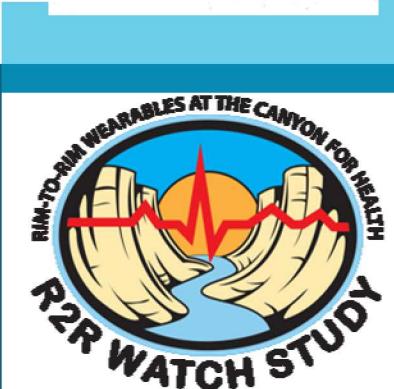




Wearables at the Canyon for Health (WATCH)

Quantifying Physical and Cognitive Fatigue in
Extreme Environments



Austin Silva, Principal Investigator

PRESENTED BY

Sandia National Laboratories

Dept. of Scalable Analysis & Visualization



Funding for Wearables At The Canyon for Health is provided by
the Defense Threat Reduction Agency (CB10359).



Sandia National Laboratories is a multimission laboratory managed and operated by National Technology & Engineering Solutions of Sandia, LLC, a wholly owned subsidiary of Honeywell International Inc., for the U.S. Department of Energy's National Nuclear Security Administration under contract DE-NA0003525.

Ooh Aah Point



Photo credit: WATCH team member, Rob Abbott

0.7mi; 790ft Down
20 miles to go!

Purpose of the Study

1) Markers for Health:

- Identify physiological, cognitive markers most related to health and task performance

2) Wearable Devices:

- Identify which commercial off-the-shelf (COTS) wearable devices are best for measurement and in rugged environments

3) Health Events:

- Use statistical analyses on collected data to identify which markers are most predictive of benign vs. traumatic health events

Two populations of interest: Military & Civilian

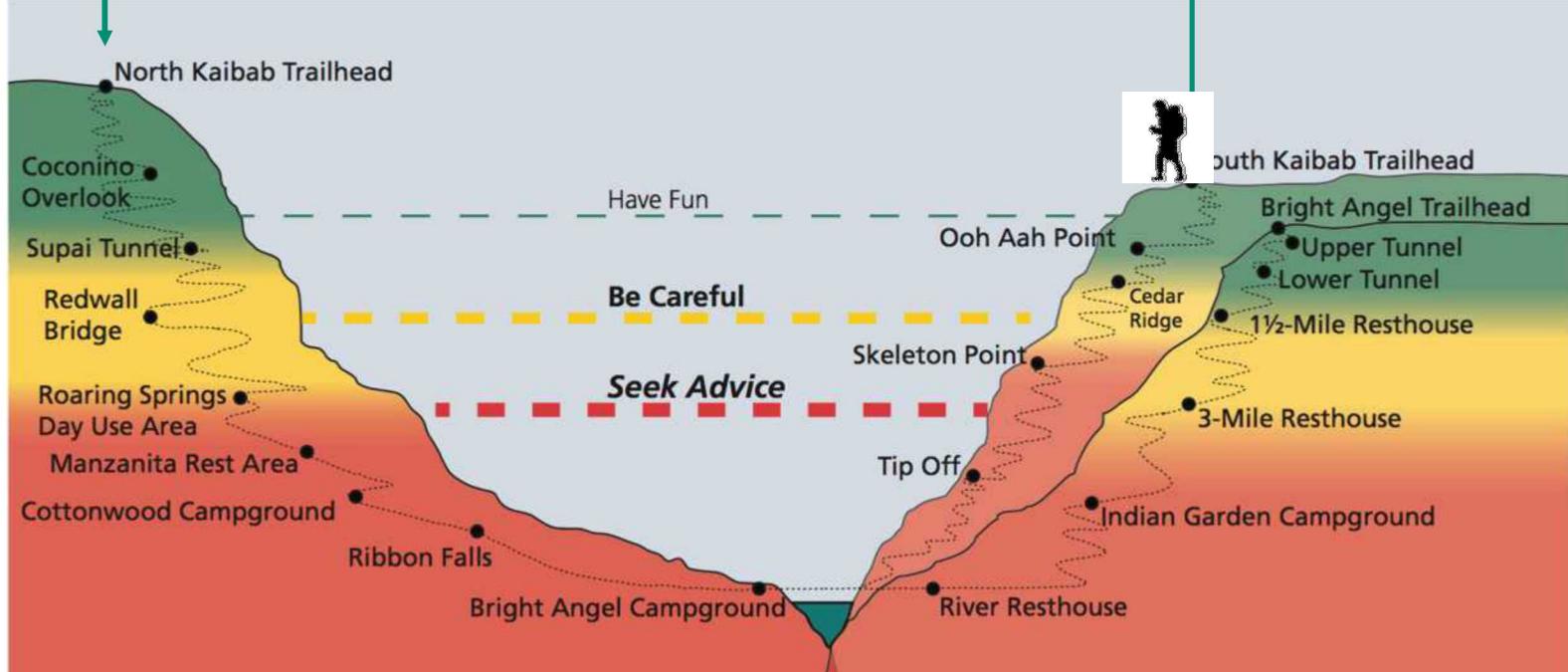
The Rim-to-Rim Hike

Elevation: 8249 ft

Elevation: 7200 ft

Delta = 5740 ft

Delta = 4700 ft



Hike distance: 7.0 miles + 13.7 miles = 20.7 miles

Average Conditions Throughout the Year

Location	Summer	Winter	Spring/Fall
Avg Top Min	48°F	19°F	32°F
Avg Top Max	83°F	45°F	63°F
Avg River Min	74°F	38°F	56°F
Avg River Max	104°F*	59°F	82°F

*Temperatures can feel like 140°F in the sun and reach 115°F in the shade in Summer.

Devices Used

Suunto
Spartan
Ultra



Garmin
Vivoactive
HR



Empatica
E4



Garmin
Fenix 3 HR



Fitbit
Charge
HR



Garmin
Fenix 5 HR



Pre / Post
Weigh-in
(participant
& pack)



