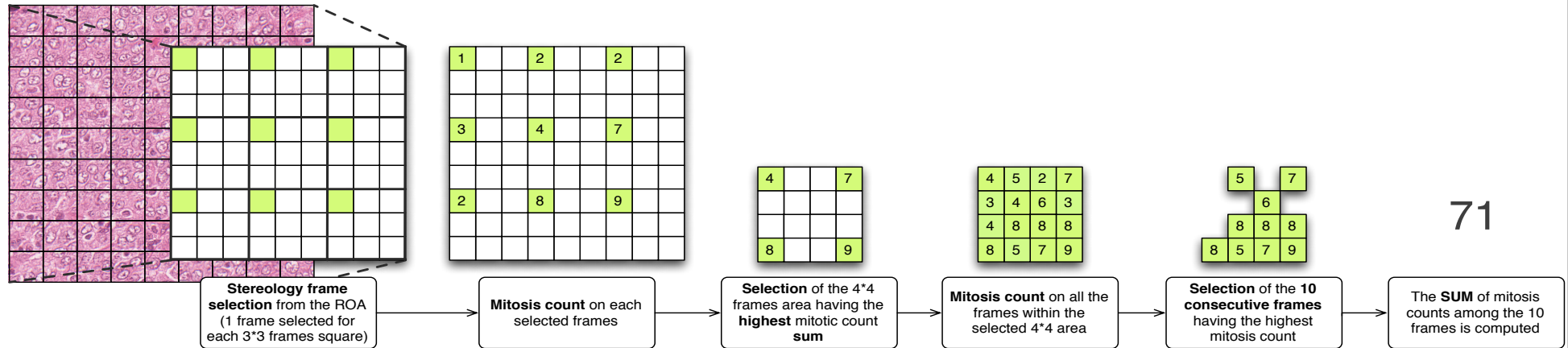
**Candidate Detection:** Yellow spots highlight candidate for Mitosis



**Candidate Classification:** The yellow colour for true positives, green for false positive and the blue for false negatives



