

# Multimodal Sensor

This document covers the full sensor suite used in our anxiety detection study. We use a multimodal setup combining eye tracking, heart rate variability (HRV), galvanic skin response (GSR), video recording, and motion capture to pick up physiological markers of anxiety during psychometric testing.

The hardware includes 10 devices across five modalities, plus 2 software platforms for facial behavior analysis. Each device was chosen for measurement quality, wearability, and compatibility with simultaneous multi-sensor recording.

## 2. Eye Tracking Sensors

Eye tracking captures gaze position, fixation patterns, saccade dynamics, pupil dilation, and blink rates. These are all sensitive to cognitive load and anxiety.

### 2.1 Pupil Labs Core

**Type:** Head-mounted eye tracker

The Pupil Labs Core is an open-source, research-grade head-mounted eye tracker. It uses dark pupil detection with a 3D eye model for gaze estimation across varying lighting. The system supports binocular tracking at 200 Hz.

Parameter	Specification
<b>Detection</b>	Dark pupil + 3D eye model
<b>Calibration</b>	5-point
<b>World Camera</b>	1080p @30 Hz, 720p @60 Hz, 480p @120 Hz
<b>Eye Camera</b>	200 Hz binocular
<b>Connectivity</b>	USB-C
<b>Software</b>	Pupil Capture, Pupil Player (open source)
<b>Outputs</b>	Gaze position, fixation duration, saccade velocity, pupil diameter, blink rate

## 2.2 Tobii Pro Glasses 3

**Type:** Wearable eye tracker

Lightweight wearable eye tracker built for naturalistic research. Wide-angle scene camera and 100 Hz gaze sampling for detailed visual attention analysis.

Parameter	Specification
Gaze Rate	100 Hz
Scene Camera	1920x1080 @25 fps, wide-angle
Gaze Accuracy	0.6°
Connectivity	Wi-Fi, SD card
Weight	76 g
Software	Tobii Pro Lab, Tobii Pro Glasses Controller
Outputs	Gaze position, fixations, saccades, heat maps, areas of interest

## 2.3 SMI Eye Tracking Glasses

**Type:** Research-grade binocular eye tracker

SMI (SensoMotoric Instruments) ETG 2 Wireless model with natural-gaze headgear and full remote control via Wi-Fi. SMI was acquired by Apple in 2017, so the hardware is no longer sold, but it remains in use in many existing lab setups.

Parameter	Specification
Sampling Rate	60 Hz binocular
Scene Camera	HD, 24 fps

<b>Tracking</b>	Dark pupil, binocular
<b>Design</b>	Natural Gaze headgear
<b>Connectivity</b>	Wi-Fi wireless control
<b>Software</b>	BeGaze analysis software
<b>Outputs</b>	Gaze coordinates, fixations, saccades, scan paths, pupil diameter

### 3. Cardiac and Electrodermal Sensors

Heart rate variability (HRV) and electrodermal activity (EDA) reflect autonomic nervous system activity. Lower HRV and higher skin conductance are both linked to anxiety and stress.

#### 3.1 Polar H10+

**Type:** Chest strap — heart rate, HRV, inter-beat intervals

Widely considered the gold standard for chest-strap HR monitoring. Provides ECG-accurate data with high temporal resolution, well suited for HRV analysis.

<b>Parameter</b>	<b>Specification</b>
<b>Processor</b>	64 MHz microprocessor
<b>Sensor</b>	ECG-grade electrode
<b>Connectivity</b>	Bluetooth 5.0, ANT+
<b>Memory</b>	Internal storage for 1 session
<b>Battery</b>	CR2025 (~400 hours)
<b>Water Resistance</b>	30 m
<b>Outputs</b>	Heart rate (bpm), R-R intervals, HRV metrics (RMSSD, SDNN)

### **3.2 Moofit HW401**

**Type:** Wearable heart rate monitor

Cost-effective chest-strap HR monitor with ECG-level accuracy. Used as a secondary HR source for cross-validation with the Polar H10+.

Parameter	Specification
<b>Processor</b>	64 MHz microprocessor
<b>Sensor</b>	ECG sensor
<b>Connectivity</b>	Bluetooth 5.0, ANT+
<b>Battery</b>	CR2032 (~800 hours)
<b>Compatibility</b>	Wahoo, Strava, Polar Beat, and 50+ apps
<b>Outputs</b>	Heart rate (bpm), R-R intervals

### **3.3 Empatica E4 Wristband**

**Type:** Wrist wearable — EDA, BVP, temperature, accelerometry

Medical-grade wristband integrating multiple physiological sensors. The only device in our setup that captures electrodermal activity from the wrist, giving continuous skin conductance alongside blood volume pulse and temperature.

