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# Measuring and Modeling Cyclists' Comfort and Stress Levels

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# Measuring and modeling cyclists' comfort and stress levels

Presenter: Miguel Figliozzi

Professor of Civil and Environmental Engineering

PSU Friday Seminar, Fri. March 11<sup>th</sup>, 2016

## Motivation

- Recent interest to study cyclists' levels of traffic stress, e.g. Furth and Mekuria 2013.
- HCM Bicycle LOS
- Other “stress” or “comfort” measures

## Terminology

The term “stress” is commonly understood as the opposite of “comfort”

One definition of “comfortable” is “free from stress or tension”

Merriam-Webster online dictionary

# Outline

1. Modeling data collected utilizing a smartphone app called ORcycle
2. Real-world, on-road measurements of physiological stress
3. Discussion, policy implications and next steps

# ORcycle Project



- Smartphone app to collect cyclists data
- *Available for iOS and Android*



# ORcycle Project Goals



- Pilot a cheaper and easier method to collect bicycle data
- Understand impacts of riding skills and personal characteristics on choices
- *Quantify the underreporting of safety data (crashes & near-misses)*
- *Learn where cyclists travel and their level of traffic and cycling stress*

# ORcycle: 4 basic parts



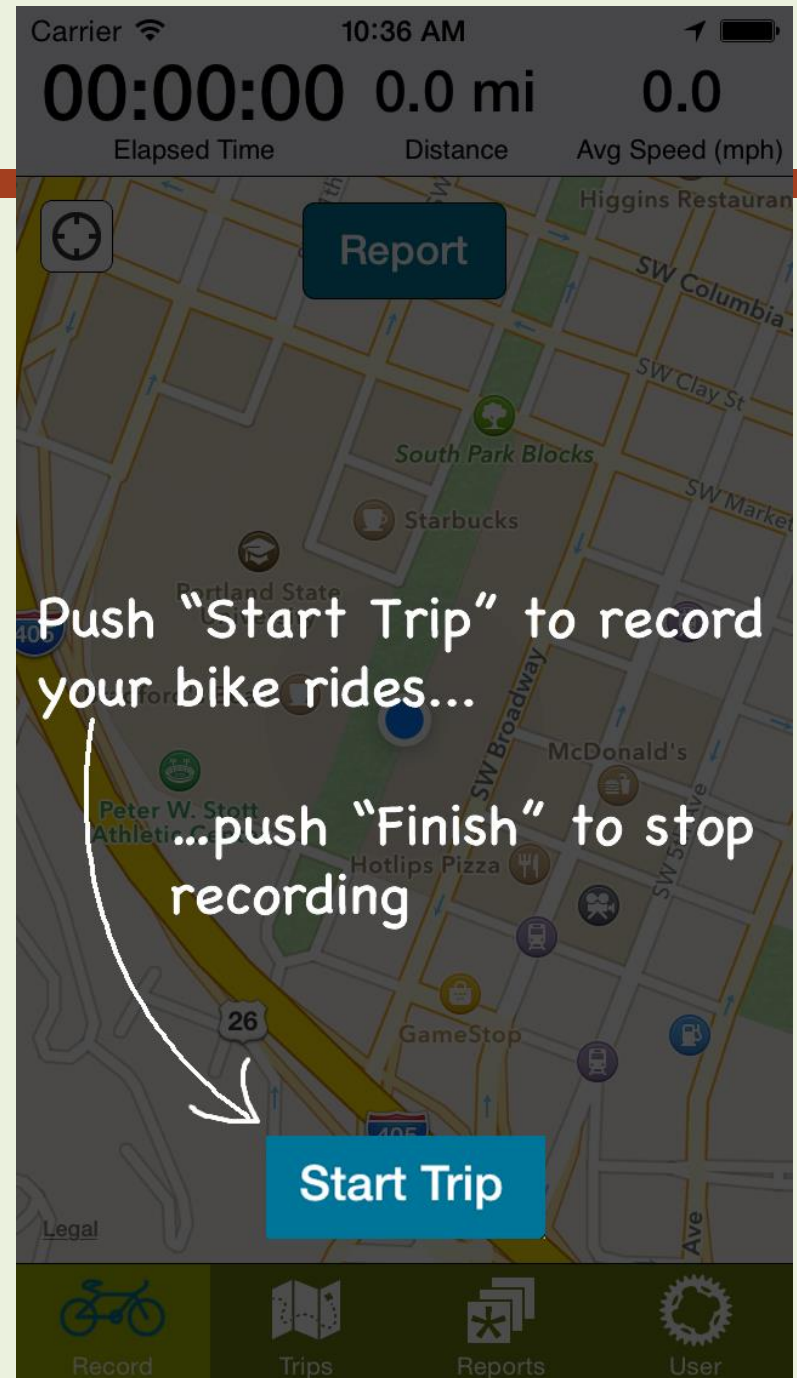
- Record Trips
- Report Safety Issues
  - Crash or near-miss
  - Safety problem (e.g. uneven pavement)
- User Data
  - Biking habits and socio-demographic (optional)
- Links to maps and to report to ODOT



# Trip Questions

Questions after completing a trip:

- Purpose
- *Frequency*
- *Route choice factors*
- *Comfort level*
- *Safety concerns?* (optional)
- *Additional comments?* (optional)



