

Computational Dermatology - Developing and Testing Algorithms to Segment Images Based on Hair Density



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Alopecia Areata (AA) introduction

Clinical motivation?

- 6.8 million people in the US, 147 million worldwide^[1].
- Quantifying abnormal hair density needed to track progression.

Current Methods

- Simple diameter measurement methods used.
- Severity of Alopecia Tool (SALT) score.
- CHOP's Alopecia app.

What we want!

- Quick, reliable and consistent quantification methods.
- Development of a computer-based automated segmentation tool.

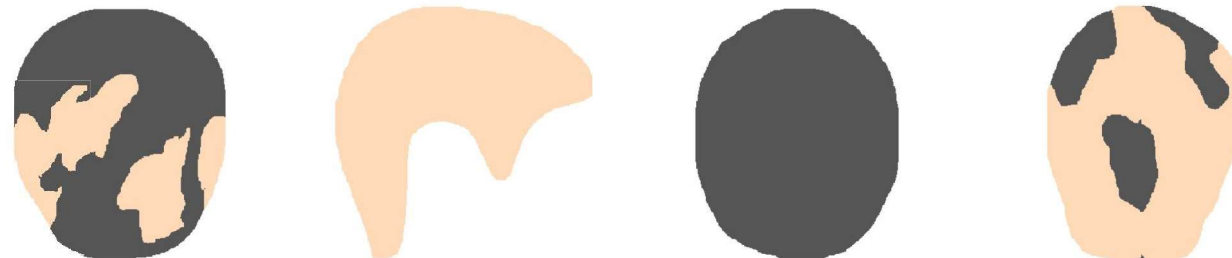
[1] www.naaf.org - National Alopecia Areata Foundation 2018

Pediatric Alopecia Areata dataset

- 251 de-identified images from CHOP's hair clinic
- Four different orientation (left, back, top, right)