## ► Mitosis analysis algorithm

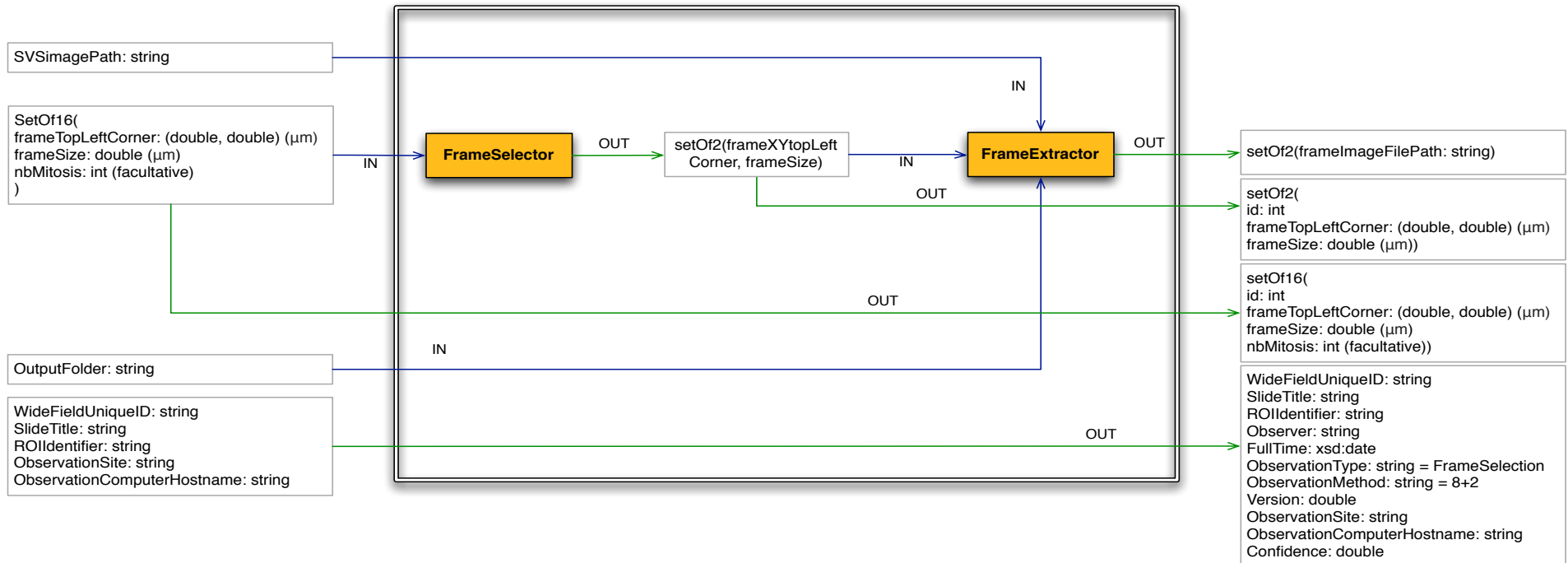


# FrameSelector 8+2

5			7
	4	6	
	8	8	
8			9

5			7
	4	6	
	8	8	?
8		?	9

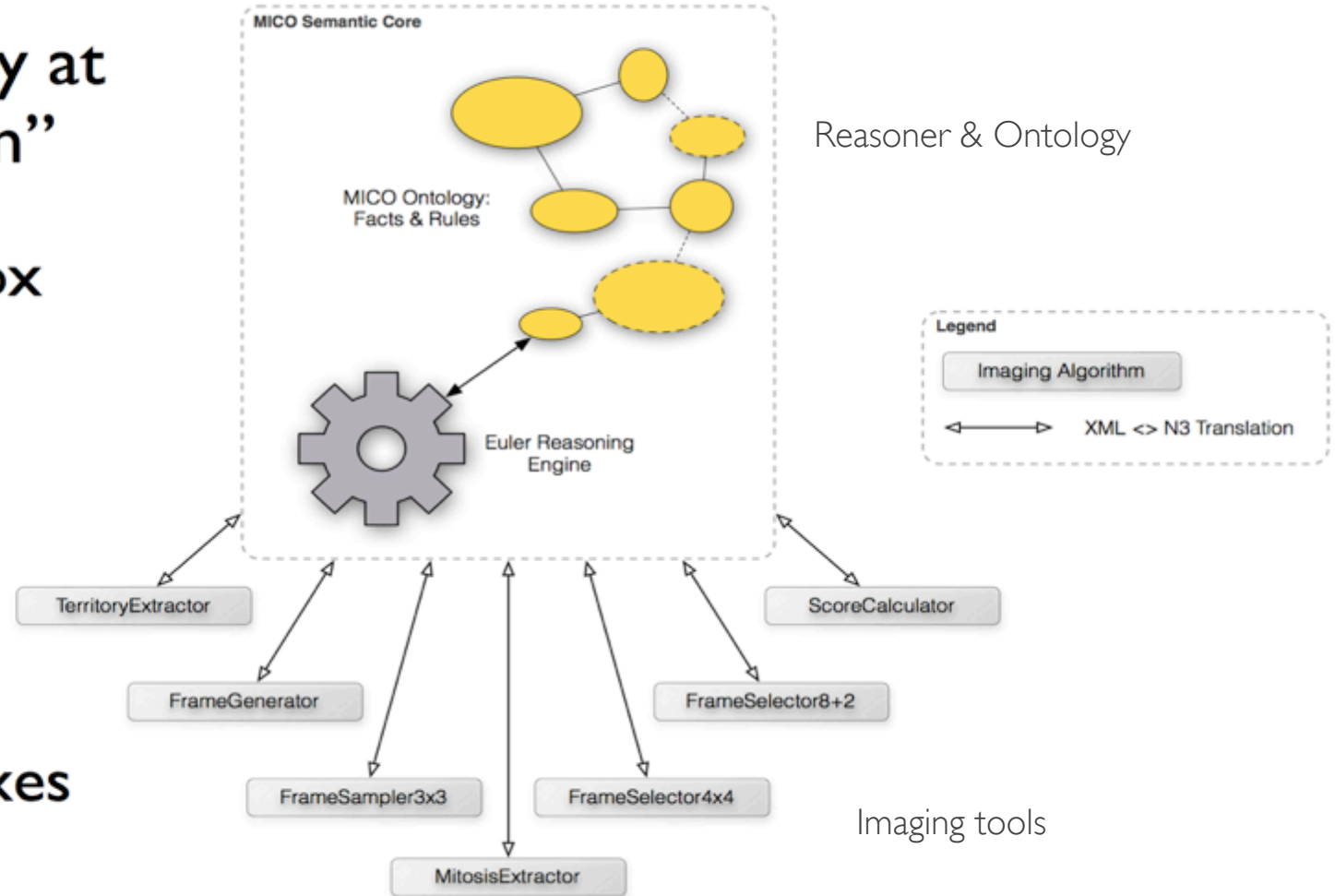
## FrameSelector8+2



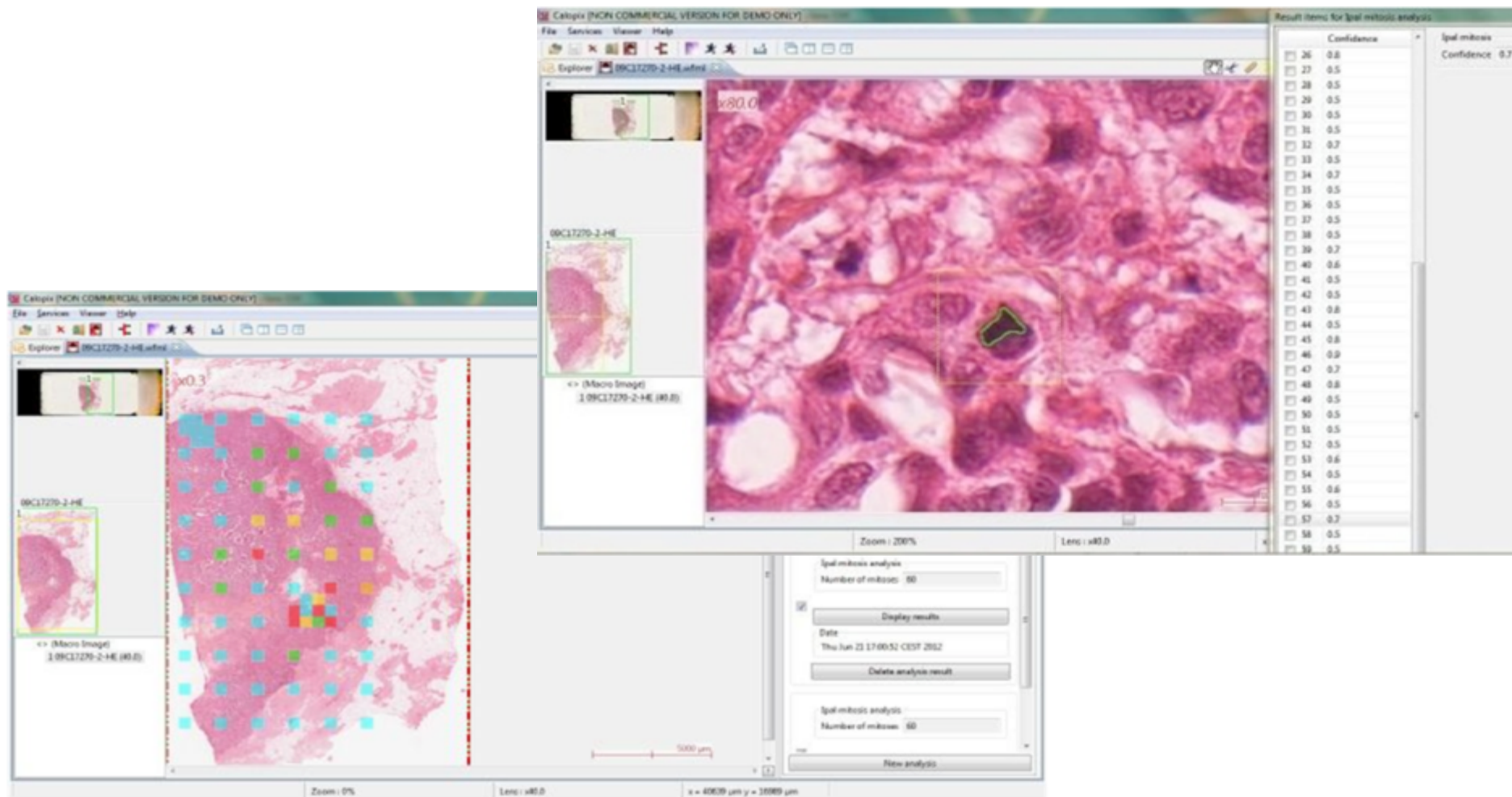
“Ontology at the helm”