Polar Foot
Pod

Garmin Foot
Pod



LifeBeam
SmartHat



Garmin
eTrex 10

Garmin
Tempe



Equivital EQ02



Wahoo Tickr-X



iPod Touch 6
BrainBaseline



Myontec Mbody Shorts

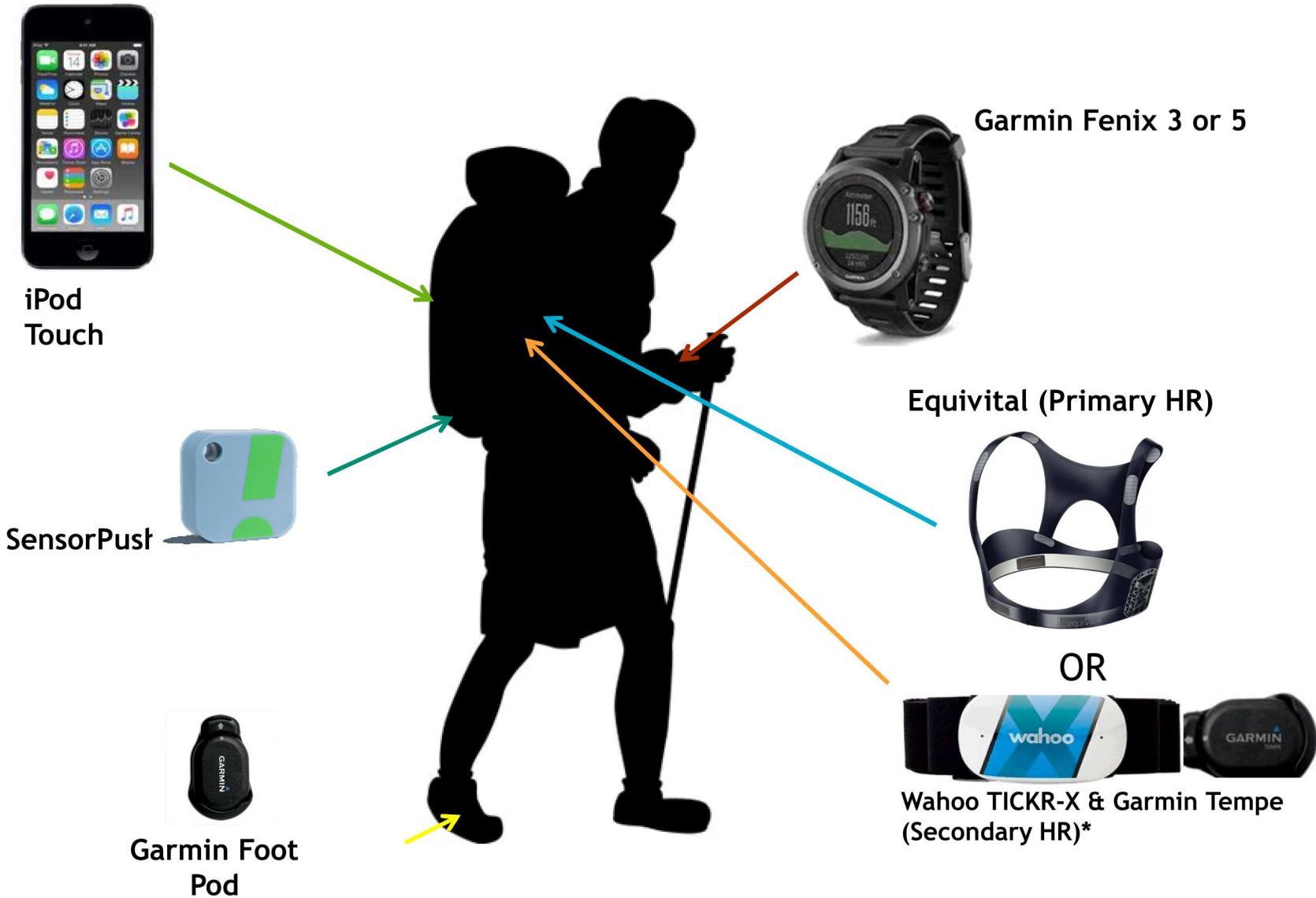


Omron
bio-impedance



sensorPush

September 2018 Data Collection Package

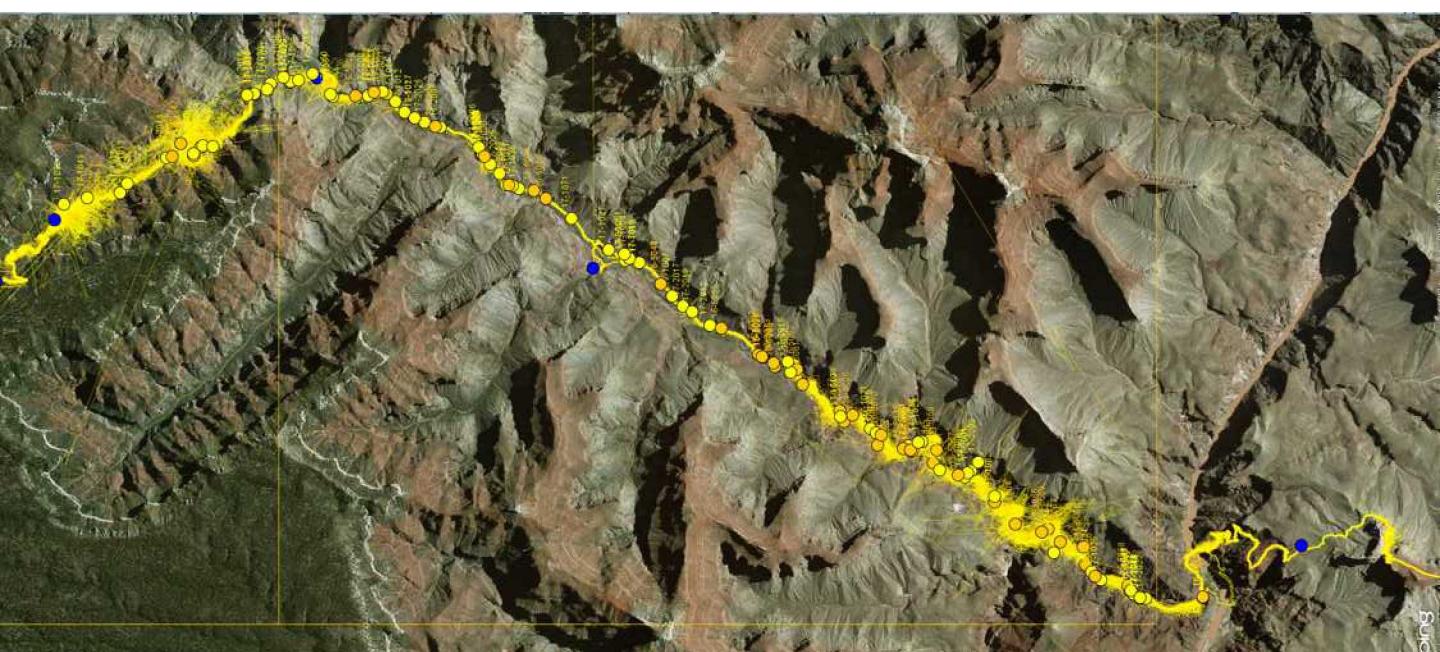


Data Collected

- Heart rate
 - HRV
 - ECG (Intervals, QRS)
- Distance & Cadence
- GPS
 - Location
 - Elevation
- Body Temperature
- Environmental Temp & Humidity
- Cognitive Battery
 - VSTM
 - Go/No-go
 - BART
 - Subjective Mental/Physical fatigue
- Survey Data
 - Pre-hike
 - Personality
 - Pack weight
 - Sleep Quality
 - Home elevation
 - Start Time
 - Post-hike
 - Fatigue
 - End Time
 - Recovery (one-week)
- Blood data
 - Delta CK
 - Lactate
 - ...
- Observation notes

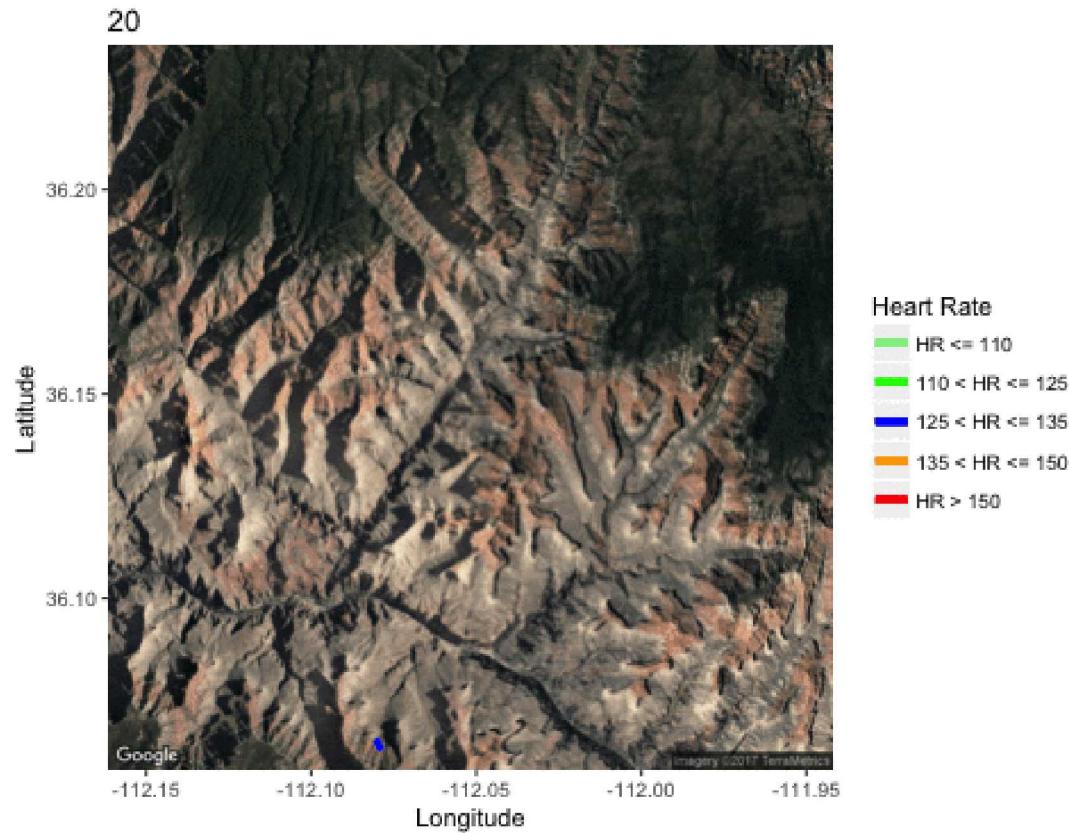
Data Collected to Date

	Wearables	Cognitive	Bloodwork	Surveys
TOTAL	174	162	179	452
Sep 2018	38	38	37	38
Oct 2017	27	27	24	27
May 2017	59	57	67	99
Oct 2016	50	40	51	288