Parameter	Specification
<b>EDA Sensor</b>	Galvanic skin response, 4 Hz
<b>BVP Sensor</b>	Photoplethysmograph (PPG), 64 Hz
<b>Temperature</b>	Infrared thermopile, 4 Hz

<b>Accelerometer</b>	3-axis MEMS, 32 Hz
<b>Battery</b>	~48 hrs streaming, ~60 hrs recording
<b>Connectivity</b>	Bluetooth Low Energy, USB
<b>Software</b>	E4 Connect, E4 Realtime
<b>Outputs</b>	EDA ( $\mu$ S), BVP, skin temperature, acceleration, inter-beat intervals

### 3.4 TEA CAPTIV T-SENS GSR

**Type:** Wireless galvanic skin response sensor

Lightweight wireless GSR sensor for ambulatory research. Measures skin conductance via finger electrodes with minimal movement artifact.

Parameter	Specification
<b>Sampling Rate</b>	32 Hz
<b>Weight</b>	20 g
<b>Battery Life</b>	8 hours continuous
<b>Connectivity</b>	Wireless (TEA CAPTIV system)
<b>Electrodes</b>	Finger-mounted Ag/AgCl
<b>Software</b>	TEA CAPTIV analysis suite
<b>Outputs</b>	Skin conductance level (SCL), skin conductance responses (SCR)

### **3.5 BioPac EDA Sensors**

**Type:** Research-grade electrodermal activity measurement

BioPac EDA100C module provides high-fidelity EDA measurement, connected to the MP160 data acquisition platform for synchronized multi-channel recording.

<b>Parameter</b>	<b>Specification</b>
<b>Module</b>	EDA100C amplifier
<b>Measurement</b>	Skin conductance (constant voltage, 0.5 V)
<b>Range</b>	0–100 µS
<b>Resolution</b>	0.001 µS
<b>Electrodes</b>	Isotonic gel electrodes (finger/palm)
<b>Software</b>	AcqKnowledge
<b>Outputs</b>	Tonic SCL, phasic SCR, response latency, amplitude

## **4. Video and Motion Capture**

Video cameras and motion capture provide visual recordings for facial expression analysis and body movement tracking, complementing the physiological sensors.

### **4.1 AXIS P1275 Camera**

**Type:** Network surveillance camera

HD network camera with Wide Dynamic Range and Forensic Capture for clear video in challenging lighting typical of lab environments.

<b>Parameter</b>	<b>Specification</b>
<b>Resolution</b>	HDTV 1080p (1920x1080)
<b>Frame Rate</b>	Up to 60 fps
<b>Dynamic Range</b>	WDR — Forensic Capture
<b>Compression</b>	H.264, Motion JPEG
<b>Connectivity</b>	Ethernet (PoE)
<b>Outputs</b>	HD video for facial expression analysis

## 4.2 AXIS P1245 Camera

**Type:** Compact network camera

Compact, discreet network camera providing supplementary video angles. Small form factor for unobtrusive placement in experimental settings.

<b>Parameter</b>	<b>Specification</b>
<b>Resolution</b>	HDTV 1080p (1920x1080)
<b>Frame Rate</b>	Up to 30 fps
<b>Compression</b>	H.264, Motion JPEG
<b>Form Factor</b>	Compact, board-mounted
<b>Connectivity</b>	Ethernet (PoE)
<b>Outputs</b>	Supplementary video angle for behavior observation

### **4.3 OptiTrack Slim X13**

**Type:** Infrared motion capture system

High-resolution IR motion capture camera that tracks reflective markers with sub-millimeter accuracy for precise body and head movement analysis.

<b>Parameter</b>	<b>Specification</b>
<b>Resolution</b>	1280 x 1024 (1.3 MP)
<b>Frame Rate</b>	240 Hz native
<b>Latency</b>	4.2 ms
<b>3D Accuracy</b>	± 0.30 mm
<b>Dimensions</b>	2.7 x 2.7 x 0.9 inches
<b>Weight</b>	0.7 lbs (0.32 kg)
<b>Outputs</b>	3D marker positions, head pose, body kinematics

## **5. Software Platforms**

Two facial behavior analysis platforms extract facial action units, emotion classifications, and gaze estimates from the recorded video.

### **5.1 OpenFace 2.0**

**Type:** Open-source facial behavior analysis toolkit

Developed by Tadas Baltrušaitis at CMU MultiComp Lab. Performs real-time facial landmark detection, head pose estimation, action unit recognition, and gaze estimation using convolutional neural networks. Free for research use.

Parameter	Specification
<b>Facial Landmarks</b>	68-point detection (CE-CLM algorithm)
<b>Head Pose</b>	6 DOF estimation (translation + rotation)
<b>Action Units</b>	AU intensity (0–5) and presence detection
<b>Gaze Estimation</b>	Per-eye gaze direction vectors
<b>Performance</b>	Real-time from webcam, no special hardware needed
<b>License</b>	Academic / research use
<b>Output Format</b>	CSV, AVI (with overlays)

## 5.2 Noldus FaceReader

**Type:** Commercial facial expression analysis software

Commercial-grade facial analysis platform using a 468-point Active Appearance Model. Achieves 99% accuracy on the ADFES benchmark and supports both real-time and post-hoc video analysis.