Glass box

Black boxes

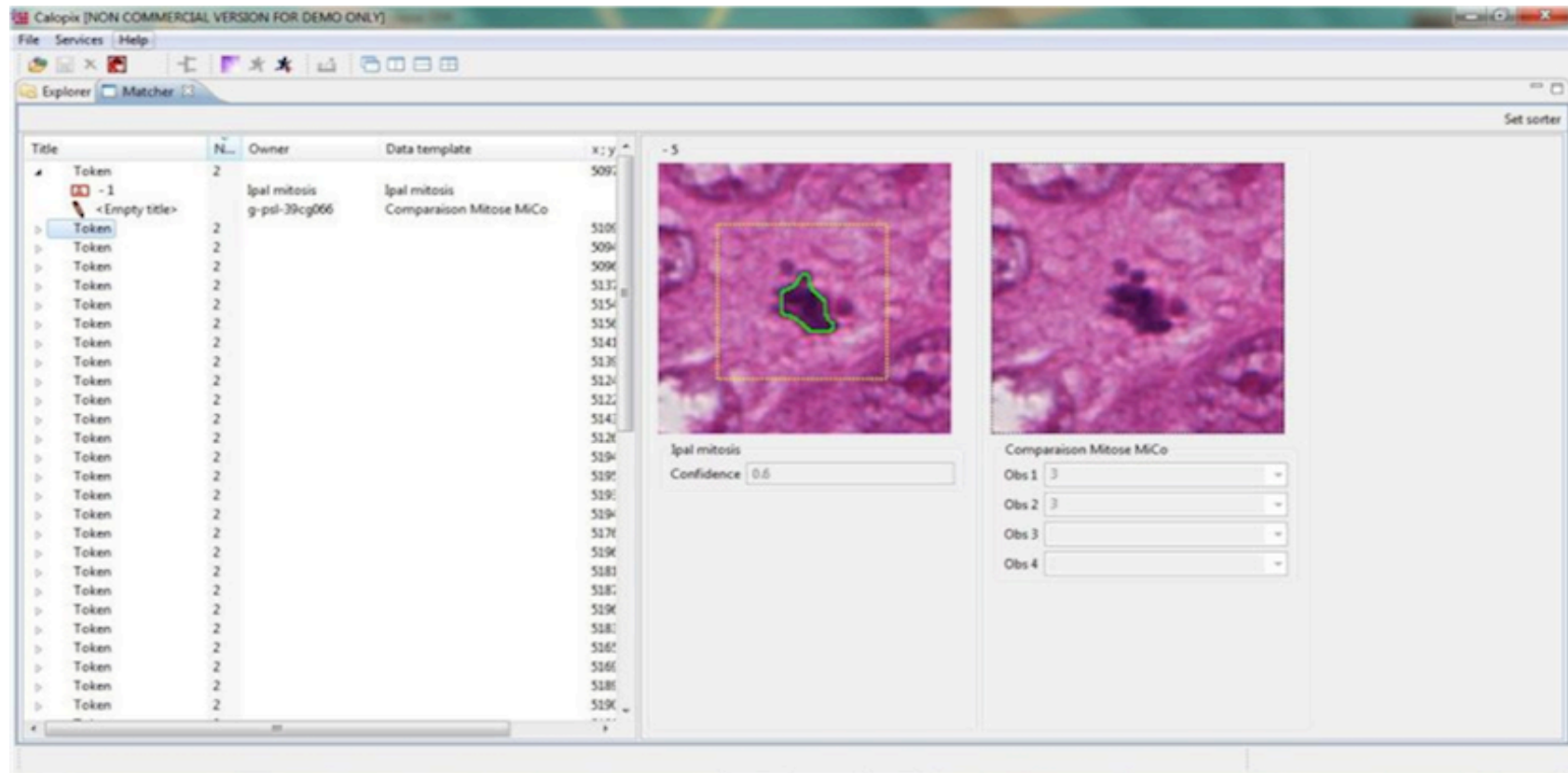


## ► Reconnaissance de formes





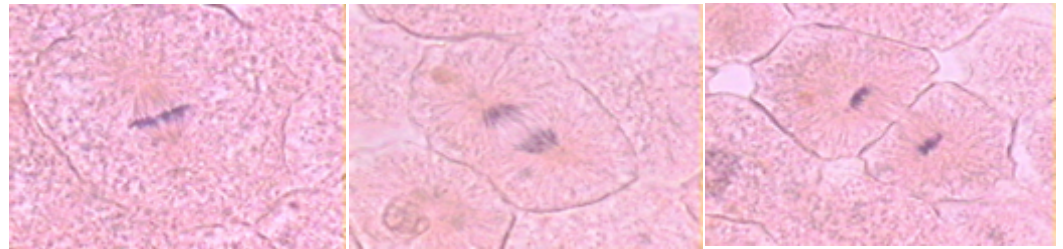
- «Match» de cohérence des informations produites





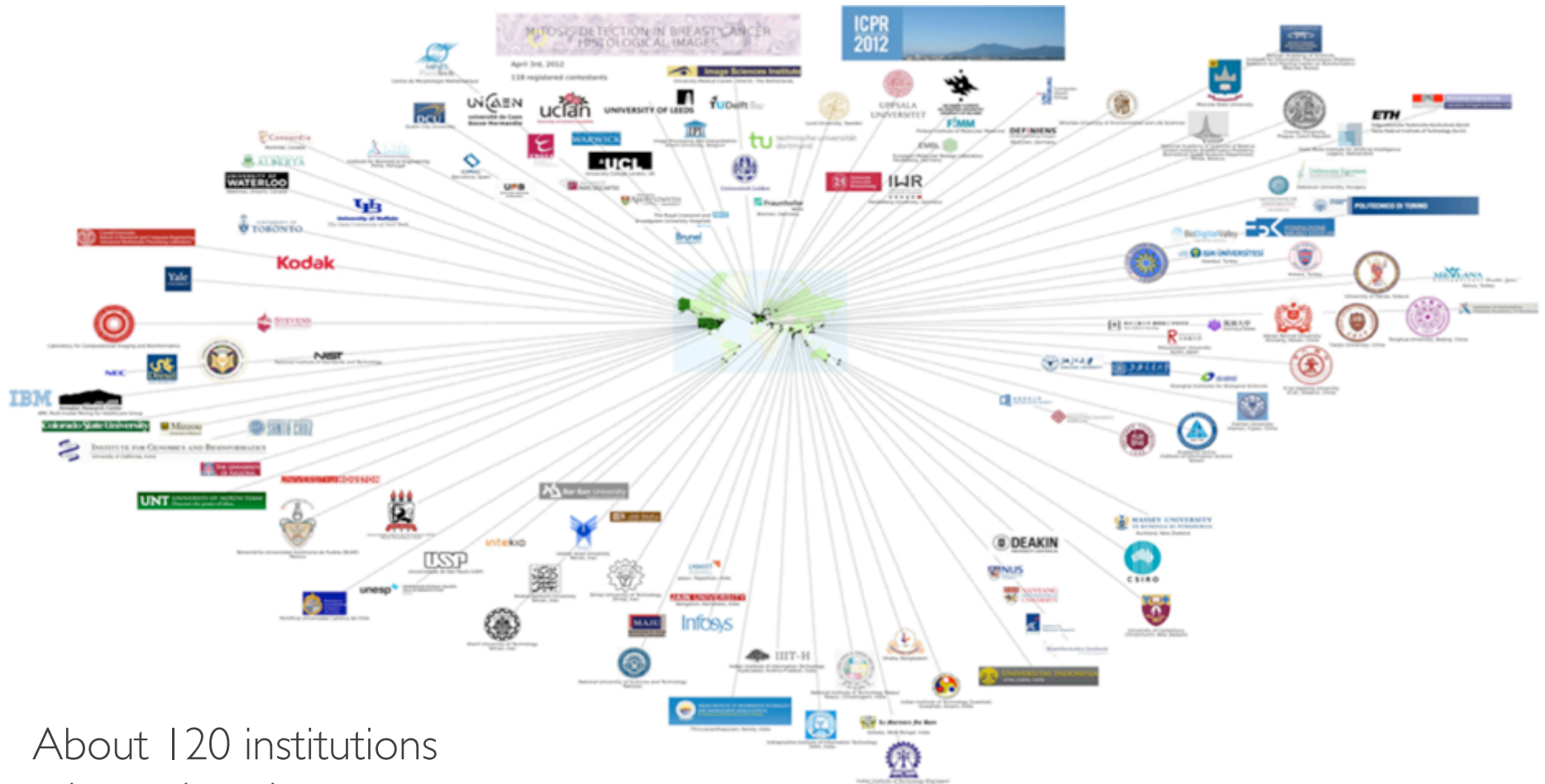
initiative leaded by IPAL

- ▶ Organized by **IPAL**, La Pitié Hospital, TRIBVN, Ohio Univ
  - ICPR 2012, November 11, 2012, Tsukuba, Japan
  - URL: <http://ipal.cnrs.fr/ICPR2012/>