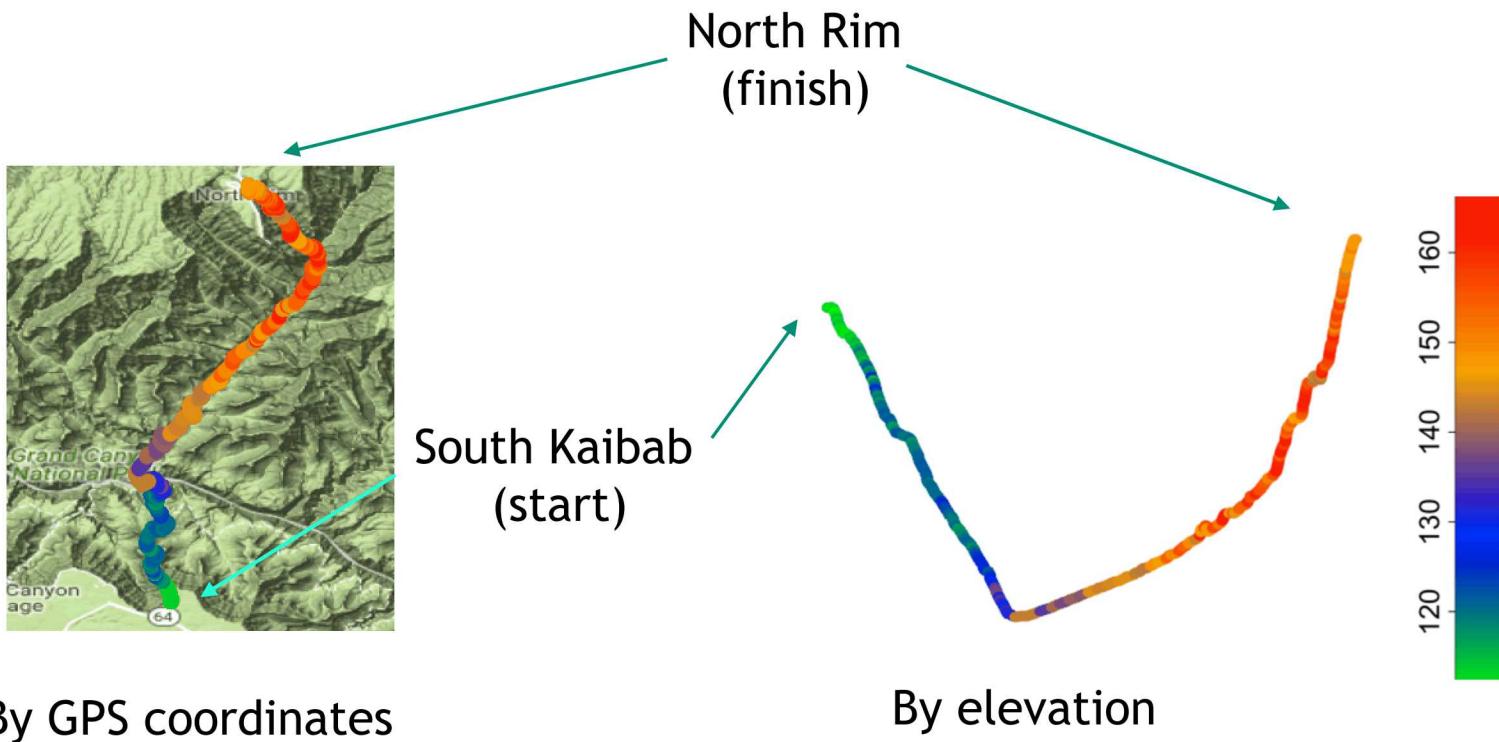
Comparing Heart Rates Across Subjects



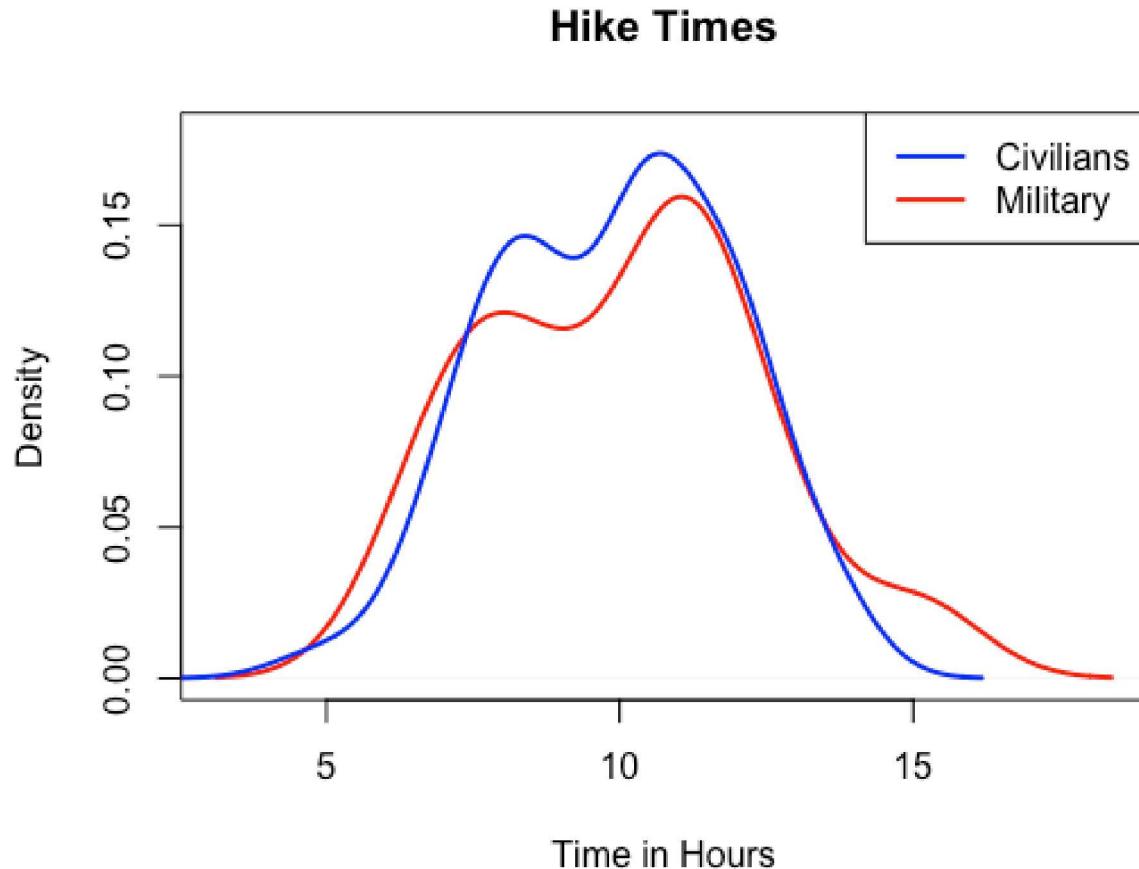
Intensity of Hike



Average Heart Rate (military)



Hike Times



Cognitive Assessments

- Subjective Fatigue
- Visual Short Term Memory (VSTM)
- Go/No-Go
- Balloon Analogue Risk Task (BART)

Cognitive Assessments – Subjective Fatigue



[Quit](#) **Fatigue Questionnaire**

On a scale from 0 to 6, what is your current level of **mental fatigue?**

0 - No fatigue

1 - Very light fatigue

2 - Light fatigue

3 - Moderate fatigue

4 - Heavy fatigue

5 - Very heavy fatigue

6 - Maximal fatigue

[Continue](#)