- Manually labelled masks

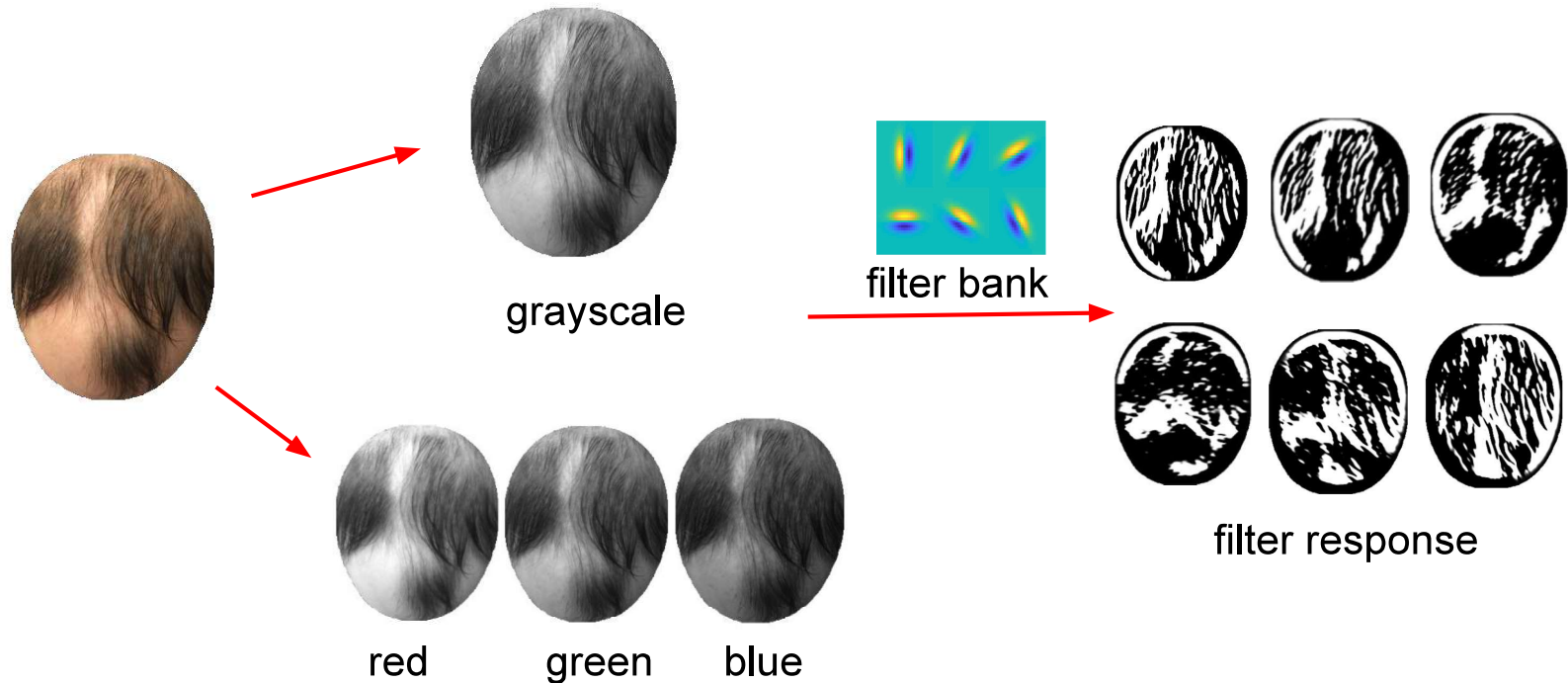


abnormal
normal

Feature exploration

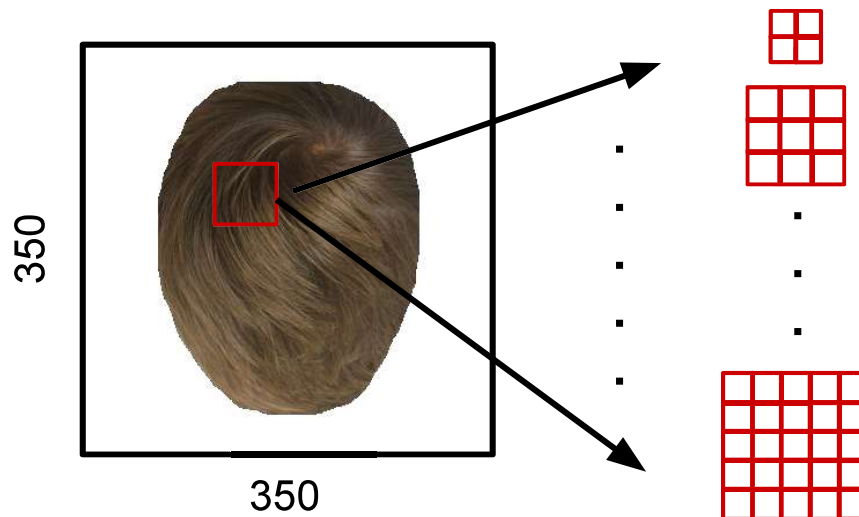
Pixel \longleftrightarrow hair density information

- Color channels
- Filter responses



