

# AIR<sup>T</sup>ENTION

Pilot training assistane of the future



# Pilot Training Assistance

## Success Story of pilot training

**Standardization** of processes as **key success factor** for increasing Safety in aviation in the last half century

- **Automation** of activities
- **Enable correct decision-making under pressure**
- **Avoidance of errors**

## Shortcomings of Pilot Training

Optimal results require **INDIVIDUALIZATION**

- **No objective measurements** of trainee performances
- **Subjective** evaluations and interpretations
- Limited availability of individual support
- No **perception-, attention-based training support**



# Airtention Challenges

Focus on technical competencies

WHAT information?

WHEN is it relevant?

WHERE can it be obtained?

HOW EFFICIENT and AUTOMATED is the interaction / information intake?





VISUAL  
ATTENTION  
ANALYSIS

GAZE  
BEHAVIOR  
ANALYSIS

COGNITIVE  
LOAD  
ANALYSIS

PILOT  
TRAINING  
ASSISTANCE

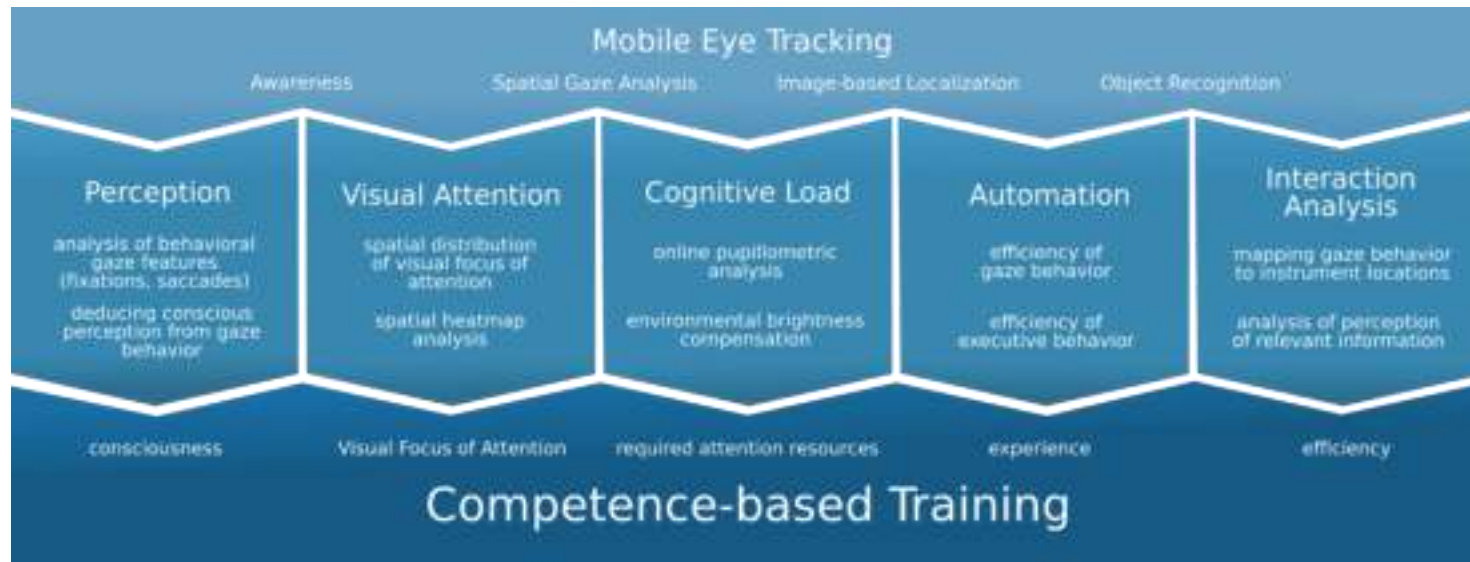
INSTRUMENT  
INTERACTION  
ANALYSIS

PERCEPTION  
ANALYSIS

ATTENTION  
STRESS  
MGMT

# SKILL & COMPETENCE APPROACH

Efficiency / Accuracy





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## Technical Setup



# TECHNICAL SETUP

## Sensor Systems :: Pupil Invisible

- „Just put it on and go:  
The world’s first deep learning powered eye tracking glasses”
- Robust gaze estimation in any environment
- Robust to slippage on the wearing person
- Swappable lenses from -8 to +8 diopter

