



P R E S E N T E D   A T

# RSNA<sup>®</sup> 2010

**PERSONALIZED MEDICINE:**  
In Pursuit of Excellence

## **Integrating bilateral information in the eigendetection CAD approach**

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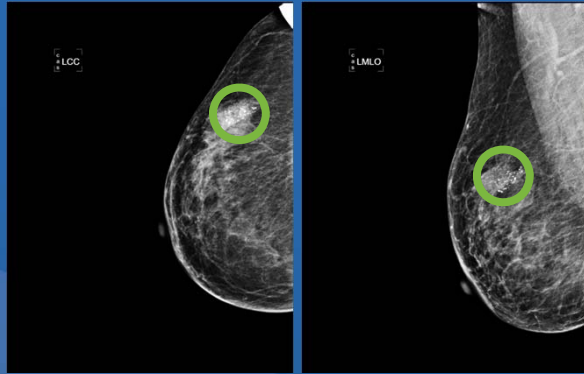
# MOTIVATION

# Screening Mammography Exam

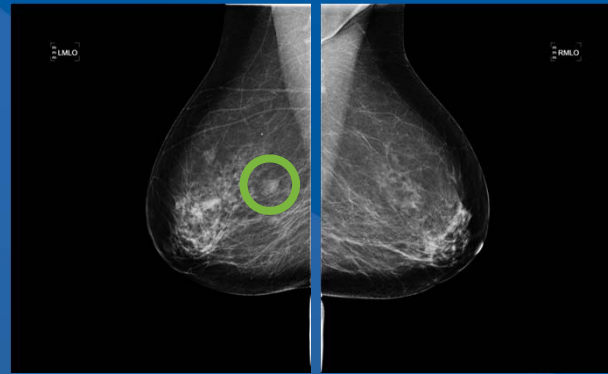


Four images are typically acquired during a screening mammography exam, CC and MLO views from left and right breasts. These images are inspected by radiologists to find signs of potential lesions.

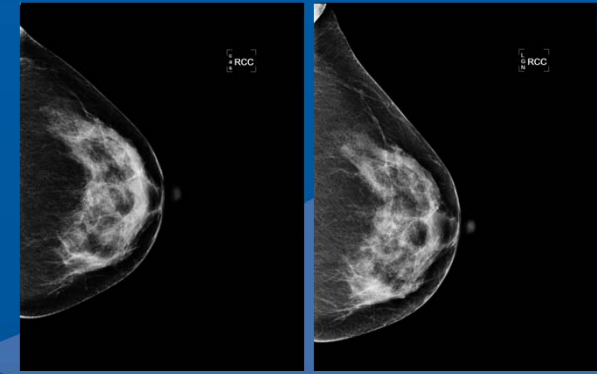
# Mammographic Image Comparison



**Ipsilateral  
comparison**



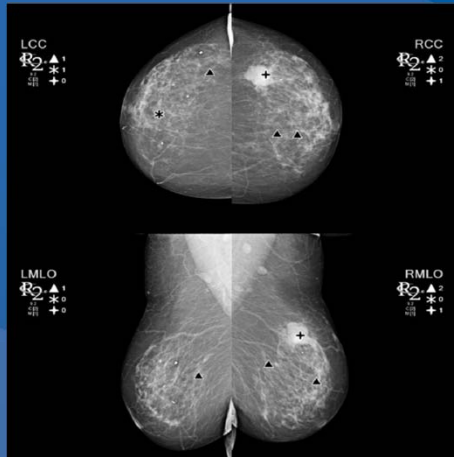
**Bilateral  
comparison**



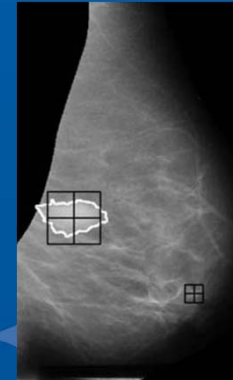
**Temporal  
comparison**

A common practice among radiologists during the image evaluation is to take not only single images but also multiple images of the same patient into account.