Feature exploration: pixels to patches

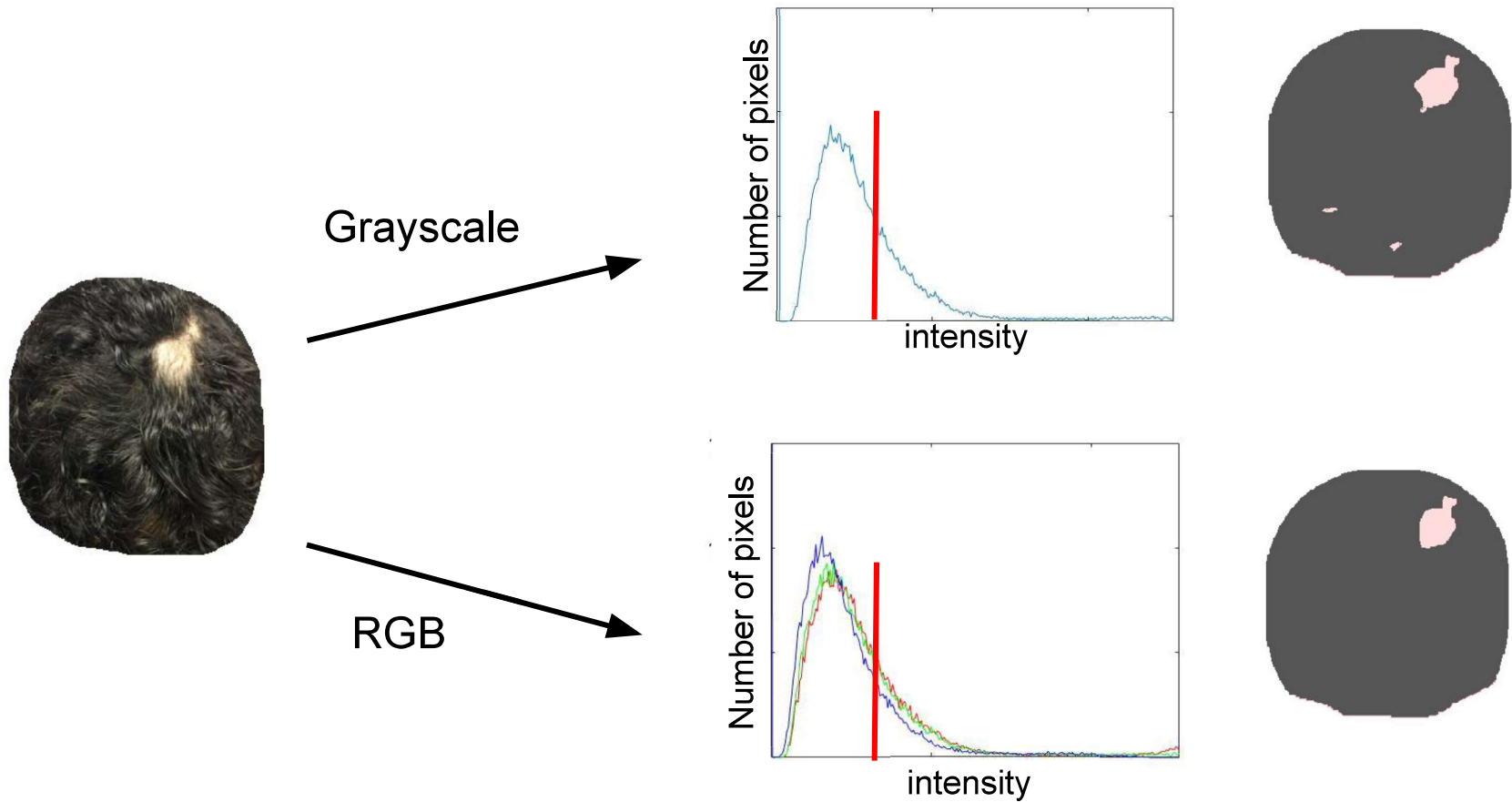
- Patch size: from $k \times k$ to the entire image
- Neighborhood Statistics: mean value, standard deviation, maximum/minimum value, intensity range