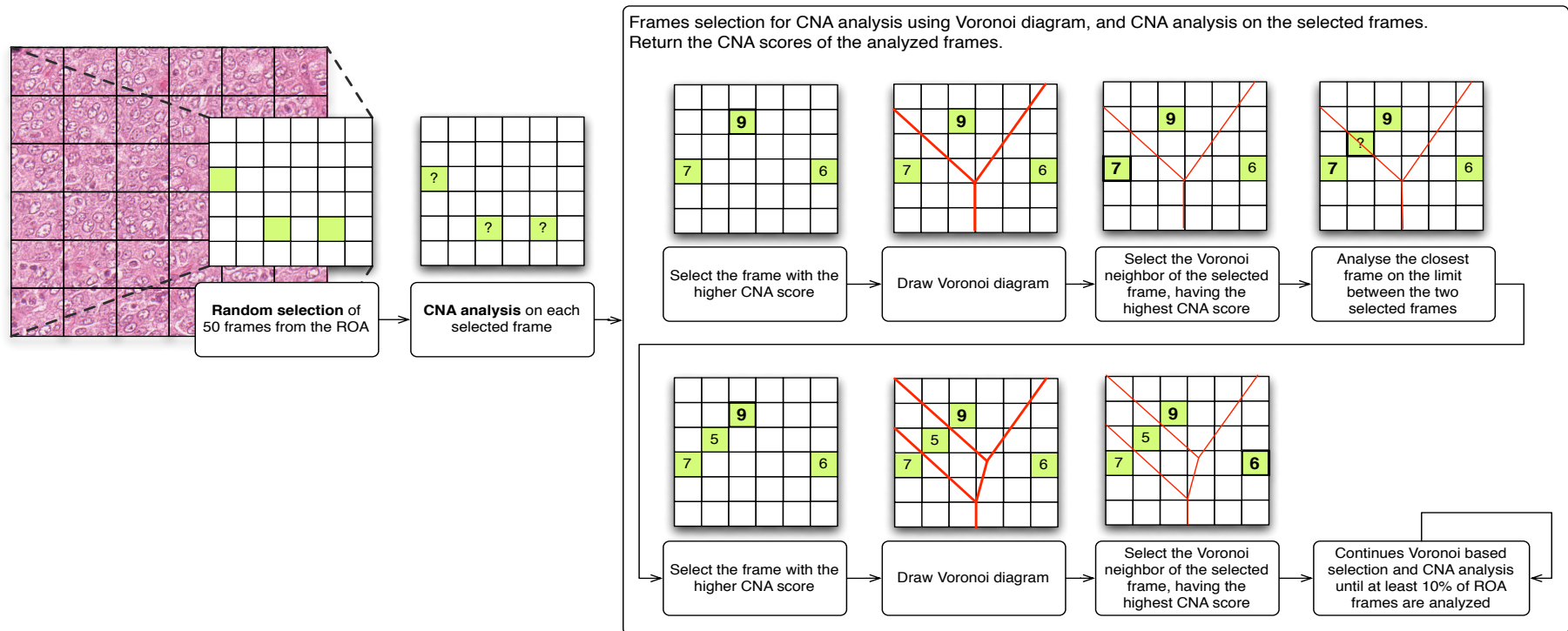
- ▶ Key information :
  - Multimodal data :
    - Fast scanners (Aperio & Hamamatsu)
    - Multispectral Multifocal Microscopy
  - March 31st, 2012: submit a paper about the proposed method to ICPR 2012
  - April 27th, 2012: submit an abstract (1 page) of their method.
  - August 1st, 2012: evaluation data set available.
  - September 10th, 2012: deadline for participants to send their results.
  - November 11th, 2012: mitosis detection contest meeting will take place during ICPR 2012 in Tsukuba, Japan. Contestants will make a short presentation of their method and results.
  - Special issue in JPI - Journal Pathology Informatics – March 2013

## Participants to the international benchmark



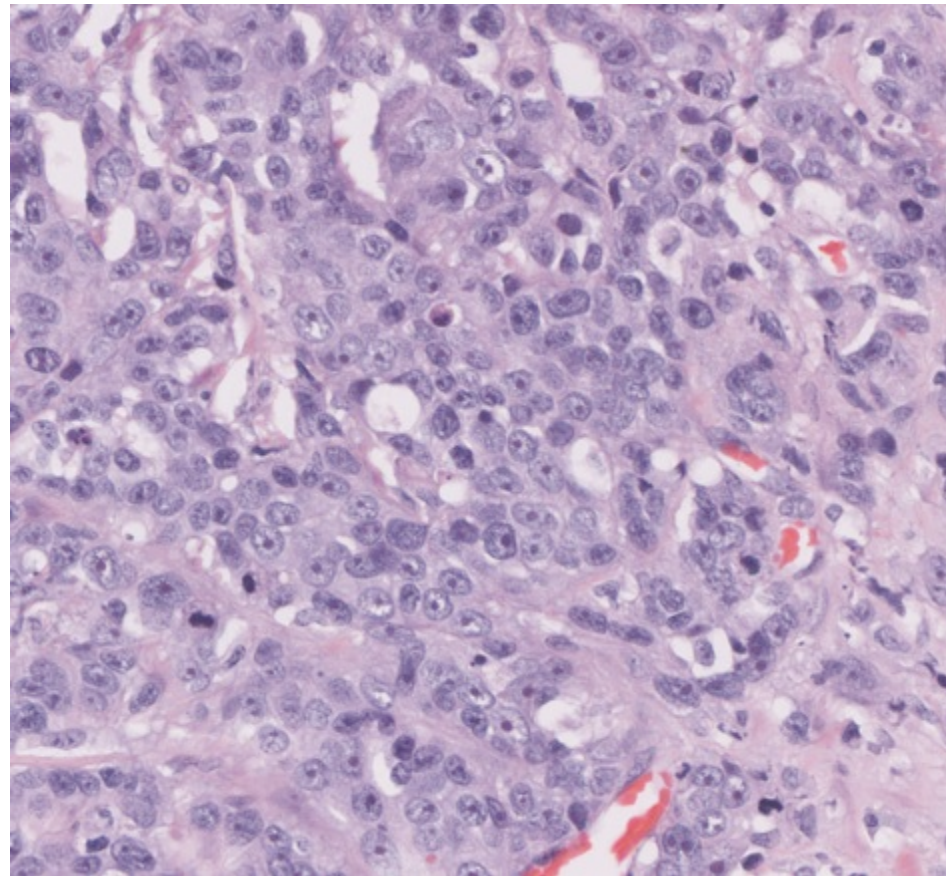
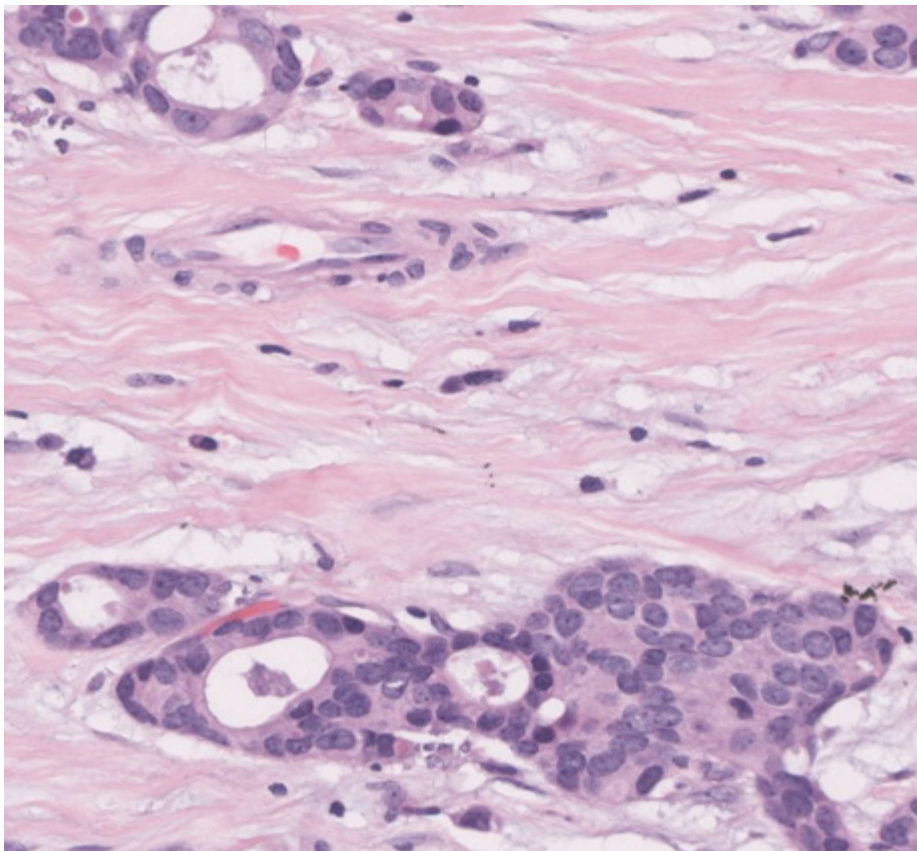
About 120 institutions  
registered to the contest