### Technical Specifications

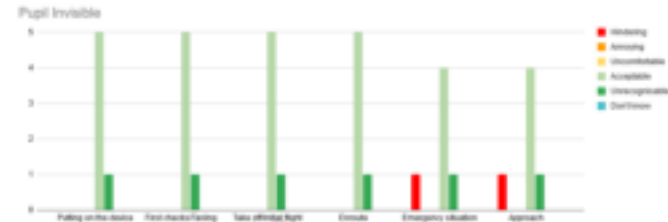
- 2 IR eye cameras with 200Hz @ 192x192px
- World camera with 30Hz @ 1088x1080px, 70°x70° FOV
- IMU with 200Hz included
- Microphone included
- Gaze data @ 55Hz



Pupil Invisible Eye Tracker



Pupil Invisible Eye Tracker

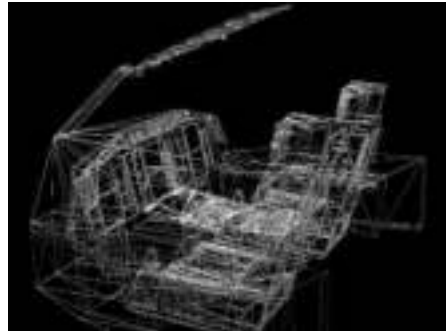
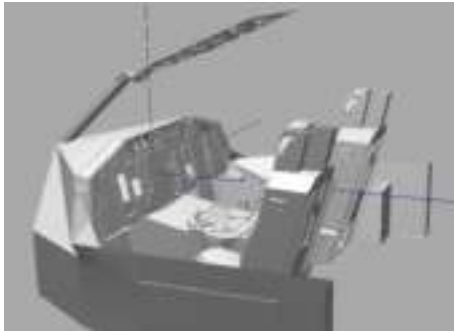


Obtrusiveness of student pilots in different phases of flight

# TECHNICAL SETUP

## Framework :: Environment Modeling

- modelling of cockpit environments for data visualization and analysis
- 1:1 virtual representation of the cockpit
- visualization styles: Mesh, Wireframe and Pointclouds



Attentive Cockpit Application's Mesh, Wireframe and Pointcloud View



# Localization & Mapping

## III: Absolute Localization (AL) + Relative Tracking (RT)

Localization results only used for visualization and not for instrument mapping or for interaction analysis



