

Project 1:

Crowd Counting

11761 - Image and Video Analysis
Master's Degree in Intelligent Systems

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Table of contents

**01. Preprocessing
methods**

**02. Detection
methods**

**03. Evaluation
methods**

**04. Obtained
results**



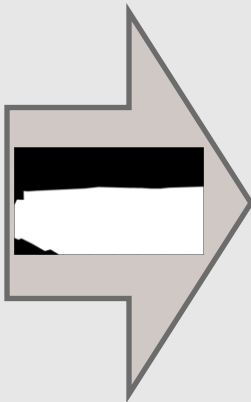
01.

Preprocessing methods

Defining preprocessing pipelines

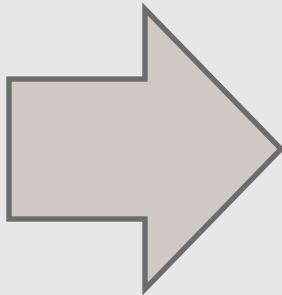
Common preprocessing steps

Static background removal



Common preprocessing steps

Background subtraction



Main proposed pipelines

Proposal 1

Static Background Removal

Background Substraction (unique image/image averaging)

**Upper and lower
thresholding**

Otsu thresholding

Proposal 2

**Water removal
(HSV thresholding)**

**Sand removal
(simple thresholding)**

Otsu thresholding

Proposal 3

CLAHE

Background Substraction

**Upper and lower
thresholding**

Otsu thresholding

AND Pixel Operator



02.

Detection methods



Detection methods used

**Simple Blob
Detector**

**Contour
Detector**

DBScan

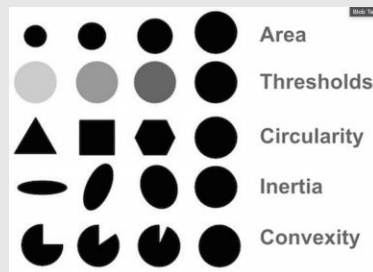
Simple Blob Detector

A Blob

A group of connected pixels in an image that share some common property

Found through connected component Labelling

Parameters Influence



Parameters Used

Min area = 2

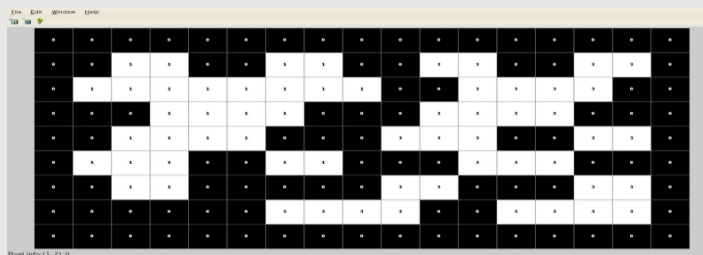
Max area = 100

Min Circularity = 0.75

Min Convexity = 0.75

Min Inertia Ratio = 0.15

Connected Component Labelling Example



Contour Detector

Contour

Curves joining all the continuous points along the boundary of an object, having the same color or intensity

Use Border Following Algorithm. Top-Bottom, Left-Right scanning for pixel of right intensity to trace contour.

Parameters Used

Contour Area < 50

cv2.CHAIN_APPROX_SIMPLE = compress vert/ horizontal/ diagonals segments into points

cv2.RETR_EXTERNAL = external contours only

Contour Detection Example



DBScan

Clusters

Near (Euclidean-based)
points are identified as
clusters.

(x,y) of high intensity pixels
as points!

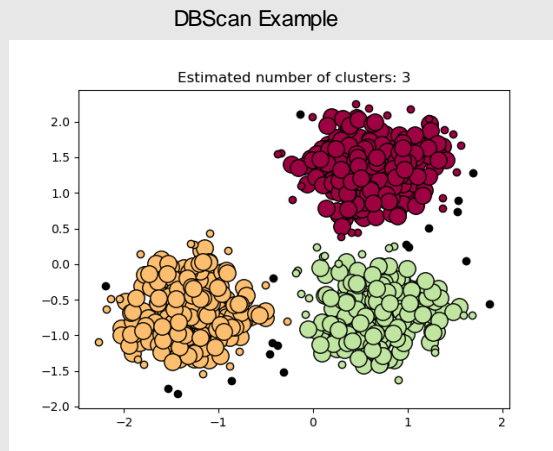
In this case, human pixels
should be clustered.