## ► Nuclear polymorphism analysis algorithm





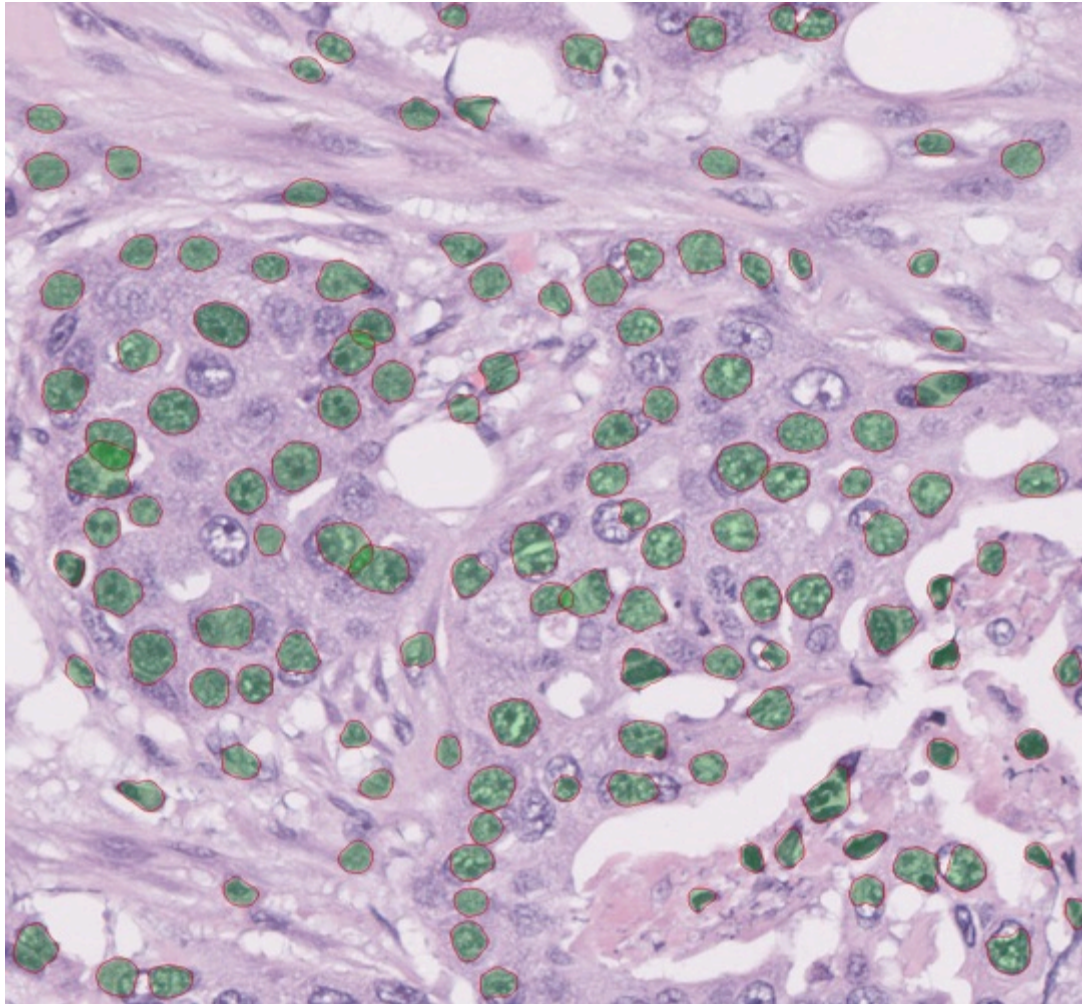
H&E stained surgical breast images  
40x magnification



1024×1024 frames where the nuclei have been  
manually delineated by pathologists



# Nuclei extraction challenges



Score 3

Problems:

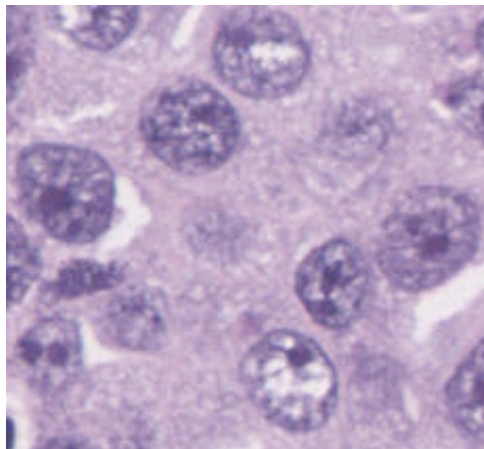
- Nuclei non-homogeneity
- Nuclei vary a lot in terms of size, shape and cytoplasm homogeneity



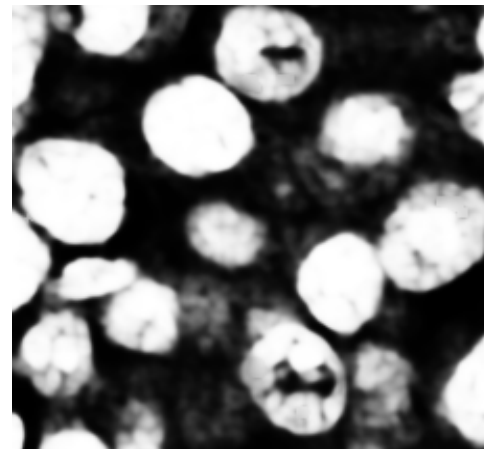
- ▶ Create a **new image modality** using a machine learning based method using
  - colour
  - texture,
  - scale information,

in order to improve the accuracy of nuclei extraction

- ▶ Probability Map
- ▶ The resulting 180-dimensional feature vector  $X$  is used to compute the probability  $p(X)$  of each pixel to belong to a cell nuclei



Original H&E image



Obtained image modality

# Nuclei Segmentation use of the probabilistic modality and of the Marked Point Process

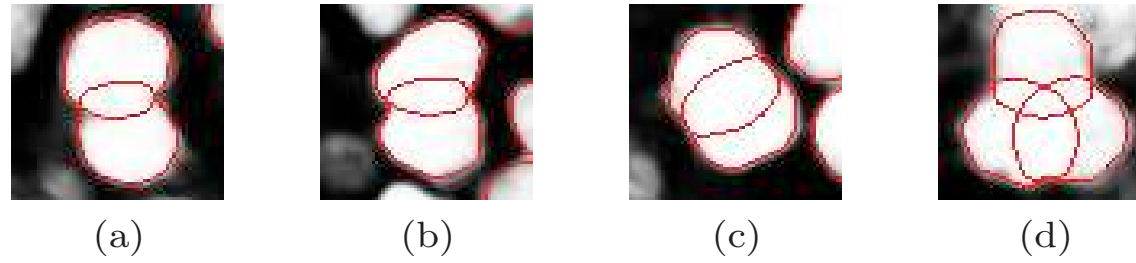


Figure 4: The shape prior information allows to extract the overlapping nuclei.