# Computer Aided Detection (CAD) Mammographic Systems

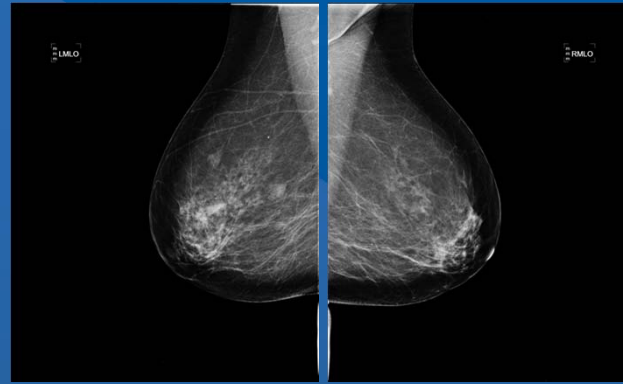
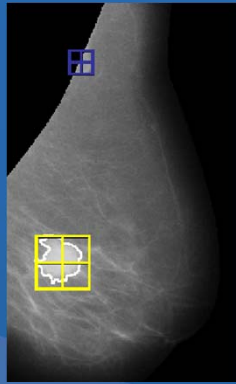


**Commercial CAD Systems**



**Our CAD System for  
detecting masses**

CAD mammographic systems usually analyze each image independently. However, the radiologists use information coming from multiple images.



**Dual Image  
CAD System**

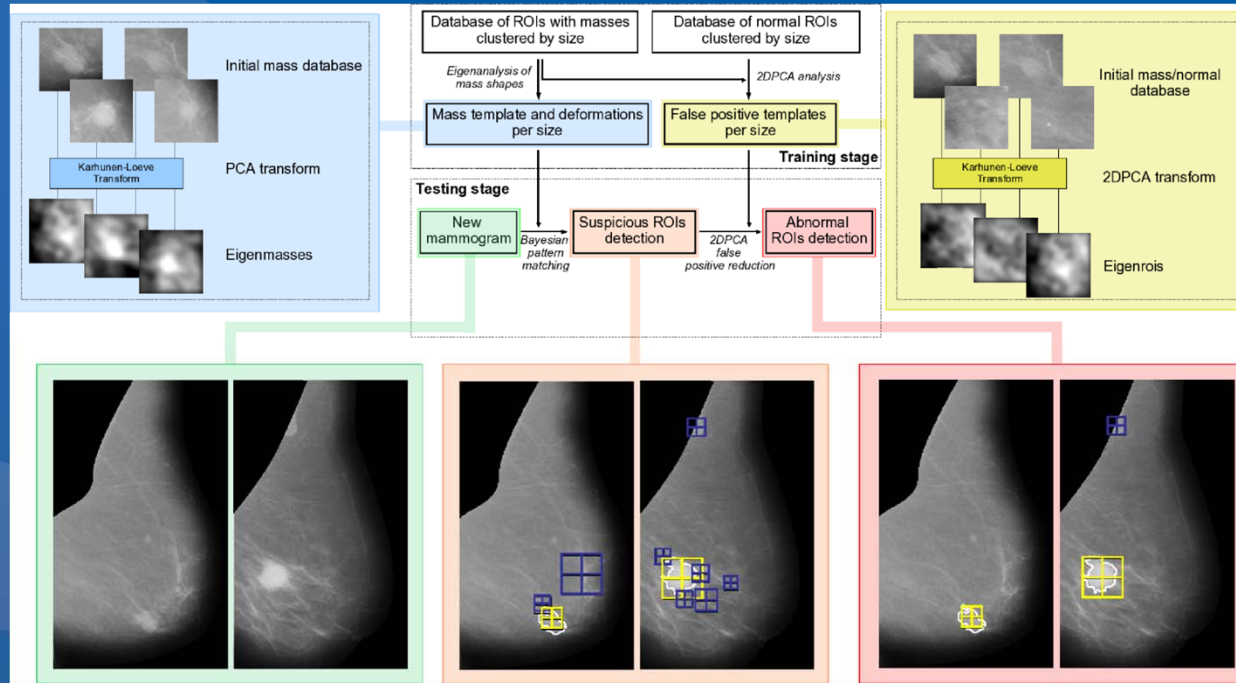
**Our Single Image  
CAD System**

**Bilateral  
Comparison**

The main idea of our research work is to transform our single image CAD system into a dual image one by adding information about the differences between left and right breasts.

