

A Cheap Portable Eye-Tracker Solution for Common Setups

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Outline

Introduction

Proposed Setup

Contributions

Experiments

Results

Conclusions

Problem Definition



- ▶ **Expensive** (€,€€€€)
- ▶ **Expertise** required for scientists
- ▶ Not accessible to **regular computer users**
- ▶ **ADVANTAGE:** High accuracy (0.1° - 1°) and high refresh rates (up to **600 Hz**)

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Our Aim

Building an eye-tracker that is:

- ▶ Cheap
- ▶ Easy to use
- ▶ Scalable
- ▶ Easy to build with custom components
- ▶ Compatible with a variety of operating systems
- ▶ Accurate and robust

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Use Cases

Such a system can be used in:

- ▶ **Remote** eye-tracking studies [1]
- ▶ **Parallel experiments** in a laboratory
- ▶ Applications in **mobile** devices
- ▶ **Non-critical applications** such as games

[1] A. Bojko, "The Truth About Webcam Eye Tracking"

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Techniques (By Camera Type) [2]

- ▶ **Infrared (IR):** IR methods use IR lights and cameras. Make use of the reflections of lights on the cornea.

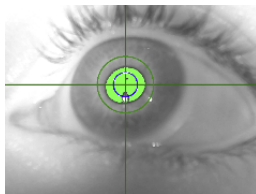
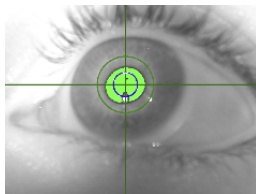


Image ©ITU Gaze Group.

[2] D. W. Hansen and Q. Ji, "In the eye of the beholder: A survey of models for eyes and gaze." IEEE TPAMI, vol. 32, no. 3, pp. 478–500, 2010.

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- ▶ **Visible light:** Use regular cameras and no additional light as part of the algorithm.

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Techniques (By Methodology)

- ▶ **Model based:** Fit a 2D/3D model to the eye/face. Then calculate the gaze point geometrically.

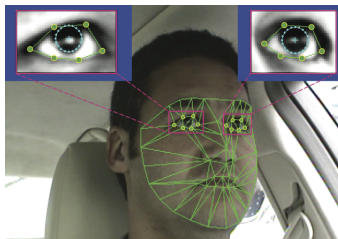
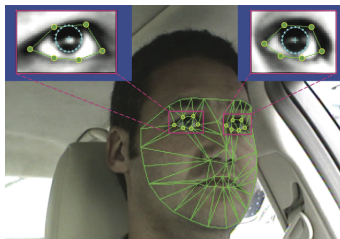


Image ©Takahiro Ishikawa.

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- ▶ **Model based:** Fit a 2D/3D model to the eye/face. Then calculate the gaze point geometrically.



- ▶ **Appearance based:** Directly map the image of the eyes to the gaze point. Mostly neural networks (NN) are trained with image pixels as input and gaze point as output.

Image ©Takahiro Ishikawa.

Open Source Eye-Tracker Software

There exist several open source options:

- ▶ **ITU Gaze Tracker** from IT Univ. of Copenhagen
Uses IR cameras and IR light sources, camera image contains only an eye
- ▶ **Opengazer** from Univ. of Cambridge
Uses regular webcams, no special lighting, camera image contains the entire face
- ▶ **Others:** EyeWriter, openEyes, Neural Network Eye Tracker (NNET), etc. [3]

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Hardware baseline:

- ▶ A regular webcam and a display

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Software structure:

- ▶ Based on Opengazer [4], works under natural light
- ▶ 5 components modified
 - ▶ Point selection
 - ▶ Point tracking
 - ▶ Blink detection
 - ▶ Calibration
 - ▶ Estimation

[4] P. Zieliński, <http://www.inference.phy.cam.ac.uk/opengazer/>

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Hardware for portable eye-tracker:

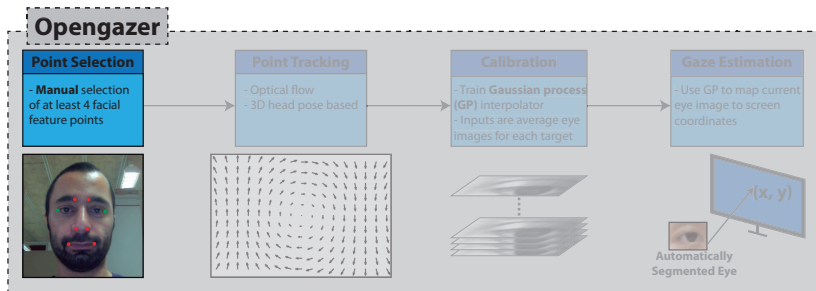
- ▶ Raspberry Pi, webcam and accessories (SD card, cables)