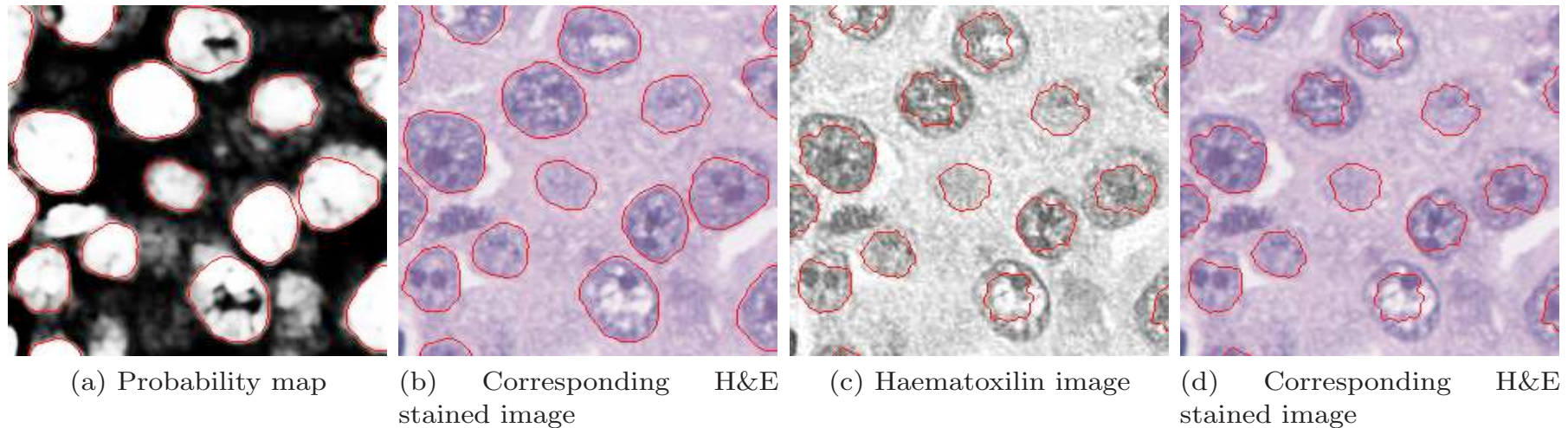
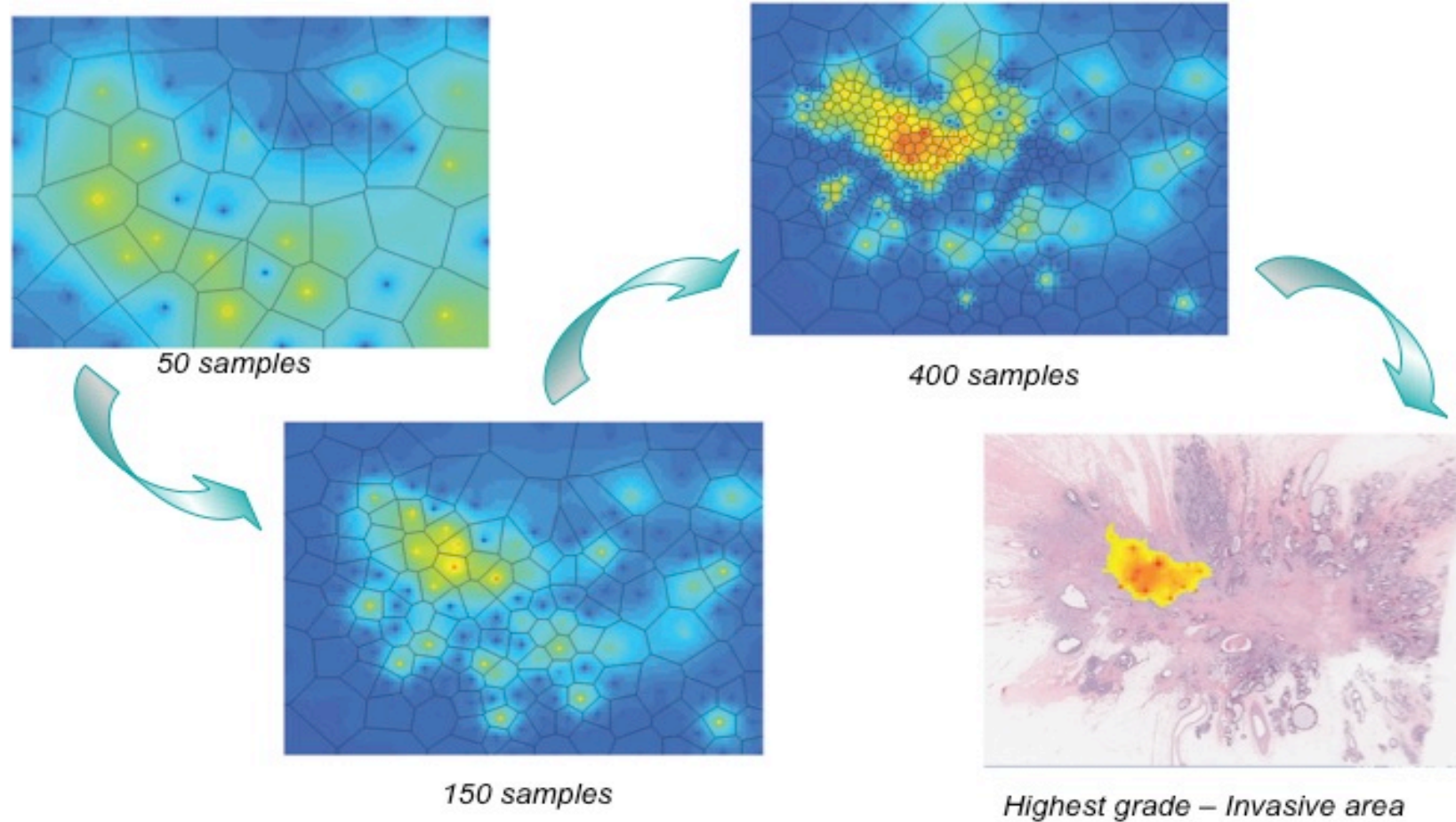


Figure 5: Illustration of the extraction results : (a-b) is obtained using the probability map and (c-d) is obtained using the haematoxylin channel after the image color deconvolution.

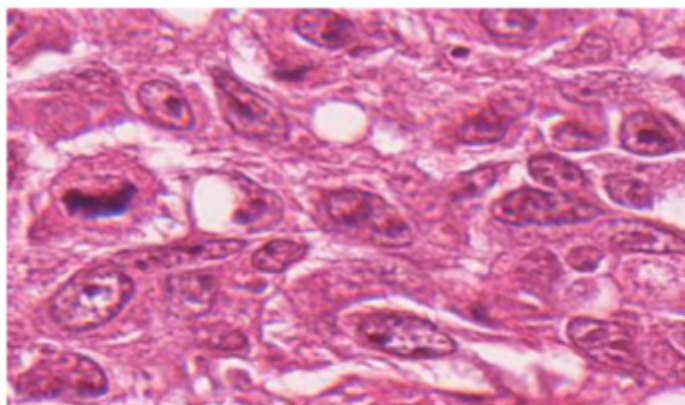


# WSI efficient BCG using dynamic sampling involving Voronoi Diagrams

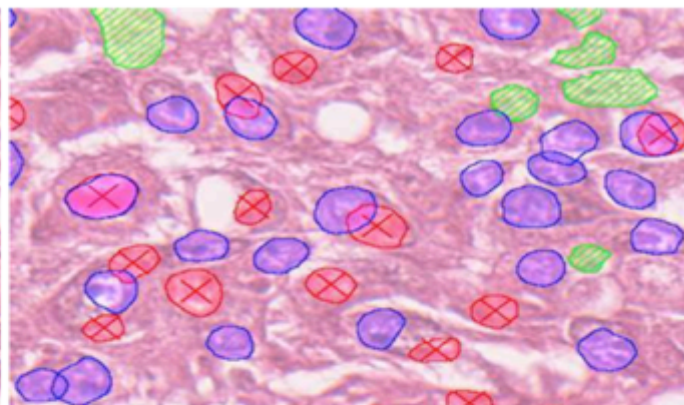


An Exploration Scheme for Large Images: application to Breast Cancer Grading, ICPR 2010

