



# NUE Face Detection

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# Introduction

- Face detection algorithm developed by Lutz Goldmann and Ullrich Monich
- It was developed at Nuremberg (NUE) Communication Systems Group in collaboration with Technische Universität, Berlin
- Detection of frontal and upright faces
- Min width 80 pixels. Ignoring this leads to unsatisfactory results

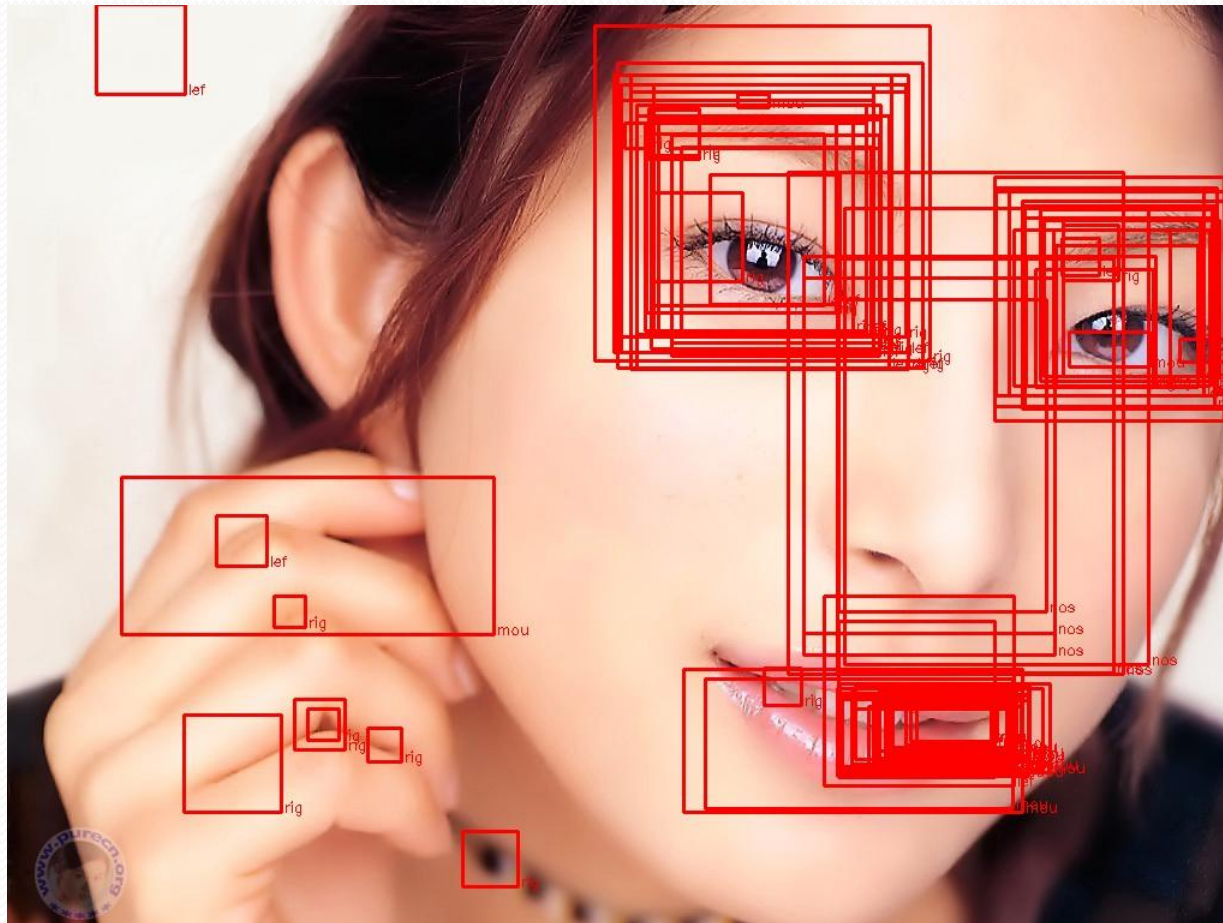
# Sample Image File



# Algorithm

- Component based face detector
- First detects components i.e. nose, mouth and eyes, then uses graph algorithms to detect faces based on the component detections
- Advantage: High robustness towards partial face occlusions