Parameter	Specification
<b>Face Model</b>	468-point Active Appearance Model
<b>Action Units</b>	20 FACS Action Units
<b>Emotions</b>	7 basic + neutral + custom expressions
<b>Accuracy</b>	99% on ADFES dataset
<b>Additional</b>	Valence, arousal, gaze direction, head orientation
<b>Multi-Subject</b>	Simultaneous analysis of multiple faces
<b>Output Format</b>	CSV, FaceReader project files

## 6. Sensor Comparison

### 6.1 Eye Tracking

Feature	Pupil Labs Core	Tobii Pro Glasses 3	SMI ETG
<b>Sampling Rate</b>	200 Hz (eye cam)	100 Hz	60 Hz
<b>Type</b>	Head-mounted	Wearable glasses	Wearable glasses
<b>Calibration</b>	5-point	Single-point	Multi-point
<b>Open Source</b>	Yes	No	No
<b>Streaming</b>	Yes	Yes (Wi-Fi)	Yes (Wi-Fi)
<b>Availability</b>	Available	Available	Discontinued
<b>Best For</b>	High-freq research	Naturalistic studies	Legacy setups

### 6.2 Cardiac and Electrodermal

Feature	Polar H10+	Moofit HW401	Empatica E4	TEA SENS	T-	BioPac EDA
<b>Modality</b>	ECG / HR	ECG / HR	EDA+BVP+Temp	GSR		EDA
<b>Form Factor</b>	Chest strap	Chest strap	Wristband	Finger sensor		Finger electrodes
<b>Wireless</b>	BLE + ANT+	BLE + ANT+	BLE	Wireless		Wired (USB)
<b>Sampling</b>	ECG-grade	ECG-grade	4–64 Hz	32 Hz		High-res

<b>Multi-Sensor</b>	No	No	Yes (4)	No	No
<b>Best For</b>	HRV research	Cross-validation	Ambulatory EDA	Wireless GSR	Lab-grade EDA

### 6.3 Video and Motion Capture

Feature	AXIS P1275	AXIS P1245	OptiTrack X13
Type	Network camera	Compact camera	IR motion capture
Resolution	1080p	1080p	1.3 MP
Frame Rate	60 fps	30 fps	240 Hz
Key Feature	WDR-Forensic	Compact form	±0.30 mm accuracy
Connectivity	PoE Ethernet	PoE Ethernet	USB / Ethernet
Best For	Primary facial video	Secondary angle	3D body tracking

### 6.4 Software Platforms

Feature	OpenFace 2.0	Noldus FaceReader
License	Open-source (academic)	Commercial
Face Model	68-point CE-CLM	468-point AAM
Action Units	Intensity + presence	20 FACS AUs

<b>Emotion Detection</b>	No (AU-based inference)	Yes (7 basic + custom)
<b>Gaze Estimation</b>	Yes (per-eye vectors)	Yes
<b>Real-Time</b>	Yes	Yes
<b>Multi-Subject</b>	Yes	Yes
<b>Best For</b>	Research / custom pipelines	Turnkey emotion analysis

## 7. Experiment Protocol

The experiment follows a 5-phase, 30-minute protocol designed to capture multimodal physiological data during psychometric testing.

<b>Phase</b>	<b>Duration</b>	<b>Description</b>
<b>1. Interview</b>	10 min	Semi-structured demographic interview and informed consent
<b>2. Sensor Setup</b>	5 min	Fit Pupil Labs Core, Polar H10+, and Moofit HW401; calibrate all sensors
<b>3. Baseline</b>	~3 min	Reading task to establish resting-state physiological measurements
<b>4. Testing</b>	15 min	Participants complete HADS, STAI, BFI-10, and FQ on screen while all sensors record
<b>5. Debrief</b>	~2 min	Participant feedback; mental health resources provided if needed

### Psychometric instruments administered:

HADS — Hospital Anxiety and Depression Scale

STAI — State-Trait Anxiety Inventory (STAI-S and STAI-T)

BFI-10 — Big Five Inventory (10-item short form)

FQ — Fear Questionnaire

## 8. Anxiety Detection Thresholds

Literature-based thresholds used to identify anxiety-related physiological responses.

Sensor	Measure	Threshold	Source
Pupil Labs Core	Fixation duration	< 250 ms	Laeng et al. (2012)
Pupil Labs Core	Saccade velocity	Extremely high	van der Lans et al. (2013)
OpenFace	Brow furrowing (AU 4)	Increased intensity	Ekman & Friesen (1978)
OpenFace	Lip tightening (AU 24)	Increased intensity	Ekman & Friesen (1978)
TEA GSR	Skin conductance response	> 0.05 µS	Boucsein (1992)
Polar H10+/Moofit	RMSSD	< 50 ms	ESC/NASPE Task Force (1996)
Polar H10+/Moofit	SDNN	< 50 ms	ESC/NASPE Task Force (1996)

## **9. References**

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