[4] P. Zieliński, <http://www.inference.phy.cam.ac.uk/opengazer/>

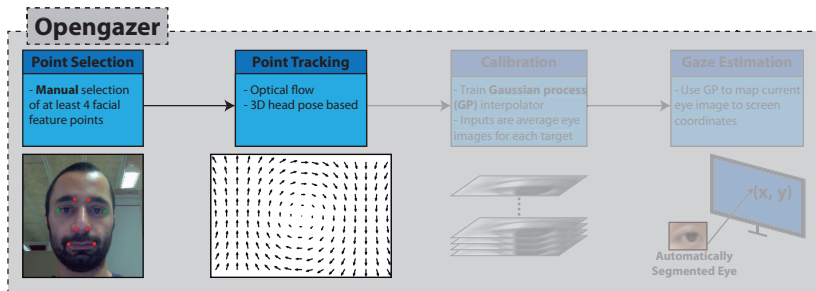
Video

[EYE-TRACKER VIDEO]

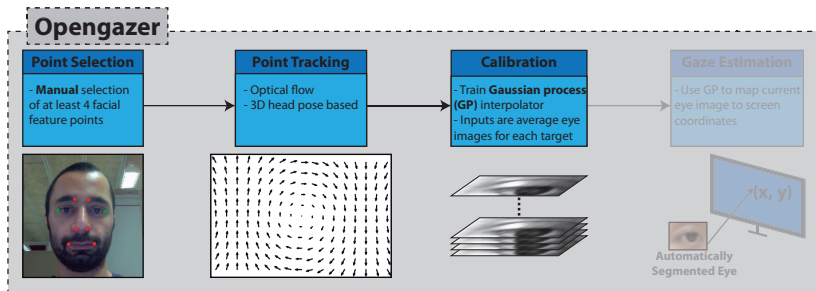
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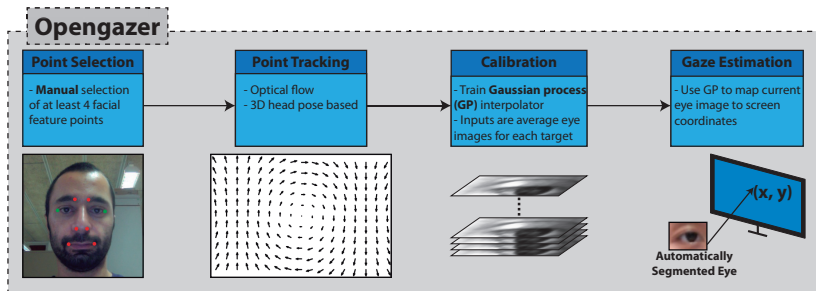
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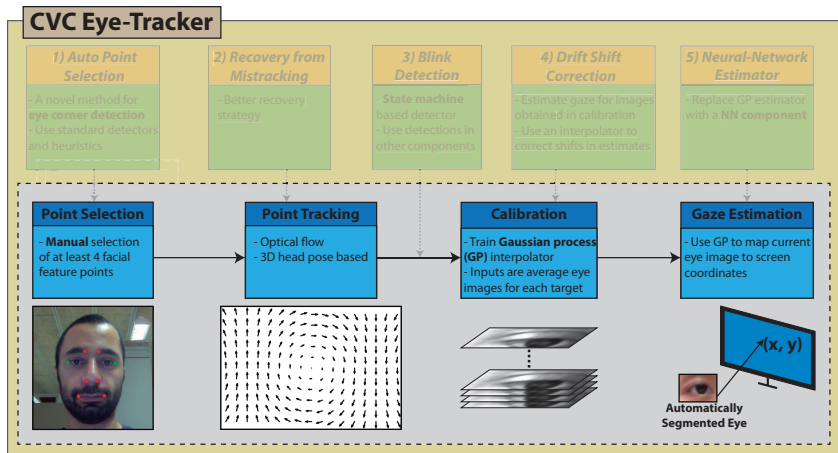
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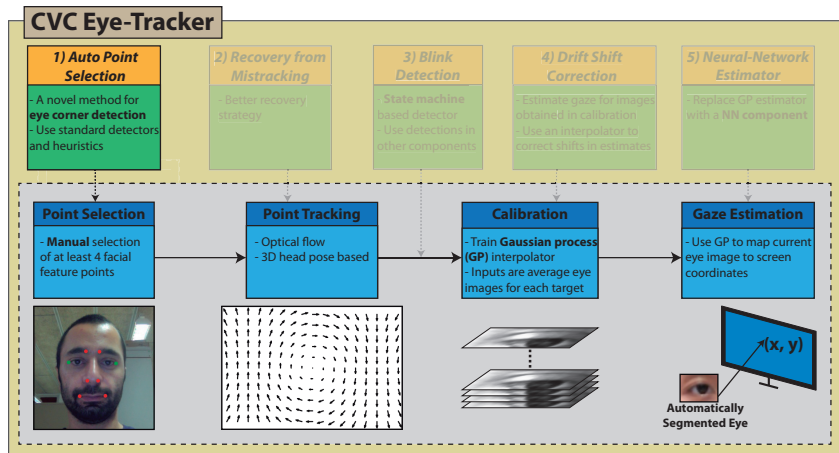