# Example (Face Components)

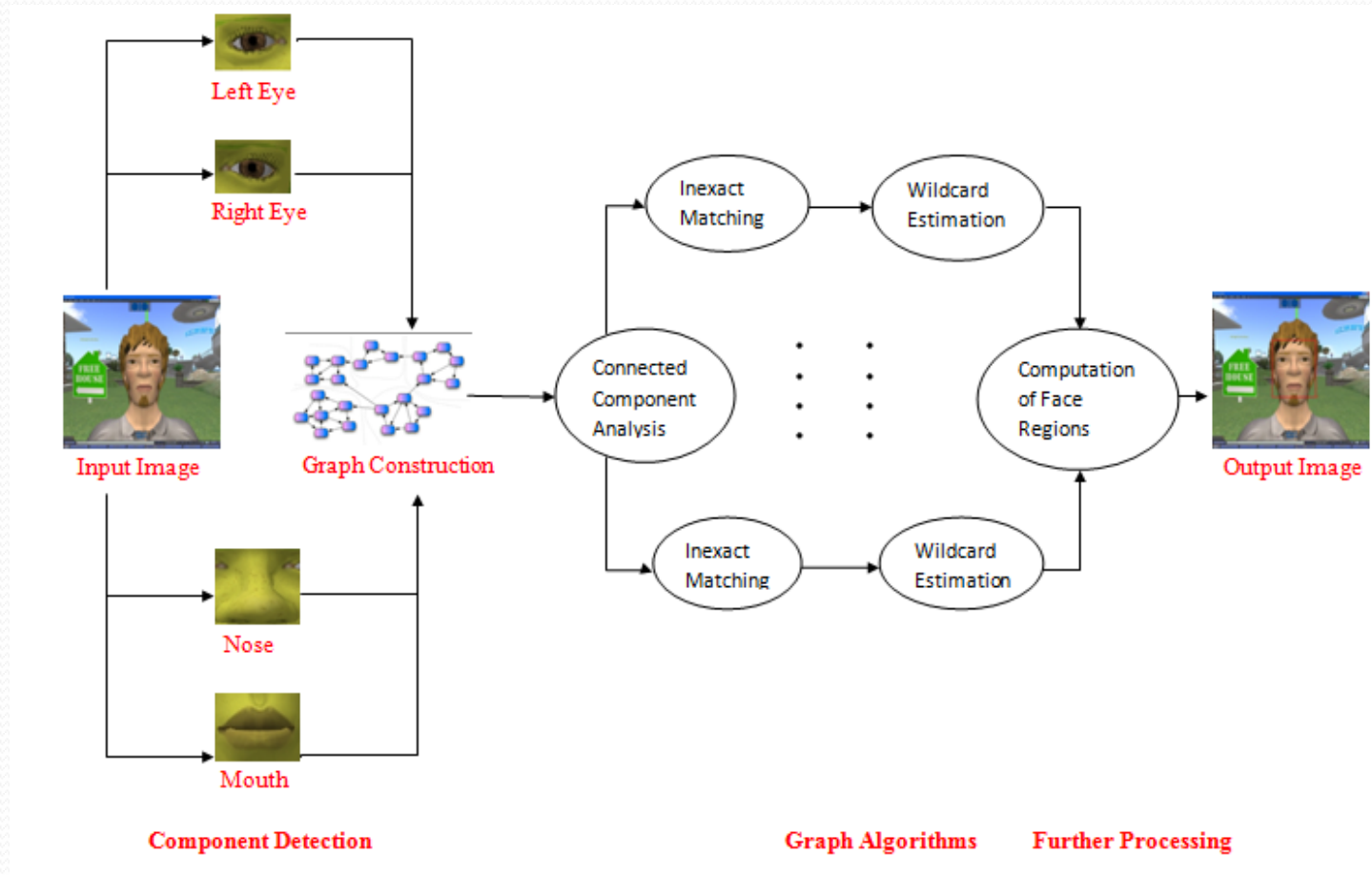




# Example (Occluded face)



# Flowchart



# Component Detection

- Modified version of OpenCV Haar detection algorithm, based on the paper by Viola and Jones and extended by Lienhardt
- Facial components detected using cascade of boosted classifiers which work with Haar-like features



# Viola Jones

- Integral Image, an intermediate representation of an image

Using the following pair of recurrences:

$$s(x,y) = s(x,y-1) + i(x,y)$$

$$ii(x,y) = ii(x-1,y) + s(x,y)$$

{ where  $s(x,y)$  is the cumulative row sum,  $s(x,-1)=0$  and  $ii(-1,y)=0$  } the integral image can be computed in one pass over the original image.