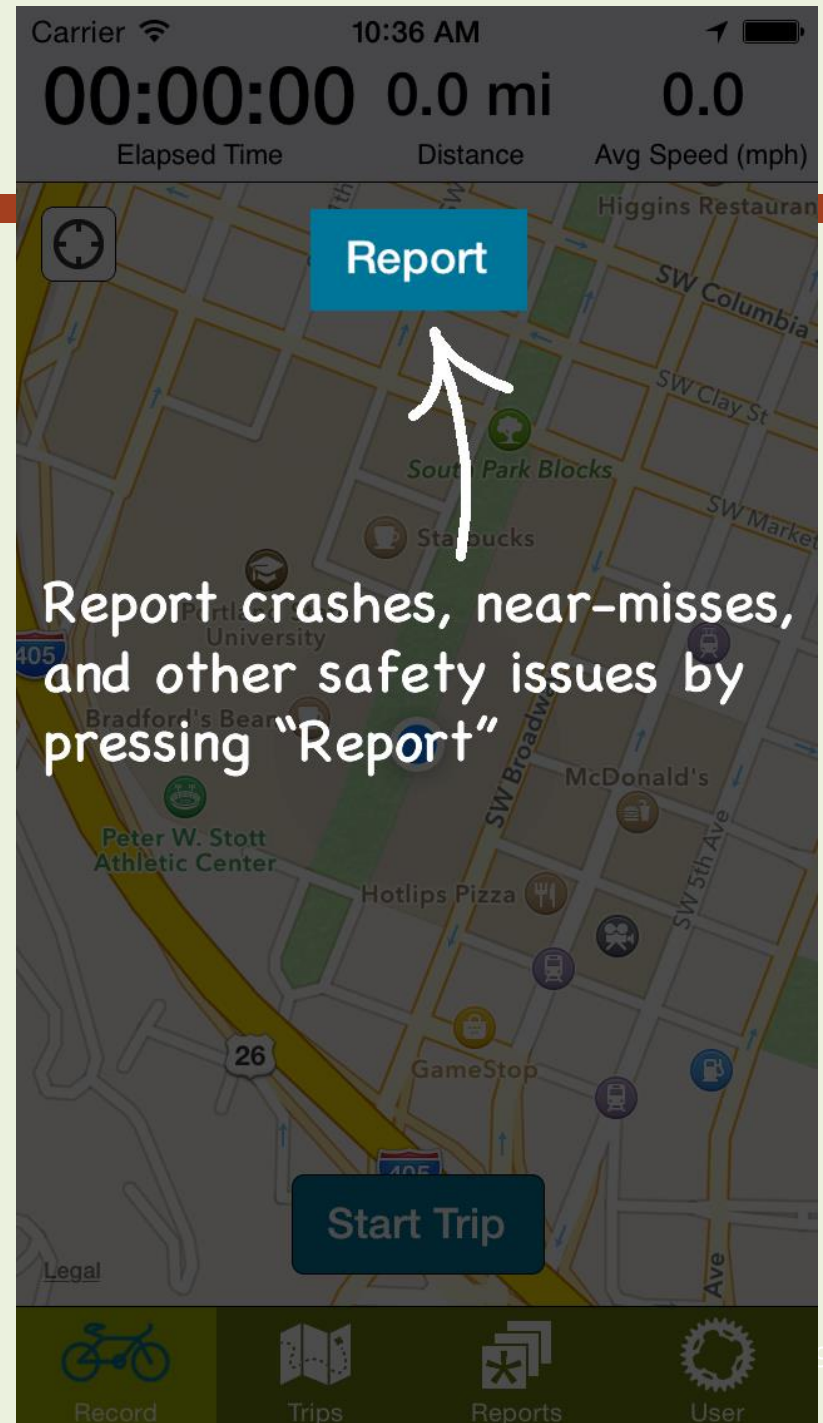
# Report Questions

## Questions after completing a crash report:

- Severity
- Object (vehicle)
- Actions that led to the event
- What contributed to the event
- Date
- Additional comments?

## Questions after completing a safety report:

- Urgency
- Type of problem
- Date
- Additional comments?



# Safety reports & AskODOT

Since Nov. 2015 users can email safety reports to ODOT using the app

- AskODOT receives the email with safety report data and a link to google maps
- Plus photos and comments
- Commitment to respond within 5 business days



# Safety reports & AskODOT

## ORcycle bicycle app improves reporting capabilities

<http://www.oregon.gov/ODOT/COMM/Pages/nr15111801.aspx>

### ODOT News

Nov. 18, 2015

For more information: Professor Miguel Figliozzi, Portland State University, (503) 725-2836 or Shelley M. Snow, ODOT Communications, (503) 881-5362



### Reports can now be shared with road authorities

SALEM — The [ORcycle application](#) for smartphones is getting an update, and safety advocates hope it will encourage riders to send in reports about problems on the transportation system so the proper road authorities can investigate and fix, if warranted. When the app was launched this time last year, users voluntarily submitted data only to researchers at Portland State University. With this update, users will have a "report safety issue" option and they can voluntarily send that report directly to the [Ask ODOT Citizens Representative Office](#) during a one year pilot program. Ask ODOT will send the safety report to the appropriate ODOT District or, if it is not a state facility, to the local road authorities.

With the new update, ODOT will receive the GPS coordinates of the safety report along with a link to Google maps and even a photo of the safety issue if the user wants to include one. There are several options for describing the type of safety issue the user is reporting, such as "narrow bike lane," "pavement condition" or "no crossing button." The app follows a strict privacy policy and does not ask for a name or address, and users have control over the data they are sharing.

Researchers at PSU will continue to receive the information voluntarily provided by users of the app, including reports of "crashes or near-misses." These reports give planners valuable data about route usage, crashes and near-misses, infrastructure issues and more.

Created by the Transportation Technology and People (TTP) lab at Portland State University in partnership with ODOT, the ORcycle app has been used regularly over the past year by several hundred participants. The data submitted by users have already been used to better understand cyclists' use of the transportation system. Additional information about the app and research outputs at <http://www.pdx.edu/transportation-lab/orcycle>. The ORcycle app is free and can be downloaded from the [App Store](#) or [Google Play](#).



