

# Fully Convolutional Networks and Generative Adversarial Networks Applied to Sclera Segmentation

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- Biometry
- Eye Regions
- Importance of Segmentation

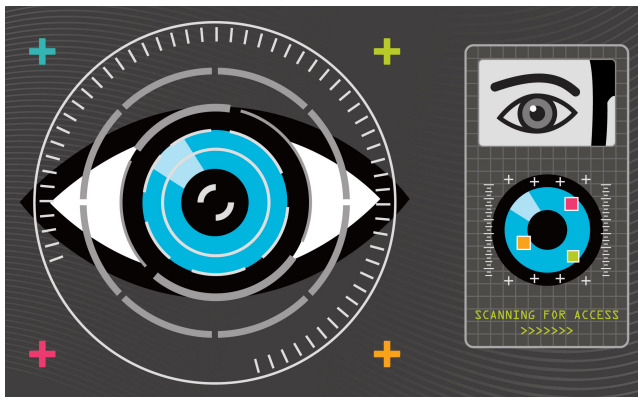


Figure: Example of a biometrics system

# Eye Regions

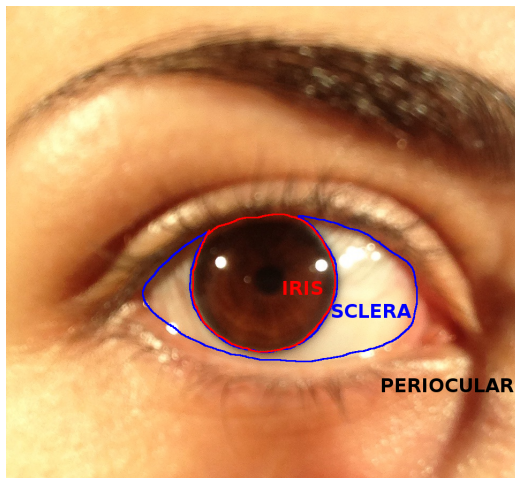


Figure: Eye regions

# Segmentation Example



(a) Mask



(b) Image

Figure: Miche iPhone 5 example image

# Segmentation Approaches

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- Generative Adversarial Network
- Fully Convolutional Network
- Encoder-decoder (SegNet)