[Quit](#) **Fatigue Questionnaire**

On a scale from 0 to 6, what is your current level of **physical fatigue?**

0 - No fatigue

1 - Very light fatigue

2 - Light fatigue

3 - Moderate fatigue

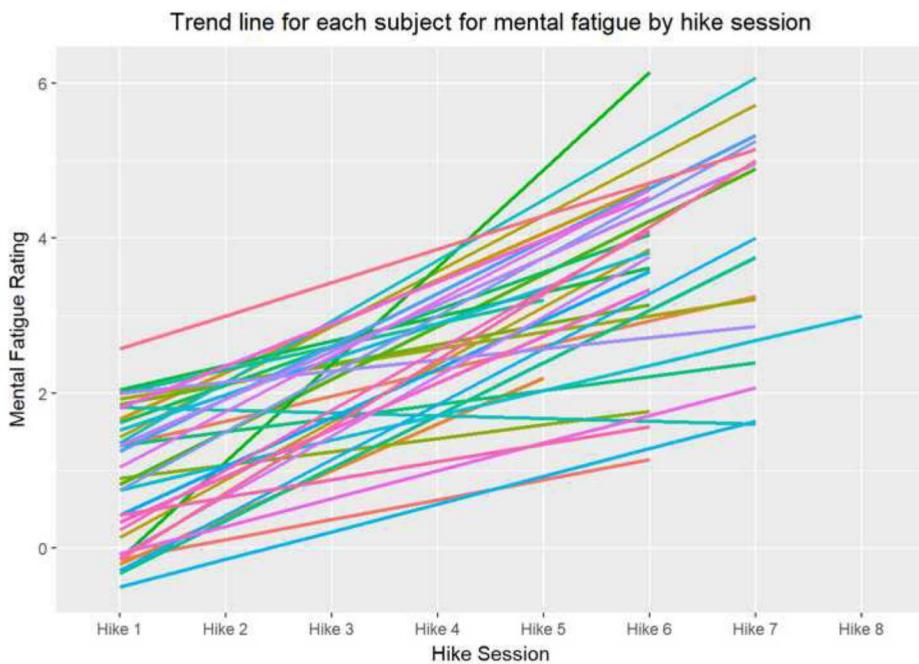
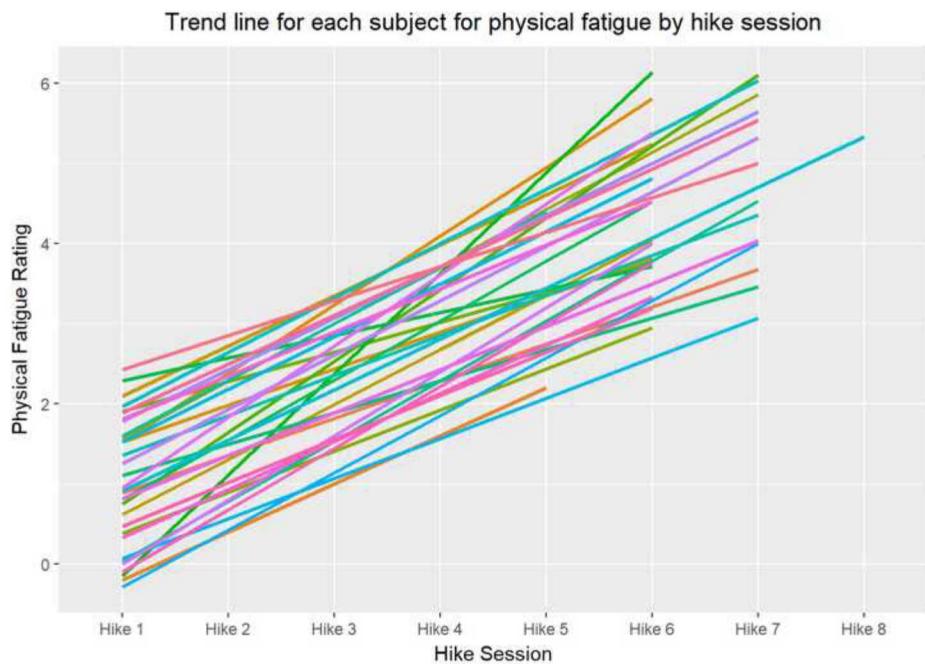
4 - Heavy fatigue

5 - Very heavy fatigue

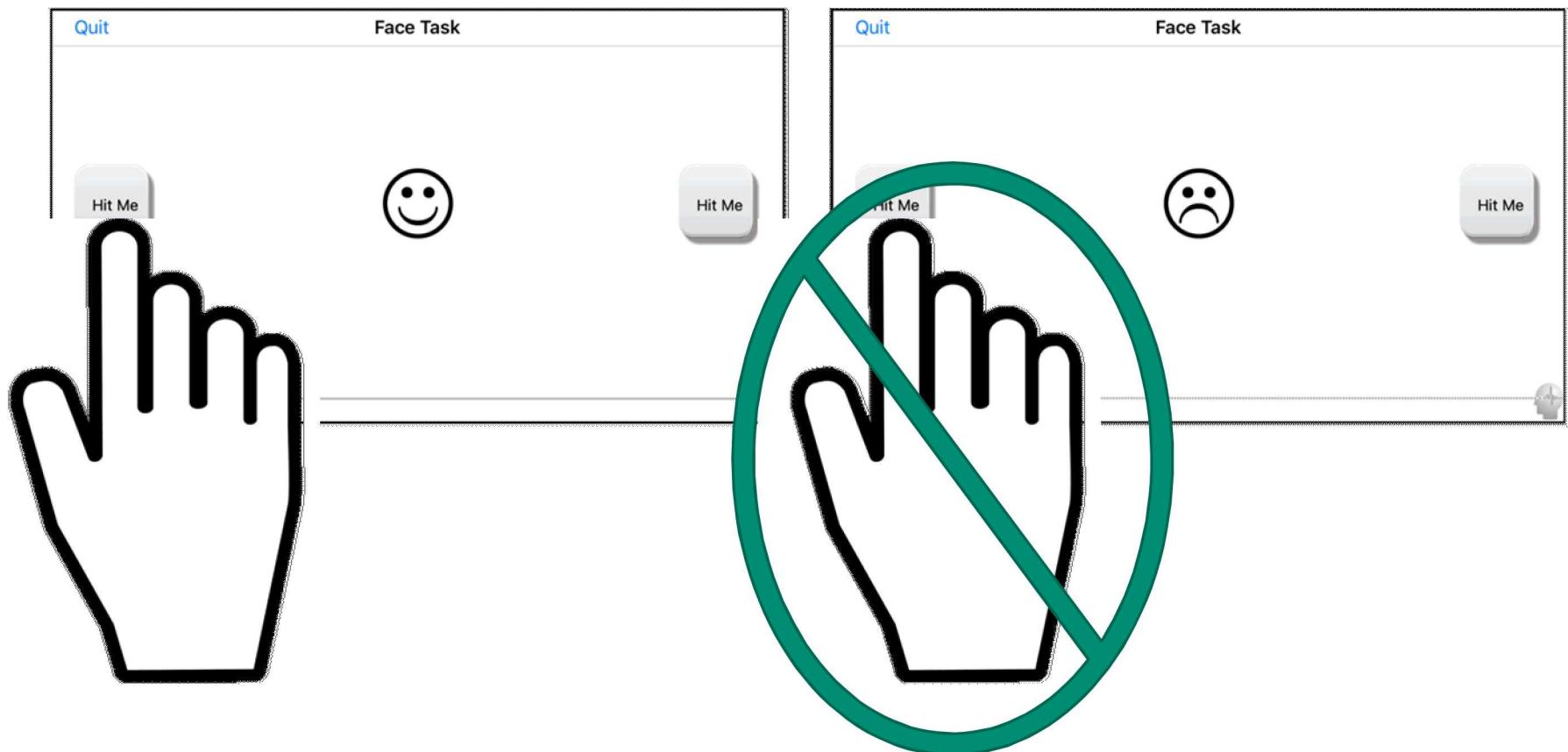
6 - Maximal fatigue

[Continue](#)