# METHODOLOGY

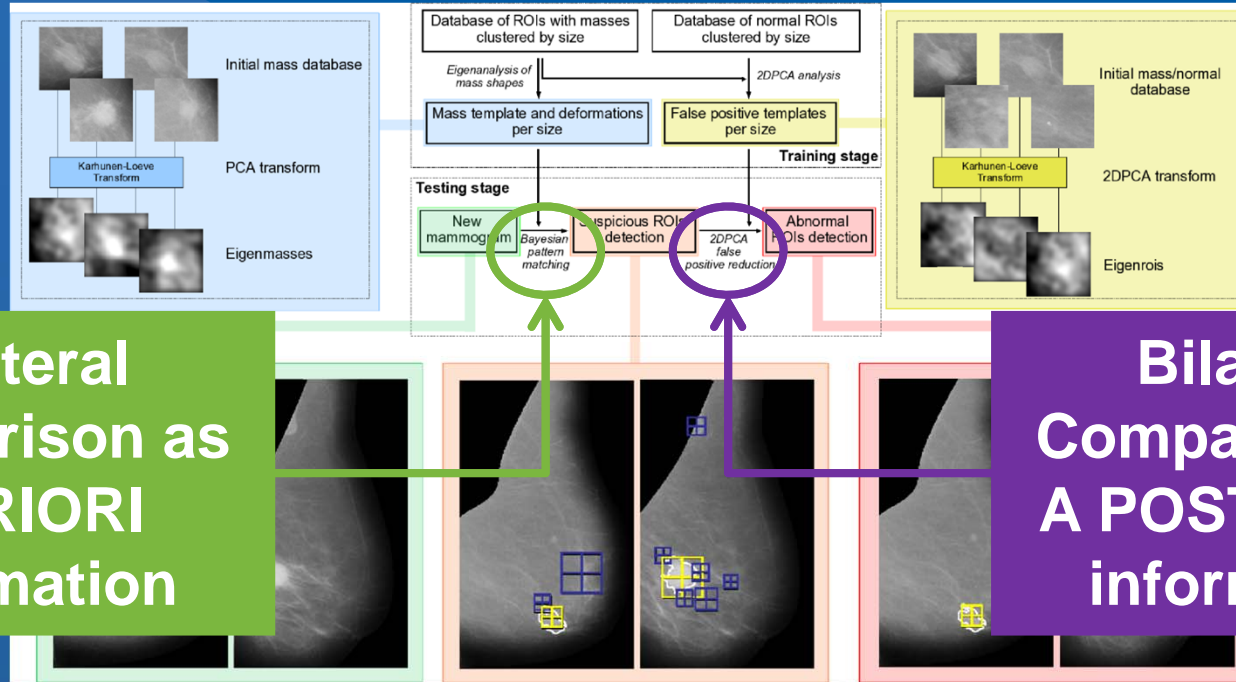
# Single Image CAD System



J. Freixenet, A. Oliver, et al., "Eigendetection of masses considering false positive reduction and breast density information", Med. Phys., vol.35, no.5, pp.1840-1853, 2008.