- Rectangle features detected with horizontal, vertical and diagonal orientations available

## Viola Jones contd ...

- Boosting used as a basic classifier to select rectangle features that separate the positive and negative examples  
For each feature, the learner determines optimal threshold classification function to reduce misclassification
- A cascade of classifiers is trained to detect almost all objects of interest in frontal faces while rejecting a fraction of the non-object patterns
- Each stage is trained by adding features until the target detection and false positive rates are met
- Stages are added until the overall target for false positives and detection rates are met

# Graph Algorithms

- A graph is built where each component detected is a vertex
- Presence of at least two face components helps estimate missing ones
- Pair of vertices belonging to one face are connected
- Connected component analysis segregates possible faces obtained

# Graph Algorithms contd ...

- Error-tolerant graph matching algorithm checks if components belong to a face or not
- This with estimation of missing components is only applied on connected components, thus helping in significant improvement in speed
- Coordinates of the detected and estimated face components help draw a bounding box around the face

# Experiment Datasets

- Avatars from different online virtual worlds

SecondLife (Manual and Automated)

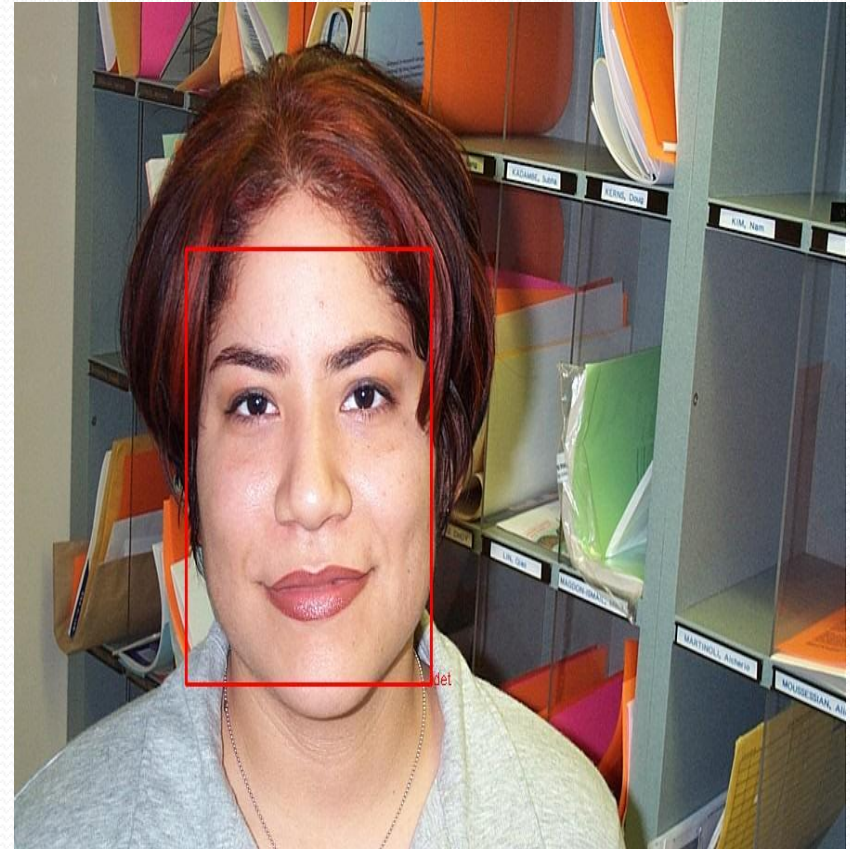
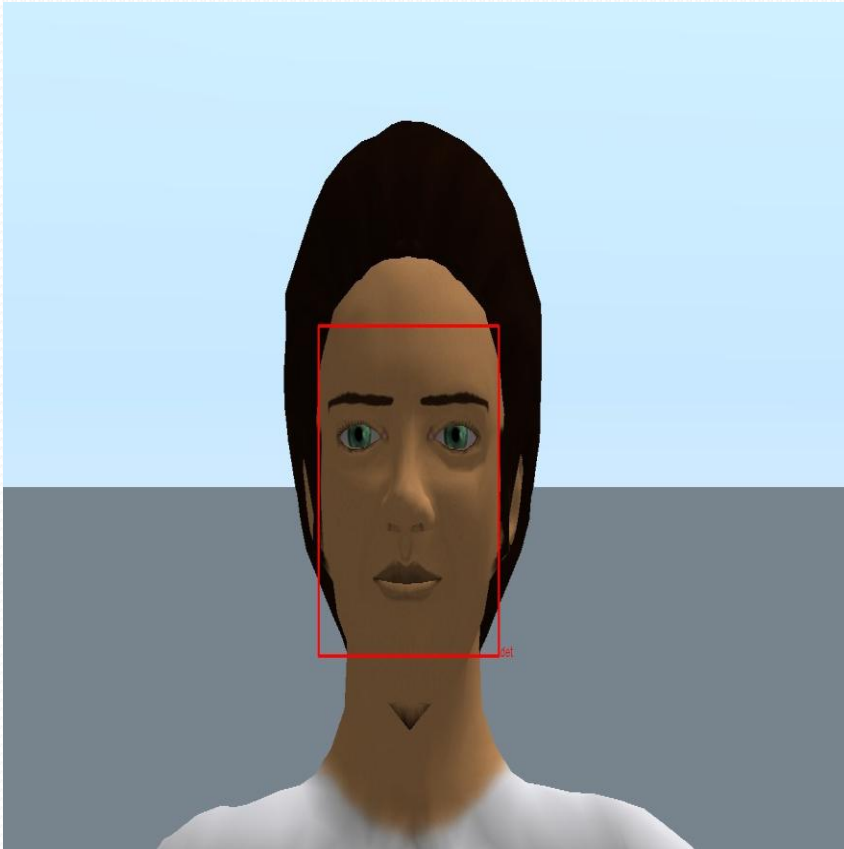
Entropia (Male and Female)

