

# Ensemble approach for differentiation of melanoma

Mojdeh Rastgoo, Olivier Morel, Franck Marzani and Rafael Garcia Univeristé de Bourgogne - Le2i, Universitat de Girona - Vicorob



# Introduction

#### Melanoma

- ▶ The deadliest type of skin cancer
- ▶ The **most treatable** kind of **cancer** conditioned to its **early stages**.
- Diagnosis by visual inspection of **dermoscopy** images based on **ABCDE** rule

# Challenges

- ▶ Time consuming
- > prone to errors due to similar characteristics of the lesions

## ► Melanoma CAD system

- ▶ CAD systems are proposed to facilitate the specialists
- ▶ CAD systems were proposed using different datasets

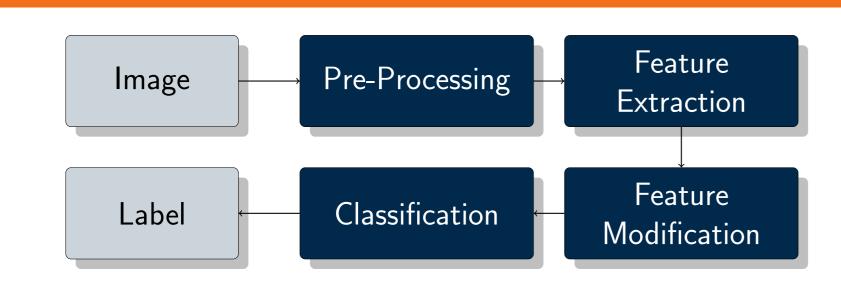
# ► Review of state-of-the-art

- ▶ Lack of benchmark in the proposed CAD systems
- Classification mostly based on single base learner
- ▶ Features to mimic dermatologists assessments: Shape and Colors

#### Motivation

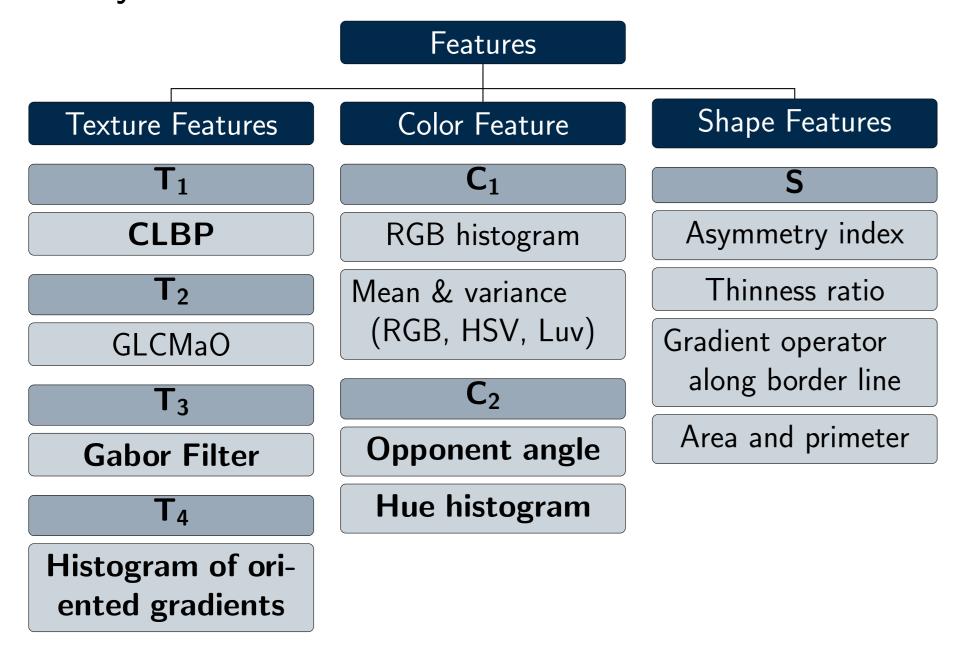
- Comparison of previously used **color** and **shape** features with well-known **texture** features
- ▶ Ensemble learning methods instead of single base learner
- ▶ Using a recently public benchmark PH² dataset