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and Computer Science

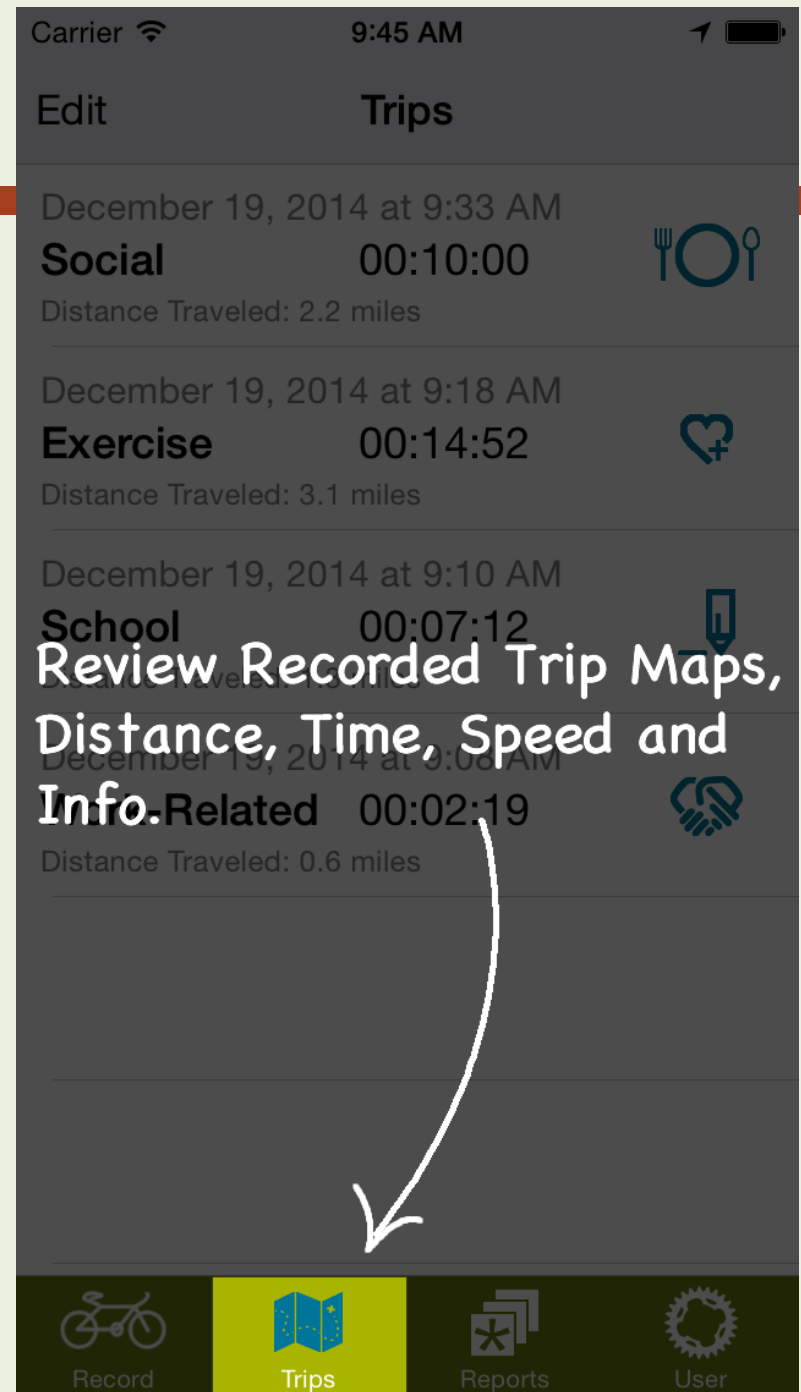
PORTLAND STATE UNIVERSITY

# Recorded Trips

User can review trips:

- Map
- Time, distance
- Questionnaire

And more features...

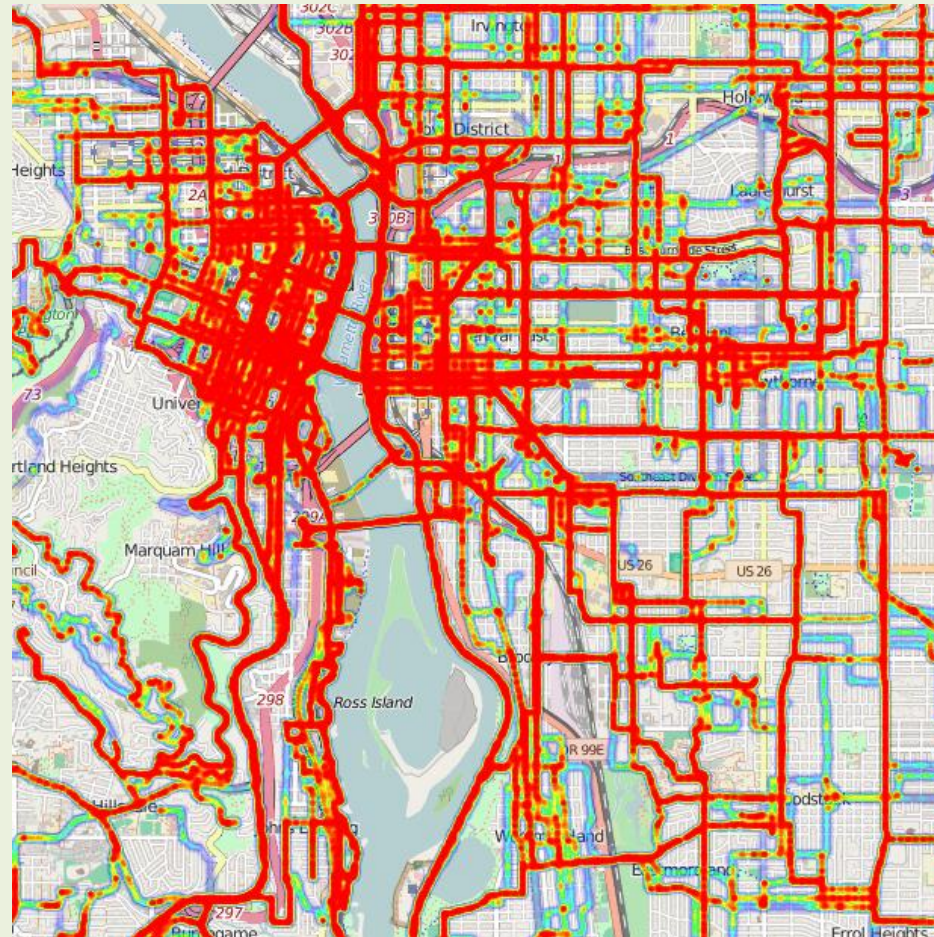




# GPS coordinates\*



\*Heatmap, not adjusted by trip frequency



# Exploratory route comfort study



Each trip rated on a 1 to 5 scale

Ordinal Logistic Regression

Route Comfort as Dependent Variable

One independent variable at the time

A screenshot of a mobile application interface. At the top, the status bar shows 'Verizon', '1:39 PM', and '83%' battery. The app title is 'Trip Details' with a 'Save' button. The first question is 'HOW OFTEN DO YOU RIDE THIS ROUTE?' with a dropdown menu showing 'Several times per month'. The second question is 'IN TERMS OF COMFORT, THIS ROUTE IS...' with a dropdown menu showing 'Choose one'. The third question is 'I CHOSE THIS ROUTE BECAUSE... (CAN SELECT MORE THAN ONE)' with a text input field containing 'It is enjoyable/has nice scenery'. At the bottom, there are three buttons: 'Cancel', 'Route Comfort', and 'Done'. Below these buttons is a list of five options: 'Very Good (even for families/children)', 'Good (for most riders)', 'Average', 'Bad (only for confident riders)', and 'Very Bad (unacceptable for most riders)'.

Verizon 1:39 PM 83%

Trip Details Save

HOW OFTEN DO YOU RIDE THIS ROUTE?

Several times per month

IN TERMS OF COMFORT, THIS ROUTE IS...

Choose one

I CHOSE THIS ROUTE BECAUSE... (CAN SELECT MORE THAN ONE)

It is enjoyable/has nice scenery

Cancel Route Comfort Done

Very Good (even for families/children)

Good (for most riders)

Average

Bad (only for confident riders)

Very Bad (unacceptable for most riders)

# Single variable model results



Why did you choose this route?

