

# Eye Gaze-Based Human Error Prevention System: Experts vs. Non-Experts



# AGENDA

- Background on Eye Gaze Behavior and Eye Tracking
- Hypotheses
- Experiment Design
  - Tobii Pro Nano Eye Tracker
  - FortiGate-90D Firewall
  - Google Form Questionnaire and Two Network
     Configuration Tasks
- Observations & Findings
- Proposed Model for Human Error Prevention

#### BACKGROUND ON EYE GAZE BEHAVIOR

- Gaze Behavior: the way an individual uses their vision to extract relevant information from the environment to produce an optimal action
- Visible field of view vs. attention
  - What to capture in high resolution or observe in fine detail?
  - Fixations: when gaze remains stable on an area of interest
  - Saccades: rapid eye movements that typically occur when moving from one fixation location to another
  - Dwells: an individual's visual visits to an area of interest, where each visit is a dwell

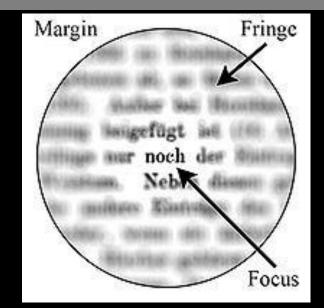
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#### Spotlight Theory

#### Michael I. Posner, 1980

- Attention is limited in spatial extent; spotlight
  - Independent of eye movement; parafoveal vision
- Research suggests that perceptual learning could enlarge an individual's perceptual span
- Saccade: The eye movement from one area of interest to the next across the perceptual span



#### Attenuation Filter and Dictionary Units Theory

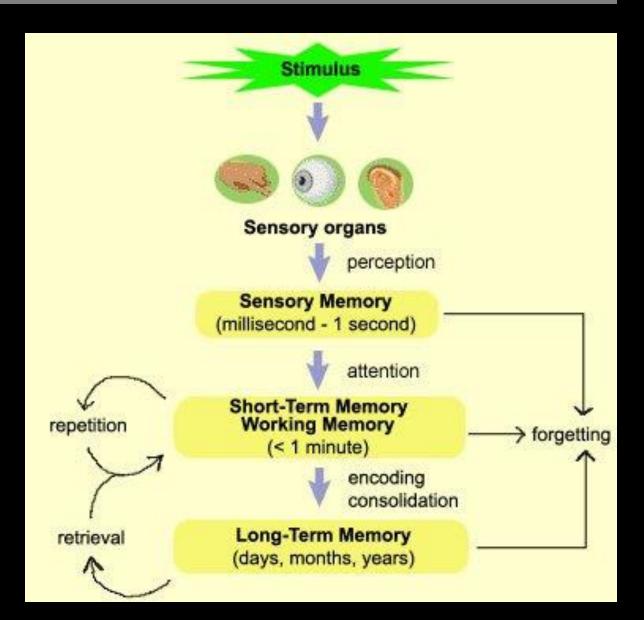
#### Anne Treisman, 1960s

- Attenuation Filter: the selection of sensory messages to filter out unwanted information so that attention is drawn to the necessary areas
- Dictionary Units: individual processes the selected information based on its importance, relevance and context to generate areas of interest
- Higher fixations in an area = area requires greater attention

#### Long-Term Working Memory Theory

#### Ericsson and Kintsch, 1995

- Working Memory: the temporary storage of information that is being processed for any cognitive task(s); Ericsson refers to this temporary storage as short-term working memory
- Ericsson introduces
   long-term working memory: information
   stored in stable form and accessed
   when presented with sufficient
   retrieval cues
  - Experts able to act proactively with skilled performance