# Generative Adversarial Network (GAN)

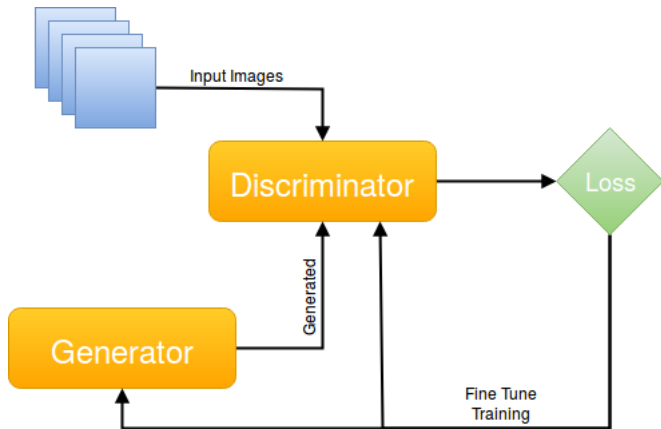


Figure: GAN Architecture



# Transfer Style



Figure: Painting styles

# Transfer Style

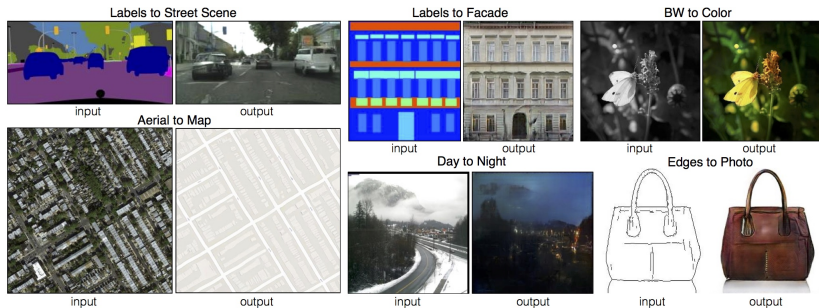


Figure: Other examples

# Fully Convolutional Network (FCN)

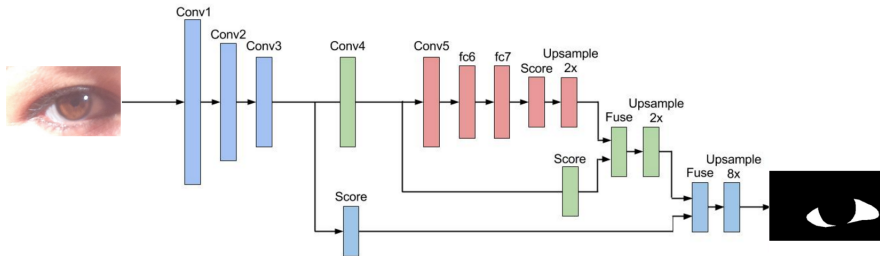


Figure: FCN8 example

# FCN Results

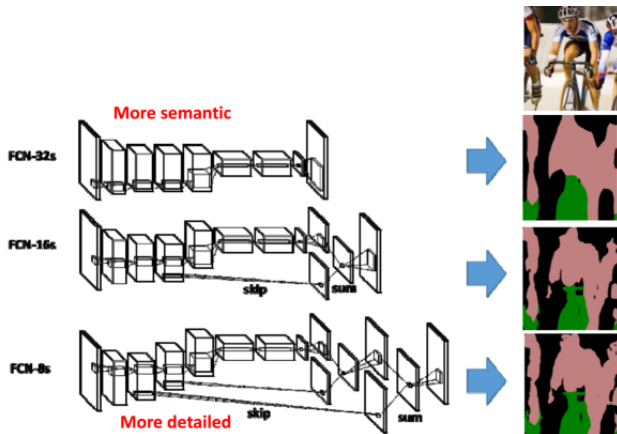


Figure: FCN's Results

# Encoder Decoder

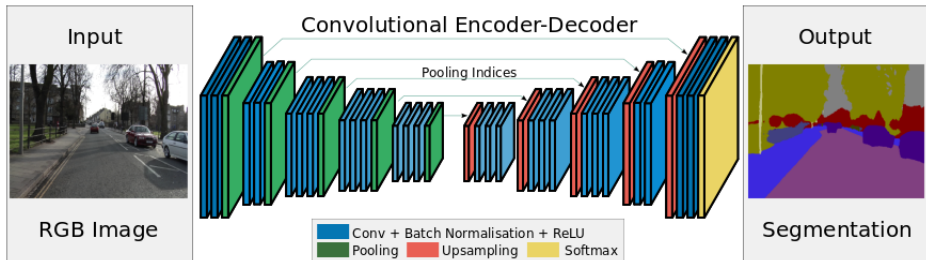


Figure: Encoder Decoder Architecture

Table: Overview of the datasets used in this work. All of these are a subset of the original dataset.

<b>Dataset</b>	<b>Images</b>	<b>Subjects</b>	<b>Resolution</b>
UBIRIS.v2	500	261	400 × 300
MICHE-I	1,000	92	Various
MICHE-GS <sub>4</sub>	333	92	Various
MICHE-IP <sub>5</sub>	323	92	Various
MICHE-GT <sub>2</sub>	344	92	640 × 480

# Proposed Approach

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- Periocular Region Detection
- Sclera Segmentation

# Periocular Region Detection (Fast-YOLO)

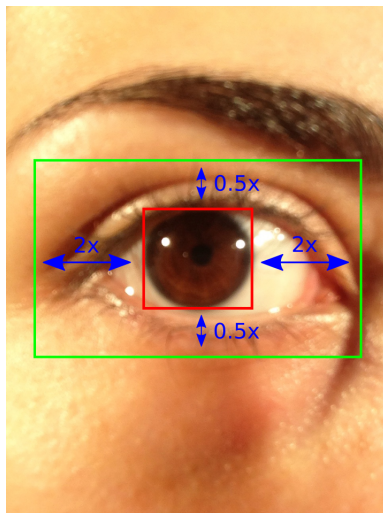
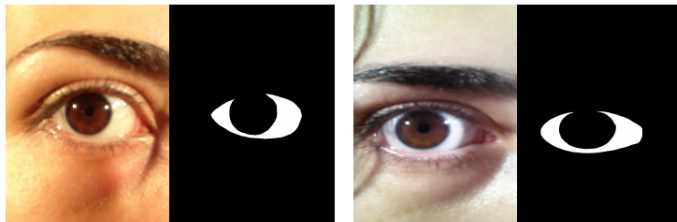