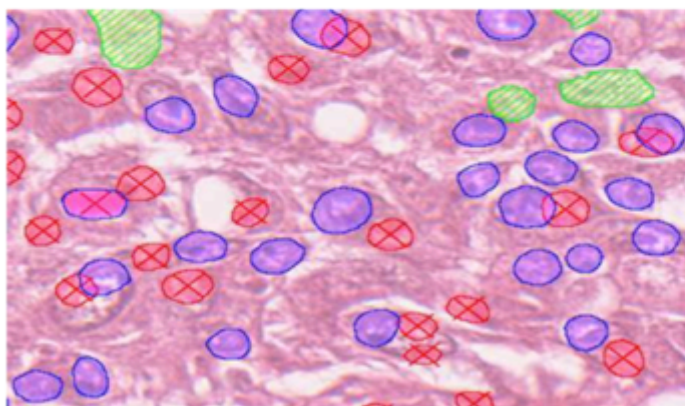
# Various MPP versions



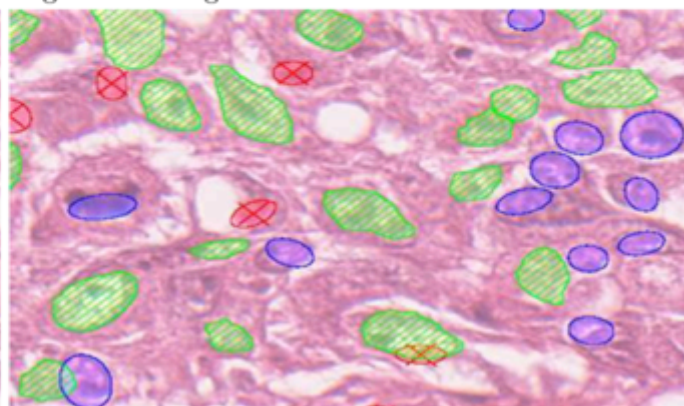
(a) H&E breast cancer surgical slide



(b) Results of Arbitrarily-Shaped Object MPP with a large radius range



(c) Results of Arbitrarily-Shaped Object MPP with a small radius range



(d) Results of Elliptically-Shaped Object MPP

Figure 3: Comparing results on a single H&E image of high grade



## ► Processing time ratio

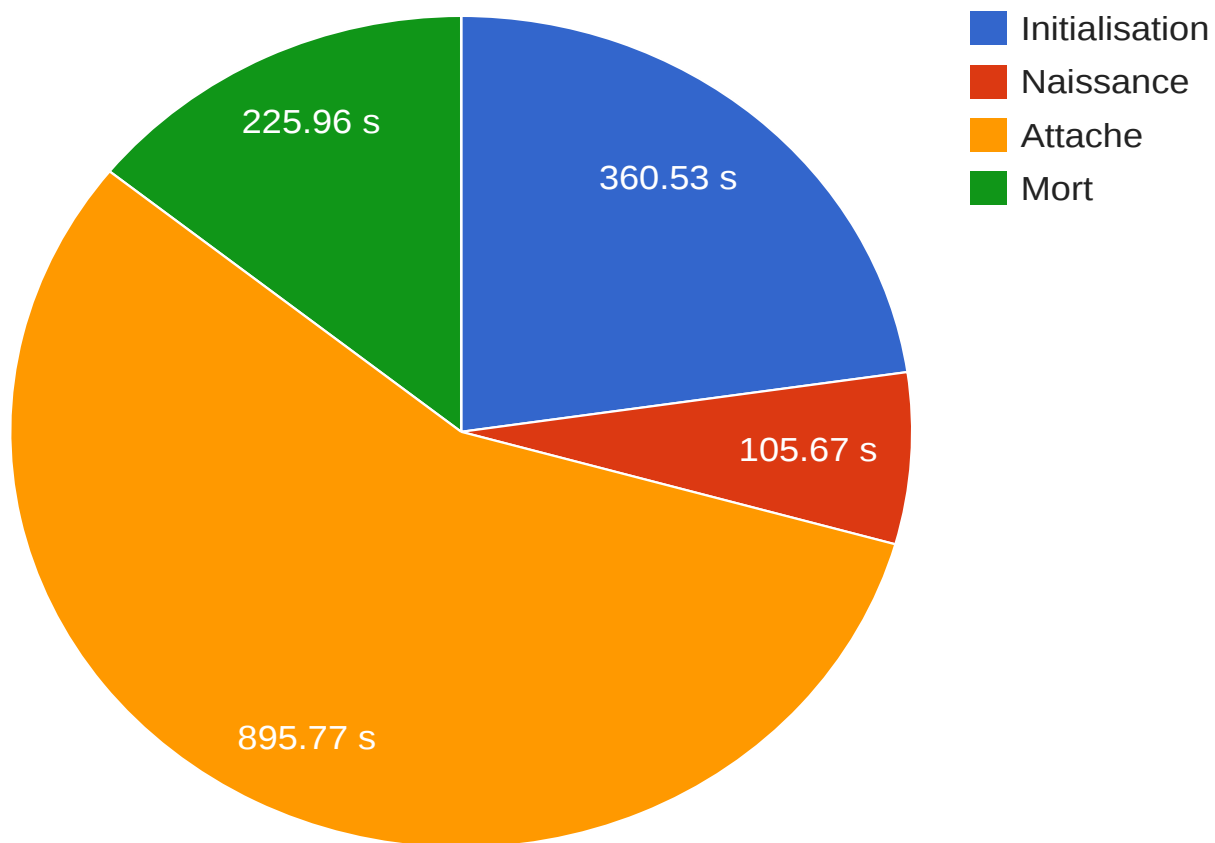


Image	Method	Manually	Detected	Matched	F. P.	F. N.	Jaccard	F-measure
01	ASO	171	89	77	12	94	0.42	0.59
01	ASO_small	171	130	110	20	61	0.58	0.73
01	ESO	171	174	134	40	37	0.64	0.78
02	ASO	133	276	109	167	24	0.36	0.53
02	ASO_small	133	323	116	207	17	0.34	0.51
02	ESO	133	134	66	68	67	0.33	0.49

Table 1: Quantitative results on a H&E image 01 of grade 1 and 02 of grade 3

$$F\text{-measure} = \frac{2 \cdot TP}{(2 \cdot TP + FN + FP)}$$

$$Jaccard\ index = \frac{TP}{(TP + FN + FP)}$$

Computation time in seconds on 3326x2971 pixel image:

[s]	Initialization	Birth	Energy	Death	Total
Sequential	360.53	105.67	895.77	225.96	1583.02
Multi-core	37.34	19.96	156.73	31.23	244.17
GPU	2.52	2.41	94.98	36.36	136.37

Acceleration ratio:

	Initialization	Birth	Energy	Death	Total
Multi-core	9.65	5.25	5.67	7.18	6.48
GPU	142.95	44.19	9.49	6.25	11.61

IPAL/BMIU

FlexMIm (Grand Emprunt, FUI project 2013-2016)

Collaborative Telepathology based on semantic imaging





- ▶ Treats the user needs, expressed by anatomo-pathologists, in a context of **decrease of their demography** and **increase of the number of medical acts**
- ▶ Provide the pathologists with tools increasing their **cooperative** (initial tele-diagnostic, tele-expertise, e-learning) and **collaborative capabilities**, based on whole slide imaging technologies
- ▶ Develop and setup **cognitive algorithms, driven by medical knowledge models** (image exploration and cancer grading rules, annotation procedures, valid medical ontologies), to identify specific regions of interest for pathological analysis/grading
- ▶ Provide innovative, effective solutions to **manage and manipulate WSI** according to the used devices and networks. Provide intelligent algorithms allowing **fluid data sharing and exchange** via telecommunication network in the «Télépathologie Ile de France» cluster.
- ▶ **Annotation and enrichment tools** using medical databases and ontologies, by bringing closer the imaging and patient data.
- ▶ “Télépathologie Ile de France” **evaluates and validates** efficient/effective cooperative and collaborative process proposed by FlexMIm, focusing on the anatomopathological imaging, in order to reach **concrete clinical use and dissemination**, by formalizing a professional reference.