### Requirements

- Stable, accurate and successful object recognition

### Advantages

- Pose Tracking's accuracy requirements are lower

### Disadvantages

- Drift compensation not possible
- Complex setup for visualization

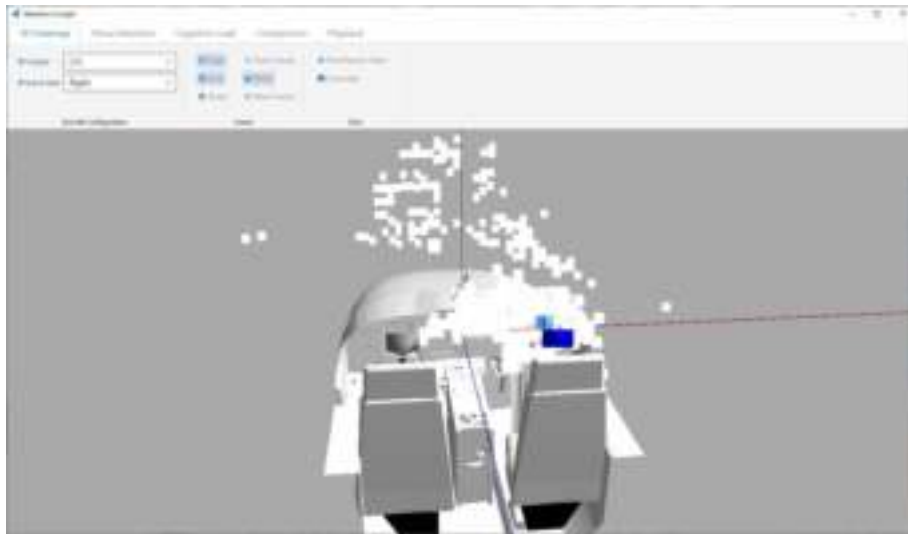
# AIR**TENTION**

## Modeling Pilot Performance

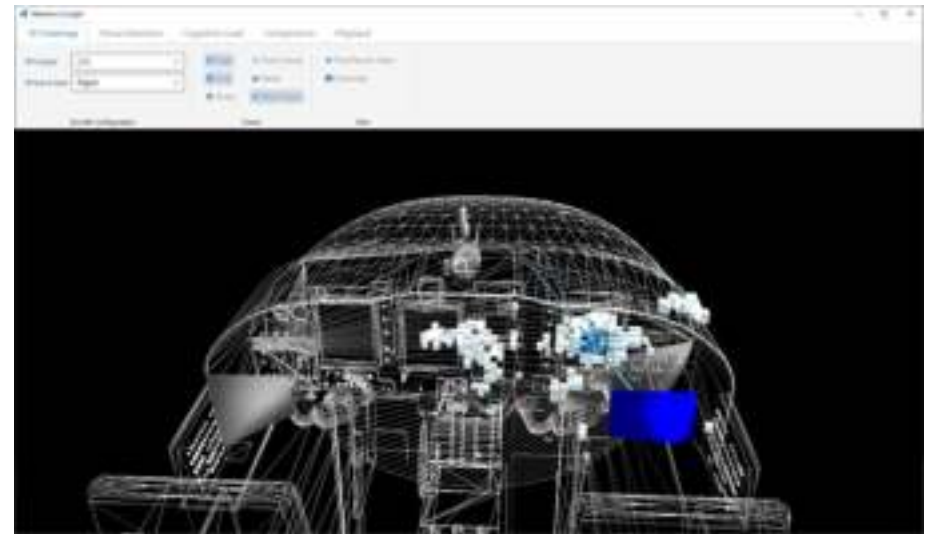


# Modeling Pilot Performance

## Analysis :: Heatmap Visual Attention



3D heatmap of visual attention after taxi and SID



3D heatmap of visual attention in approach

# Modeling Pilot Performance

## Conscious Perception

Analysis of behavior patterns for estimation of consciousness of interaction

- **fixations, saccades, dwell time duration, frequentation**
- analysis of cognitive load
- Interpretation of gaze behavior in relation to **saliency of contextual stimuli** (covert (conscious behavior control) vs. overt behavior (extraneously trigger behavior control))
- **Smooth pursuit**



# Modeling Pilot Performance

## Cognitive Load from Pupil dilation

Established, reliable indicator for **cognitive activity / load**

- Pupil dilation shows correlations to para-sympathetical nervous system which is **associated with cognitive load**
- Spontaneous dilation **independent from illumination**
- Pupil Dilation changes associated with cognitive load: 0-1 mm
- Pupil Dilation changes associated with illumination: 0-6 mm

### Problem:

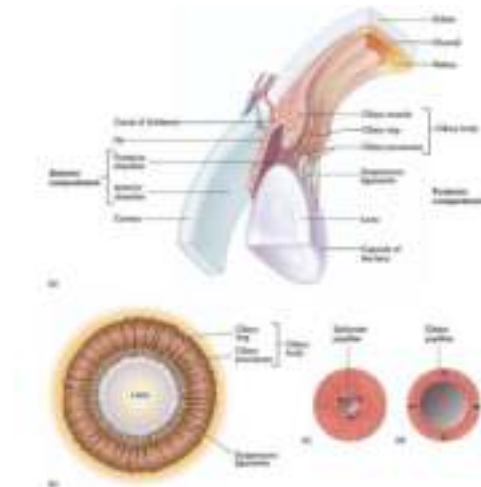
- **Separation** of cognitive effects **from light-induced effects** of pupil size