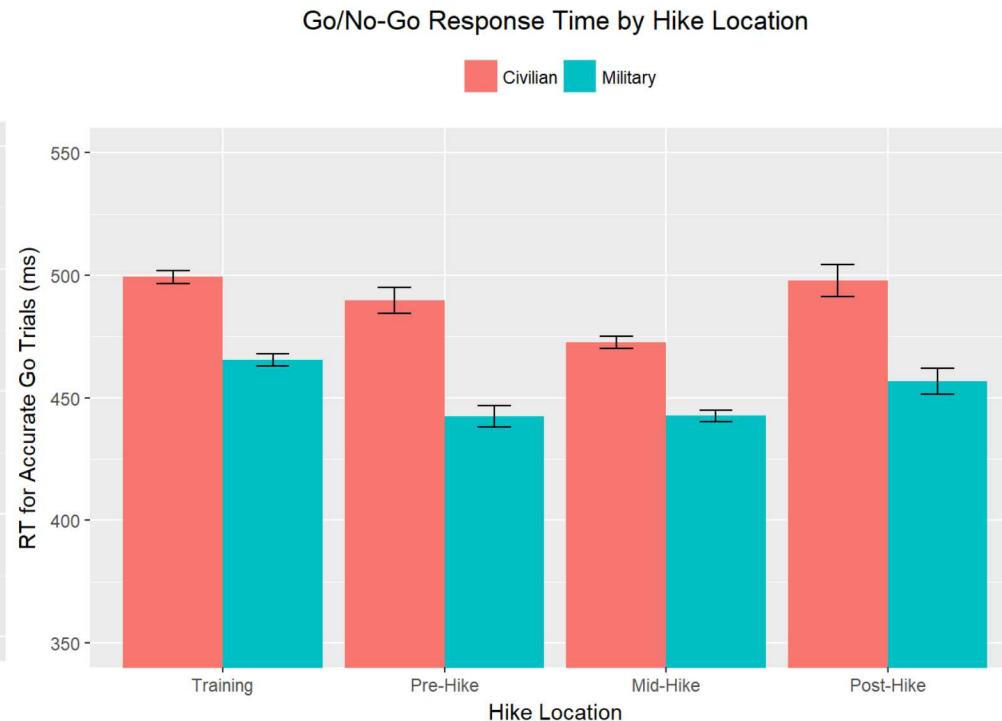
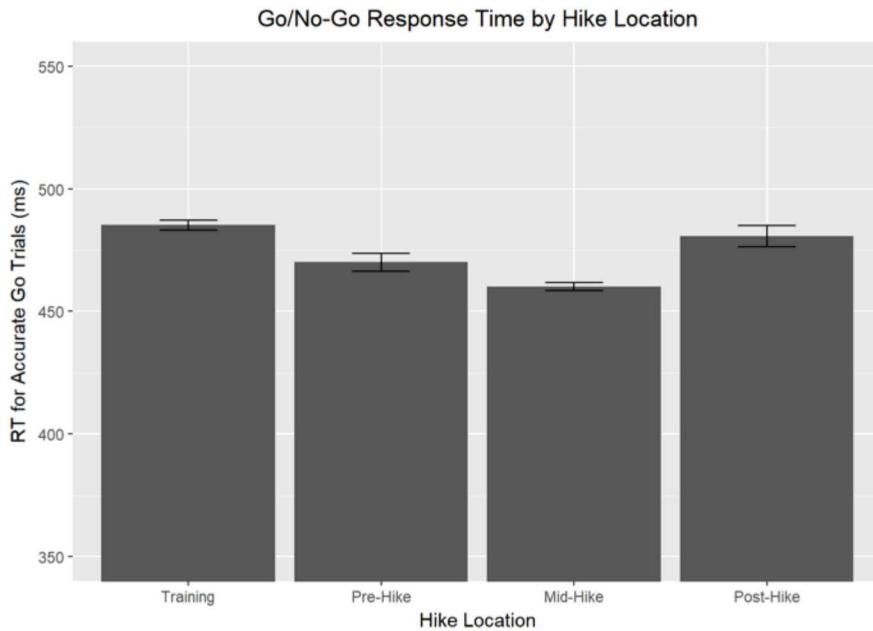
Fatigue



