

# LeAFtool

Lesion Area Finding tool



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Research on plant diseases requires the acquisition of quantitative data to characterize and quantify the symptoms caused by different pathogens, especially lesions on leaves. The most relevant variables used to characterize disease impact are the number of lesions per unit of leaf area, the area and the shape of the lesions.

We developed LeAFtool (Lesion Area Finding tool), an R package aimed to automatically analyze visible lesions on an infected leaf. Automatic scoring of relevant variables increase precision and repeatability while avoiding experimenter biases. LeAFtool has been encapsulated in a graphical, user-friendly interface (GUI), but can also be used in command line mode.

## Methodology

### Training

Training step is based on supervised learning (pixel colors in RGB or HSV)

Matrix of pixels for training

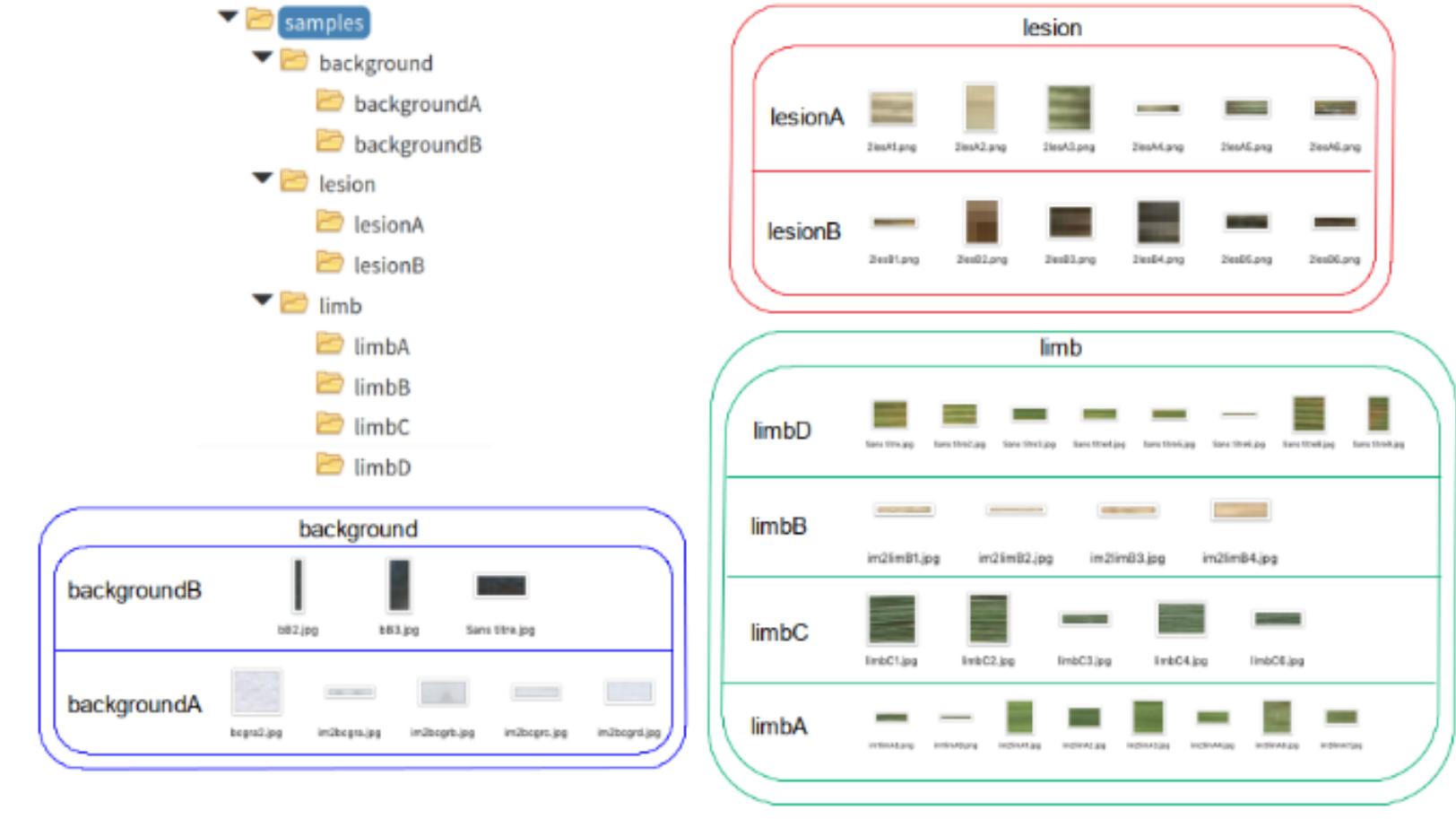
group	red	green	blue	
background	0.988235	0.972549	0.968627	
background	0.788235	0.788235	0.780392	background
limb	0.235294	0.392157	0.164706	limb
limb	0.215686	0.372549	0.137255	
lesion/lesion1	0.749020	0.603922	0.396078	lesion/lesion1
lesion/lesion2	0.760784	0.603922	0.400000	lesion/lesion1
lesion/lesion2	0.980392	0.980392	0.392157	lesion/lesion2
lesion/lesion2	0.992157	1.000000	0.419608	lesion/lesion2