Gabay, Shai, Yoni Pertzov, and Avishai Henik. "Orienting of attention, pupil size, and the norepinephrine system." *Attention, Perception, & Psychophysics* 73.1 (2011): 123-129.

S. H. Fairclough and K. Houston. A metabolic measure of mental effort. *Biological Psychology*, 66(2):177-190, 2004.

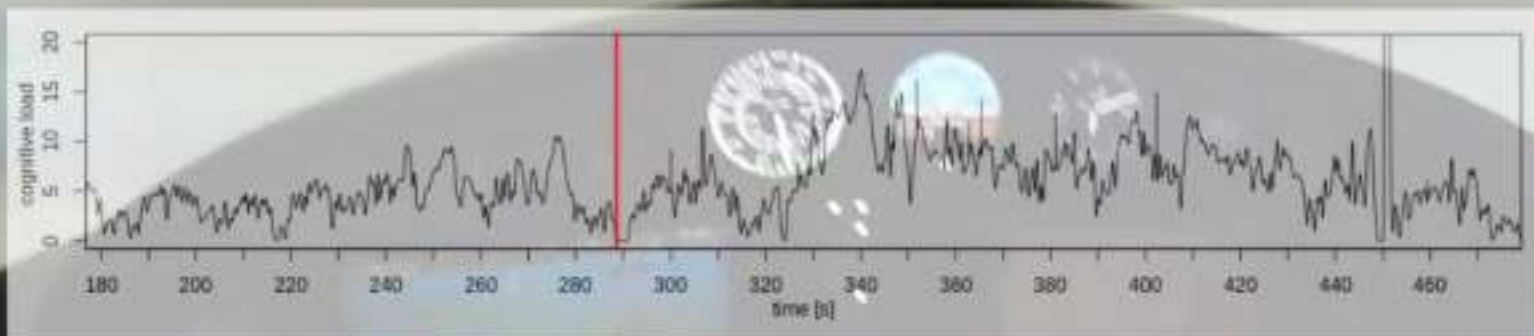
Jepma, Marieke, and Sander Nieuwenhuis. "Pupil diameter predicts changes in the exploration-exploitation trade-off: evidence for the adaptive gain theory." *Journal of cognitive neuroscience* 23.7 (2011): 1587-1596.

Hoeks, Bert, and Willem JM Levelt. "Pupillary dilation as a measure of attention: A quantitative system analysis." *Behavior Research Methods, Instruments, & Computers* 25.1 (1993): 16-26



