



10<sup>th</sup> INTERNATIONAL CONGRESS  
ON TRANSPORTATION  
RESEARCH



**ICTR 2021**

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# Investigation of speeding and aggressive behavior of professional drivers on highways through an innovative smartphone application

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# Background

- The **Internet of Things** (IoT) constantly offers new opportunities and features to monitor and analyse driver behavior through:
  - Widespread use of **smartphones** and social media
  - Effective **data collection** and handling
  - **Big Data** Analysis
- **Naturalistic driving experiments** via smartphones allow for:
  - Investigation of the **impact of risk factors** on driver behavior
  - Identification of **aggressive and dangerous** driving profiles
  - Provision of **driver feedback**





# The BeSmart project

## ➤ Project partners:

- National Technical University of Athens, Department of Transportation Planning and Engineering [www.nrso.ntua.gr](http://www.nrso.ntua.gr)
- OSeven Private Company [www.oseven.io](http://www.oseven.io)

## ➤ Duration of the project:

- 42 months (July 2018 – January 2022)

## ➤ Operational Program:

- "Competitiveness, Entrepreneurship and Innovation" (EPAnEK) of the National Strategic Reference Framework (NSRF)

# BESMART



European Union  
European Regional  
Development Fund



ΕΡΑΝΕΚ 2014-2020  
OPERATIONAL PROGRAMME  
COMPETITIVENESS • ENTREPRENEURSHIP • INNOVATION



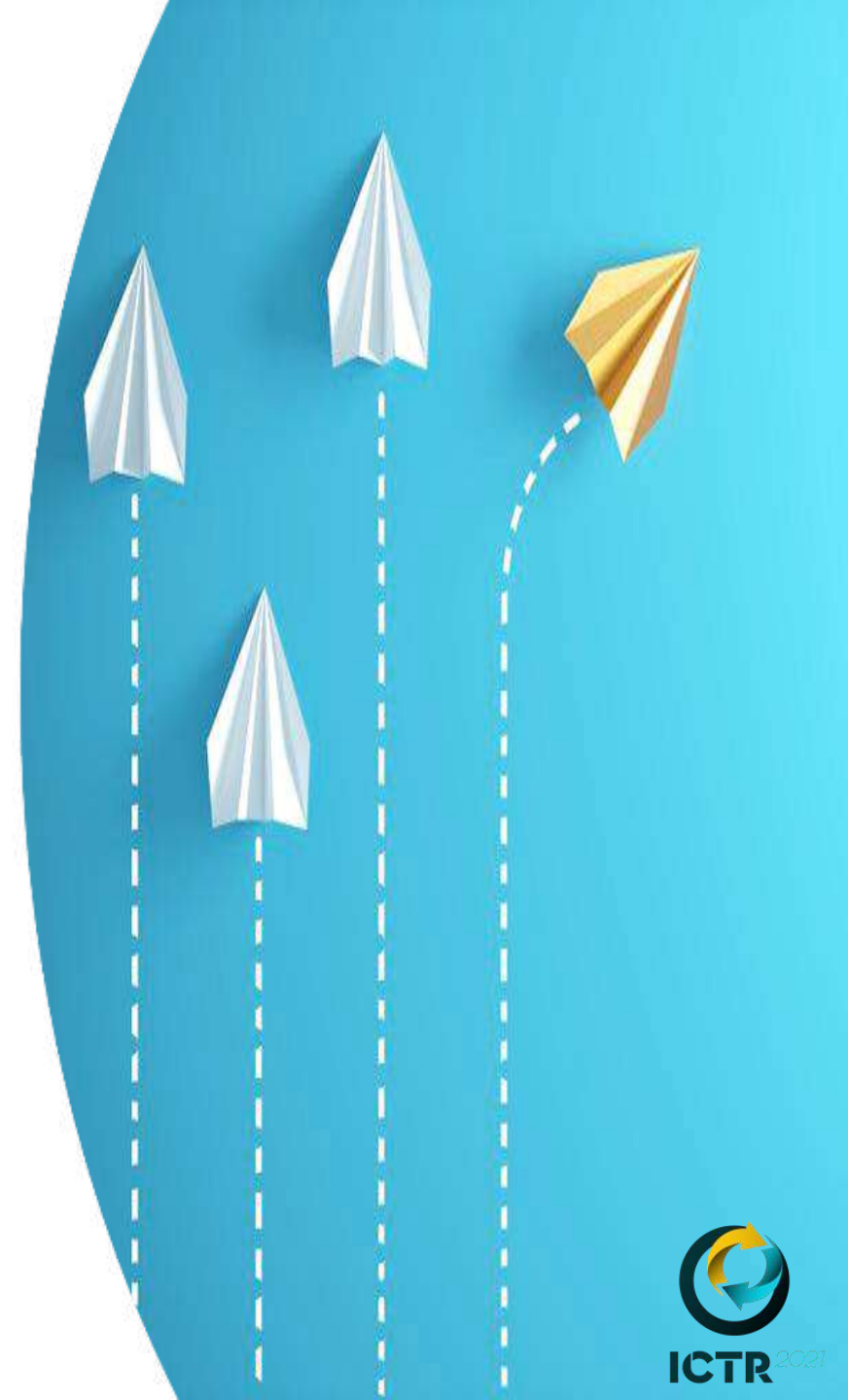
# The BeSmart Objectives

- Development of an **innovative and seamless** Internet of Things **application**
- **Assessment and improvement** of behavior and safety of all drivers (car drivers, powered two-wheelers, cyclists, professional drivers) along multi-modal trips
- Organization and exploitation of a **naturalistic driving experiment** of 200 drivers for 12 months