Classification of the training set

group	red	green	blue	predict
background	0.988235	0.972549	0.968627	background
background	0.788235	0.788235	0.780392	background
limb	0.235294	0.392157	0.164706	limb
limb	0.215686	0.372549	0.137255	limb
lesion/lesion1	0.749020	0.603922	0.396078	lesion/lesion1
lesion/lesion2	0.760784	0.603922	0.400000	lesion/lesion1
lesion/lesion2	0.980392	0.980392	0.392157	lesion/lesion2
lesion/lesion2	0.992157	1.000000	0.419608	lesion/lesion2

Error rate: 0.04%

Confusion matrix

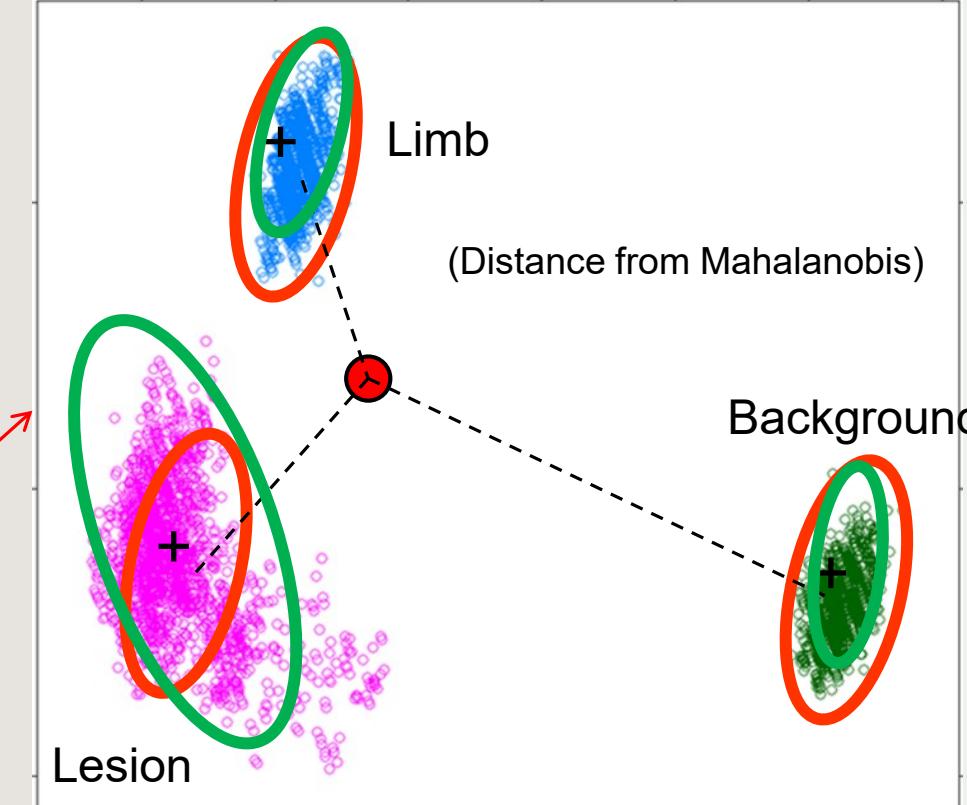


Three input folders are mandatory for training

The interface allows the editing of lesions (deletion of false lesion), and the filtering of information according to parameters (surface area, shape,...)