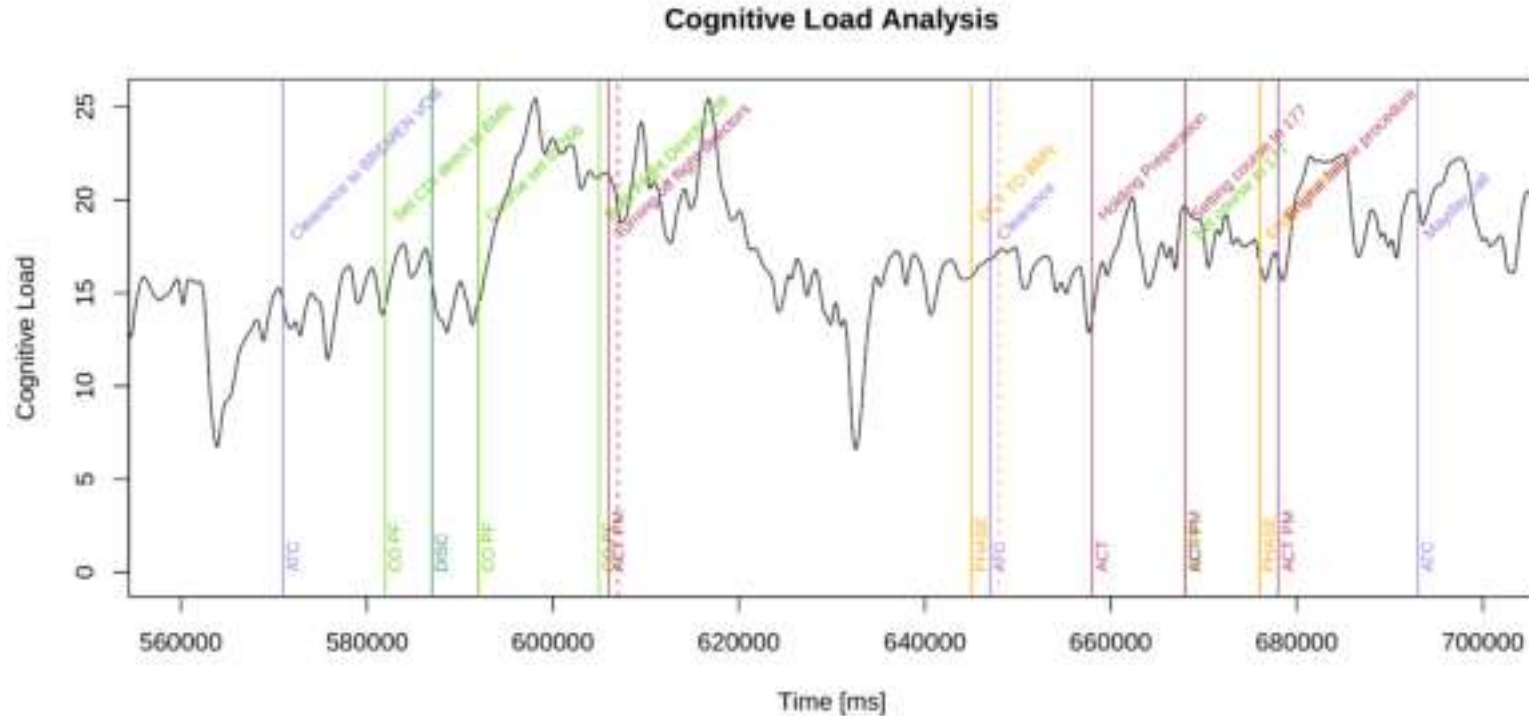
Physiology of the eye,  
[http://intzones10mu.edu.ua/data/afedra/internal/normal\\_ghts/classer\\_stud/en/nurse/Bacchaour%20of%20science%20in%20nurses/ADN/17\\_Physiology\\_of\\_eye.htm](http://intzones10mu.edu.ua/data/afedra/internal/normal_ghts/classer_stud/en/nurse/Bacchaour%20of%20science%20in%20nurses/ADN/17_Physiology_of_eye.htm)