# Dual Image CAD System

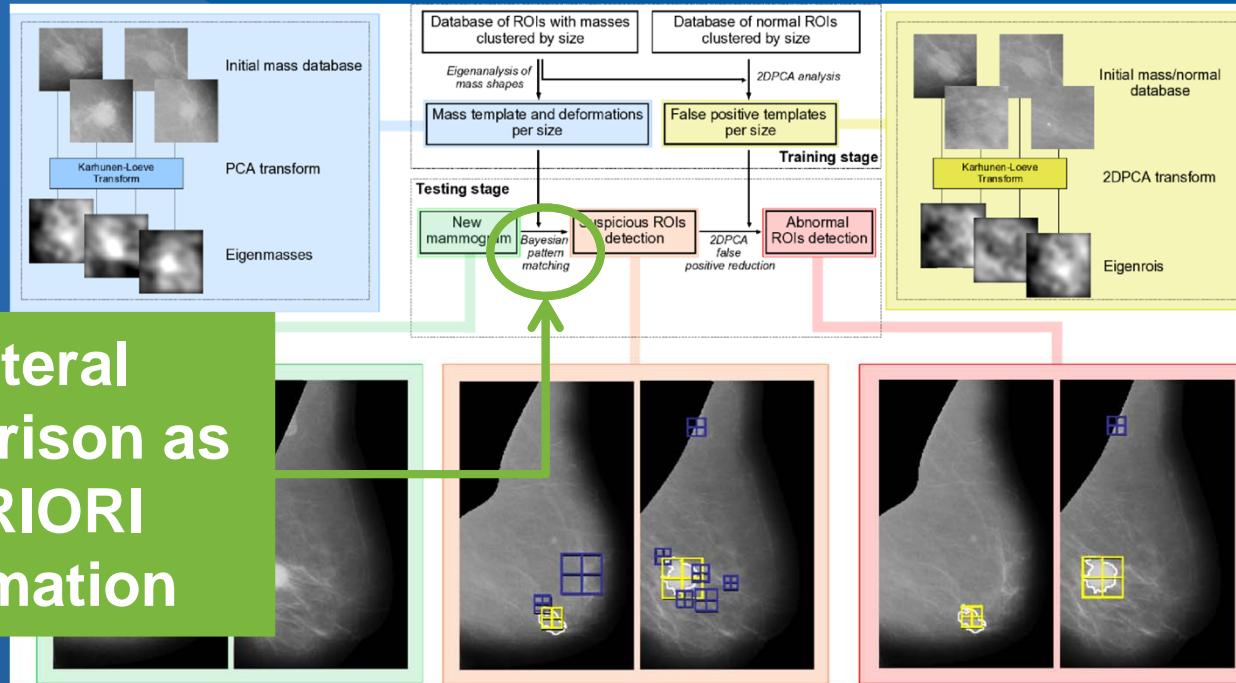


**Bilateral Comparison as A PRIORI information**

**Bilateral Comparison as A POSTERIORI information**

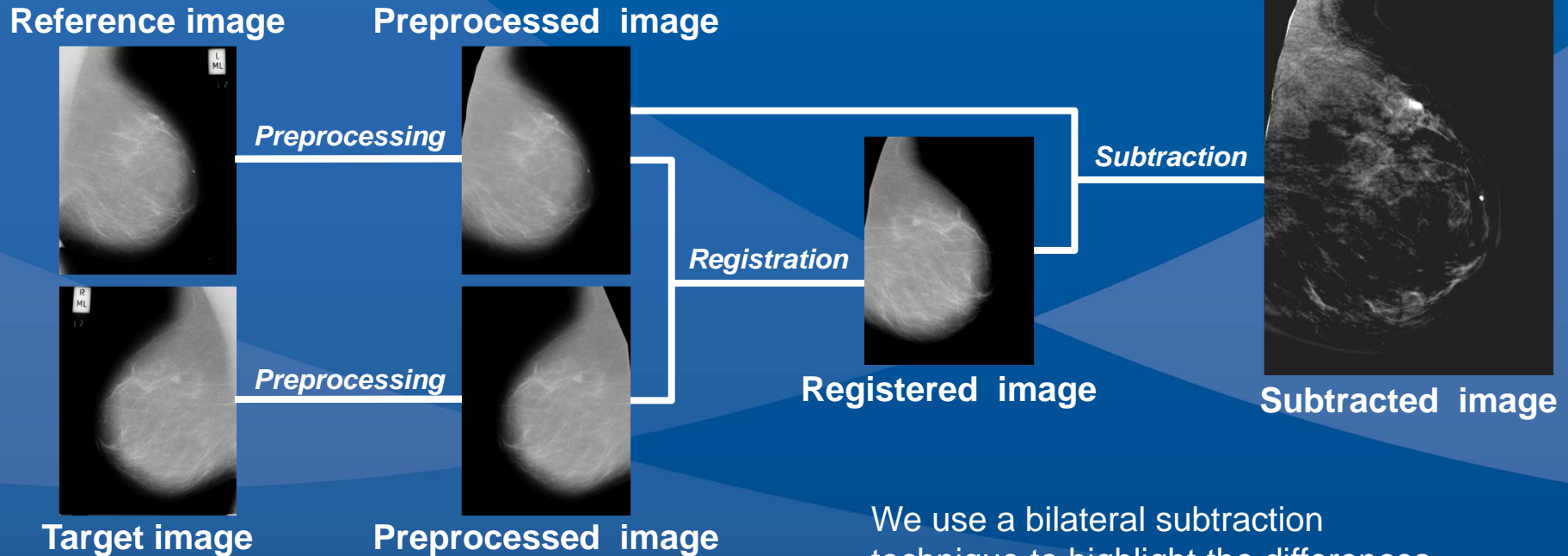
The bilateral information can be integrated as **a priori** information (during the detection stage) or as **a posteriori** information (during the false positive reduction stage).