Figure: Detection example

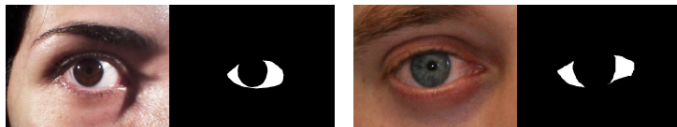


# Images without preprocessing



(a) MICHE-IP5

(b) MICHE-GS4



(c) MICHE-GT2

(d) UBIRIS.v2

Figure: Images without preprocessing

# Preprocessed Images

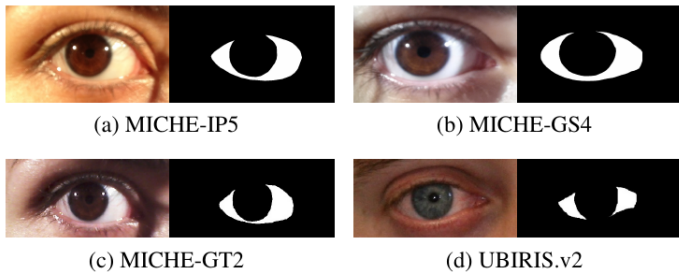
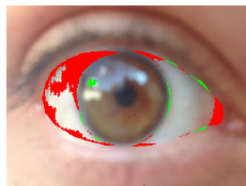


Figure: Preprocessed images

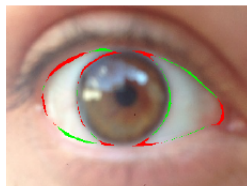
Table: Results achieved using the proposed protocol.

Database	Approach	Recall %	Precision %	F-score %
UBIRIS.v2	GAN	87.48 ± 08.19	87.10 ± 08.16	86.82 ± 05.88
	SegNet	72.48 ± 17.15	87.52 ± 08.53	77.82 ± 13.08
	FCN	<b>87.31 ± 06.68</b>	<b>88.45 ± 06.98</b>	<b>87.48 ± 03.90</b>
MICHE-I	GAN	87.07 ± 10.81	86.39 ± 12.02	86.27 ± 09.97
	SegNet	64.59 ± 24.73	83.39 ± 18.53	69.87 ± 22.34
	FCN	<b>87.59 ± 11.28</b>	<b>89.90 ± 09.82</b>	<b>88.32 ± 09.80</b>
MICHE-GS <sub>4</sub>	GAN	85.72 ± 12.53	86.12 ± 13.01	85.20 ± 11.31
	SegNet	66.50 ± 26.34	76.09 ± 23.80	67.92 ± 23.87
	FCN	<b>88.24 ± 12.03</b>	<b>88.65 ± 10.62</b>	<b>88.12 ± 10.56</b>
MICHE-IP <sub>5</sub>	GAN	88.11 ± 07.40	87.71 ± 07.71	87.42 ± 05.43
	SegNet	31.90 ± 26.05	79.40 ± 32.93	40.95 ± 29.19
	FCN	<b>87.51 ± 11.61</b>	<b>89.32 ± 05.22</b>	<b>87.80 ± 08.24</b>
MICHE-GT <sub>2</sub>	GAN	86.20 ± 15.02	83.81 ± 15.73	84.50 ± 14.28
	SegNet	73.77 ± 21.20	76.46 ± 18.29	72.33 ± 18.26
	FCN	<b>87.86 ± 12.23</b>	<b>88.50 ± 12.68</b>	<b>87.94 ± 11.59</b>

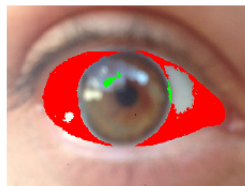
# Results - Comparison



(a) GAN



(b) FCN



(c) SegNet



(d) GAN



(e) FCN



(f) SegNet

Figure: Samples of scleras segmented using the ground truth for highlighting errors: green and red pixels represent the FPs and FNs, respectively.

- To design novel and better network architectures
- To create a unique architecture that integrates the periorcular region detection stage
- To employ a post-processing stage to refine the segmentation given by the proposed approaches

- To design a general and independent sensor approach, where the image sensor is first classified and then the sclera is segmented with a specific approach
- To compare the proposed approaches with methods applied in other domains such as iris segmentation and periocular-based recognition.



<http://www.inf.ufpr.br/drlucio/>

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