### **HYPOTHESES**

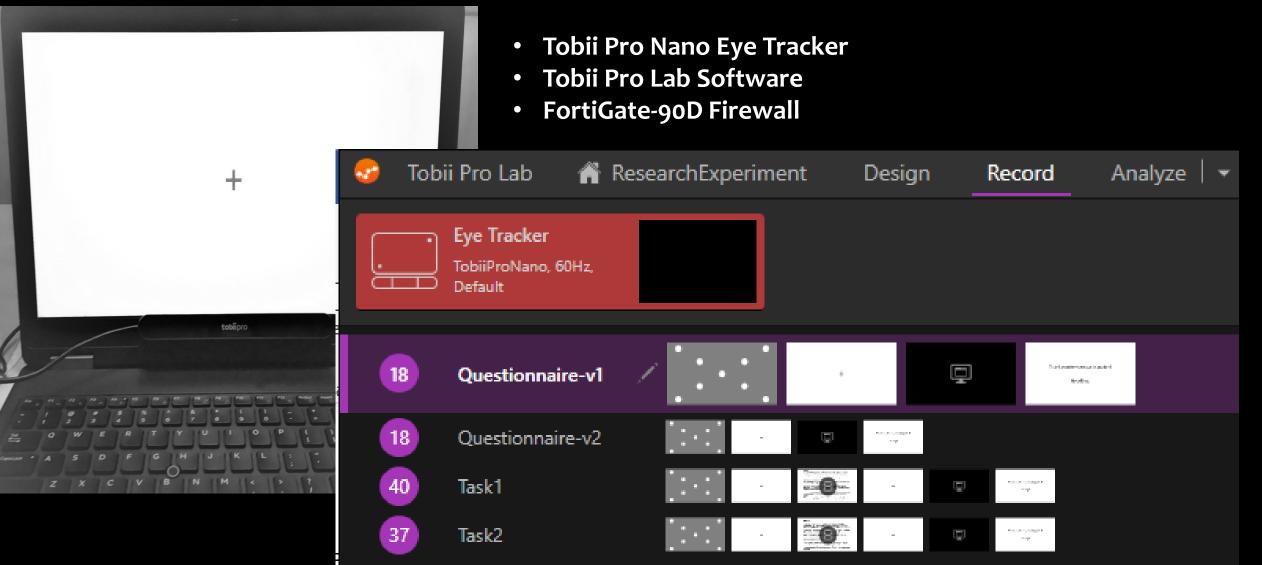
Main Hypothesis: Experts have different eye gaze behavior when compared to non-experts

**Hypothesis 1: Spotlight theory on parafoveal vision:** experts are expected to have less saccades in comparison to non-experts with a possibly higher amplitude of saccades

Hypothesis 2: Attenuation Filter and Dictionary Units Hypothesis: experts are expected to make less fixations of shorter durations throughout each task in-comparison to non-experts.

**Hypothesis 3: Long-term Working Memory Hypothesis:** experts are expected to retrieve relevant information from working memory more rapidly than non-experts, therefore, experts will have shorter fixation durations and shorter dwell times in comparison to non-experts, while making fewer errors than non-experts.

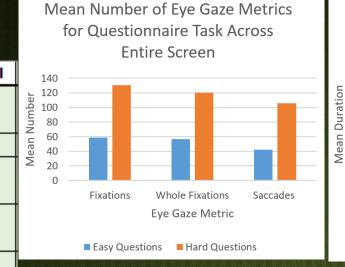
## EXPERIMENT DESIGN



# FINDINGS FOR EACH TASK ENTIRE SCREEN AOI

# **RESULTS FOR QUESTIONNAIRE TASK**

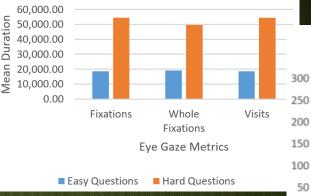
T-test	Entire Screen AOI	14
Total Duration of		
Fixations	2.77E-07	Num 8
Number of Fixations	2.02E-08	Mean Number
Total Duration of		≥ 2
Whole Fixations	1.20E-07	
Number of Whole		
Fixations	1.62E-08	
Total Duration of		
Visits	6.64E-08	
Number of Visits	N/A	
Number of Saccades		60
(AOI)	8.93E-08	ount)
Total Amplitude of		O 40
Saccades (TOI)	1.36708E-05	30 Numh
		Standard Deviation (Number Count) 0 01 02 02 09 05 05
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Standard Deviation of Eye Gaze Metrics for