# Dual Image CAD System



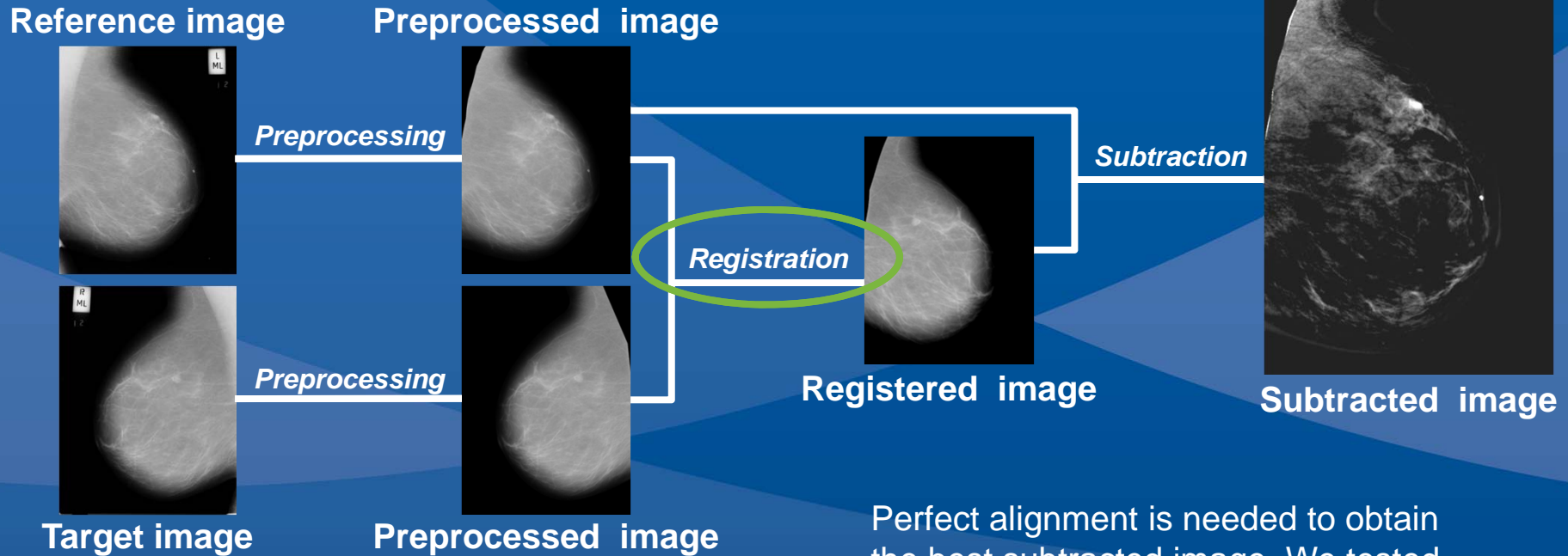
**Bilateral Comparison as A PRIORI information**