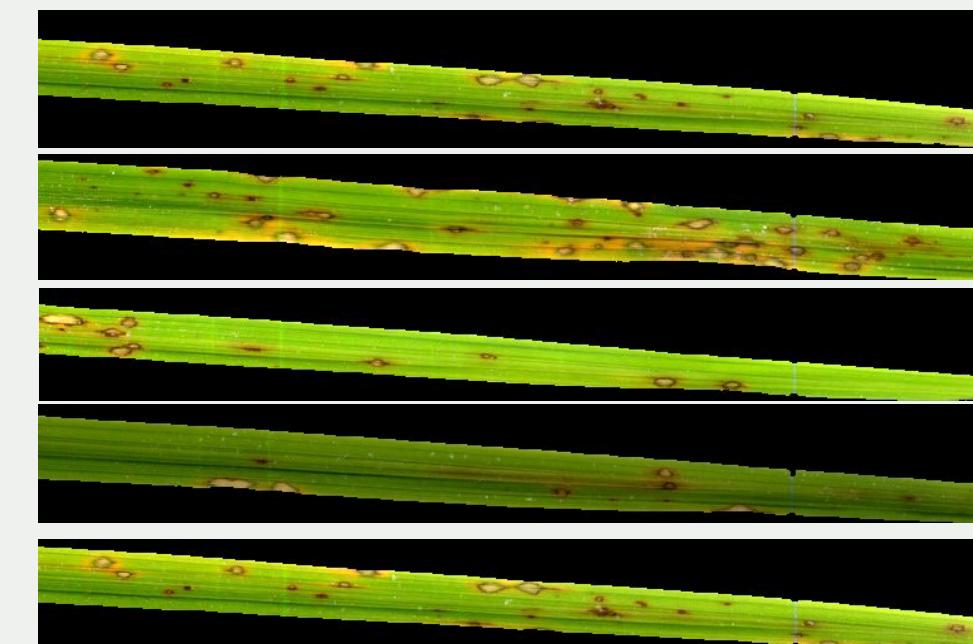
### Different methods

- Linear discriminant analysis
- Quadratic discriminant analysis



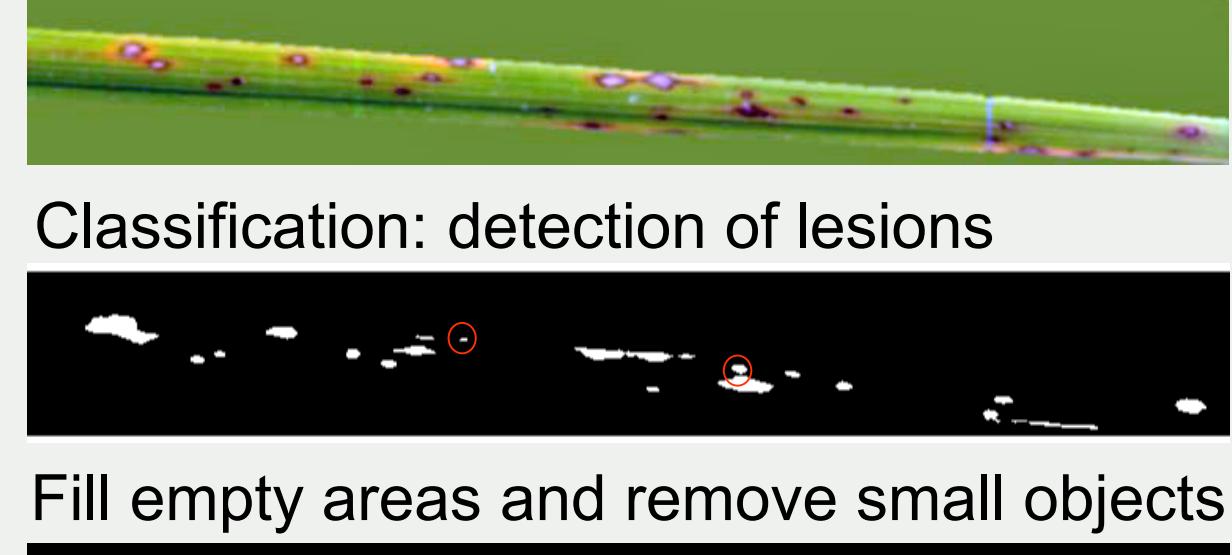
### Analysis

Original image