- Humans

Obtained by Markus Weber, California Institute of Technology

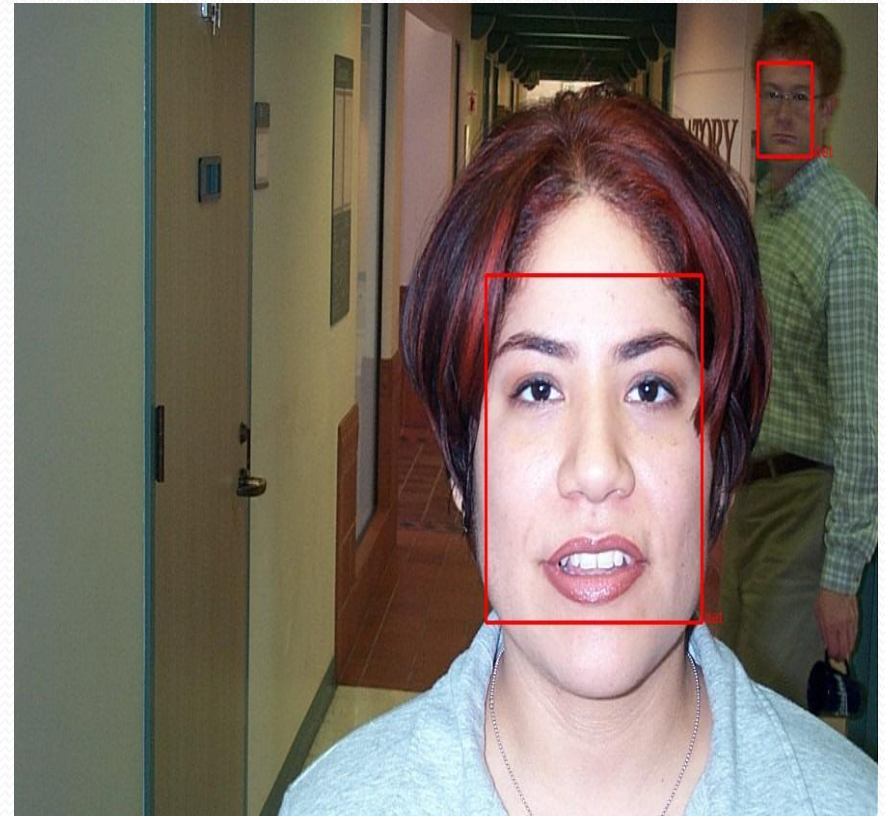
[http://www.vision.caltech.edu/Image\\_Datasets/faces/README](http://www.vision.caltech.edu/Image_Datasets/faces/README)

# Results (Accurate Detection)





# Results (False positives)



# Results (Zero detection)





Questions ???