- ... It has good bicycle facilities (+)
- ... It has nice scenery (+)
- ... It has low traffic speeds (+)
- ... It has few busy intersections (+)
- ... It is good for families + kids (+)
- ... I do not know another route (-)
- ... It is direct + fast (--)

*Not significant:* I found it on my phone/online, It is good for a workout, It has other riders/people

The screenshot shows a mobile app interface for 'Trip Details'. At the top, it displays 'Verizon', '1:39 PM', and '83%' battery. Below the title 'Trip Details' is a 'Save' button. The first question is 'HOW OFTEN DO YOU RIDE THIS ROUTE?' with a dropdown menu showing 'Several times per month'. The second question is 'IN TERMS OF COMFORT, THIS ROUTE IS...' with a dropdown menu showing 'Choose one'. The third question is 'I CHOSE THIS ROUTE BECAUSE... (CAN SELECT MORE THAN ONE)' with a text input field containing 'It is enjoyable/has nice scenery'. At the bottom, there are three buttons: 'Cancel', 'Route Comfort', and 'Done'. Below these buttons is a scale for 'Route Comfort' with five options: 'Very Good (even for families/children)', 'Good (for most riders)', 'Average', 'Bad (only for confident riders)', and 'Very Bad (unacceptable for most riders)'.



# Single variable model results



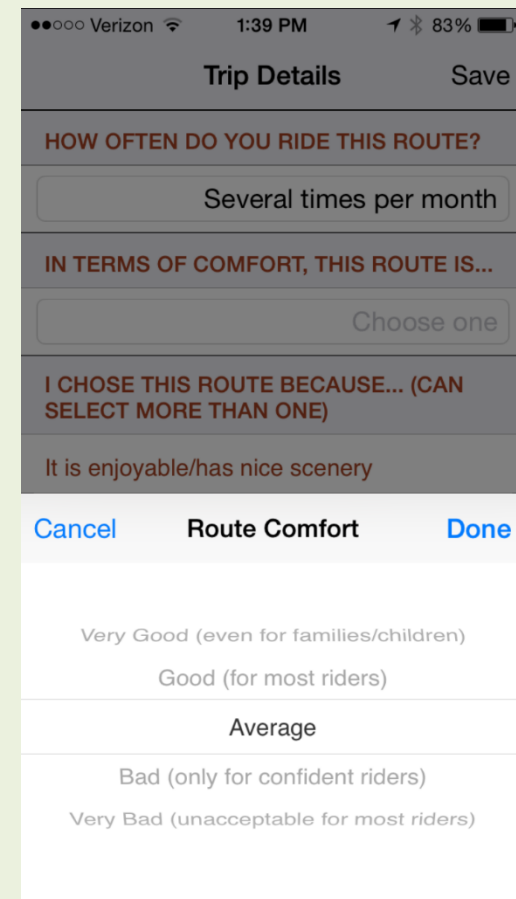
Along this route, you are concerned about conflicts/crashes with...

... NOT concerned (++)

... Auto traffic (-)

... Other cyclists (-)

... Large commercial vehicles (trucks) (--)



The screenshot shows a mobile application interface for "Trip Details". At the top, it displays "Verizon", "1:39 PM", and "83%" battery. Below the title "Trip Details" is a "Save" button. The first question is "HOW OFTEN DO YOU RIDE THIS ROUTE?" with a dropdown menu showing "Several times per month". The second question is "IN TERMS OF COMFORT, THIS ROUTE IS..." with a dropdown menu showing "Choose one". Below this is a section titled "I CHOSE THIS ROUTE BECAUSE... (CAN SELECT MORE THAN ONE)" with the text "It is enjoyable/has nice scenery". At the bottom, there are three buttons: "Cancel", "Route Comfort", and "Done".

# Single variable model results



Average Trip Speed of Cyclist (-)

Trip Distance (-)

Weekday Trip (-)

Trip Purpose: Exercise (+)

Trip Purpose: Shopping/Errands (+)

No bike facility, primary arterial (-)

No bike facility, other (-)

Bike lane, primary arterial (-)

Bike lane, minor arterial (-)

Separated path (+)

A screenshot of a mobile application interface. At the top, it shows 'Verizon', '1:39 PM', and '83%' battery. The main heading is 'Trip Details' with a 'Save' button. Below this, there are three sections: 1. 'HOW OFTEN DO YOU RIDE THIS ROUTE?' with a dropdown menu showing 'Several times per month'. 2. 'IN TERMS OF COMFORT, THIS ROUTE IS...' with a dropdown menu showing 'Choose one'. 3. 'I CHOSE THIS ROUTE BECAUSE... (CAN SELECT MORE THAN ONE)' with a text input field containing 'It is enjoyable/has nice scenery'. At the bottom, there are three buttons: 'Cancel', 'Route Comfort', and 'Done'. Below these buttons is a list of five options: 'Very Good (even for families/children)', 'Good (for most riders)', 'Average', 'Bad (only for confident riders)', and 'Very Bad (unacceptable for most riders)'. The 'Route Comfort' button is highlighted in blue.

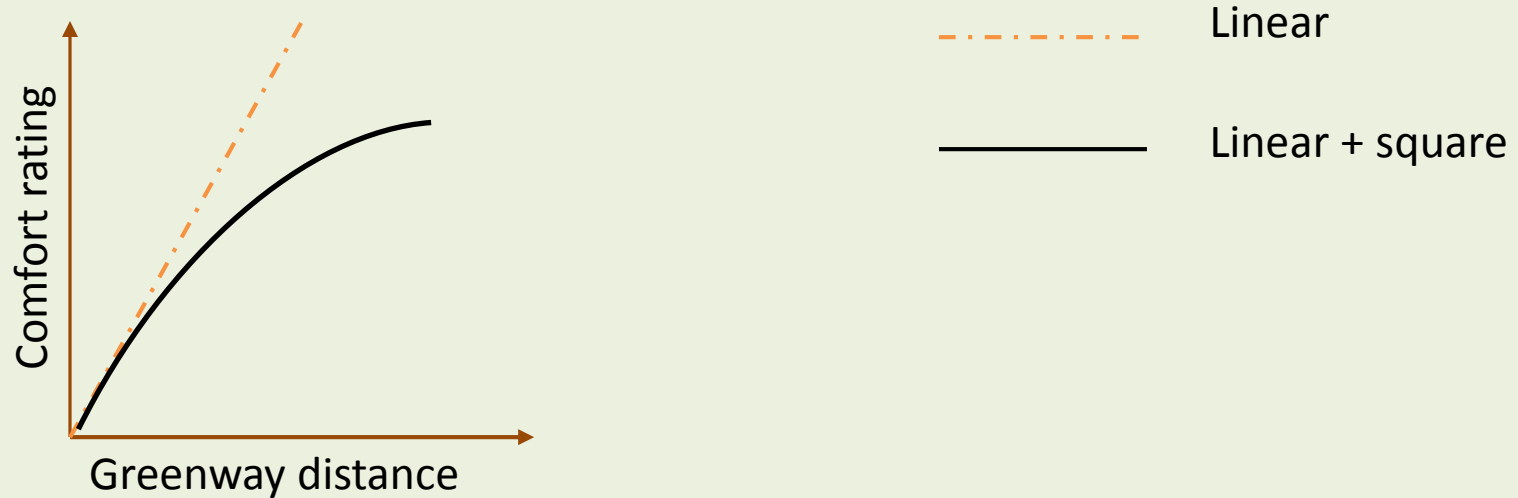
# Pooled model – distance based



Final Model - Relative importance	Sign	Relative Score*
Stressed by large commercial vehicles	(-)	100%
Arterial (with and without bike lane)	(-)	85%
Stressed by auto traffic on route	(-)	85%
Separated path	(+)	84%
Trip purpose: Shopping/errands	(+)	82%
Stressed by “other cyclists” on route	(+)	80%
Trip purpose: Exercise	(+)	80%
Not concerned about stressors on route	(+)	79%
Greenways (aka bike boulevards)	(+)	76%
Greenways (aka bike boulevards) (squared)		76%