Cognitive Assessments – Go/No-Go



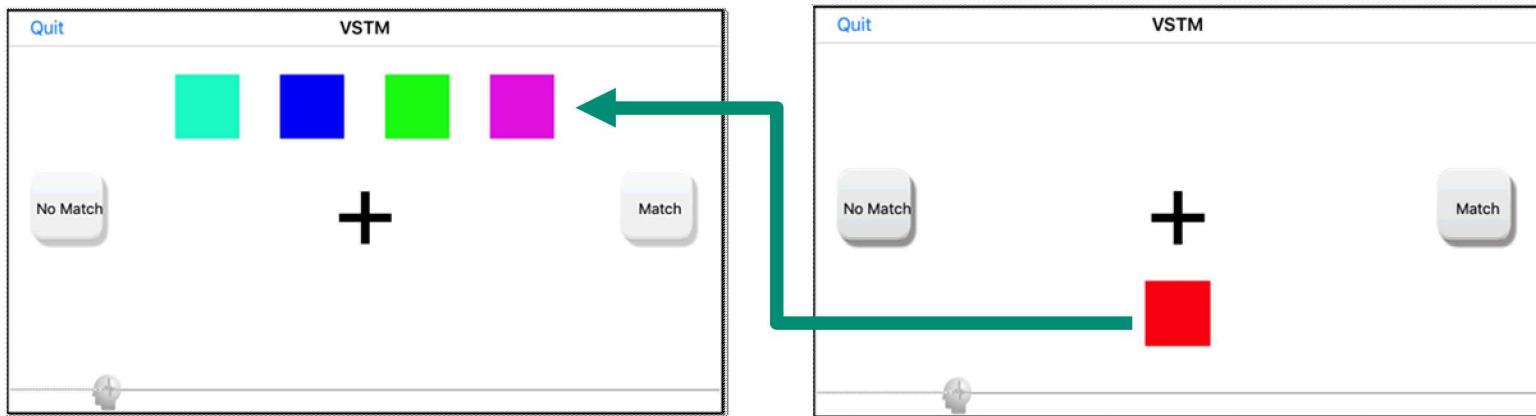
Go/No-Go



Cognitive Assessments – VSTM

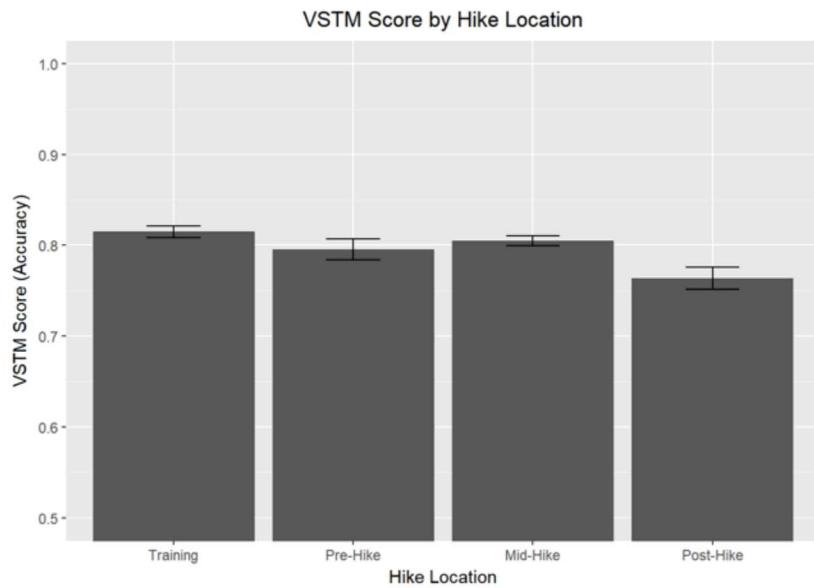


Visual Short Term Memory (VSTM) task

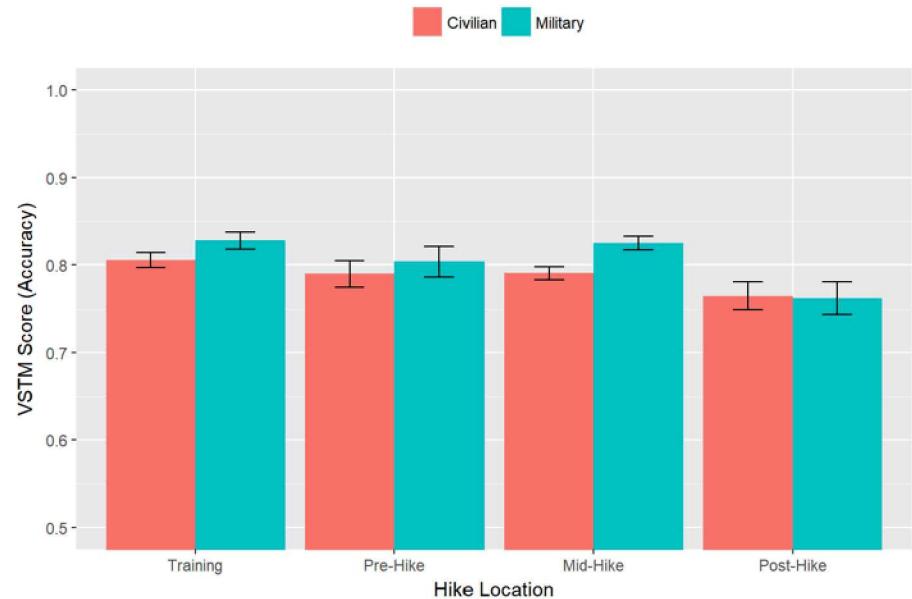




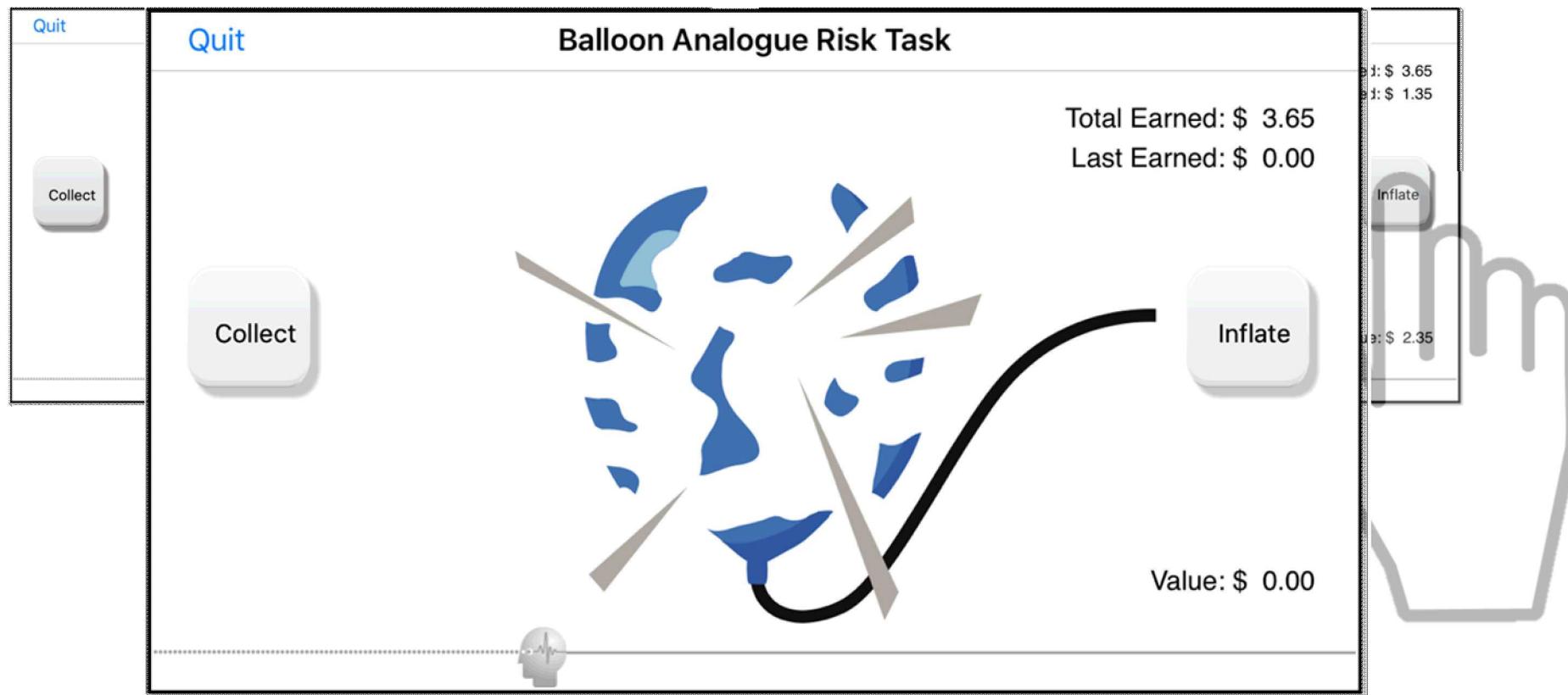
VSTM Score by Hike Location



VSTM Score by Hike Location

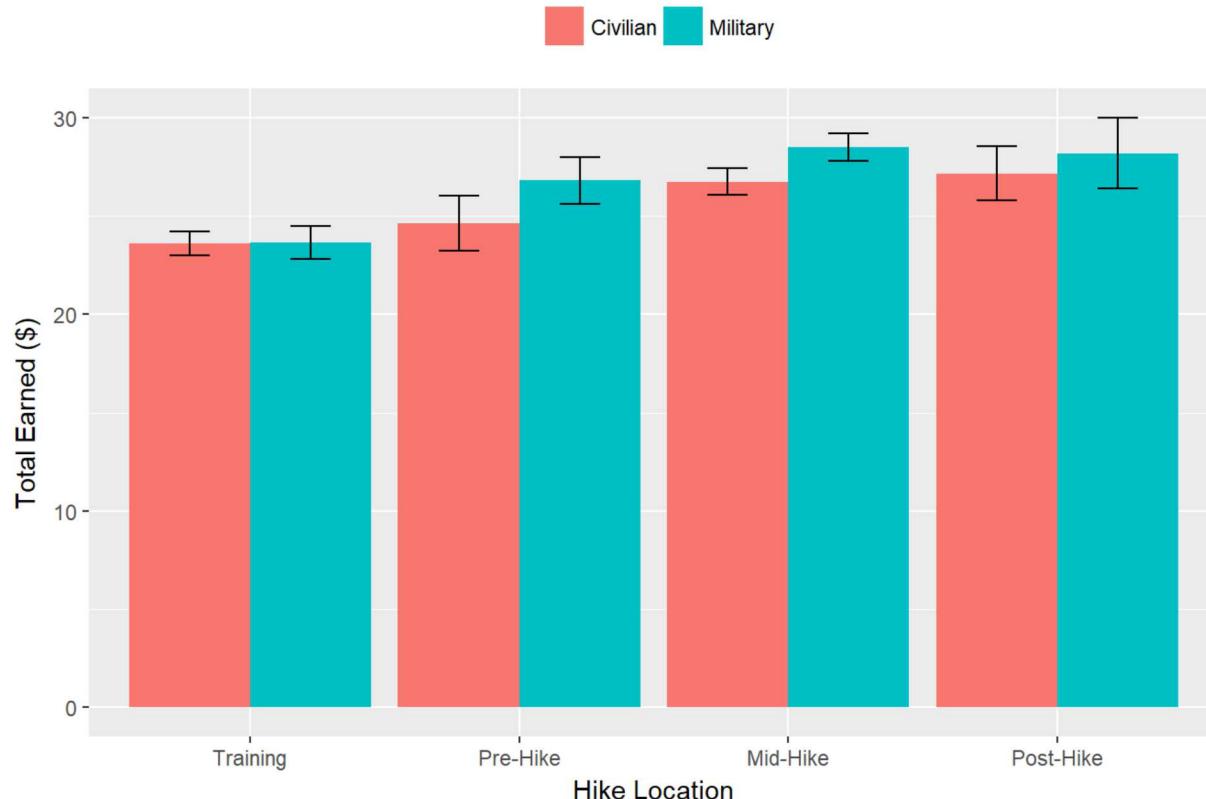


Cognitive Assessments – BART





BART: Averaged Total Earned by Hike Location

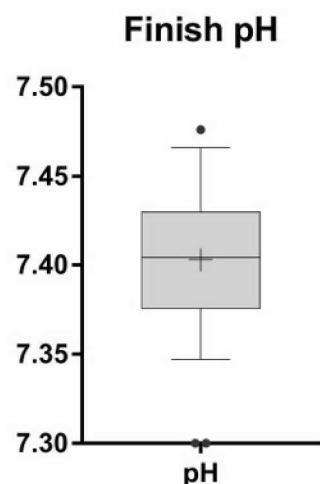
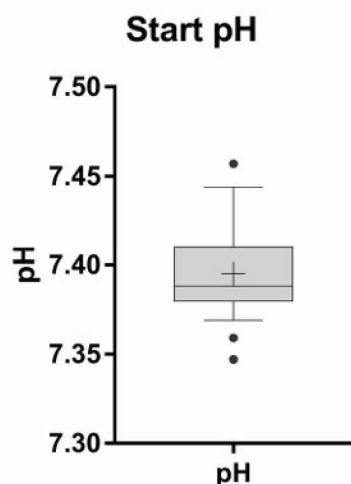
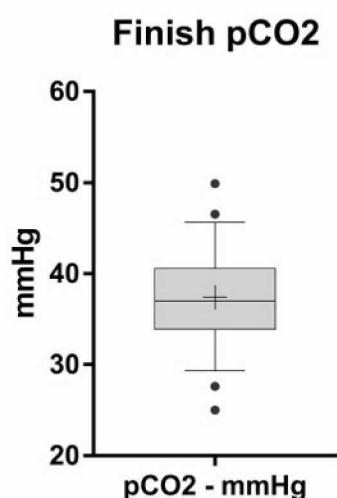
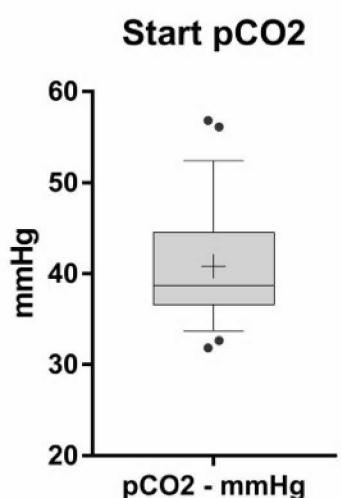
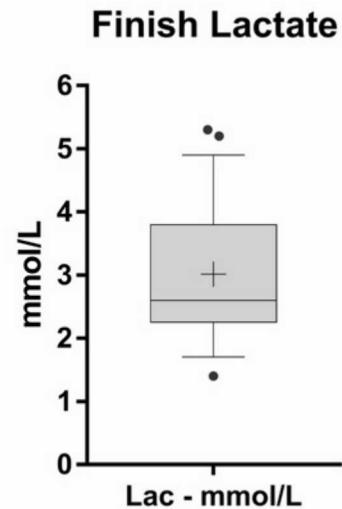
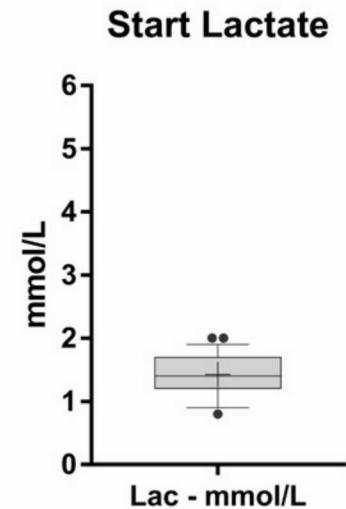
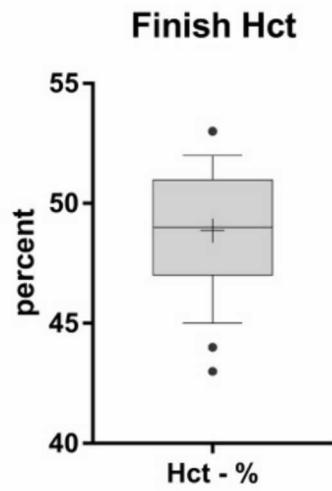
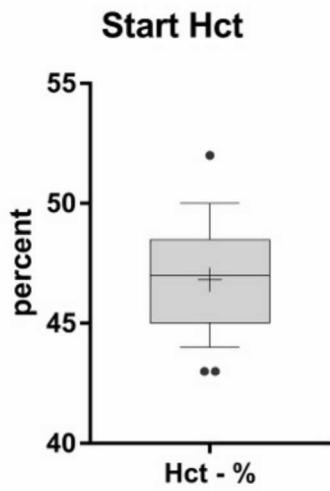