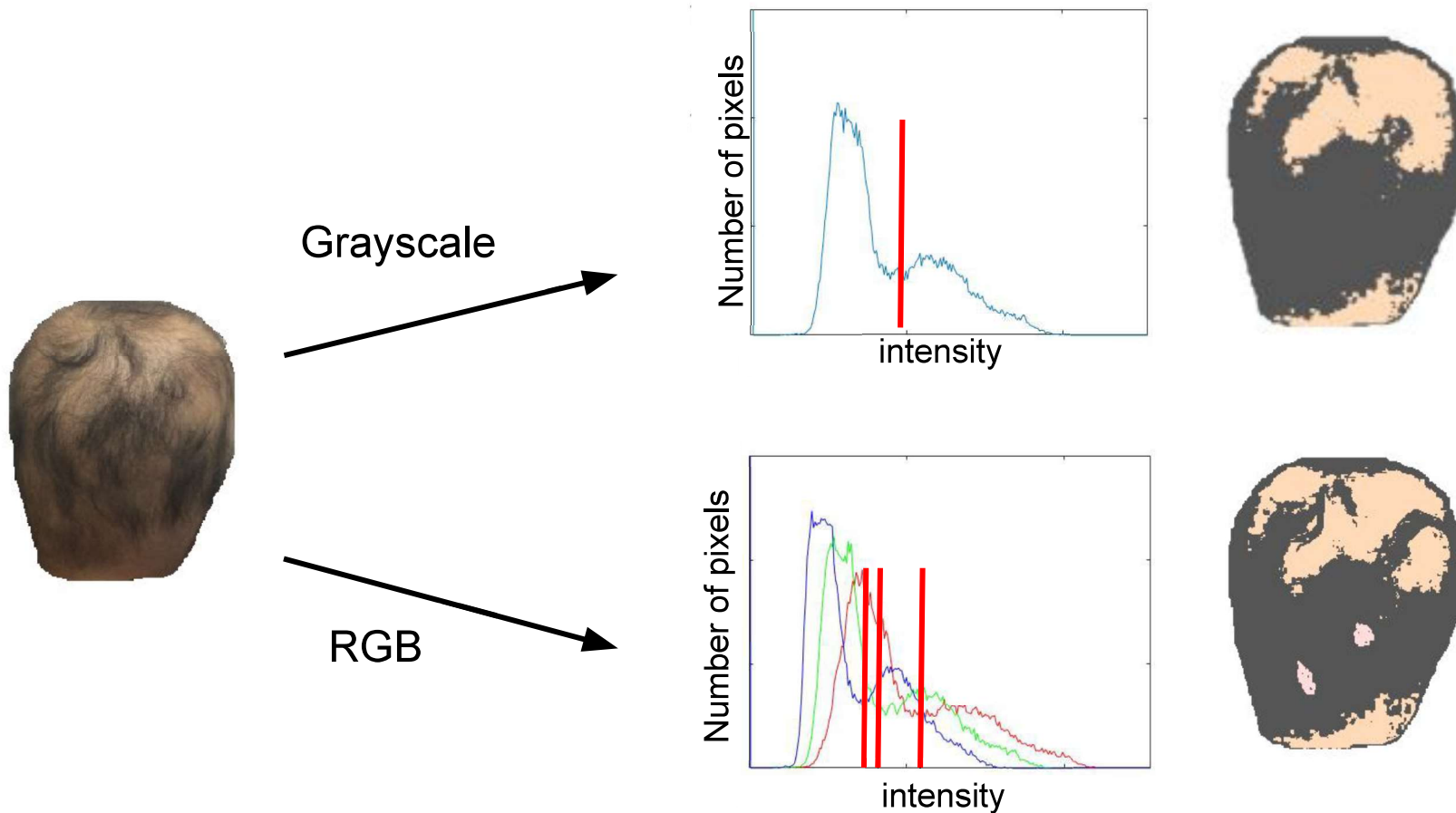
Hair density segmentation

- Unsupervised
 - Histograms and thresholding
 - K-means
- Supervised
 - K-Nearest Neighbours (KNN)
 - Random Forests (RF)
 - Naive Bayes (NB)
 - Logistic Regression (LR)
 - Fully Connected Neural Networks (FCNN)

