

UNIVERSITY OF PADUA

INFORMATION ENGINEERING DEPARTMENT (DEI)

MASTER'S DEGREE IN COMPUTER ENGINEERING

Computer Vision Report

Prof.

Stefano Ghidoni

Students:

Francesco Caldivezzi

Simone D'Antimo

Daniela Cuza

Contents

1 Hand Detection	2
2 Hand Segmentation	4
3 Results	5
3.1 Ouput Images	5
3.2 Intersection Over Unions	12
3.3 Pixel Accuracy	15
4 Contribution	16
4.1 Files Developed	16
4.2 Hours of work	17
5 Conclusions	18
5.1 Results Discussions	18
5.2 Future Works	18

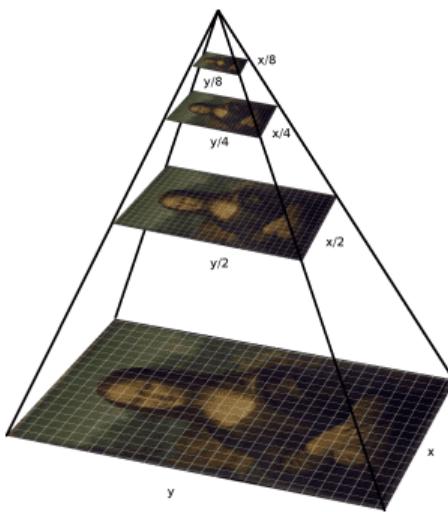
Chapter 1

Hand Detection

In this project, the key idea is to convert an image classifier into an object detector. In particular, we explore a pre-trained ResNet50V2 CNN trained on the ImageNet dataset. Moreover, we make use of image pyramid and sliding windows. Regarding image pyramid, it consists of different layers, each one representing an image at a different scale and usually a smoothing filter is applied. In our code, we implement `getGaussianPyramid(cv::Mat image)` that computes image pyramid by employing a gaussian filter.

Another essential tool in our work is sliding windows. A sliding window is composed by a rectangle of a given size that we translate from left-to-right and top-to-bottom into an image. For each window, we compute the subsequent steps:

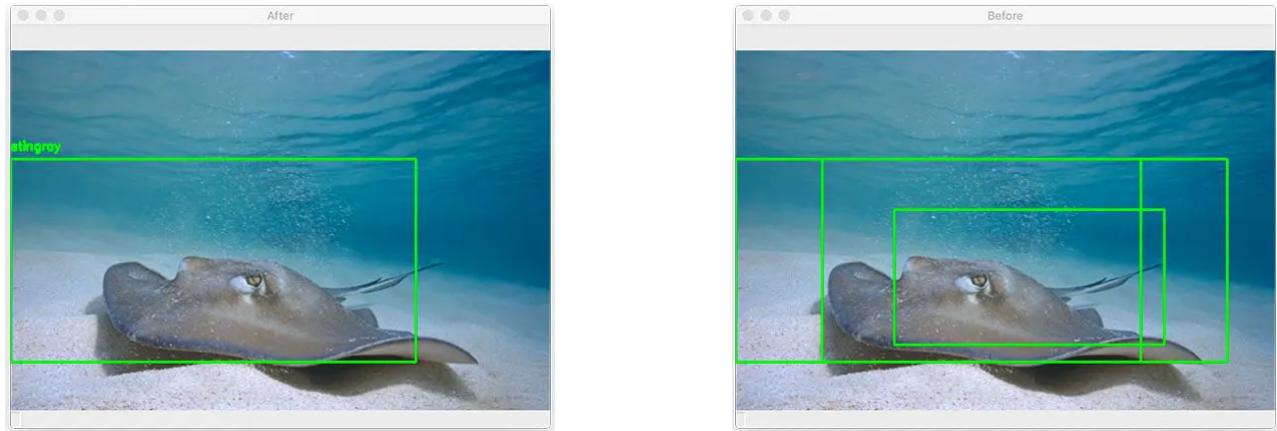
1. Obtain the region of interest
2. Apply the image classifier to the ROI
3. Get the final predictions, together with the confidence score



Thanks to image pyramid and sliding windows, we can consider a rectangle at various locations and various scales of the input image. The problem with this procedure are the different bounding boxes surrounding the same object. To deal with this issue, we apply non-maxima suppression. This method allows to maintain only the stronger bounding box, eliminating the extraneous ones. Consider the set P of all the predicted bounding boxes, comprehensive of the confidence score and the overlap threshold, the non-maxima suppression approach goes as follow:

1. Delete from P the bounding box S with the top confidence score, and add it to a list F , initially empty, representing the predictions that we maintain

2. Compute IoU between S and any other prediction T present in P. Delete T from P only if each resulting IoU is greater than the overlap threshold.
3. If P is empty return F and stop, otherwise compute step 1 and step 2



Finally, the last step applied is one that is used to remove occlusions. Such step consist of removing the bounding boxes obtained after Non Maxima Suppression that may not contain an hand. In particular such step consist of, for each bounding box after Non Maxima Suppresion (notice that, this step can be only applied if the orginal image was not a grayscale image) :

1. Get the ROI identified by selected bounding boxes
2. Convert the ROI to an image into the color space YCrCb
3. Threshold the ROI with a certain range of colors (range of the skin color)
4. Compute $percentage = \frac{\#pixels\ equal\ to\ 255\ in\ thresholded\ image}{image\ size}$
5. Reject the bounding box if $percentage \leq threshold$

The detection task is quite time-consuming, principally do to the sliding window method. As future work, we suggest to reduce the computational complexity by using an alternative approach of sliding window.

Chapter 2

Hand Segmentation

Chapter 3

Results

3.1 Output Images

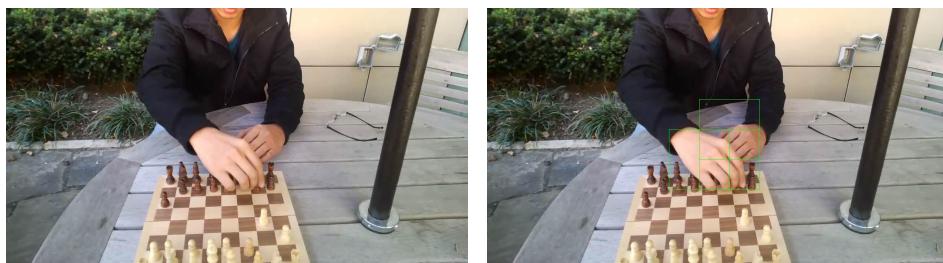
The results will be listed below for each image of the test set :

(Notice that all the images will be displayed in the following way : Orginal Image, Detection Image, Segmented Image)

- 01.jpg:



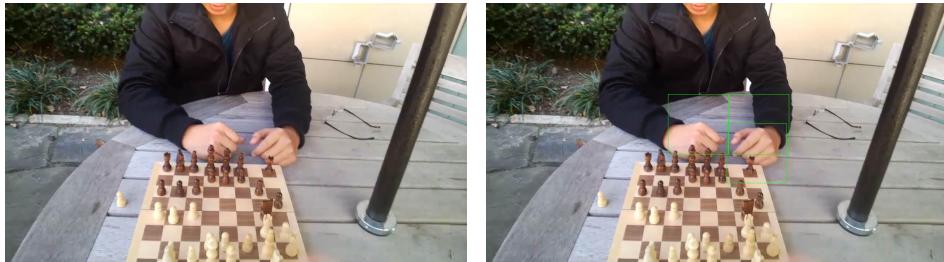
- 02.jpg:



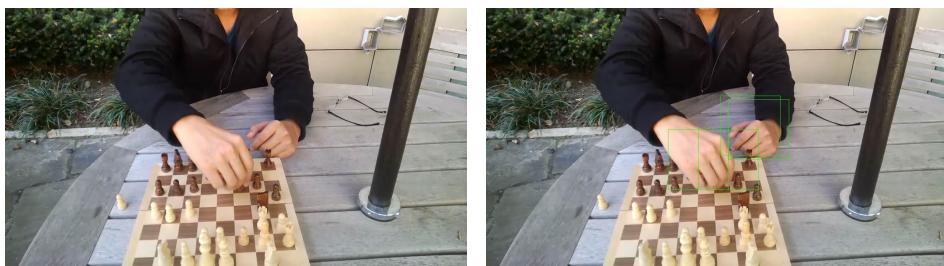
- 03.jpg:



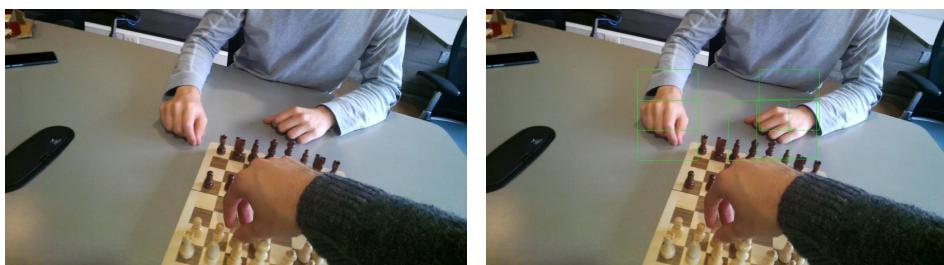
- 04.jpg:



- 05.jpg:



- 06.jpg:



- 07.jpg:



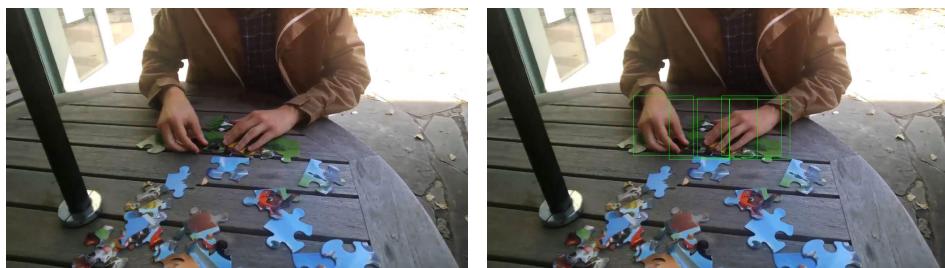
- 08.jpg:



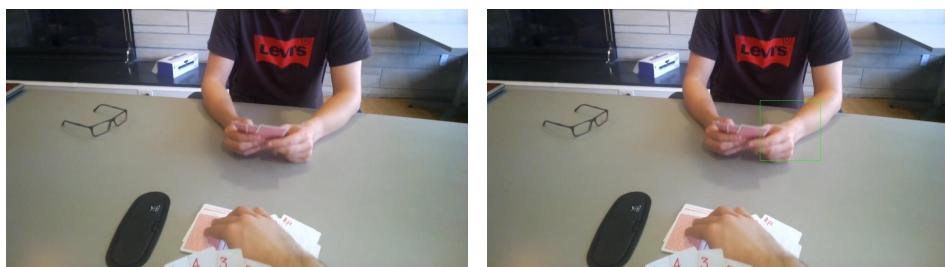
- 09.jpg:



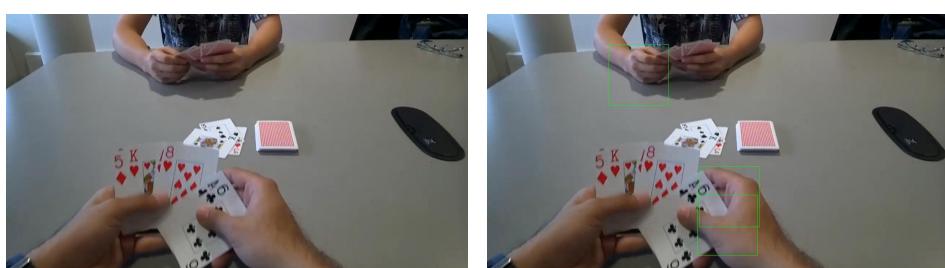
- 10.jpg:



- 11.jpg:



- 12.jpg:



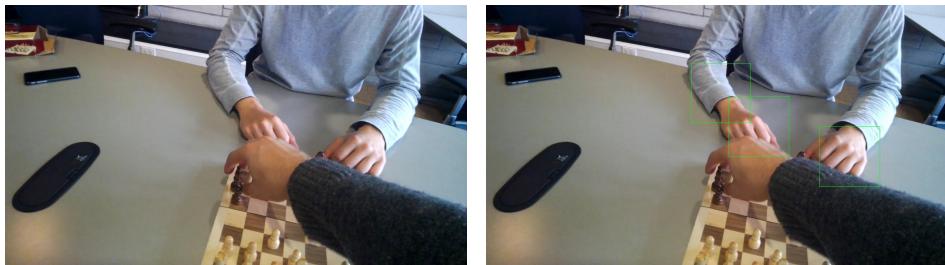
- 13.jpg:



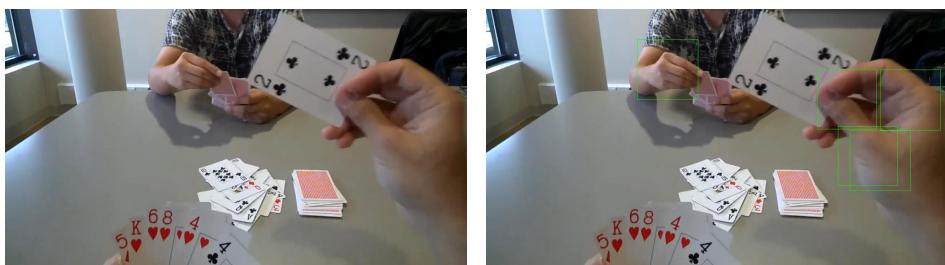
- 14.jpg:



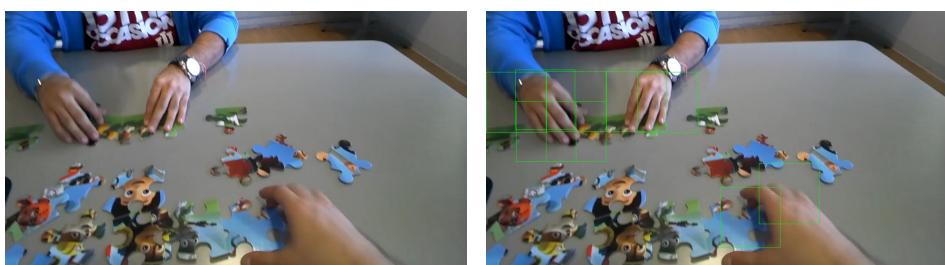
- 15.jpg:



- 16.jpg:



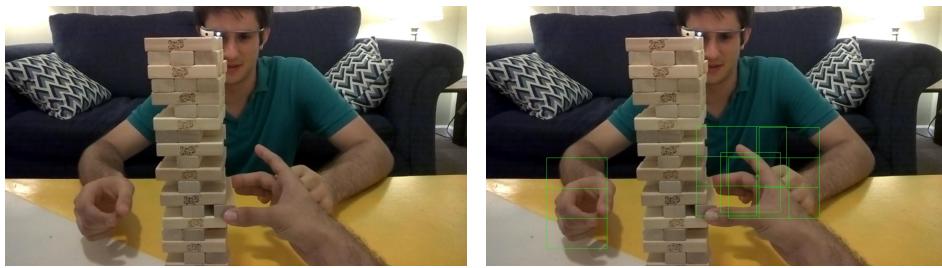
- 17.jpg:



- 18.jpg:



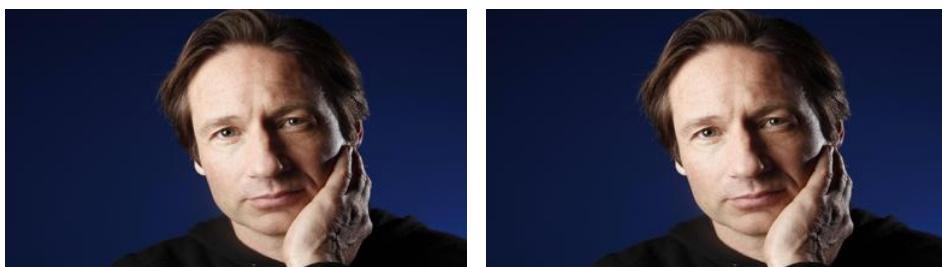
- 19.jpg:



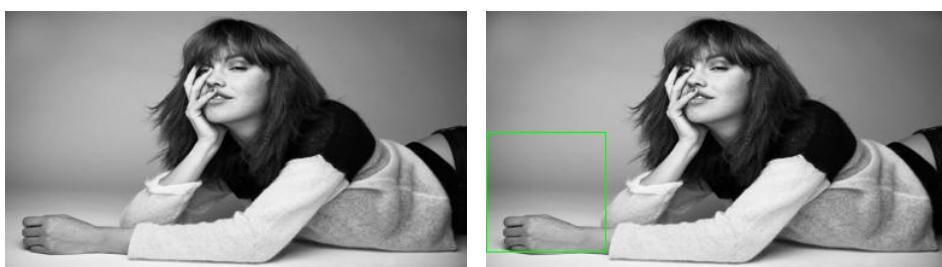
- 20.jpg:



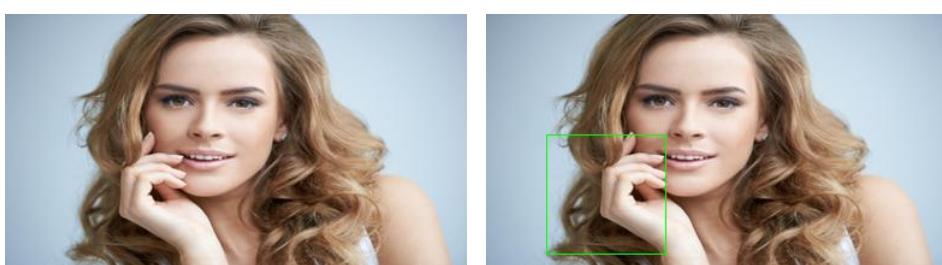
- 21.jpg:



- 22.jpg:



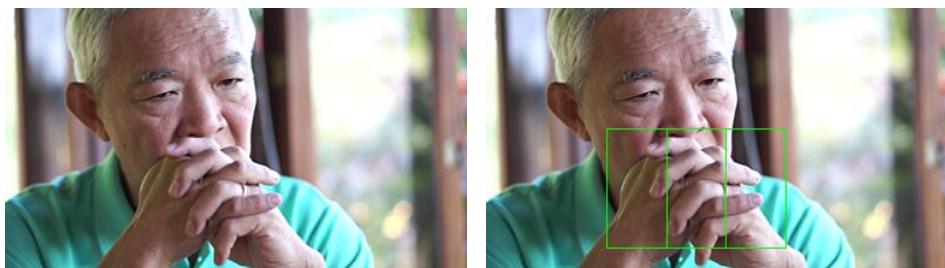
- 23.jpg:



- 24.jpg:



- 25.jpg:



- 26.jpg:



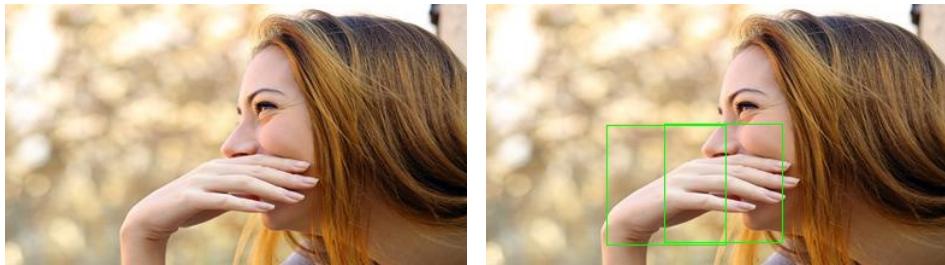
- 27.jpg:



- 28.jpg:



- 29.jpg:



- 30.jpg:



3.2 Intersection Over Unions

Here will be shown the values of IOUs computed for each image :