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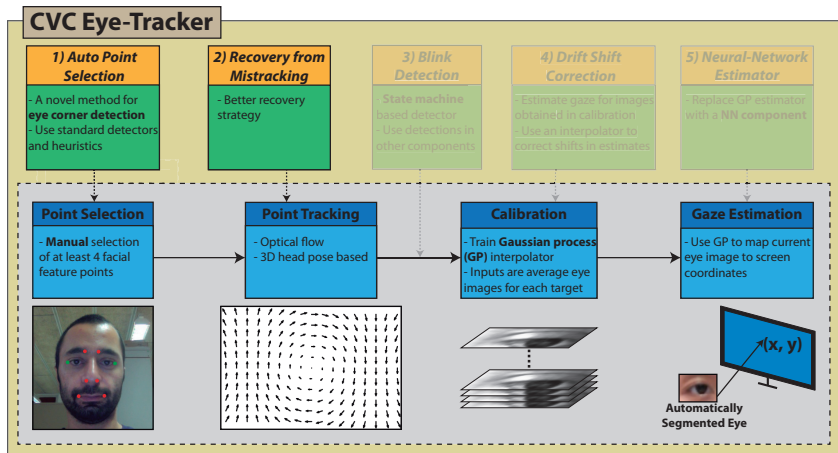
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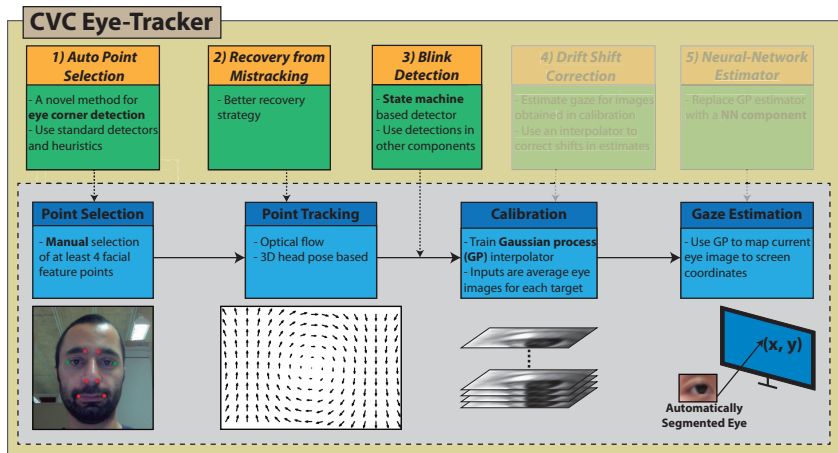
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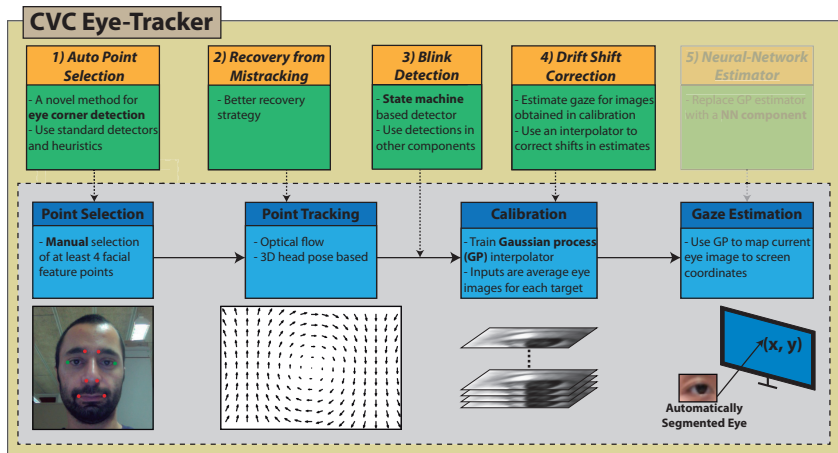
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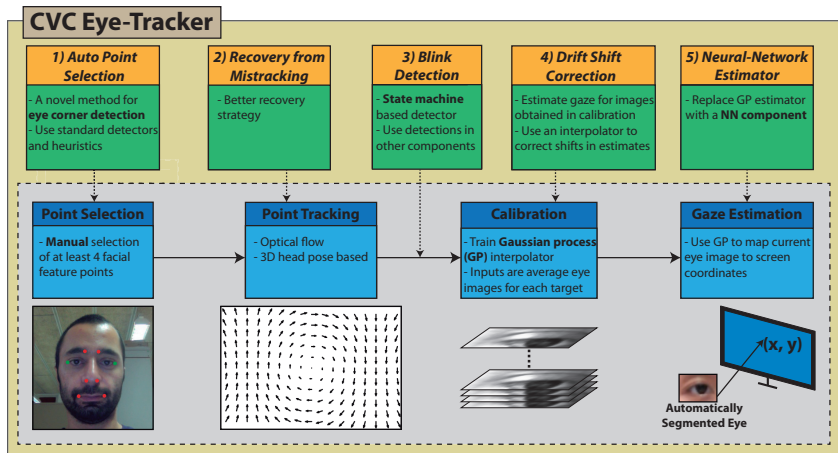
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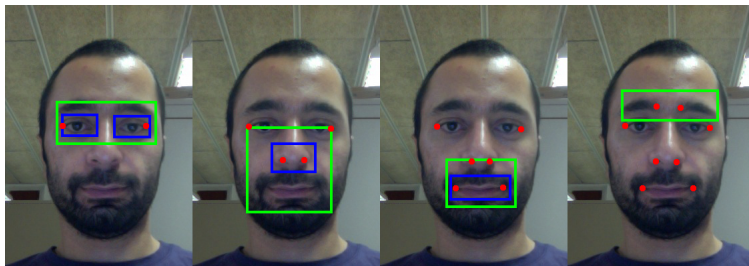