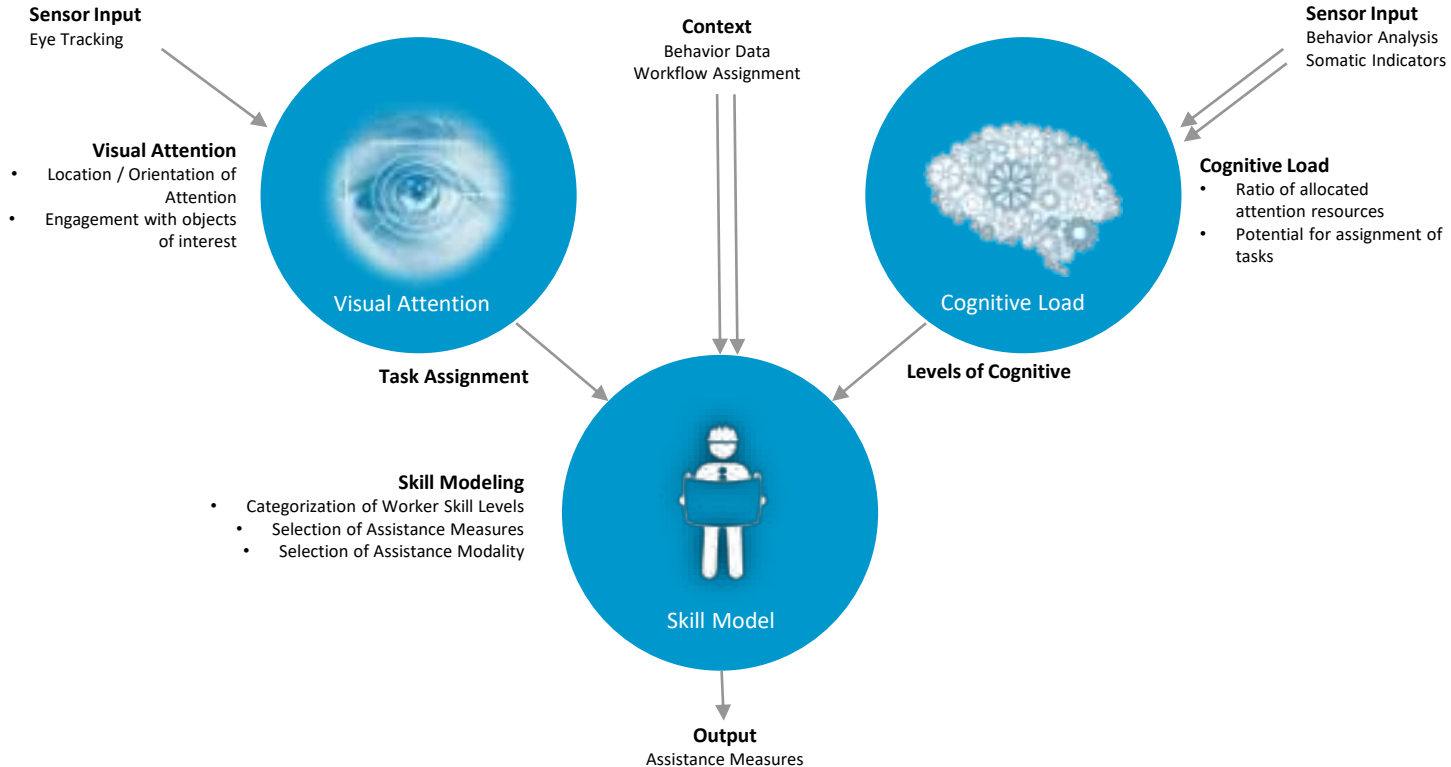




# Modeling Pilot Performance

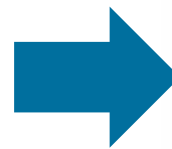
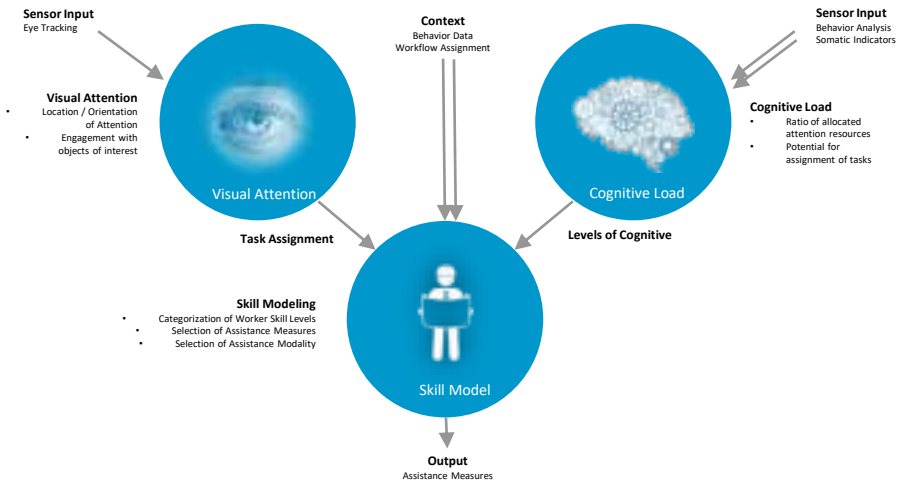