Questionnaire Task Across Entire Screen

Mean Duration of Eye Gaze Metrics for Questionnaire Task Across Entire Screen

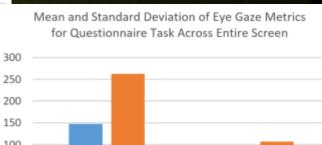


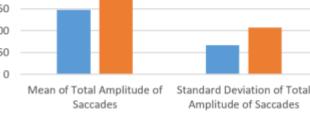
Standard Deviation of Eye Gaze Metrics for Questionnaire Task Across Entire Screen

Whole Fixations

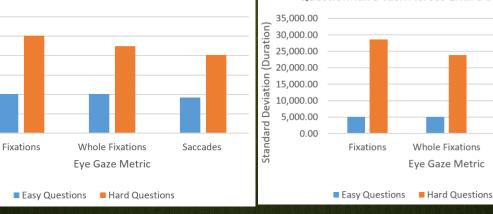
Eye Gaze Metric

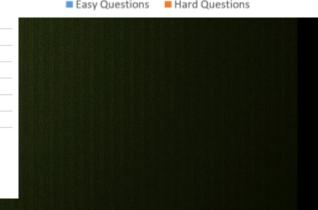
Visits





Easy Questions Hard Questions

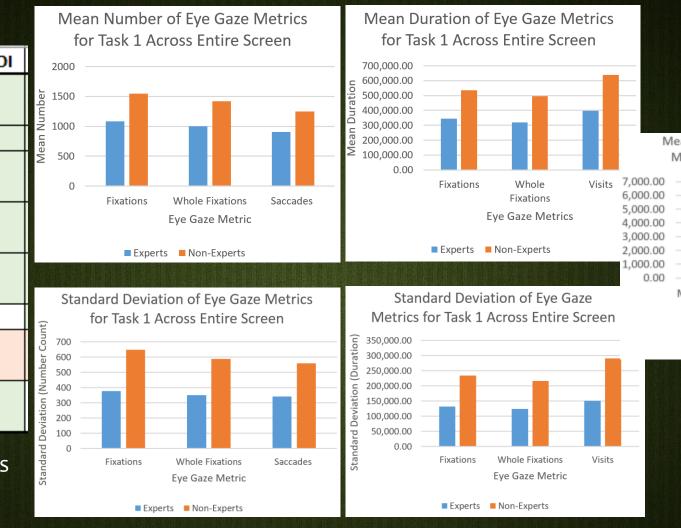




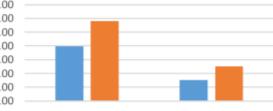
# RESULTS FOR NETWORK CONFIGURATION TASK 1

T-test	Entire Screen AOI
Total Duration of	
Fixations	0.02313056
Number of Fixations	0.045000478
Total Duration of	
Whole Fixations	0.022723908
Number of Whole	
Fixations	0.048403096
Total Duration of	
Visits	0.018924052
Number of Visits	N/A
Number of Saccades	
(AOI)	0.083679725
Total Amplitude of	
Saccades (TOI)	0.040636117

**Common error:** 9 non-experts failed to block the attacker from their network



Mean and Standard Deviation of Eye Gaze Metrics for Task 1 Across Entire Screen



Mean of Total Amplitude Standard Deviation of of Saccades Total Amplitude of Saccades

Easy Questions Hard Questions

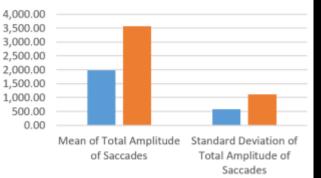
# RESULTS FOR NETWORK CONFIGURATION TASK 2