An Eye-Tracking System for a Single Webcam Setup



1) Automatic Point Selection

- ▶ Based on Haar cascades [5] (detectors for eye, nose, mouth)
- ▶ Use of geometrical heuristics (e.g. location of nosetips inside the detected nose rectangle)
- ▶ Novel method for fast eye-corner detection



[5] M. Castrillon-Santana, <http://mozart.dis.ulpgc.es/Gias/modesto.html?lang=0>

2) Tracking and 3) Blink Detection

- ▶ Improved strategies for point tracking and recovery from mistracking
 - ▶ In case of mistracking, use the 3D head pose based estimation
- ▶ A state-machine based blink detector
 - ▶ No estimation during blinks
 - ▶ Skip blinking frames during calibration

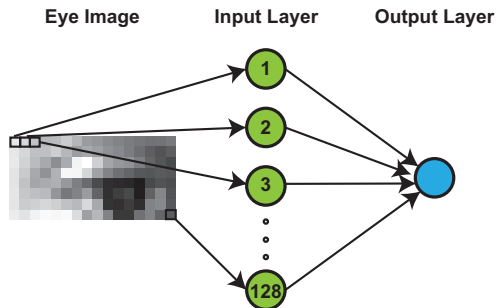
4) Calibration Error Correction

A drift shift correction method for improving training:

1. After calibration, calculate the gaze estimations for images acquired during calibration
2. Measure the errors between the average estimation for a target and actual target coordinates
3. Train a multivariate interpolator to correct these shifts
4. During testing, correct the estimations using the interpolator

5) Neural Network Estimator

Implement a neural network based estimator [6]:

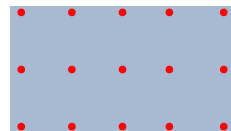
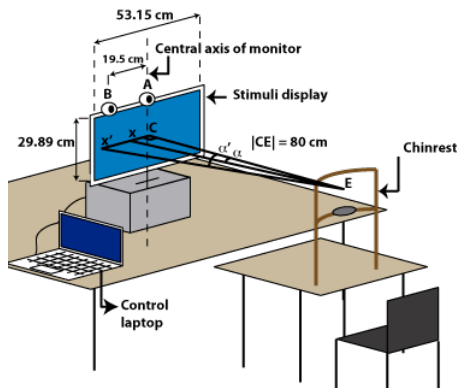


- ▶ Eye image resized to 16x8 pixels
- ▶ 4 networks for 2 eyes and 2 different outputs (X and Y coordinates)

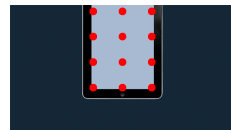
[6] O. V. Komogortsev, <http://cs.txstate.edu/ok11/nnet.html>

Experimental Setup

Components of the experimental setup and target point locations:



Entire screen (15 points)



iPad screen (12 points)

Setup Variations

Test for 4 different cases:

Setup	Distance	Camera	Chinrest	Target
STANDARD	80cm	Center		
EXTREME	80cm	Left		
CHINREST	80cm	Center	Yes	
iPAD	40cm	Center		

STANDARD setup

	Horizontal err.		Vertical err.	
	$^{\circ}(\sigma)$	Px	$^{\circ}(\sigma)$	Px
ORIG	1.82 (1.40)	95	1.56 (0.81)	80
2-EYE	1.56 (1.28)	82	1.48 (0.86)	75
TRACK	1.73 (1.37)	91	1.58 (0.78)	81
BLINK	1.73 (1.37)	91	1.58 (0.76)	80
CORR	1.62 (1.40)	85	1.50 (0.77)	76
NN	5.12 (2.26)	266	2.26 (0.92)	115

640 × 480 camera

	Horizontal err.		Vertical err.	
	$^{\circ}(\sigma)$	Px	$^{\circ}(\sigma)$	Px
ORIG	2.07 (1.69)	109	1.73 (1.04)	88
2-EYE	1.94 (2.14)	101	1.67 (1.07)	85
TRACK	1.77 (1.52)	93	1.50 (0.80)	76
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- ▶ **NN:** Previous + neural network estimator

Comparison of Setups (CORR)

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Standard	1.62 (1.40)	85	1.50 (0.77)	76
Extreme	1.88 (1.37)	98	1.78 (0.58)	91
Chinrest	1.25 (0.78)	66	1.53 (0.44)	78
iPad	2.49 (1.64)	64	2.08 (0.92)	54

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1280 × 720 camera

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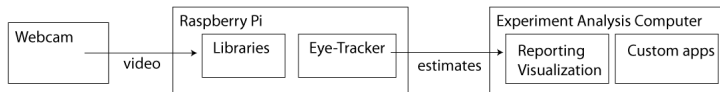
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A Portable Eye-Tracker

Feasibility analysis of our system as a portable, stand-alone eye-tracker



- ▶ The video stream is processed by **Raspberry Pi**
- ▶ Estimates can be accessed in **real-time** (ethernet) or **offline** (text file)
- ▶ The **reporting** and **visualisation** tools run in the analysis computer
- ▶ The eye-tracker can estimate the gaze with **~4 fps** in 640×480

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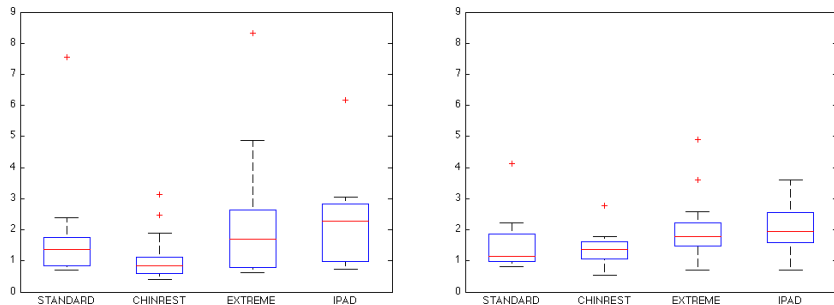
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The End

Thanks for your time!

Comparison of Subject Performances



Box plots for subject error rates horizontally (left) and vertically (right) under 1280×720 camera