\* Log-Likelihood change when removing one variable *Ceteris Paribus*

# Linear plus Square Contributions



# Pooled model – % based



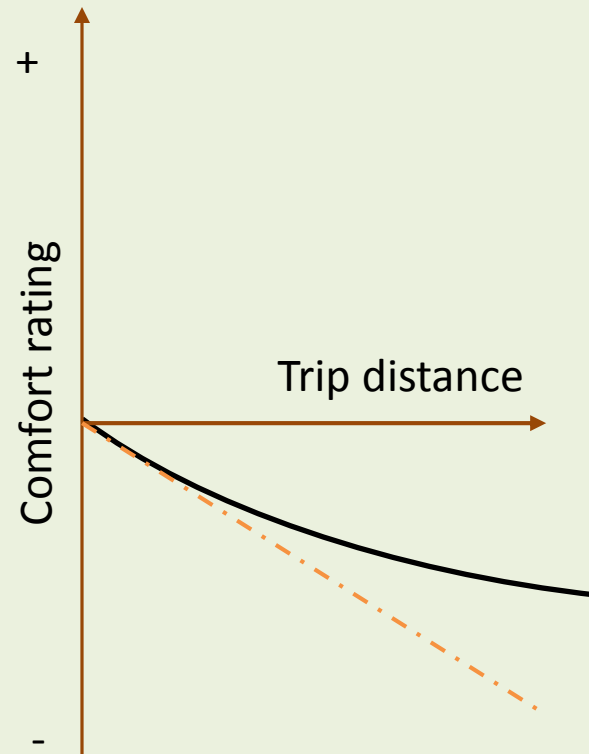
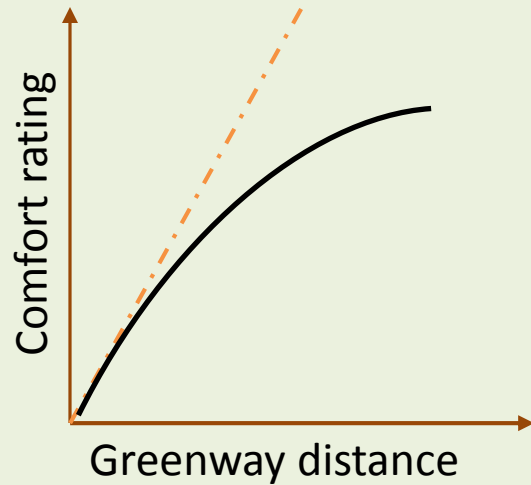
Final Model - Relative importance	Sign	Relative Score*
Stressed by large commercial vehicles	(-)	100%
Separated path	(+)	87%
Stressed by auto traffic on route	(-)	85%
Trip purpose: Shopping/errands	(+)	83%
Trip purpose: Exercise	(+)	82%
Arterial (with and without bike lane)	(-)	81%
Total trip distance	(-)	81%
Total trip distance (squared)		81%
Stressed by “other cyclists” on route	(+)	80%
Not concerned about stressors on route	(+)	80%

\* Log-Likelihood change when removing one variable *Ceteris Paribus*

# Linear plus Square Contributions



----- Linear  
———— Linear + square



# Key insights to increase comfort



- Avoid routes with commercial vehicles
- Less traffic
- Shorter routes (or distance effect?)
- More bike paths or separated facilities
  
- Commuter trip comfort levels are not the same as exercise or shopping trip comfort levels (confounded factors?)

Measuring stress levels for real-world on-road cyclists: do bicycle facilities, intersections, and traffic levels affect cyclists' stress?

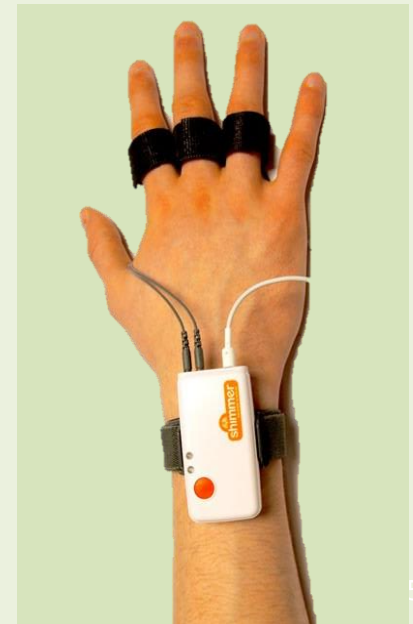
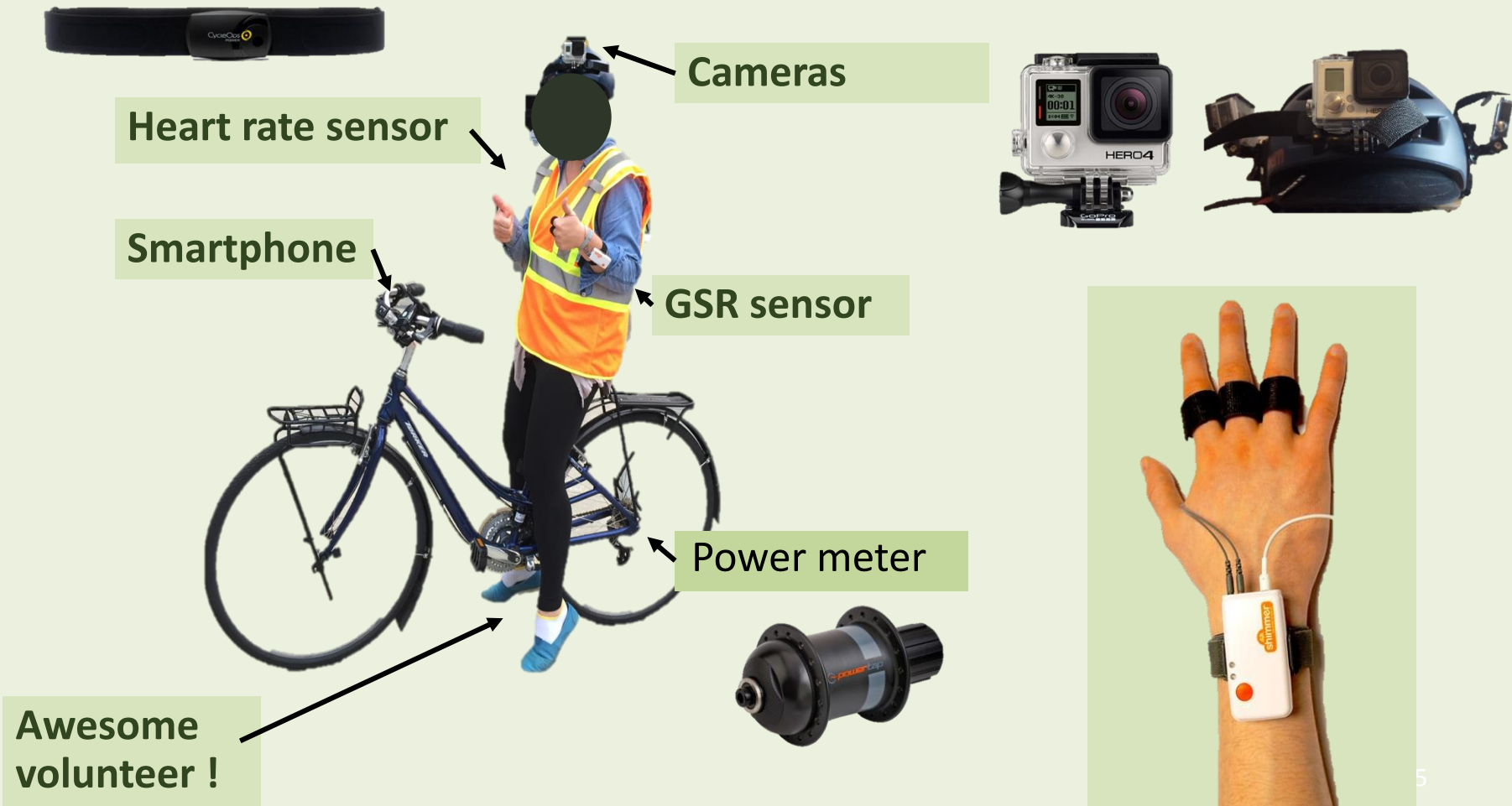