# Bilateral Comparison: Image Subtraction



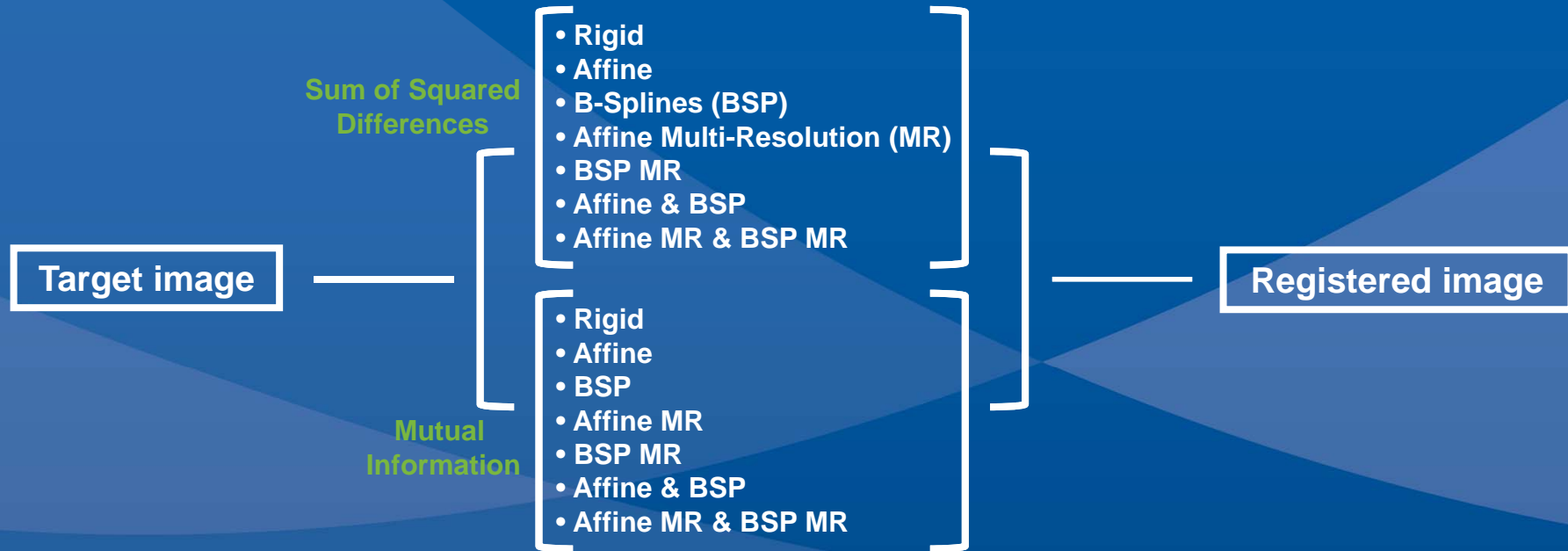
We use a bilateral subtraction technique to highlight the differences between breasts.

# Bilateral Comparison: Image Subtraction



Perfect alignment is needed to obtain the best subtracted image. We tested several registration methods.

# Registration Methods



We evaluated global and local registration methods, including multi-resolution approaches and several combinations. The transformation parameters are recovered by maximizing two different **metrics**.

# RESULTS

# Registration Evaluation (I)

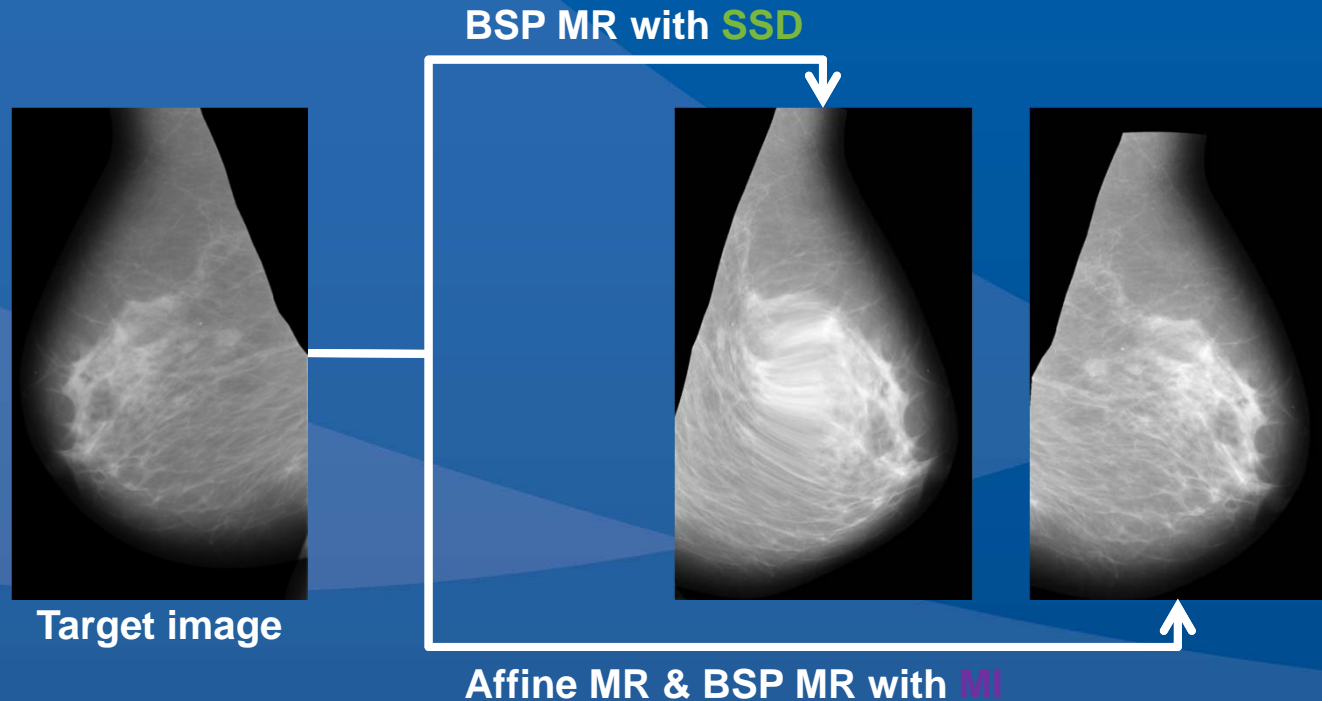
The evaluation was done using a set of 160 pairs of left and right MLO mammograms from the MIAS database.