Histograms and thresholding

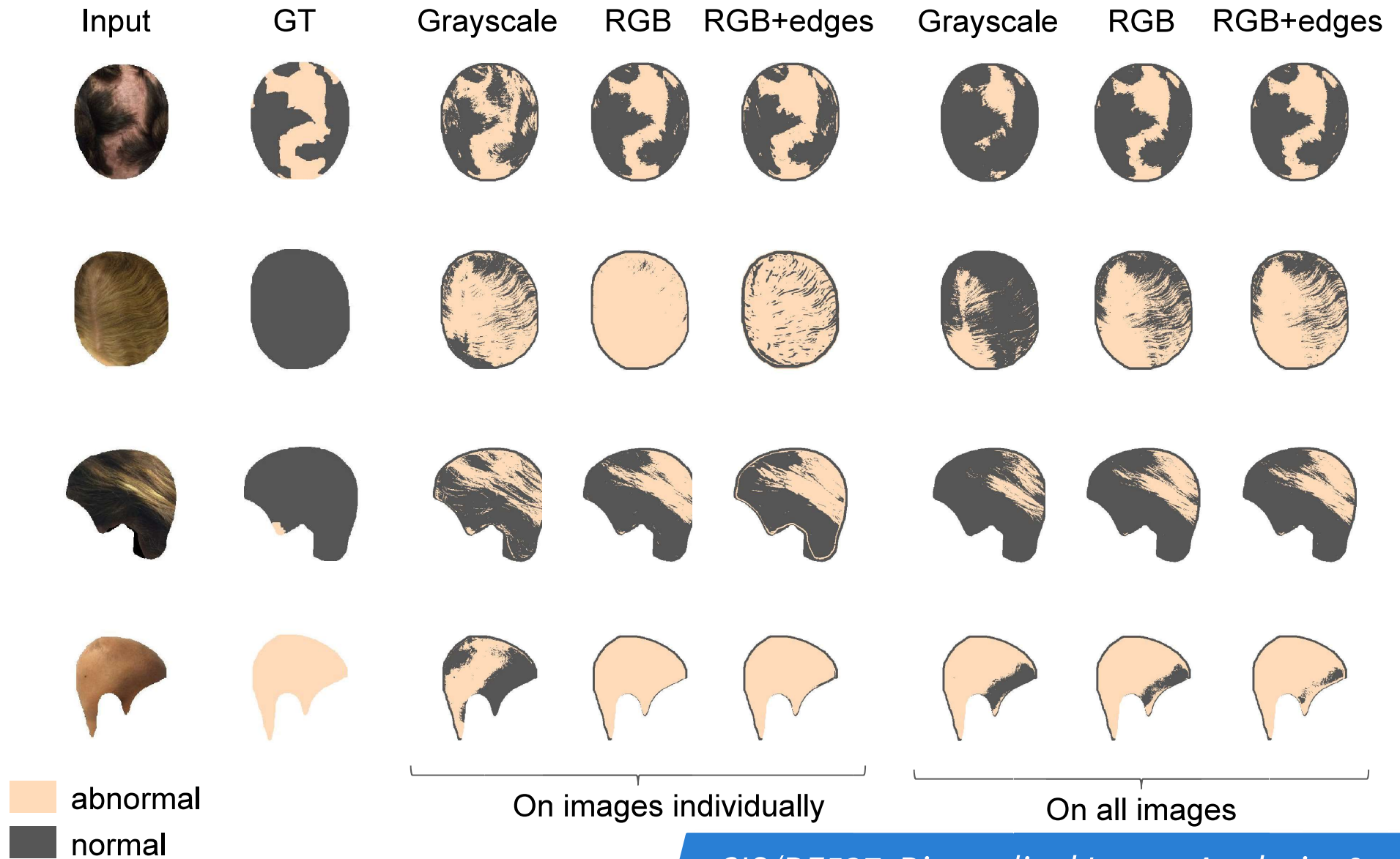


Histograms and thresholding

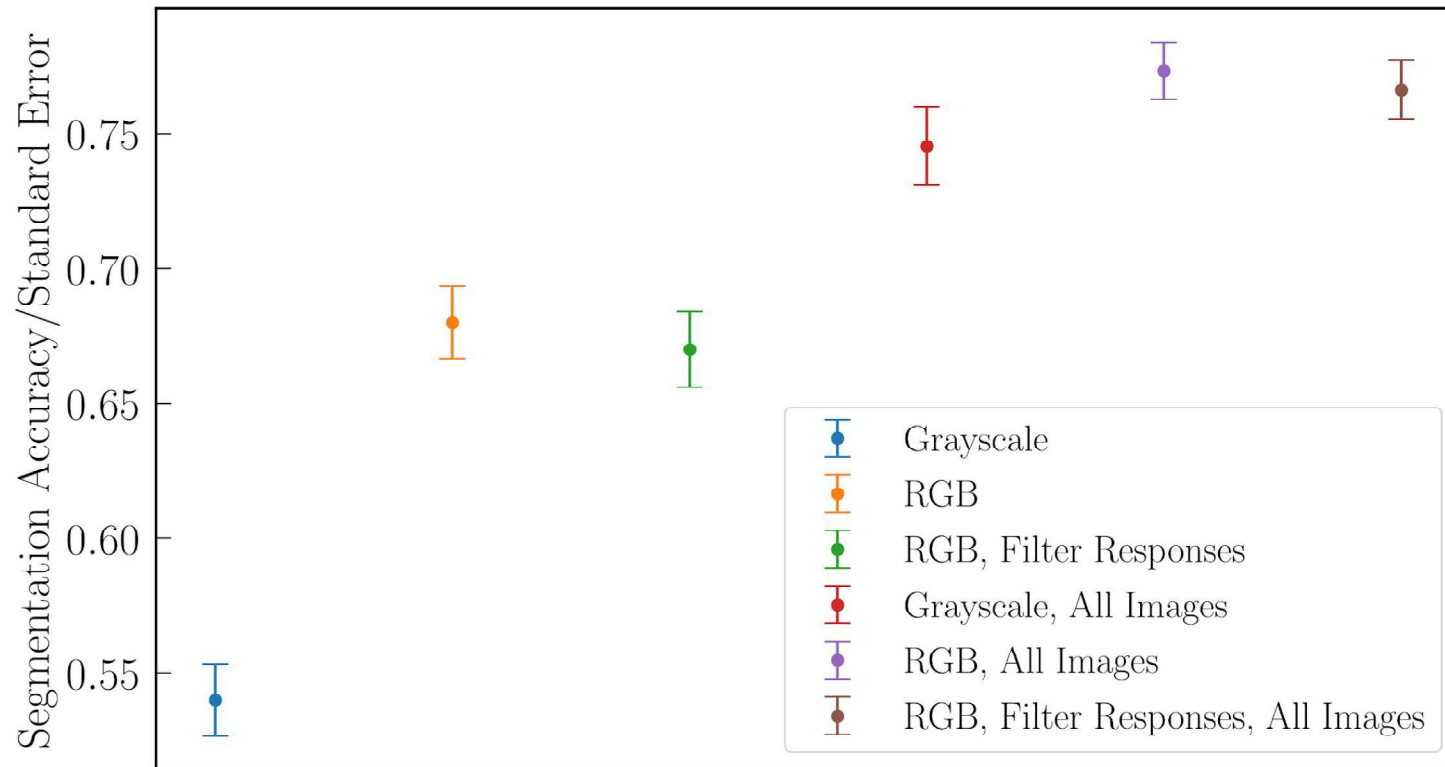


Even if we can find such thresholds, this method is not scalable.