# **Automated Classification Framework**



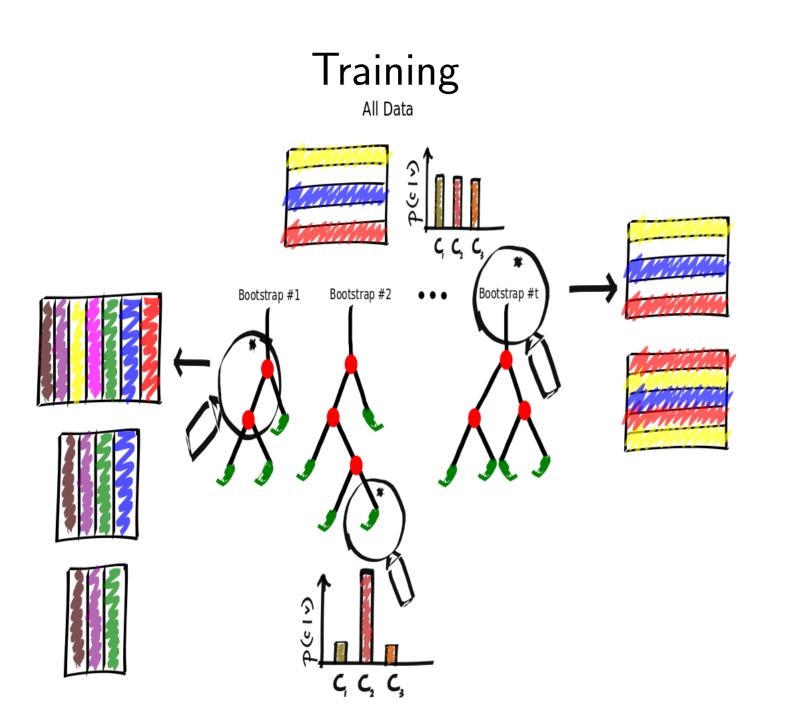
## **Feature Extraction**

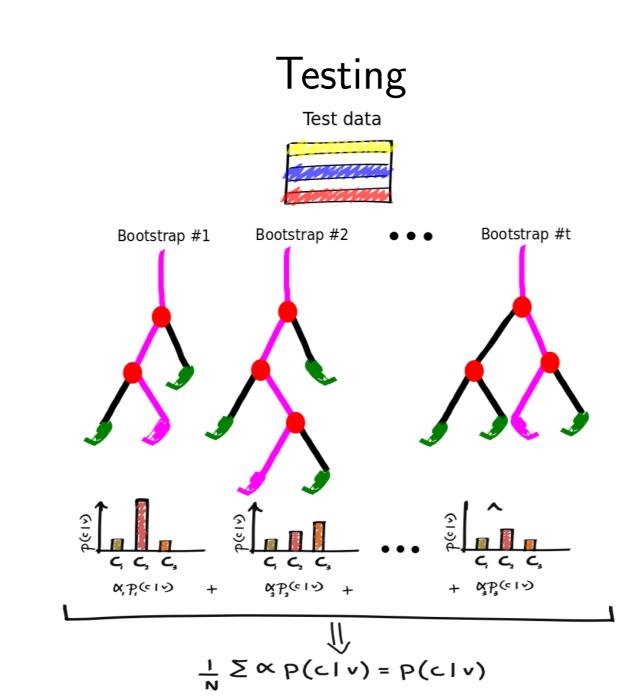
► Global feature extraction approach from the segmented lesions - **features** did not or rarely been used in this field



# **Ensemble Classifier**

► Random forest (RF) ensemble





Weighted combination ensemble

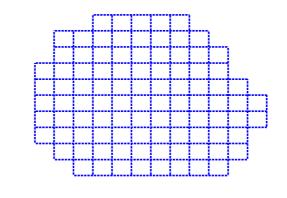
# **Experiment**

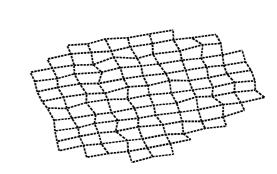
# ► PH<sup>2</sup> Dataset

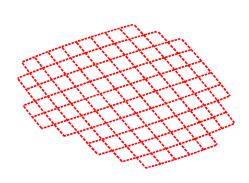
- ▶ First public dermoscopic dataset
- Acquired at Dermatology Service of Hospital Pedro Hispano, Matosinhos, Pourtugal
- ▶ 200 lesions, 40 melanoma, 80 benign and 80 dysplastic lesions
- Dur subset contains 39 melanoma, 78 benign and 76 dysplastic lesions. Seven lesions are removed due to artefacts such as hair occlusions.