# Modeling Pilot Performance



# Modeling Pilot Performance

## Mapping to CBT Models



# AIR<sub>NTENTION</sub>

## FlightAnalyzer Application



Session:  
Flight\_2021-06-29\_10-31-48

Pilot Flying:  
benedikt

Pilot Monitoring:  
n.A.

Instructor:  
mic

Stop Recording

Monitor 1

Trainee View

Cockpit View

Cockpit 3D View

Statistics View



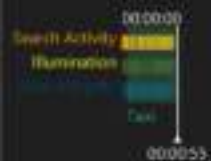
Monitor 2

Trainee View

Cockpit View

Cockpit 3D View

Statistics View



00:30:00

Take Off

Landing

Go around

Taxi

Departure

Climb

Approach

Missed Approach

Return

Note...

Session:  
**flight\_2021-06-28\_13-04-11**

Pilot Flying:  
**benedikt**

First Monitoring:  
**n.A.**

Instructor:  
**mic**

Stop Recording

Monitor 1

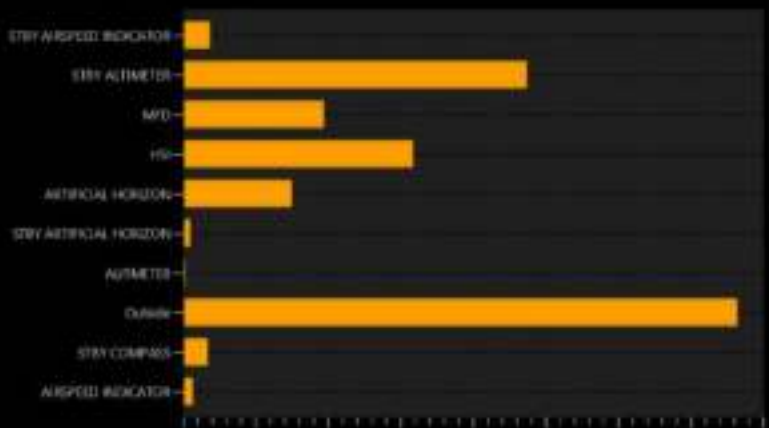
[Trainee View](#)
[Cockpit View](#)
[Cockpit 3D View](#)
[Statistics View](#)



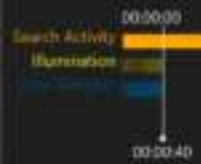
Monitor 2

[Trainee View](#)
[Cockpit View](#)
[Cockpit 3D View](#)
[Statistics View](#)

Gaze Distribution (since session start)



Fixation Duration (last 20 seconds)



[Take Off](#)
[Landing](#)
[Go around](#)
[Taxi](#)
[Departure](#)
[Cruise](#)
[Approach](#)
[Missed Approach](#)
[Failure](#)
[None](#)



Session  
flight\_2021-11-11\_11-27-55

Pilot Flying  
Q78341

Pilot Monitoring  
n.A.