More risks are taken throughout the course of the hike.

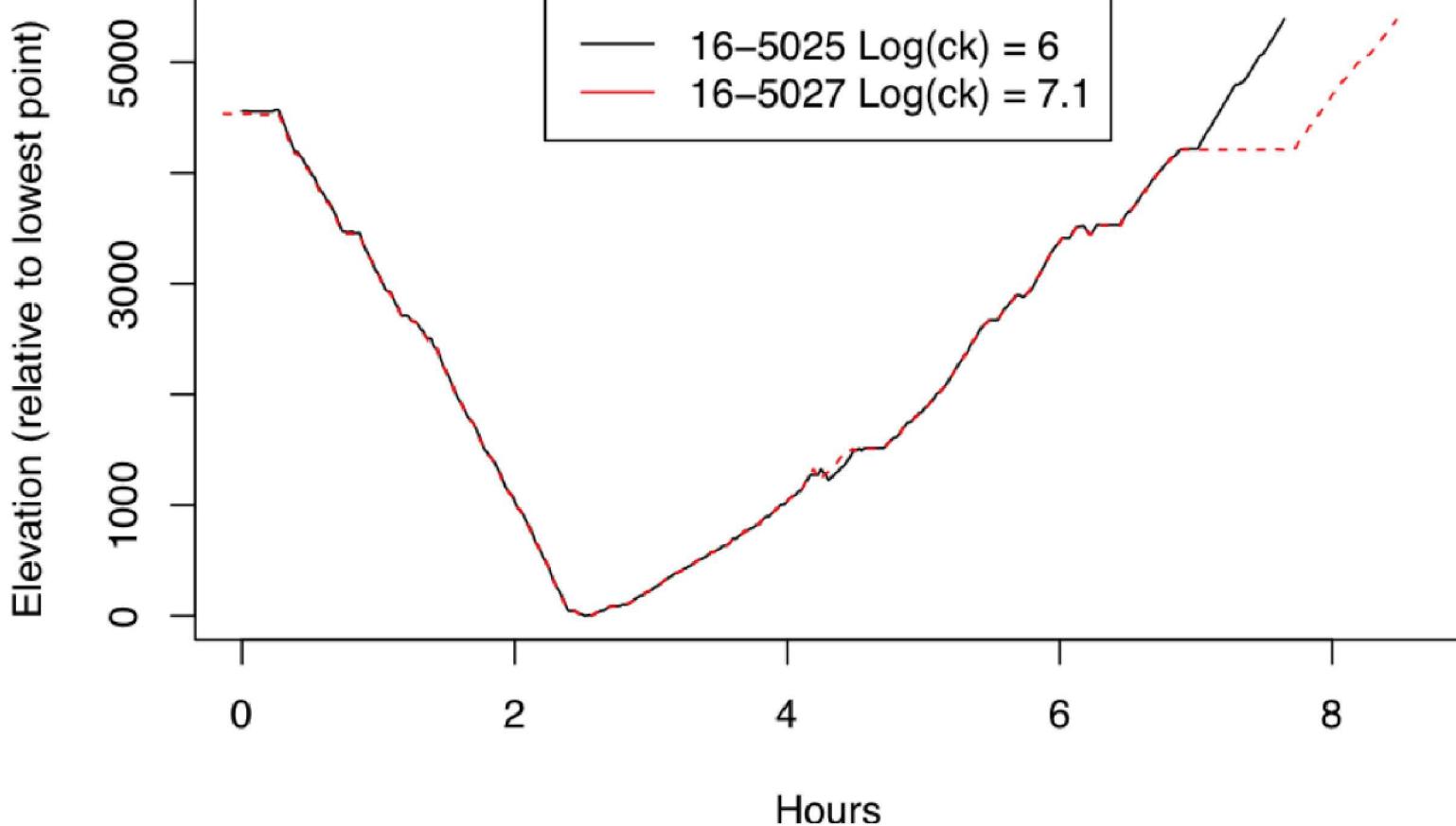
Blood Data

- Creatine Kinase (CK)
 - An enzyme used as a marker for muscle damage
 - Used to detect various health events such as myocardial infarction or rhabdomyolysis.
- Hematocrit
 - Measure of % of red blood cells
 - One of the best measures of dehydration
- Blood lactate
 - Lactic acid in the blood is linked to deficient oxygen to tissue during high levels of activity
 - Can be used as a measure of muscle breakdown
- $p\text{CO}_2$ – partial pressure of carbon dioxide in blood
 - Can be used to understand respiration rate
 - Decrease can be caused by hypoxia and hyperventilation
- pH
 - Blood is modulated around 7.4
 - Changes can result from respiration changes and lactate