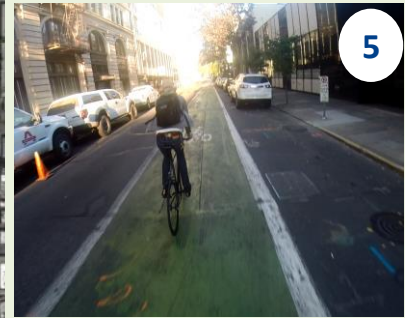
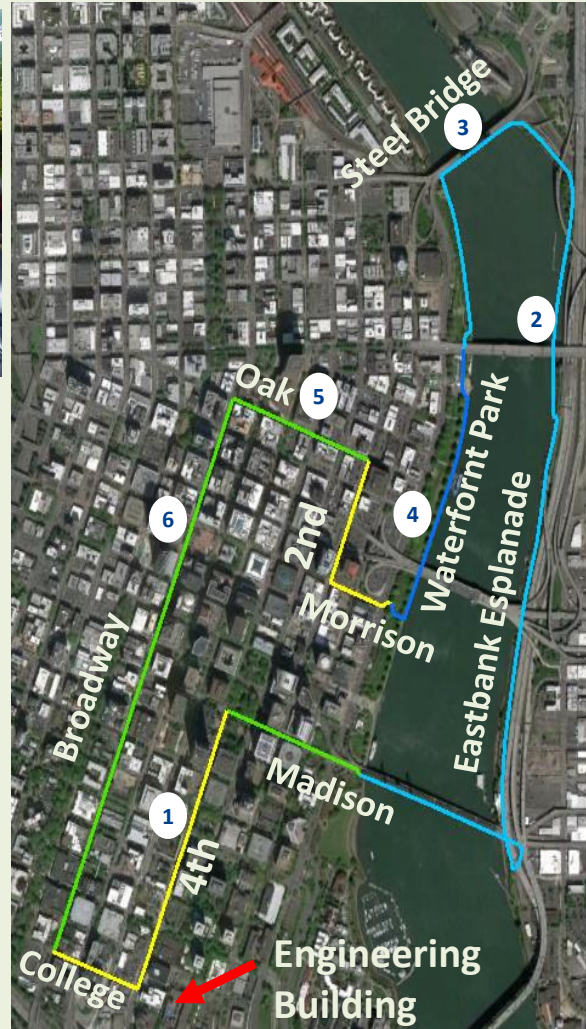
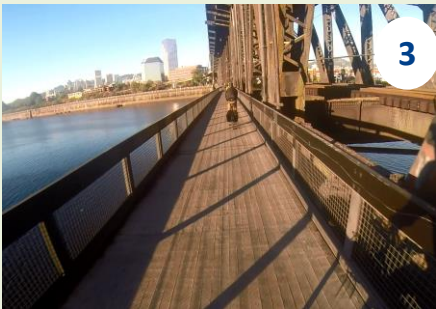
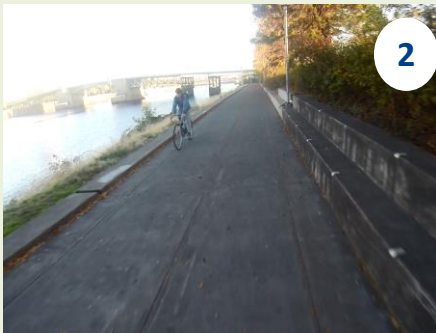
# Galvanic Skin Response (GSR)

- GSR has been utilized by many research studies in fields ranging from psychology to sports medicine.
- GSR is a robust non-invasive way to measure stress.
- The resistance of the skin changes with the activity of the sweat gland and small changes in resistance that can be measured accurately.