# Etablissements impliqués et lien avec l'ARS

27 établissements impliqués dans  
FlexMIm

dont 17 établissements impliqués dans ARSIF

## CHU APHP

CHU Ambroise Paré  
CHU Antoine Bécère  
CHU Bicêtre-Paul Brousse  
CHU Bichat  
CHU Cochin  
CHU HEGP  
CHU Henri Mondor  
CHU Jean Verdier  
CHU Necker  
CHU Pitié Salpêtrière  
CHU Robert Debré  
CHU Saint Louis  
CHU Saint-Antoine  
CHU Trousseau

## CHG

CHG Eaubonne  
GHI Le Raincy-Montfermeil  
CHG Pontoise  
CHG Villeneuve St-Georges  
CHG Versailles

## ESPIC

Hôpital Foch  
Hôpital St Joseph

## CLCC

Institut Gustave Roussy  
Institut Curie

## Secteur libéral

ACP Bièvres  
Cabinet Tolbiac  
Cabinet de Pathologie Amiens  
Cabinet de Pathologie Compiègne

ARSIF

Pathologiste requérant  
Demande d'avis

Dysplasie sur MICI  
Biopsies de prostate  
Cancer du sein

FlexMIm

Plate-Forme de Télépathologie

Avis diagnostique  
par télépathologie  
conventionnelle

Pathologiste requis

Utilisation  
des outils  
FlexMIm

Pathologiste requis

1

- Un workflow exploitant le Cloud pour gérer, analyser et partager des données médicales de taille grandissante : → simplification de l'exploitation, services additionnels, contrôle de la qualité

2

- Des algorithmes permettant de pré-analyser la qualité d'une lame virtuelle

3

- pour permettre l'interprétation des lames

4

- Des algorithmes de compression validés par les pathologistes

→ pour assurer une visualisation fluide et fiable sur stations de travail et mobiles

Pour une plate-forme d'échanges multi-thématiques entre pathologistes (unique en France)

Vers une plate-forme d'échanges mais aussi d'aide automatique au diagnostic ou à l'établissement de scores pronostiques dans les cancers

IPAL/BMIU

A\*STAR JCO IAMS (2013-2016)

Integrated Autonomous Microscopy Systems: “Imaging anatomies of complex 3D cell culture systems”





## ► Specific aims:

- Suite of automated microscopy systems that can perform experiments automatically for a contiguous period of several days or weeks. **Complex 3D cell cultures.**

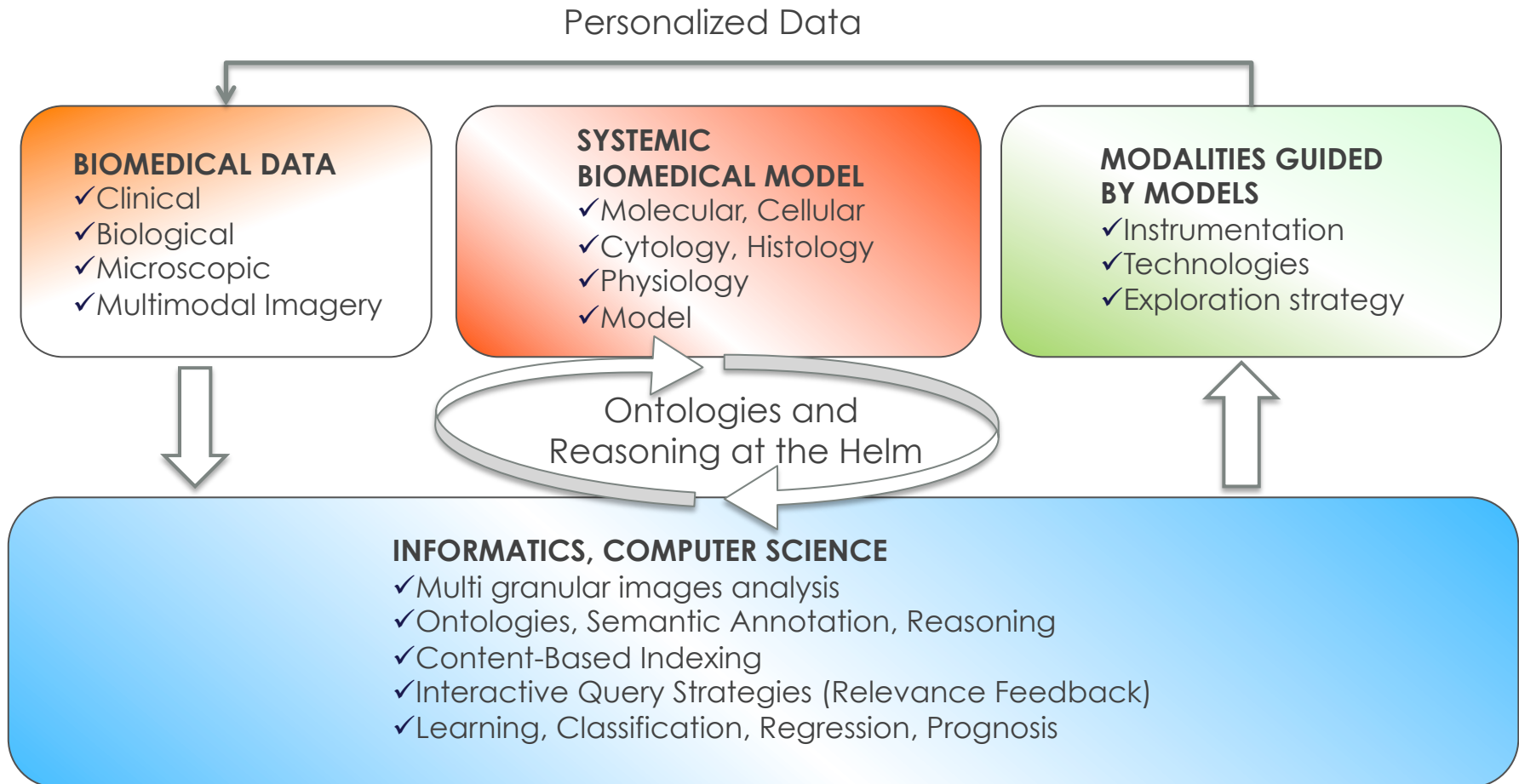
## ► Hypotheses:

- Enable biological experiments (**otherwise currently impossible to perform**) to be carried out **systematically**. We will provide enabling technologies to progress biological studies on 3D cell cultures and to **advance new pharmaceutical development.**

## ► Methodology:

- **Human neural stem cells, neurospheres, reconstructed skin and intestinal spheroids/crypts.** Assortment of **microscopy techniques**, which includes **light sheet, confocal, super-resolution**

- Combine microscopic exploration with symbolic and quantitative models and modalities



# Acknowledgement

- ▶ Dr Ludovic ROUX, IPAL/UJF



- ▶ Dr Antoine VEILLARD, IPAL/UPMC



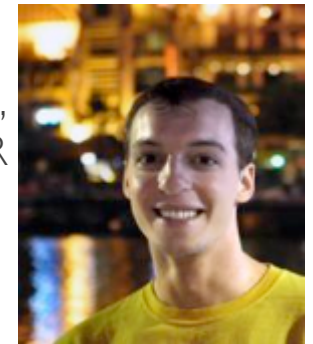
M. Christophe AVENEL, LIP6/UPMC



- ▶ M. Humayun IRSHAD, IPAL/UJF



- ▶ M. Olivier MORERE, IPAL/CNRS-A\*STAR



Prof. Frédérique CAPRON,  
Hospital Pitié -Salpêtrière,



- ▶ Dr Jacques KLOSSA,  
TRIBVN