Name Image	Intersection Over Union		
	Bounding Box Detected	Bounding Box Ground Truth	IOUs
01.jpg	X: 667 Y: 249 W: 166 H: 166	X: 631 Y: 318 W: 217 H: 217	0.428918
	X: 504 Y: 252 W: 168 H: 168	X: 453 Y: 308 W: 175 H: 175	0.367544
	Bounding Box Detected	Bounding Box Ground Truth	IOUs
02.jpg	X: 588 Y: 252 W: 168 H: 168	X: 641 Y: 322 W: 133 H: 133	0.355330
	X: 504 Y: 336 W: 168 H: 168	X: 518 Y: 339 W: 201 H: 201	0.702322
	Bounding Box Detected	Bounding Box Ground Truth	IOUs
03.jpg	X: 504 Y: 252 W: 168 H: 168	X: 727 Y: 322 W: 153 H: 153	0.000000
	X: 504 Y: 252 W: 168 H: 168	X: 493 Y: 328 W: 162 H: 162	0.452597
	Bounding Box Detected	Bounding Box Ground Truth	IOUs
04.jpg	X: 667 Y: 333 W: 166 H: 166	X: 682 Y: 347 W: 138 H: 138	0.530846
	X: 504 Y: 252 W: 168 H: 168	X: 489 Y: 331 W: 172 H: 172	0.430163
	Bounding Box Detected	Bounding Box Ground Truth	IOUs
05.jpg	X: 672 Y: 252 W: 168 H: 168	X: 669 Y: 316 W: 151 H: 151	0.529127
	X: 504 Y: 336 W: 168 H: 168	X: 483 Y: 312 W: 201 H: 201	0.712781
	Bounding Box Detected	Bounding Box Ground Truth	IOUs
06.jpg	X: 672 Y: 252 W: 168 H: 168	X: 620 Y: 414 W: 235 H: 235	0.012332
	X: 750 Y: 249 W: 167 H: 167	X: 730 Y: 273 W: 181 H: 181	0.508381
	X: 420 Y: 252 W: 168 H: 168	X: 437 Y: 224 W: 125 H: 125	0.492529
	Bounding Box Detected	Bounding Box Ground Truth	IOUs
07.jpg	X: 756 Y: 420 W: 168 H: 168	X: 740 Y: 413 W: 400 H: 400	0.283374
	X: 588 Y: 168 W: 168 H: 168	X: 627 Y: 221 W: 164 H: 164	0.439881
	X: 333 Y: 166 W: 167 H: 167	X: 365 Y: 190 W: 154 H: 154	0.606553
	Bounding Box Detected	Bounding Box Ground Truth	IOUs
08.jpg	X: 420 Y: 336 W: 168 H: 168	X: 627 Y: 314 W: 247 H: 247	0.000000
	X: 420 Y: 336 W: 168 H: 168	X: 430 Y: 339 W: 187 H: 187	0.663680
	Bounding Box Detected	Bounding Box Ground Truth	IOUs
09.jpg	X: 672 Y: 504 W: 168 H: 168	X: 668 Y: 533 W: 109 H: 109	0.341481
	X: 325 Y: 324 W: 166 H: 166	X: 406 Y: 490 W: 98 H: 98	0.000000
	Bounding Box Detected	Bounding Box Ground Truth	IOUs
10.jpg	X: 650 Y: 243 W: 166 H: 166	X: 608 Y: 276 W: 211 H: 211	0.595996
	X: 406 Y: 243 W: 166 H: 166	X: 421 Y: 234 W: 143 H: 143	0.813092
	Bounding Box Detected	Bounding Box Ground Truth	IOUs
11.jpg	X: 756 Y: 252 W: 168 H: 168	X: 557 Y: 545 W: 276 H: 276	0.000000
	X: 756 Y: 252 W: 168 H: 168	X: 734 Y: 325 W: 121 H: 121	0.297203
	X: 756 Y: 252 W: 168 H: 168	X: 598 Y: 302 W: 121 H: 121	0.000000
	Bounding Box Detected	Bounding Box Ground Truth	IOUs
12.jpg	X: 583 Y: 499 W: 167 H: 167	X: 68 Y: 469 W: 375 H: 375	0.000000
	X: 583 Y: 499 W: 167 H: 167	X: 536 Y: 430 W: 316 H: 316	0.311860
	X: 583 Y: 499 W: 167 H: 167	X: 525 Y: 93 W: 162 H: 162	0.000000
	X: 336 Y: 84 W: 168 H: 168	X: 385 Y: 96 W: 113 H: 113	0.408376