# Many ingredients...

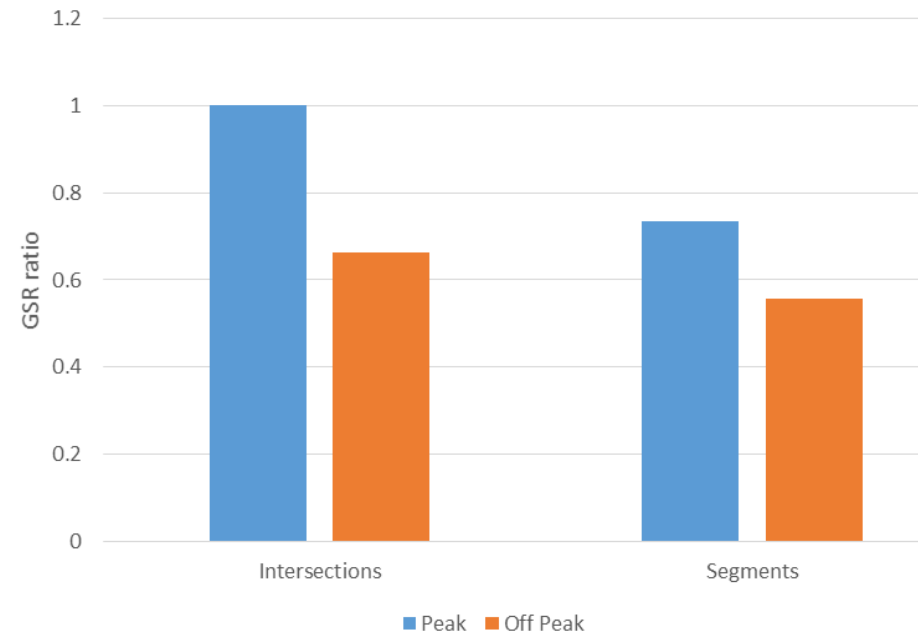
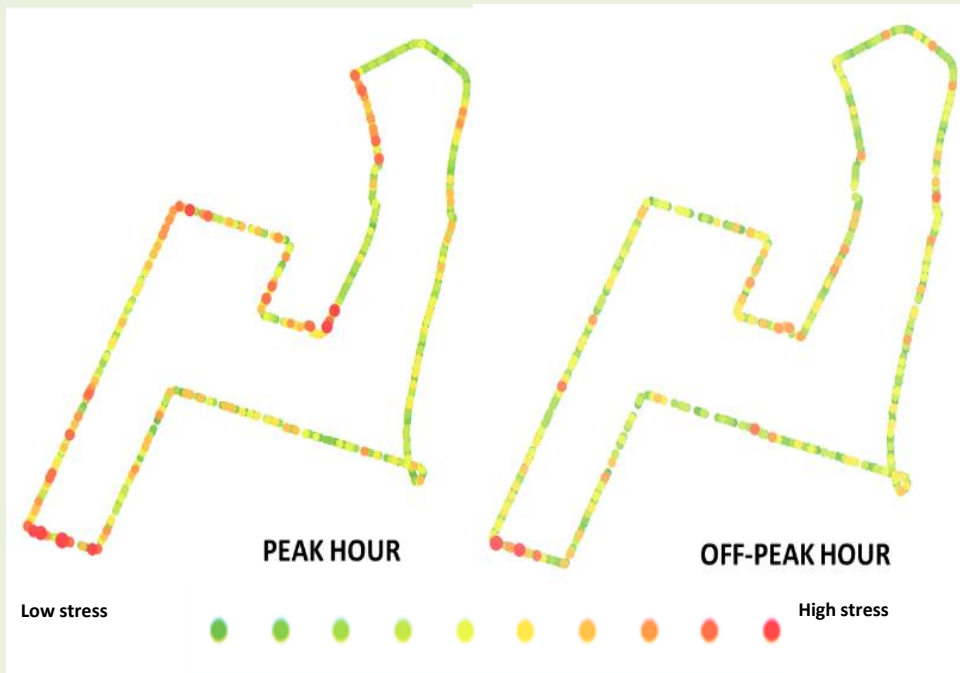


# Facility types: mixed traffic, off-street, wide bike lane, and standard bike lane



# Some findings

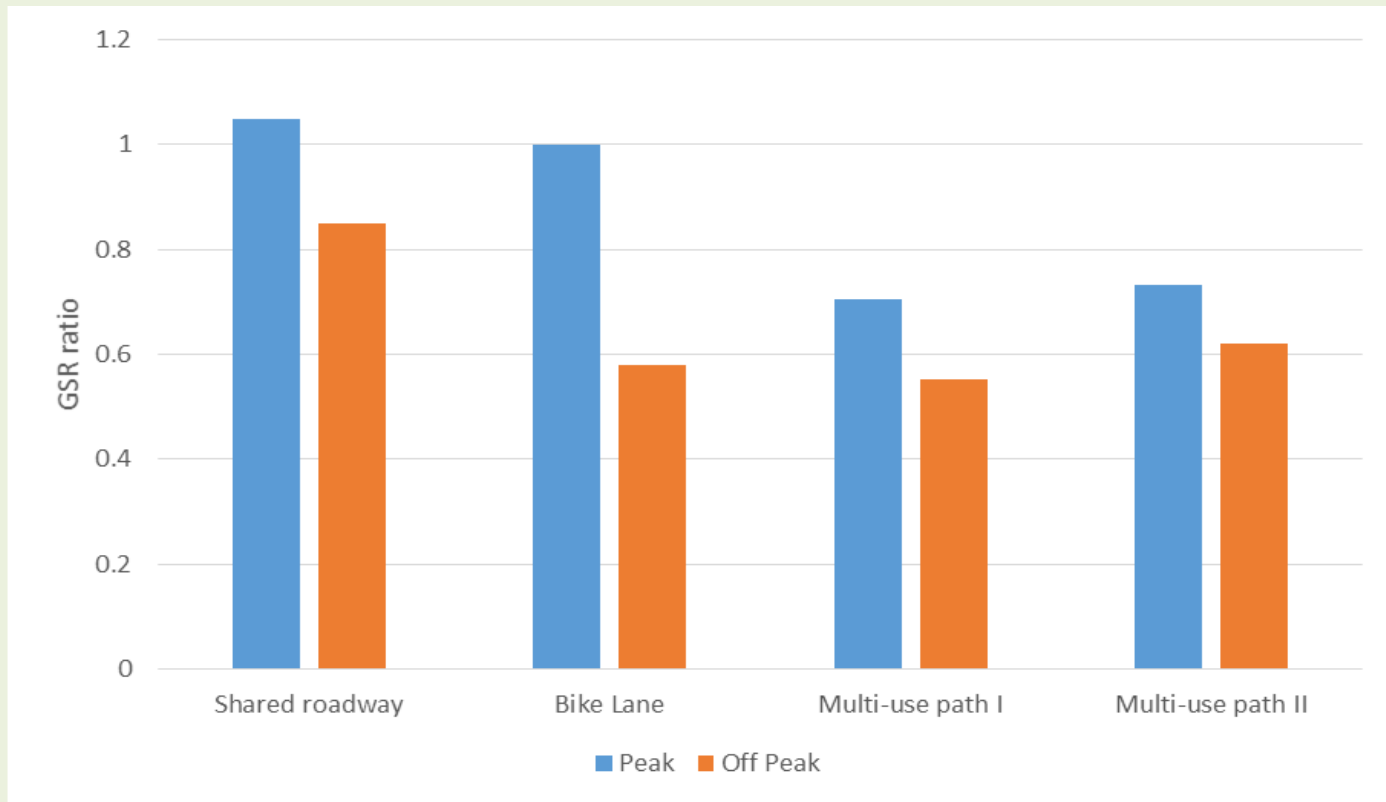
## Does peak traffic impact stress levels? YES