Sample segmentations by K-means

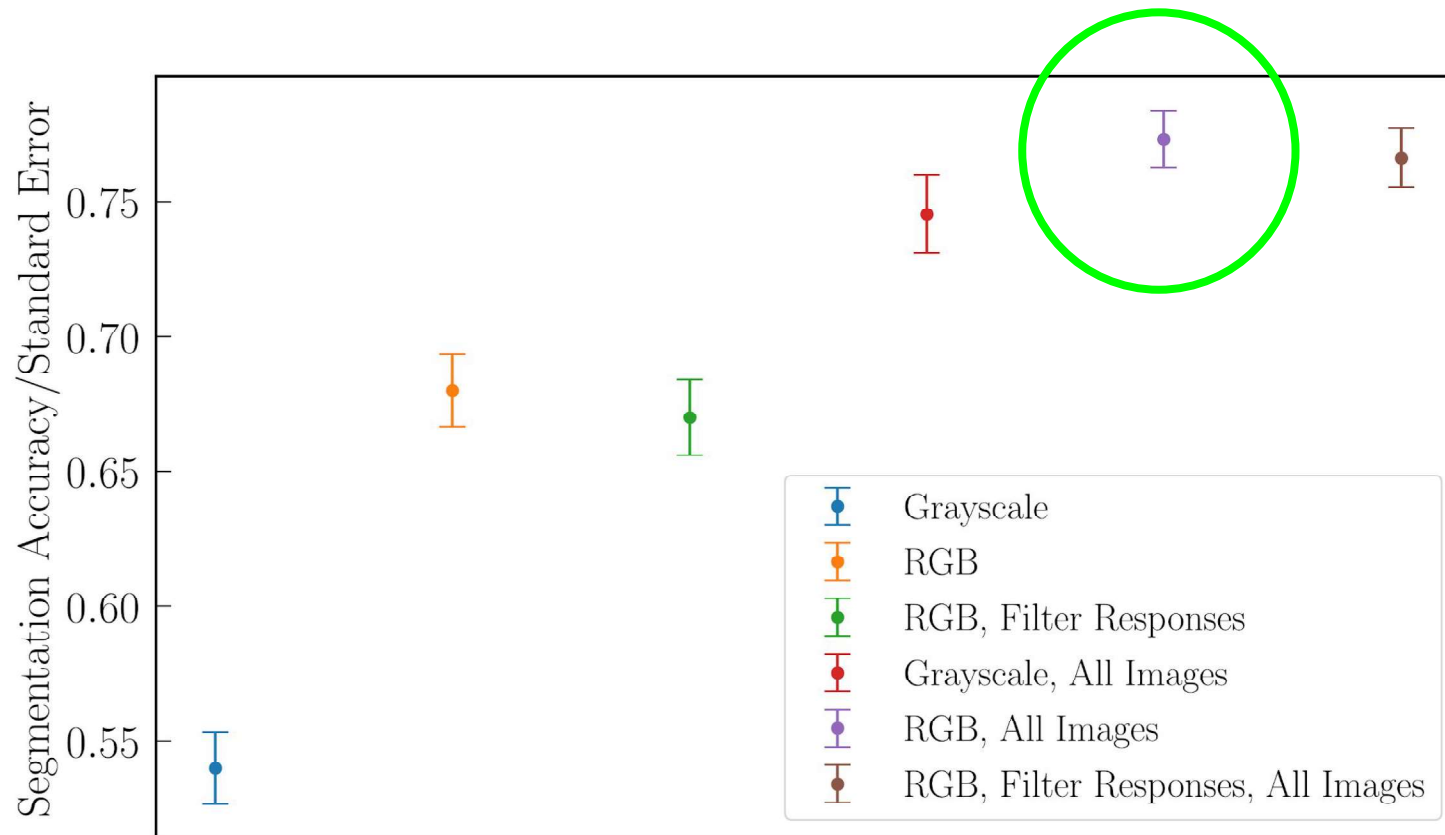


Quantitative evaluation



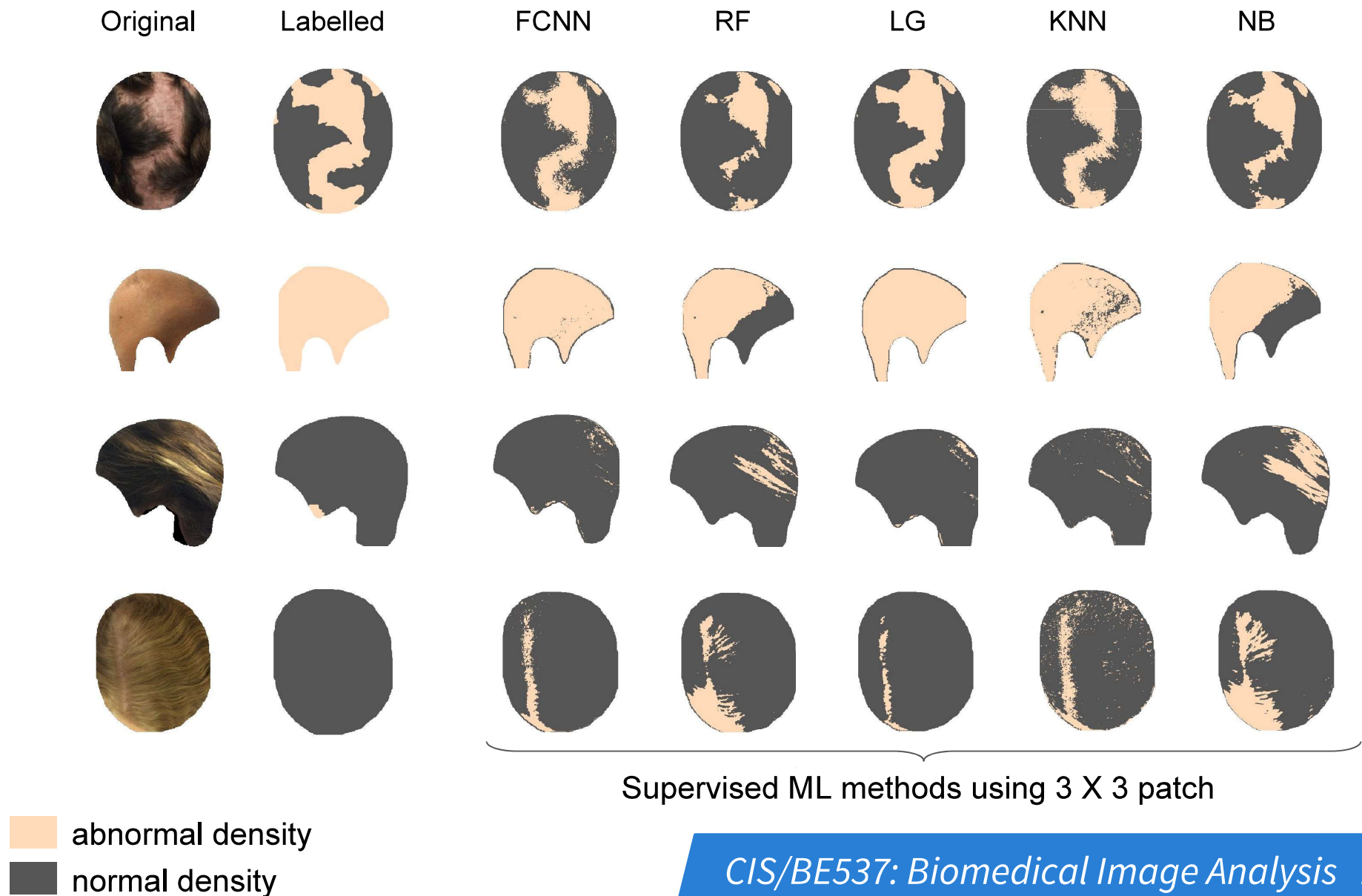
$$\text{Segmentation Accuracy} = \frac{\# \text{ of correctly labelled pixels}}{\# \text{ of all pixels}}$$