	Bounding Box Detected	Bounding Box Ground Truth	IOUs
13.jpg	X: 333 Y: 333 W: 167 H: 167	X: 285 Y: 611 W: 229 H: 229	0.000000
	X: 588 Y: 420 W: 168 H: 168	X: 554 Y: 365 W: 226 H: 226	0.502155
	X: 333 Y: 333 W: 167 H: 167	X: 299 Y: 305 W: 161 H: 161	0.533938
14.jpg	Bounding Box Detected	Bounding Box Ground Truth	IOUs
	X: 336 Y: 420 W: 168 H: 168	X: 256 Y: 477 W: 235 H: 235	0.273295
	X: 650 Y: 486 W: 166 H: 166	X: 659 Y: 473 W: 202 H: 202	0.564895
	X: 756 Y: 336 W: 168 H: 168	X: 757 Y: 391 W: 186 H: 186	0.536001
	X: 420 Y: 336 W: 168 H: 168	X: 459 Y: 312 W: 153 H: 153	0.583333
15.jpg	Bounding Box Detected	Bounding Box Ground Truth	IOUs
	X: 672 Y: 252 W: 168 H: 168	X: 617 Y: 366 W: 214 H: 214	0.153860
	X: 924 Y: 336 W: 168 H: 168	X: 893 Y: 337 W: 158 H: 158	0.522181
	X: 672 Y: 252 W: 168 H: 168	X: 654 Y: 271 W: 152 H: 152	0.512800
16.jpg	Bounding Box Detected	Bounding Box Ground Truth	IOUs
	X: 917 Y: 166 W: 166 H: 166	X: 264 Y: 670 W: 61 H: 61	0.000000
	X: 1008 Y: 336 W: 168 H: 168	X: 873 Y: 142 W: 405 H: 405	0.159837
	X: 917 Y: 166 W: 166 H: 166	X: 633 Y: 219 W: 162 H: 162	0.000000
	X: 420 Y: 84 W: 168 H: 168	X: 440 Y: 127 W: 160 H: 160	0.507814
17.jpg	Bounding Box Detected	Bounding Box Ground Truth	IOUs
	X: 650 Y: 486 W: 166 H: 166	X: 654 Y: 482 W: 432 H: 432	0.262064
	X: 333 Y: 166 W: 167 H: 167	X: 389 Y: 156 W: 122 H: 122	0.599011
	X: 81 Y: 162 W: 166 H: 166	X: 97 Y: 181 W: 181 H: 181	0.567167
18.jpg	Bounding Box Detected	Bounding Box Ground Truth	IOUs
	X: 250 Y: 499 W: 166 H: 166	X: 150 Y: 430 W: 360 H: 360	0.269250
	X: 500 Y: 499 W: 167 H: 167	X: 542 Y: 456 W: 255 H: 255	0.280827
	X: 924 Y: 252 W: 168 H: 168	X: 917 Y: 192 W: 207 H: 207	0.543218
	X: 924 Y: 420 W: 168 H: 168	X: 880 Y: 346 W: 261 H: 261	0.356891
19.jpg	Bounding Box Detected	Bounding Box Ground Truth	IOUs
	X: 672 Y: 420 W: 168 H: 168	X: 619 Y: 390 W: 295 H: 295	0.324321
	X: 756 Y: 420 W: 168 H: 168	X: 785 Y: 447 W: 130 H: 130	0.580357
	X: 168 Y: 504 W: 168 H: 168	X: 187 Y: 479 W: 174 H: 174	0.600541
20.jpg	Bounding Box Detected	Bounding Box Ground Truth	IOUs
	X: 672 Y: 420 W: 168 H: 168	X: 686 Y: 413 W: 266 H: 266	0.367250
	X: 672 Y: 336 W: 168 H: 168	X: 729 Y: 342 W: 77 H: 77	0.270089
	X: 672 Y: 336 W: 168 H: 168	X: 544 Y: 348 W: 22 H: 22	0.000000
21.jpg	Bounding Box Detected	Bounding Box Ground Truth	IOUs
	X: 231 Y: 112 W: 76 H: 76	No Detections	0.000000
22.jpg	Bounding Box Detected	Bounding Box Ground Truth	IOUs
	X: 0 Y: 100 W: 100 H: 100	X: 145 Y: 41 W: 38 H: 38	0.000000
	X: 0 Y: 100 W: 100 H: 100	X: 15 Y: 168 W: 62 H: 62	0.194777
23.jpg	Bounding Box Detected	Bounding Box Ground Truth	IOUs
	X: 50 Y: 100 W: 100 H: 100	X: 94 Y: 96 W: 81 H: 81	0.418931
24.jpg	Bounding Box Detected	Bounding Box Ground Truth	IOUs
	X: 100 Y: 50 W: 100 H: 100	X: 110 Y: 81 W: 76 H: 76	0.421815
25.jpg	Bounding Box Detected	Bounding Box Ground Truth	IOUs
	X: 100 Y: 100 W: 100 H: 100	X: 89 Y: 115 W: 141 H: 141	0.581674
	X: 150 Y: 100 W: 100 H: 100	X: 132 Y: 106 W: 133 H: 133	0.622640