**For SSD:** lower values indicate more similarity.

**For MI:** higher values indicate more similarity.

	Sum of squared differences		Mutual Information	
	Mean	Standard Deviation	Mean	Standard Deviation
<b>Rigid</b>	795.84	502.77	0.83	0.27
<b>Affine</b>	503.03	310.15	1.05	0.21
<b>BSP</b>	277.51	131.69	1.34	0.23
<b>Affine MR</b>	788.25	476.13	1.05	0.21
<b>BSP MR</b>	<b>218.56</b>	100.93	1.34	0.23
<b>Affine &amp; BSP</b>	276.69	143.14	1.37	0.21
<b>Affine MR &amp; BSP MR</b>	221.30	111.29	<b>1.38</b>	0.22

# Registration Evaluation (II)

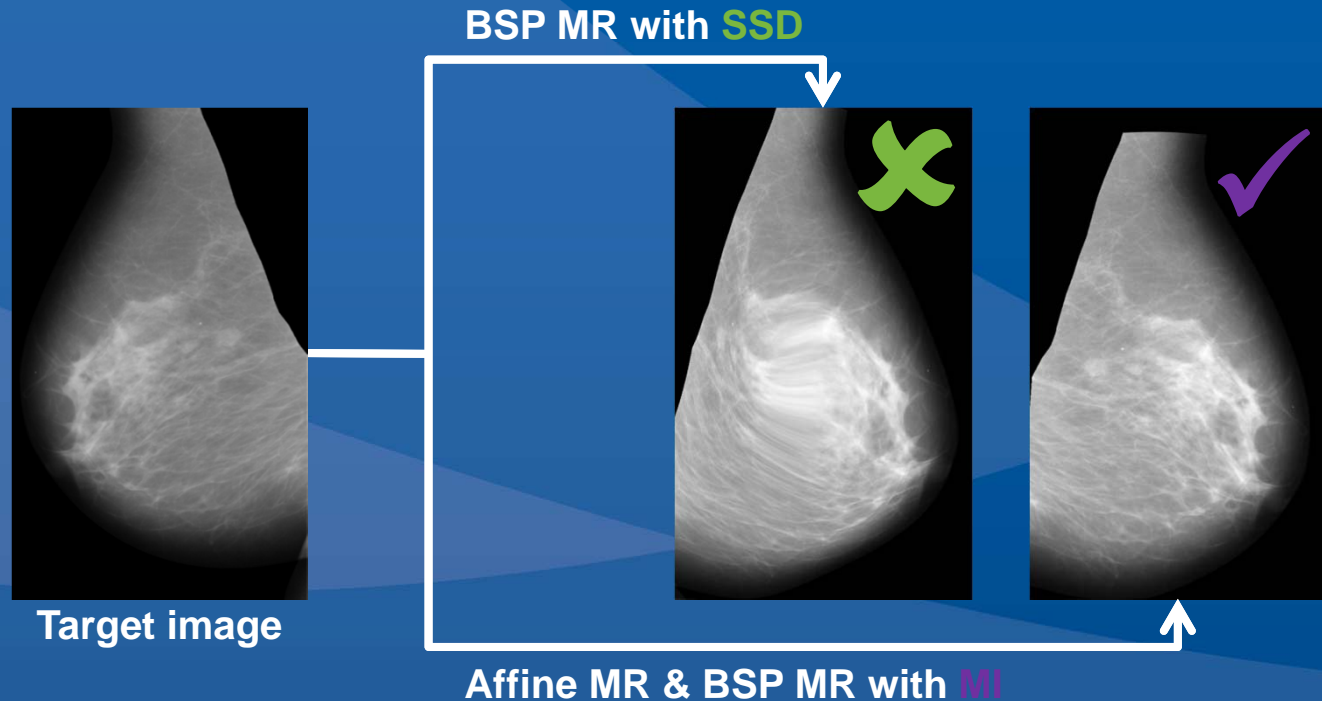


To determine the metric we performed a visual assessment.

**MI** provided better results than **SSD**.



# Registration Evaluation (II)

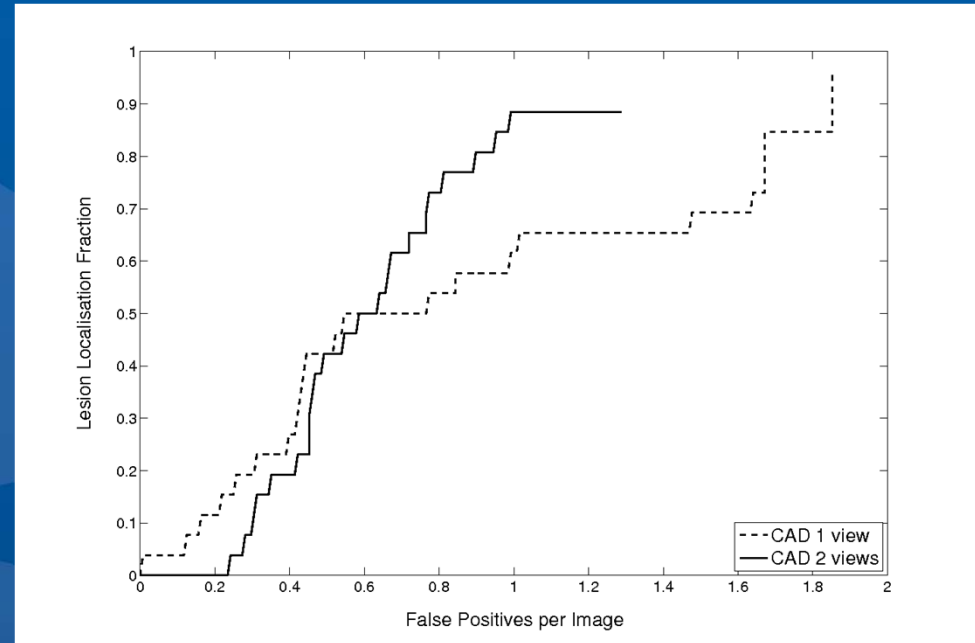


Therefore, Affine MR & BSP MR with MI was used in our experiments.

# FROC analysis for CAD Evaluation

The evaluation was done in terms of FROC analysis using a set of 104 pairs of left and right MLO mammograms from the MIAS database containing 52 mammograms with at least one mass and a leave-one-pair-out methodology.

At higher sensitivities the dual image CAD improved the single image one. For instance, at a 88% of sensitivity, the false positives per image were 1.85 for the single system and 0.99 for the dual one.



# CONCLUSIONS & FUTURE WORK

# Conclusions

- Affine MR combined with BSP MR using Mutual Information as metric has provided the best results when registering bilateral images.
- Including bilateral comparison as *a priori* information has improved the performance of our single-image CAD system at higher sensitivities.

# Further Work

- To evaluate the influence of introducing breast density information in the training step.
- To analyze the use of bilateral registration information as a false positive reduction method.
- To test our approach with a full-field digital database.