Quantitative evaluation

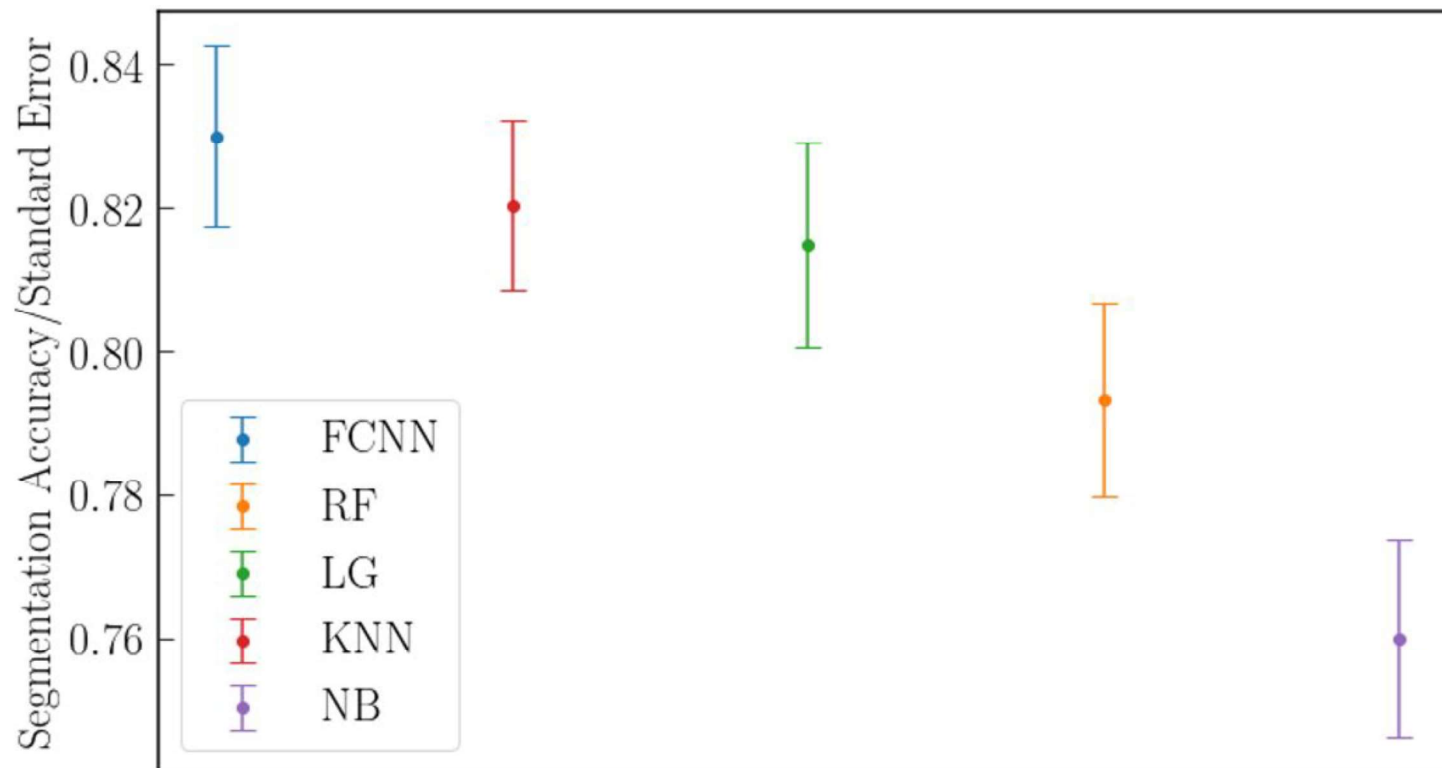


$$\text{Segmentation Accuracy} = \frac{\# \text{ of correctly labelled pixels}}{\# \text{ of all pixels}}$$