	Bounding Box Detected	Bounding Box Ground Truth	IOUs
26.jpg	X: 100 Y: 50 W: 100 H: 100	X: 73 Y: 71 W: 125 H: 125	0.382170
27.jpg	Bounding Box Detected	Bounding Box Ground Truth	IOUs
	X: 100 Y: 50 W: 100 H: 100	X: 135 Y: 64 W: 55 H: 55	0.441437
28.jpg	X: 100 Y: 50 W: 100 H: 100	X: 230 Y: 100 W: 82 H: 82	0.000000
	Bounding Box Detected	Bounding Box Ground Truth	IOUs
29.jpg	X: 198 Y: 99 W: 99 H: 99	X: 188 Y: 115 W: 114 H: 114	0.638462
	Bounding Box Detected	Bounding Box Ground Truth	IOUs
30.jpg	X: 100 Y: 100 W: 100 H: 100	X: 95 Y: 124 W: 167 H : 167	0.492675
	Bounding Box Detected	Bounding Box Ground Truth	IOUs
	X: 89 Y: 90 W: 68 H: 68	No Detections	0.000000

3.3 Pixel Accuracy

Here will be shown the values of Pixel Accuracies computed for each image :

Name Image	Pixel Accuracy
01.jpg	
02.jpg	
03.jpg	
04.jpg	
05.jpg	
06.jpg	
07.jpg	
08.jpg	
09.jpg	
10.jpg	
11.jpg	
12.jpg	
13.jpg	
14.jpg	
15.jpg	
16.jpg	
17.jpg	
18.jpg	
19.jpg	
20.jpg	
21.jpg	
22.jpg	
23.jpg	
24.jpg	
25.jpg	
26.jpg	
27.jpg	
28.jpg	
29.jpg	
30.jpg	

Chapter 4

Contribution

4.1 Files Developed

- Francesco Caldivezzi : In this project I have contributed by developing the following files :
 - *python_scripts/config/configs.py*
 - *python_scripts/utils/helper.py*
 - *python_scripts/build.py*
 - *python_scripts/convert_model_to_opencv.py*
 - *python_scripts/fine_tune_cnn.py*
 - *python_scripts/TrainCNN.ipynb*
 - *matlab_scripts/create_annotation_egohands_dataset.m*
 - *Project/include/Detector.h*
 - *Project/source/Detector.cpp*
 - *Project/include/Utils.h*
 - *Project/source/Utils.cpp*
 - *Project/source/main.cpp*
 - *Project/CMakeLists.txt*
 - *problems/c++/source/main.cpp*
 - *problems/c++/CMakeLists.txt*
 - *problems/python/try.py*
 - *problems/README.MD*
 - *README.MD*
- Daniela Cuza :
 - *Project/source/main.cpp*
 - *Project/source/Segmentator.cpp*
 - *Project/include/Segmentator.h*
- Simone D'antimo :
 - *Project/source/main.cpp*
 - *Project/source/Segmentator.cpp*
 - *Project/include/Segmentator.h*

4.2 Hours of work

- Francesco Caldivezzi : In this project I have worked the following amount of hours :
 - Roughly 60 hours to develop the C++ code
 - Roughly 50 hours to develop the python and matlab code and write the README file
 - Roughly 30 hours to find a suitable solution for the project after the first several trials
 - Roughly 15 hours to write the report
- Daniela Cuza : TODO COMPLETE
- Simone D'antimo : TODO COMPLETE

Chapter 5

Conclusions

5.1 Results Discussions

For what concerns the detection part, we can immediately observe that, some images have bounding boxes well detected, others instead not or they do not have any detections at all. The main reason why there are those problems are :

- Some of the images contains hands with different point of view and, by using a window with static size for all the images (different size for images from 01 to 20 and from 21 to 30) there are multiple detections for the same hand because it is too big compared to the window size. (This can be seen in images like 17,18,19,20 etc.)
- Moreover, other images have no detection at all, and this may be cause by the fact that some of the hands have very strong illumination like images 21 and 30.

Therefore, even if the result is not 100% accurate, still it's quite good, because there are only 14 values of the IOU out of 68. So, we can say that the main issue of this solution is the time taken for processing a single image which is very high.

5.2 Future Works

To solve the problems of the detection solution proposed, we can adopt more sophisticated techniques like ad-hoc Neural Networks that are able to recognize objects, by fine-tuning them, in order to recognize only hands (i.e. Yolo, Fast-RCNN, Faster-RCNN, SSD).