## Do intersections impact stress levels? YES

# Some findings

## What about facility types?

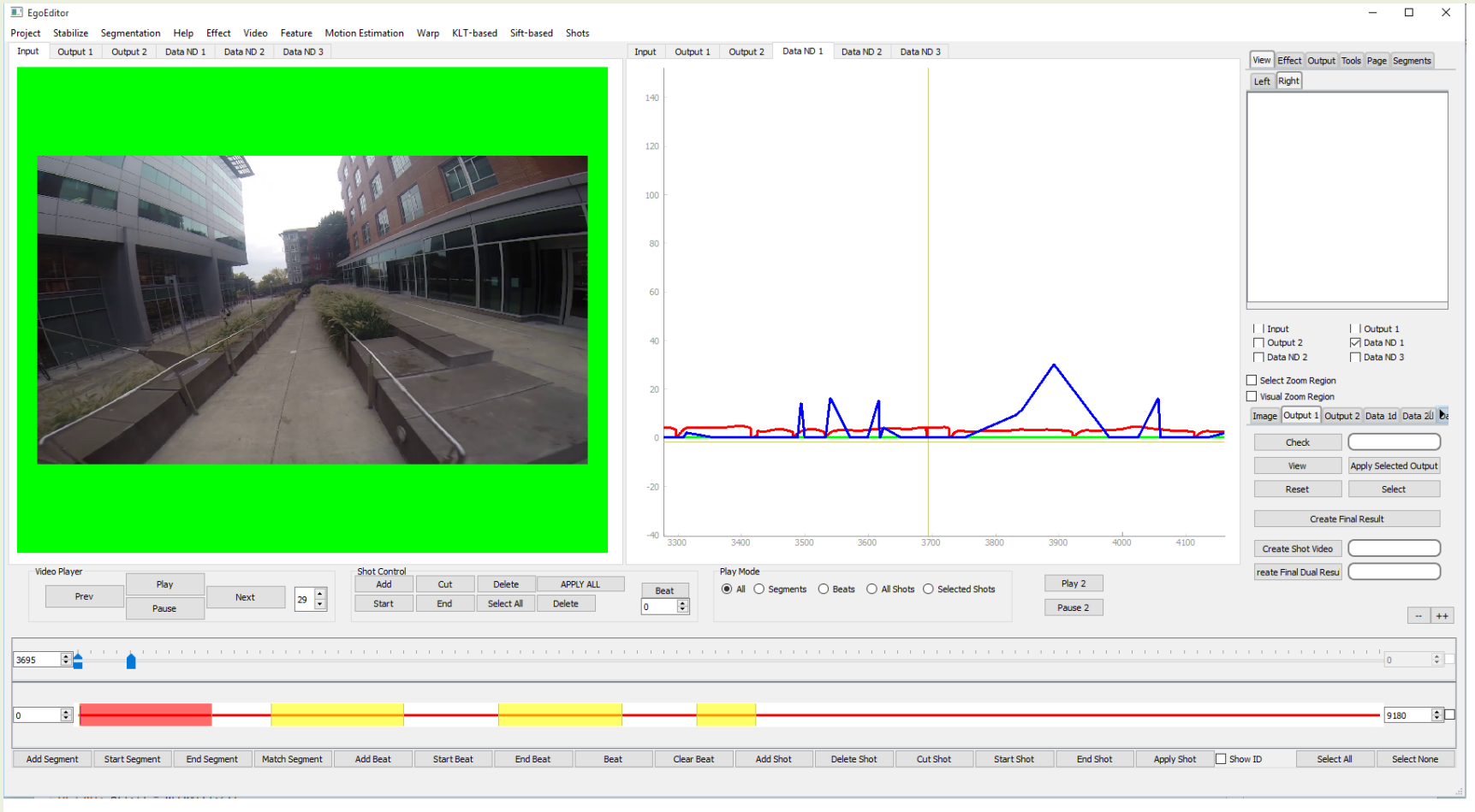


Multi-use path I: Waterfront park (westside)

Multi-use path II: Eastbank esplanade (more eastside)



# What else can we learn?



A lot, video analysis of peaks and lows...

# More details ?



Do you want to know more about measuring real-world on-road stress levels?

30 minute presentation on Monday 14<sup>th</sup>,  
Oregon Active Transportation Summit, 2pm

# Final comments

Early work but results are very promising

Data complementarities

- General policy insights: revealed data + questions
- Very specific stress measurements for a facility, e.g.
  - compare paths or intersections
  - before/after



# Collaborators



Modeling and ORcycle:

Bryan Blanc (\*)

Bikram Maharjan (\*\*)

Robin Murray (\*\*)

(\*) Department of Civil and Environmental Engineering, PSU

(\*\*) Department of Computer Science, PSU

# Collaborators

Modeling and measuring real-world on-road Stress

Alvaro Caviedes (\*)

Robin Murray (\*\*)

Hoang Le (\*\*)

Feng Liu (\*\*)

Wu-chi Feng (\*\*)



(\*) Department of Civil and Environmental Engineering, PSU

(\*\*) Department of Computer Science, PSU

# Learn more...



About the project

<http://www.pdx.edu/transportation-lab/orcycle>

Download the app, for iOS or Android  
Search “ORcycle” in the iTunes App Store or in  
Google Play

Send safety reports to AskODOT using ORcycle

Email us at: [ttplab@pdx.edu](mailto:ttplab@pdx.edu)

# Learn more... Related Papers and Reports

1. Blanc, B., & Figliozi, M. (2016a). Modeling the Impacts of Facility Type, Trip Characteristics, and Trip Stressors on Cyclists' Comfort Levels Utilizing Crowdsourced Data. Forthcoming 2016 Transportation Research Record.
2. Blanc, B., Figliozi, M, Clifton, K. (2016b). How Representative of Bicycling Populations are Smartphone Application Surveys of Travel Behavior, Forthcoming 2016 Transportation Research Record
3. Figliozi, M.A., (2015). Evaluating the use of crowdsourcing as a data collection method for bicycle performance measures and identification of facility improvement needs, Final Report SPR 768, ODOT, [http://www.oregon.gov/ODOT/TD/TP\\_RES/pages/researchreports.aspx](http://www.oregon.gov/ODOT/TD/TP_RES/pages/researchreports.aspx)
4. Caviedes, A. & Figliozi, M. (2016) Measuring stress levels for real-world on-road cyclists: do bicycle facilities, intersections, and traffic levels affect cyclists' stress? Presented at 2016 Transportation Research Board Annual Meeting, Washington DC.
5. More papers under review...

# THANK YOU

## Questions? Comments...

Visit our webpage :

<http://www.pdx.edu/transportation-lab>

Email us at: [ttplab@pdx.edu](mailto:ttplab@pdx.edu)