T-test	Entire Screen AOI	
Total Duration of		
Fixations	0.011788231	
Number of Fixations	0.004657775	
Total Duration of		1
Whole Fixations	0.012749469	
Number of Whole		
Fixations	0.005318629	
Total Duration of		and the second second
Visits	0.008319449	
Number of Visits	N/A	
Number of Saccades		
(AOI)	0.004679926	Statistics of
Total Amplitude of		
Saccades (TOI)	0.001306337	

**Common error:** 8 non-experts failed to enable successful access for the contractor, of which 4 non-experts didn't create the service



Mean and Standard Deviation of Eye Gaze Metrics for Task 2 Across Entire Screen



Easy Questions Hard Questions

## HYPOTHESES

Main Hypothesis: Experts have different eye gaze behavior when compared to non-experts

Hypothesis 1: Spotlight theory on parafoveal vision: experts are expected to have less saccades in comparison to non-experts with a possibly higher amplitude of saccades

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# PROPOSED MODEL

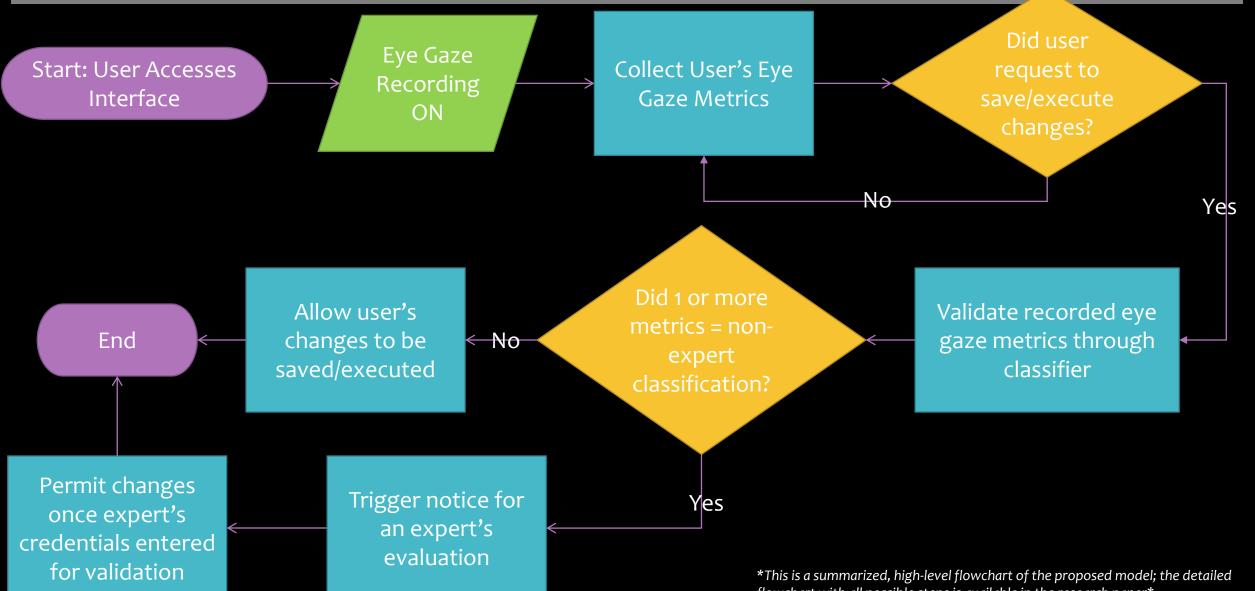
A classifier was created with all the successful eye gaze metrics

- Classifies an expert with a "0" output and a non-expert with a "1" output
  - KStar: 99.74%
  - Random Forest: 99.47%
  - J48: 99.23%
  - JRIP: 96.93%
  - Decision Table: 92.60%
  - Logistic: 88.77%

An attribute selection method was executed using Wrapper Subset Evaluation for the best classifier
The search method (Best First) concluded that KStar had the best features, which were:

Fixation Duration and Fixation Number, with KStart 99.74%

# PROPOSED MODEL (High Level Flowchart)



flowchart with all possible steps is available in the research paper\*



# THANK-YOU FOR WATCHING! Eye Gaze-Based Human Error Prevention System: Experts vs. Non-Experts