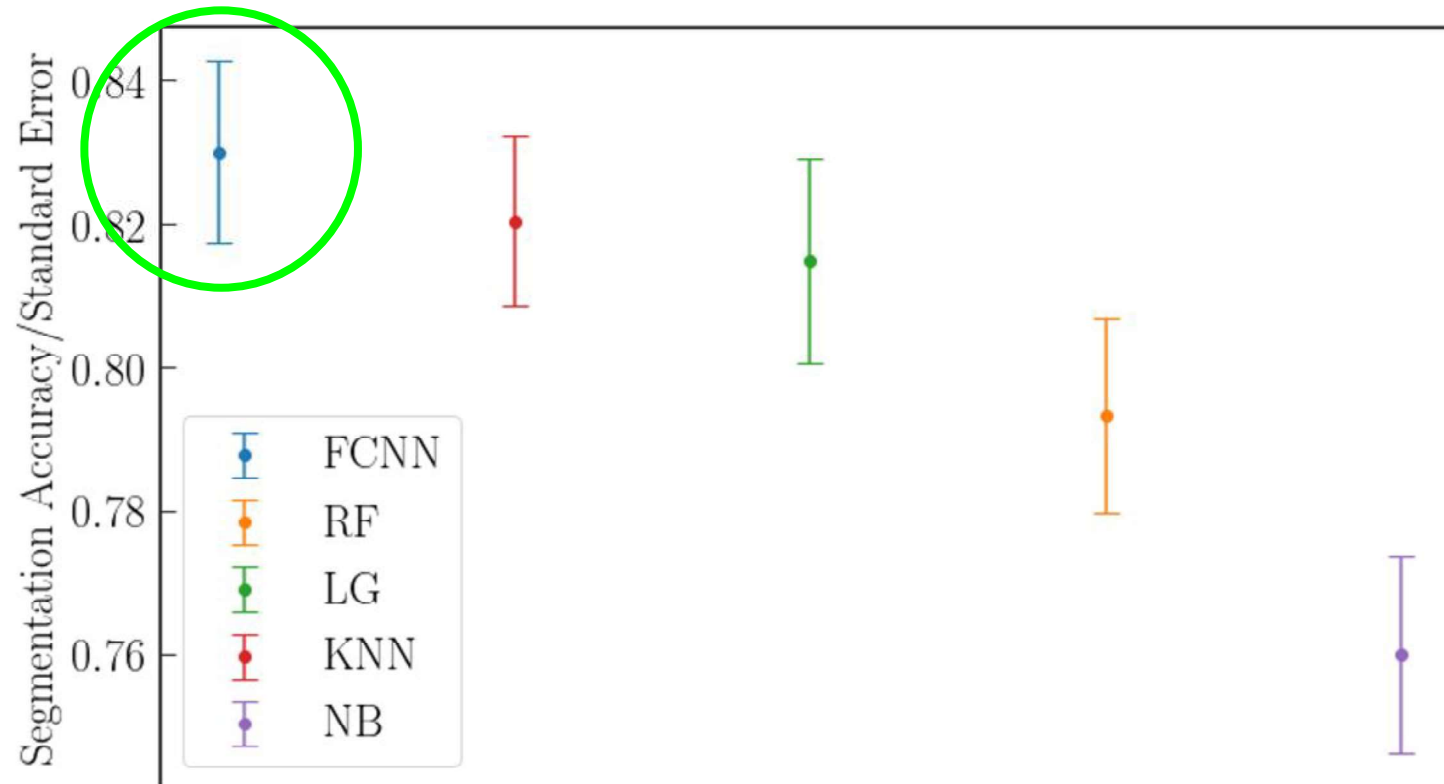
Sample segmentations by ML algorithms



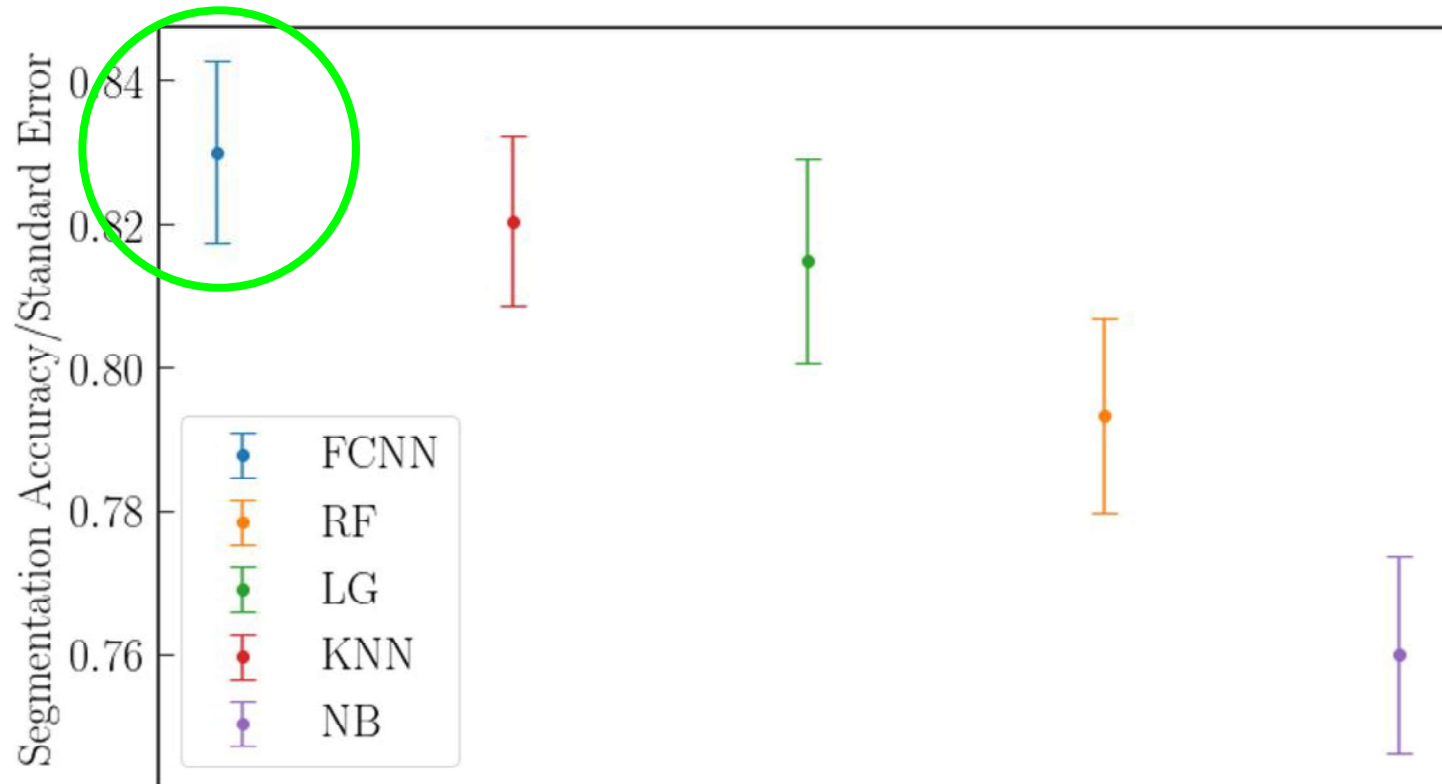
Quantitative evaluation of ML models



Quantitative evaluation of ML models



Quantitative evaluation of ML models



Note: >10% better than Appopecia app!

Scope for improvement

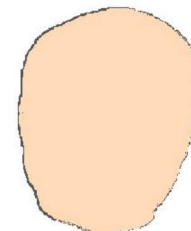
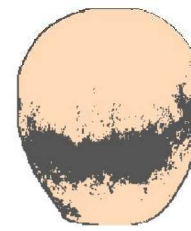
Original





Labelled



FCNN



 abnormal density
 normal density

Conclusions: It was a hairy problem!

- Supervised preferred over unsupervised
- Visual/Clinical meaning of hair density regions
- Edges cannot be used to encode hair density information.
- Combining features is an art!
- RGB patches better than grayscale
- Hair color! Skin contrast!

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THANKS