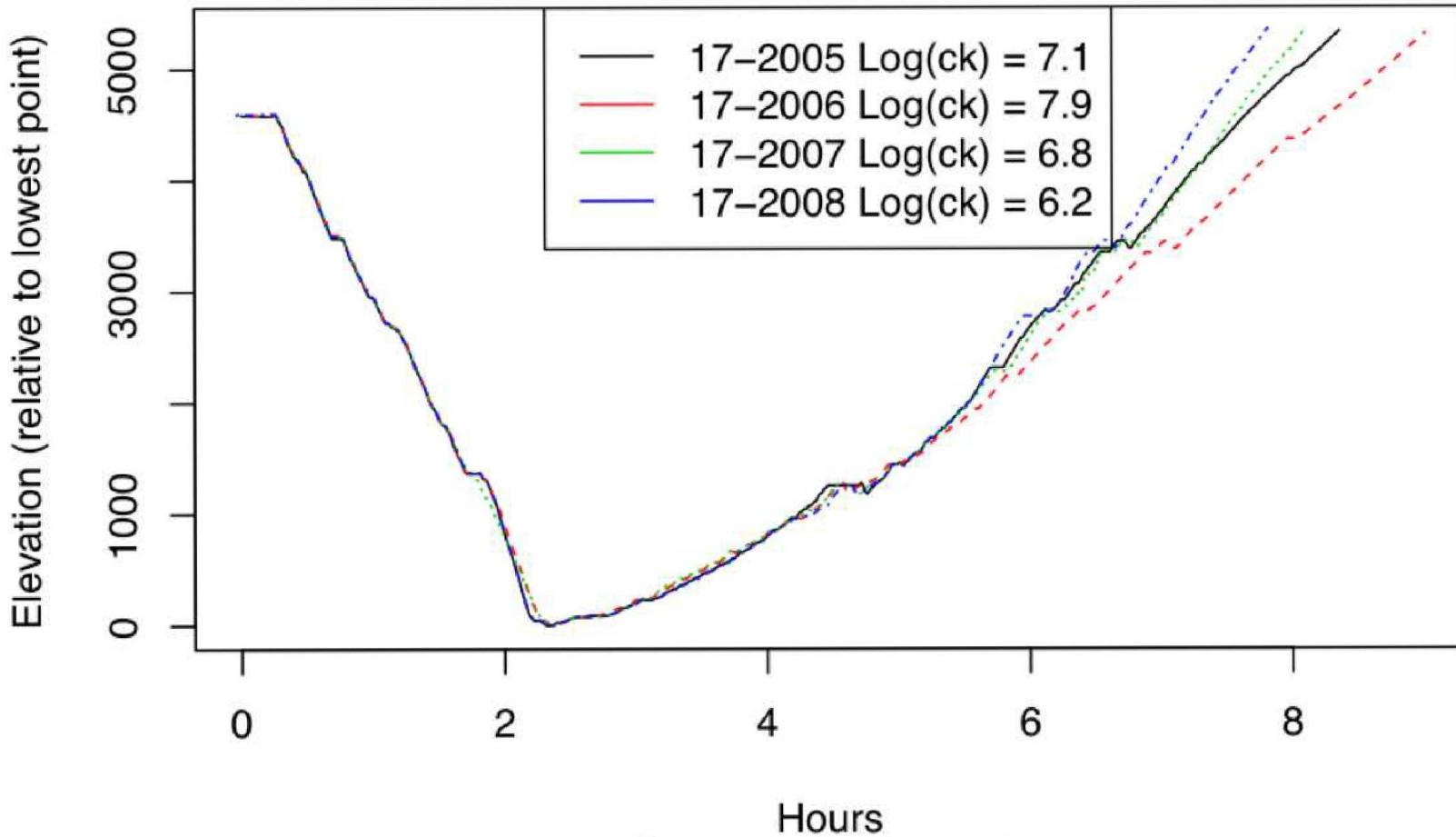
Blood Data



Identifying “Droppers”



Identifying “Droppers”



Wearables at the Z-Machine (WAZE)

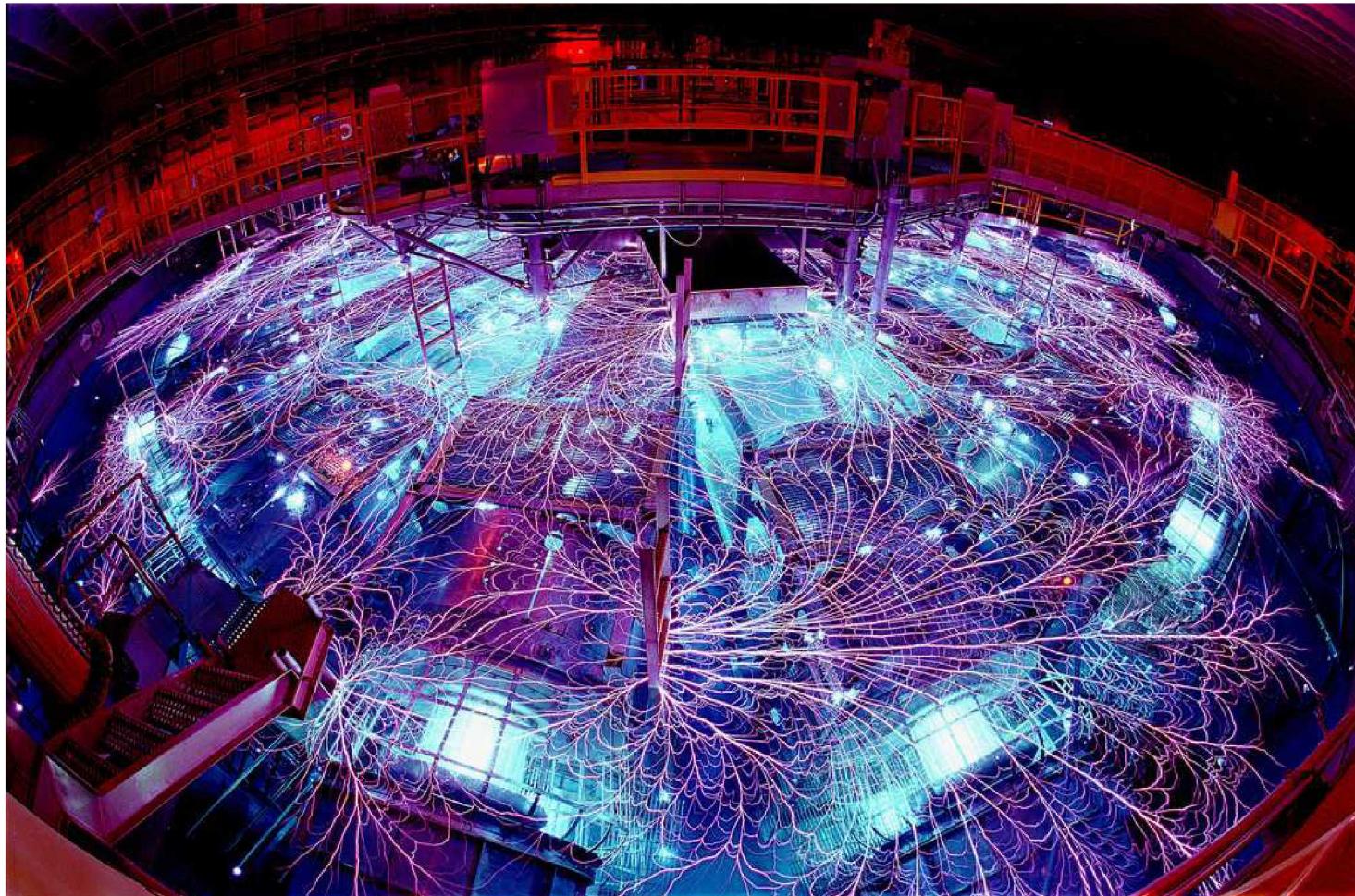


Photo Credit: Randy Montoya



Photo Credit: Randy Montoya

Additional Considerations for WAZE

- Observations
- Sleep journals
- More environmental condition measures
- No blood draw
- Activity logs
 - Including task and equipment & PPE used

Conclusions

- Several data streams are necessary to predict health events. It is difficult to do it in real-time.
- Individual variability is key to understand – outliers can often reveal interesting insights.
- Fatigue is not just physical – you can also observe cognitive decline.
- COTS devices are good enough to use for fatigue analysis and performance prediction, but not all are created equally.
- You must understand the nature of the task as much as possible before you can start to apply a research paradigm.

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