Lower min_samples =
more false detections!

Parameters Used

Epsilon = 4

Min_Samples = 40





03.

Evaluation methods

Evaluation methods used

Image-level

Mean Squared Error is used as an image-level indicator of performance.

Person-level

Based on the predictions obtained, we carry out a **one near neighbor algorithm without replacement**, with thresholded distance, to decide to which category the detection belongs (TP, FP, FN).

Distance between neighbor use Euclidean Distance of 100.

Precision, recall and F1-Score are computed.



04.

**Obtained
results**

Pipeline 1

Green: real annotations
Blue: detections
Detector: Blob

MSE	16179.3
Mean Precision	0.431
Mean Recall	0.896
Mean F1-Score	0.582



Pipeline 1

Green: real annotations
Blue: detections
Detector: Blob

MSE	16179.3
Mean Precision	0.431
Mean Recall	0.896
Mean F1-Score	0.582



Pipeline 2

Green: real annotations
Blue: detections
Detector: Blob

MSE	113420.6
Mean Precision	0.205
Mean Recall	0.972
Mean F1-Score	0.339



Pipeline 2

Green: real annotations
Blue: detections
Detector: Blob

MSE	113420.6
Mean Precision	0.205
Mean Recall	0.972
Mean F1-Score	0.339



Pipeline 3

Green: real annotations
Blue: detections
Detector: Blob

MSE	88323.5
Mean Precision	0.26
Mean Recall	0.958
Mean F1-Score	0.41



Pipeline 3

Green: real annotations
Blue: detections
Detector: Blob

MSE	88323.5
Mean Precision	0.26
Mean Recall	0.958
Mean F1-Score	0.41



Combined Pipeline

Green: real annotations
Blue: detections
Detector: Blob

MSE	719.6
Mean Precision	0.696
Mean Recall	0.843
Mean F1-Score	0.762



Combined Pipeline

Green: real annotations
Blue: detections
Detector: Contour

MSE	427.8
Mean Precision	0.827
Mean Recall	0.675
Mean F1-Score	0.743



Combined Pipeline

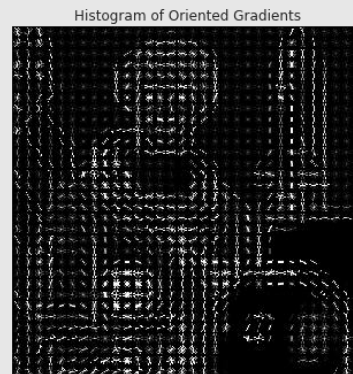
Green: real annotations
Blue: detections
Detector: DBScan

MSE	279.9
Mean Precision	0.734
Mean Recall	0.672
Mean F1-Score	0.702



Conclusion

- Detections are only as good as mask!
- Combined Pipelines show good results in terms of curbing false positives.
- HOG-SVM Tried but not very good
- Potential
 - Better HSV thresholding!
 - Smart Pipeline Section!
 - Different Parameters for detection depending on areas in image.



References

- Images

- DBScan: 'https://scikit-learn.org/stable/auto_examples/cluster/plot_dbscan.html'
- Contour: '<https://www.semanticscholar.org/paper/Fast-human-detection-in-crowded-scenes-by-contour-Beleznai-Bischof/bb3b6bb0c13d66be0a80f66172e943435efe68ab/figure/0>'
- Blob Parameters: '<https://learnopencv.com/blob-detection-using-opencv-python-c/>'
- Connected Labeling: 'https://en.wikipedia.org/wiki/Connected-component_labeling'
- HOG-SVM: '<https://medium.com/analytics-vidhya/a-gentle-introduction-into-the-histogram-of-oriented-gradients-fdee9ed8f2aa>'



**Thank you for
your attention**