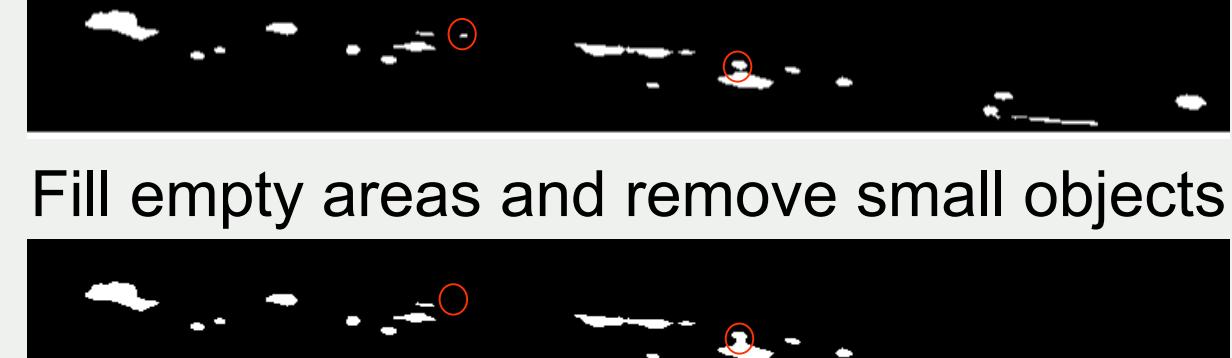


Separation of leaves

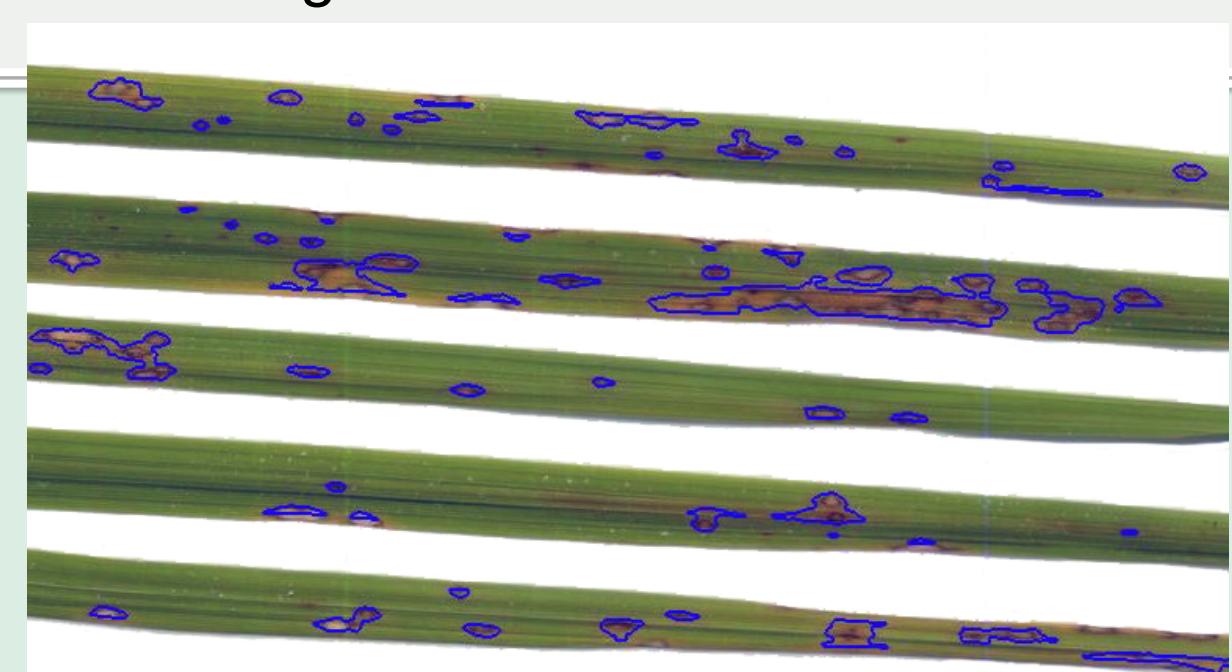
Replacing the background with limb



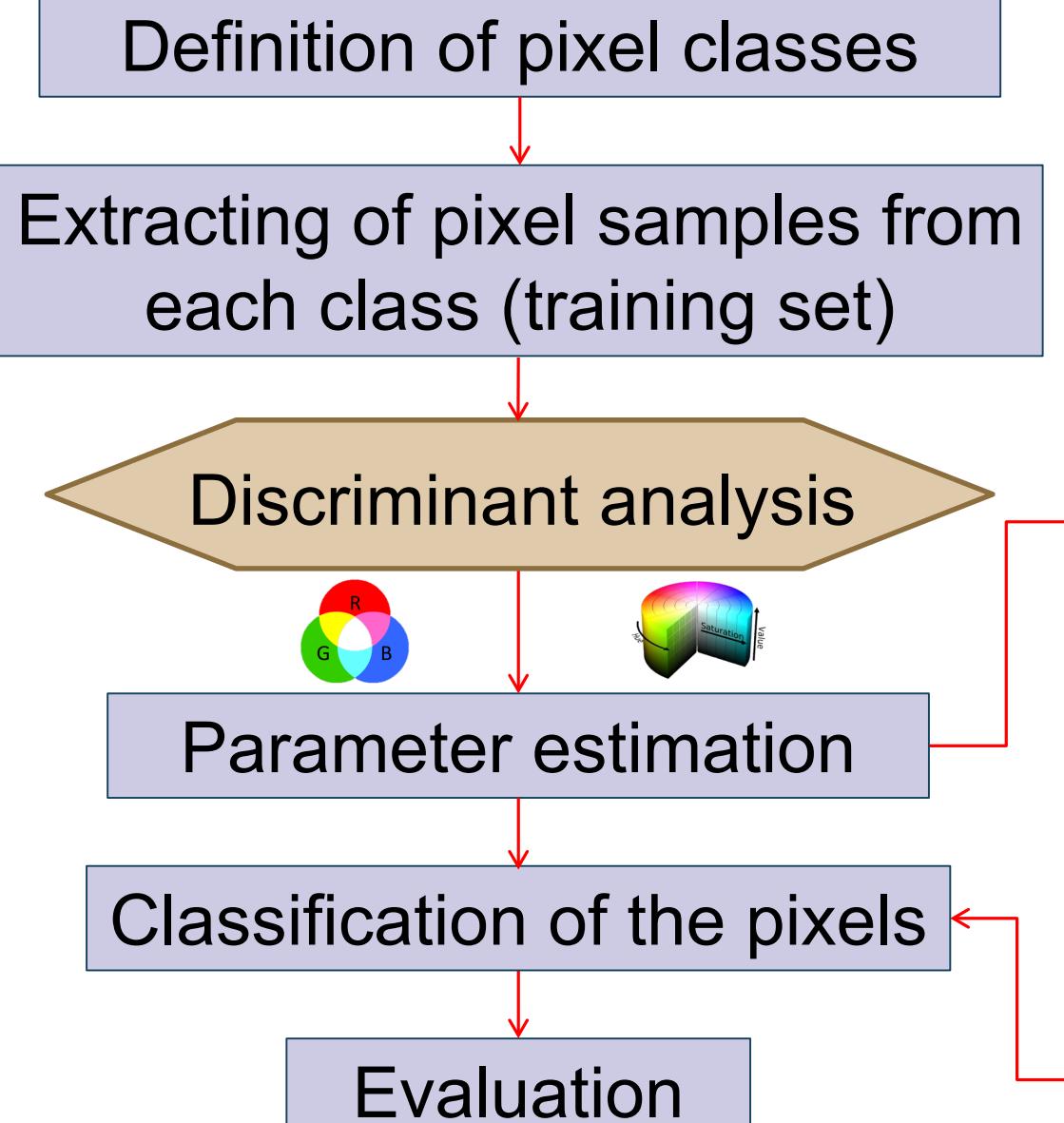
Classification: detection of lesions