#### Validation

- Description of the Development of the Unbalanced data
- Oversampling in data space generating synthetic melanoma images by deforming the original images
- ▶ First approach: random deformation using Gaussian grid (RDGM) N(5,5),  $R=80^{\circ}$
- $\triangleright$  Second approach: barrel deformation (BD) barrel distortion ,  $R=145^{\circ}$







Original grid

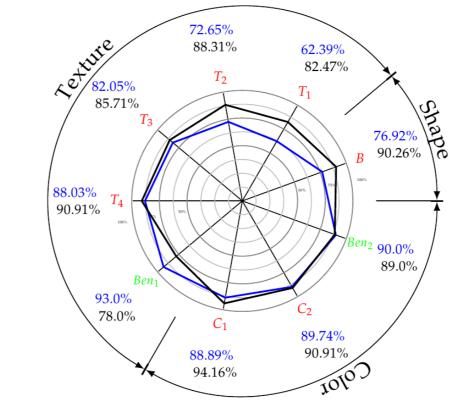
RDGM deformation

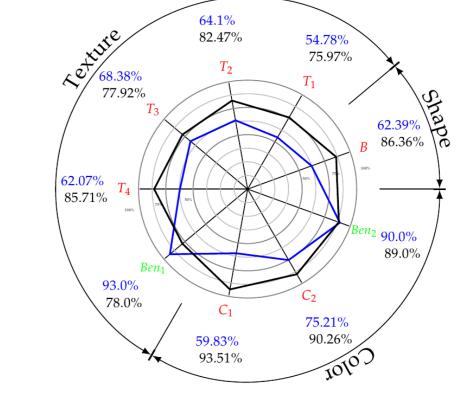
BD deformation

One-vs-all classification

# Results

Individual features

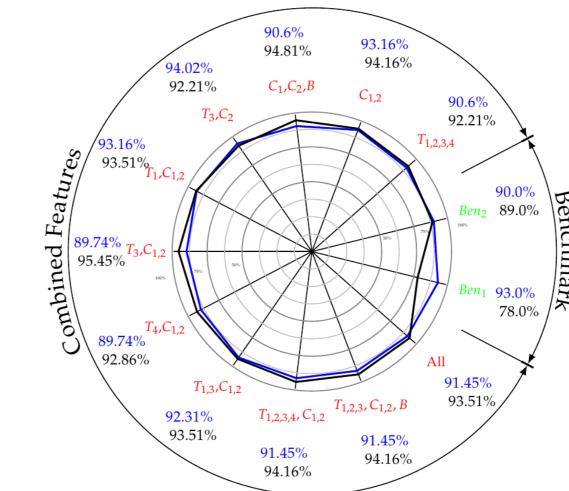


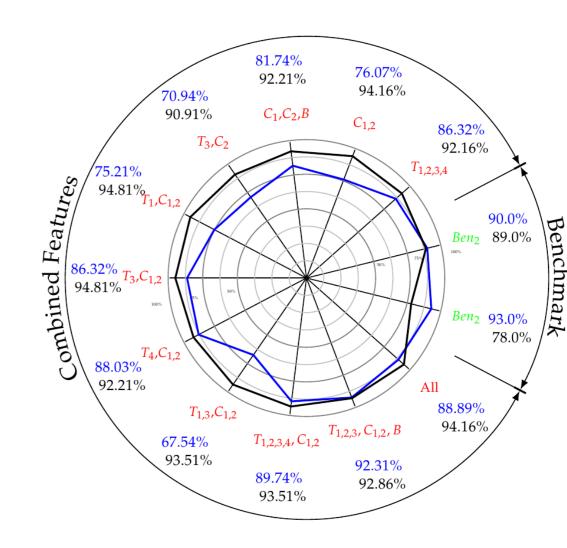


RF ensemble

Weighted ensemble

Combination of features





RF ensemble

Weighted combination ensemble

The features, sensitivity and specificity are presented in red, blue and black, respectively. The Ben<sub>1</sub> and Ben<sub>2</sub> represent the benchmark results, obtained by [Barata et al., 2014]. with color and texture features respectively.

# Conclusion

- ► RF ensemble outperforms the single learners
- ► The obtained results by RF ensemble and combination of several features outperform the benchmark results without over-fitting
- ► Texture features such as Histogram of Oriented Gradients and Gabor filters and the new Opponent color angle prove to be effective for classification of melanoma lesions in comparison to previously color and shape features

# References

Barata, C., Ruela, M., Francisco, M., Mendona, T., and Marques, J. (2014). Two systems for the detection of melanomas in dermoscopy images using texture and color features.

*IEEE Systems Journal*, 8(3):965–979.