Instructor  
test

Pause Playback

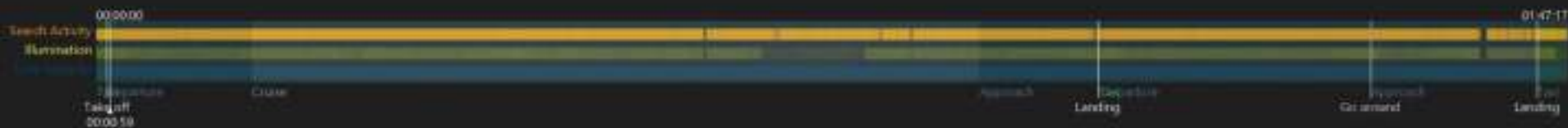
Monitor 1

Trace View Cockpit View Cockpit 3D View Station View



Monitor 2

Trace View Cockpit View Cockpit 3D View Station View



Events

Take Off (T) Landing (L) Go around (G) Failure (F) Procedure (P) Note (N)

Flight Phase

Take Off (T) Departure (D) Cruise (C) Approach (A) Missed Approach (M)

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## Validation



# Validation :: Reference Data

- Enable comparison of individual session data to references
- Flight phase dependent data (SID, Cruise, Approach)
- Sources for reference data:
  - Expert flights  
Gaze data of experienced pilots are used
  - Averaged data of multiple sessions  
Data for flight phases of multiple sessions are aggregated
- Data types:
  - Heatmap
  - Gaze distribution
  - Gaze AOI transitions
  - Advanced Metrics



Reference heatmap as averaged heatmap out of 15 ILS approaches

# Validation :: Reference Data Comparison

*Comparison to reference data as an approach to analyze source of performance shortages*



Difference heatmap for approach: red shows "lacking areas", yellow shows "additional areas" and black "matching areas"



Gaze distribution for approach: orange shows actual distribution, blue shows reference gaze distribution

Transition Matrix

	0	1	2	3	4	5	6	7	8	9
0	100	0	0	0	0	0	0	0	0	0
1	0	100	0	0	0	0	0	0	0	0
2	0	0	100	0	0	0	0	0	0	0
3	0	0	0	100	0	0	0	0	0	0
4	0	0	0	0	100	0	0	0	0	0
5	0	0	0	0	0	100	0	0	0	0
6	0	0	0	0	0	0	100	0	0	0
7	0	0	0	0	0	0	0	100	0	0
8	0	0	0	0	0	0	0	0	100	0
9	0	0	0	0	0	0	0	0	0	100

Transition difference matrix: values show the percentual difference between transitions from one AOI to another

Transition Matrix Density: 0.256 (0.750 - 0.410)  
 State Transition Entropy (STE): 0.940 (0.999 - 0.214)  
 Lempel-Ziv Complexity (LZC): 0.683 (0.750 - 0.633)

Transition metrics with reference values and difference to the reference value in blue

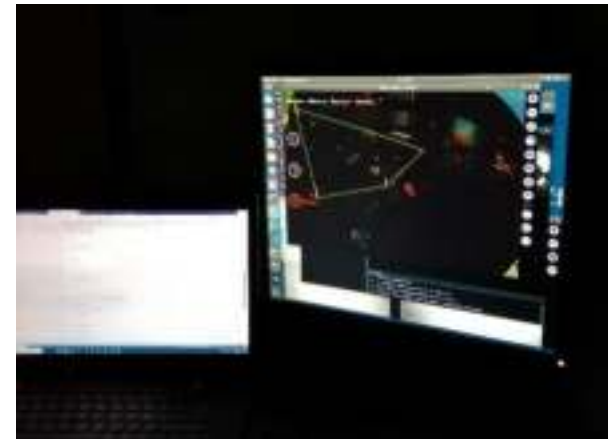
# AIR<sub>CONTROL</sub>TENTION

## Summary



## USPs - current

- Combination of low-cost infrastructure / high quality interaction analysis (2k € vs. 25 – 80k€)
- Level of detail in visual interaction analysis
  - Continuous gaze tracking in 3D
  - High spatial resolution
- Cognitive load analysis
  - Qualitative / quantitative analysis
- Single system for live / debriefing assistance
- Without additional infrastructure
  - no alteration of certified simulators
  - Simple scalability





# USPs - future



- Competence modeling for individuals and in comparison to colleagues
  - Visual features of cognition, perception, engagement, automation
- Adaptive training schedules
- Scalability towards real cockpits

**R S A F G**

Research Studio **PCA**

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