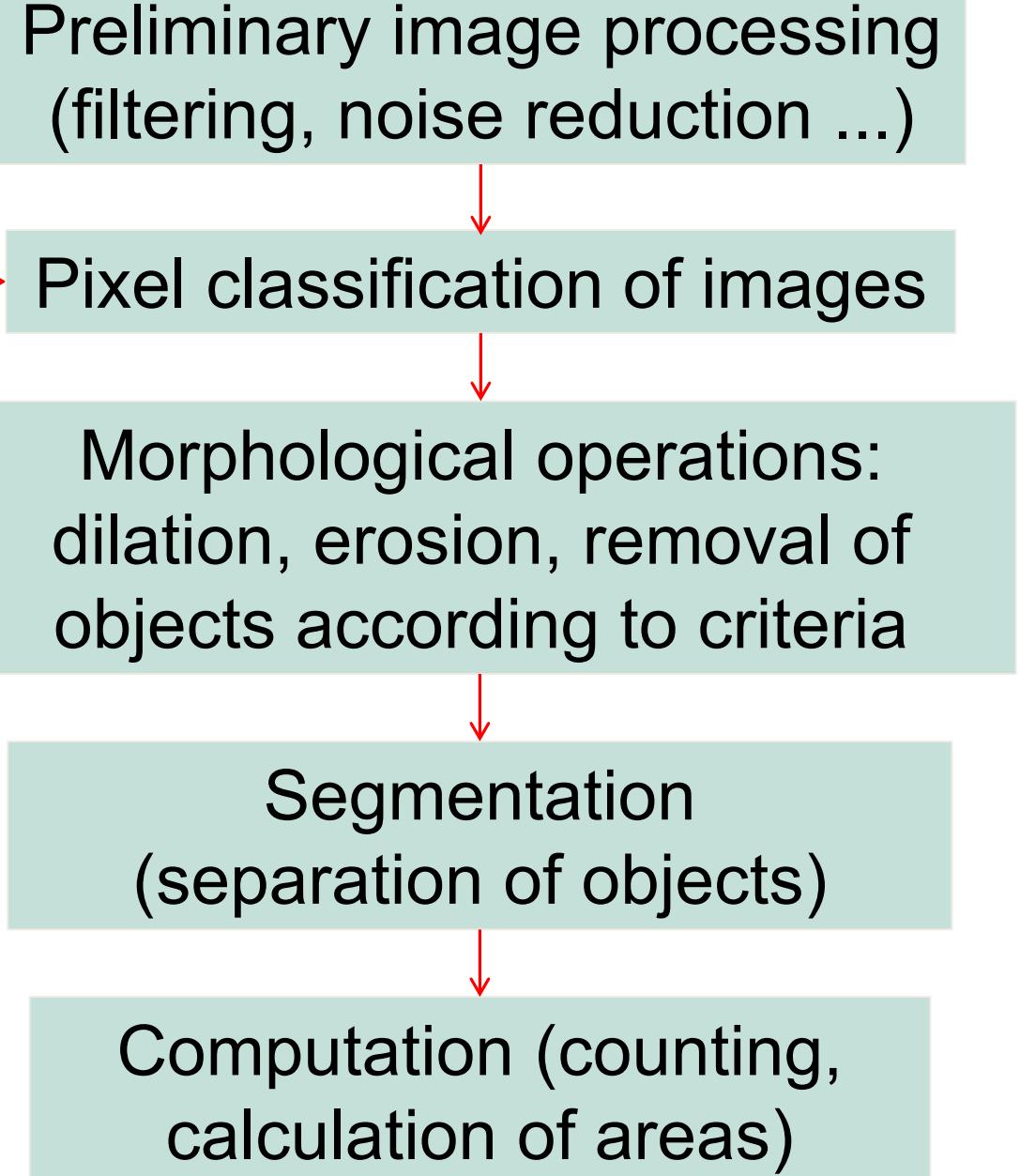
Final image with lesions



### Training phase (pixel sample)



### Analysis phase (images)



### Parameters

Discriminant analysis

Parameter estimation

Classification of the pixels

Evaluation

Parameters

Discriminant analysis

Parameter estimation

Classification of the pixels

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Discriminant analysis