# Research Scope

- Which are the critical driving parameters that affect **speeding and aggressive behavior** of professional drivers on highways using data from:
  - Smartphone devices
  - Naturalistic driving experiment
- Can **incentives in a social gamification scheme** through a smartphone application **improve driving behavior**?





# The BeSmart driving experiment

- The experiment consists of different phases differing in the **type of feedback** provided to drivers
- The present study refers to Phases A and B:
  - Phase A - **personalized feedback**; namely a trip list and a scorecard regarding their driving behavior are provided to drivers
  - Phase B - **30-day competition** with prizes for safe driving
- A total of **5,345 trips from a sample of 19** professional drivers were recorded



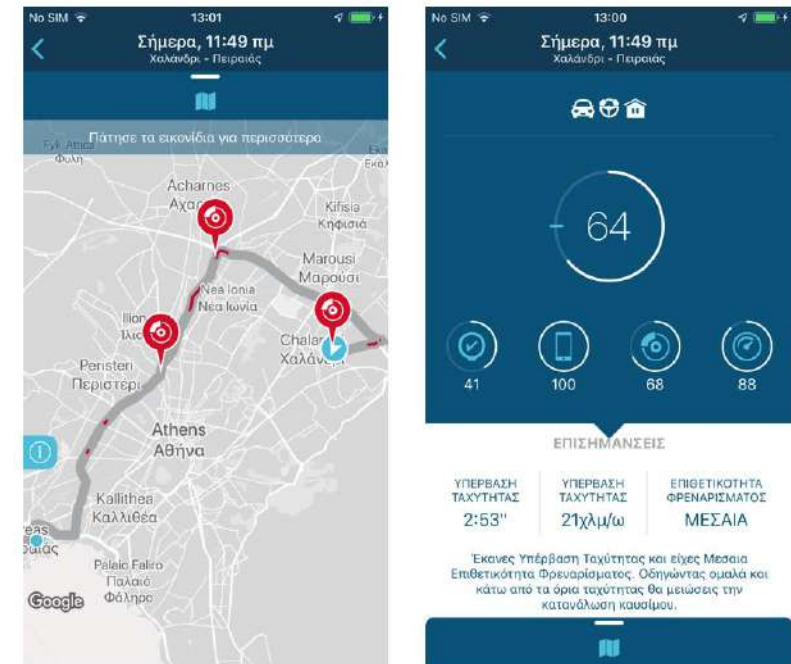
# The BeSmart Application

## Driving behavior characteristics

- Speeding
- Harsh braking
- Harsh acceleration
- Harsh cornering
- Mobile phone use

## Travel behavior characteristics

- Total distance
- Road network type
- Risky hours driving
- Vehicle type



# Smartphone data collection

- A **variety of APIs** is used to read mobile phone sensor data
- Data is transmitted from the mobile App to the **central database**
- Data are stored in a sophisticated database where they are **managed and processed**
- Indicators are designed using **machine learning algorithms** and **big data mining techniques**
- **State-of-the-art technologies** and procedures in compliance with personal data protection laws (**GDPR**)





# Methodology

## Analysis scope

- Among the recorded risk factors, **the frequency of harsh events and speeding** is chosen to be investigated in the present study

## Selection of statistical method

- Need for event prediction - data counting (data modeling)
- **Generalized Linear Mixed-Effects Models** (GLMMs) to capture different driving behaviors, given by the following formula:

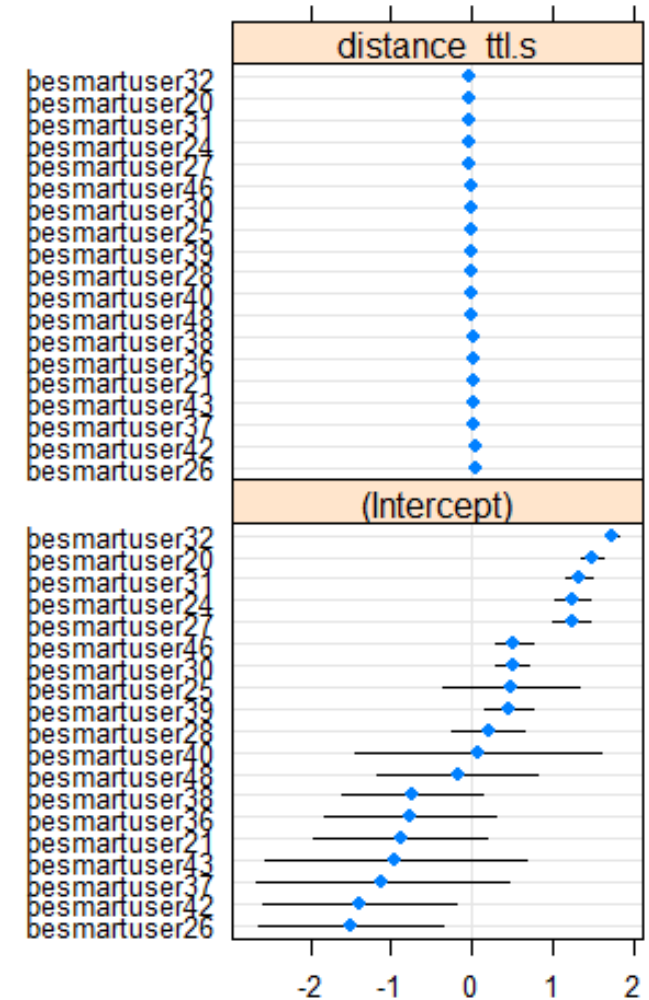
$$\log(\lambda_i) = \beta_{0i} + \beta_{ji}x_{ji} + \beta_{n-1}x_{n-1} + \varepsilon$$



# Results (1/3)

GLMMs for the percentage of travelled time above the speed limits per trip

Trip characteristic	Estimate	s.e.	p-value	Sig.	Rel. Risk Ratio
Intercept	-12.581	1.736	0.000	***	-
Competition	-1.492	0.339	0.000	***	0.225
Trip Duration	- 6.148	0.421	0.000	***	0.002
Harsh Acceleration	0.422	0.027	0.000	***	1.525

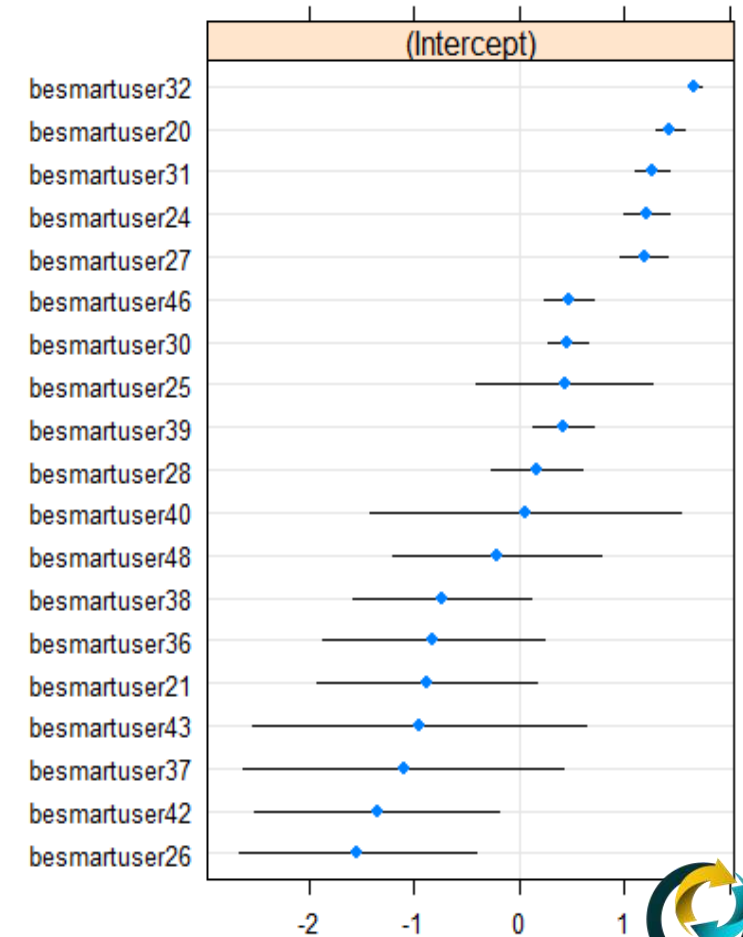




# Results (2/3)

GLMMs for the frequencies of harsh acceleration events per trip

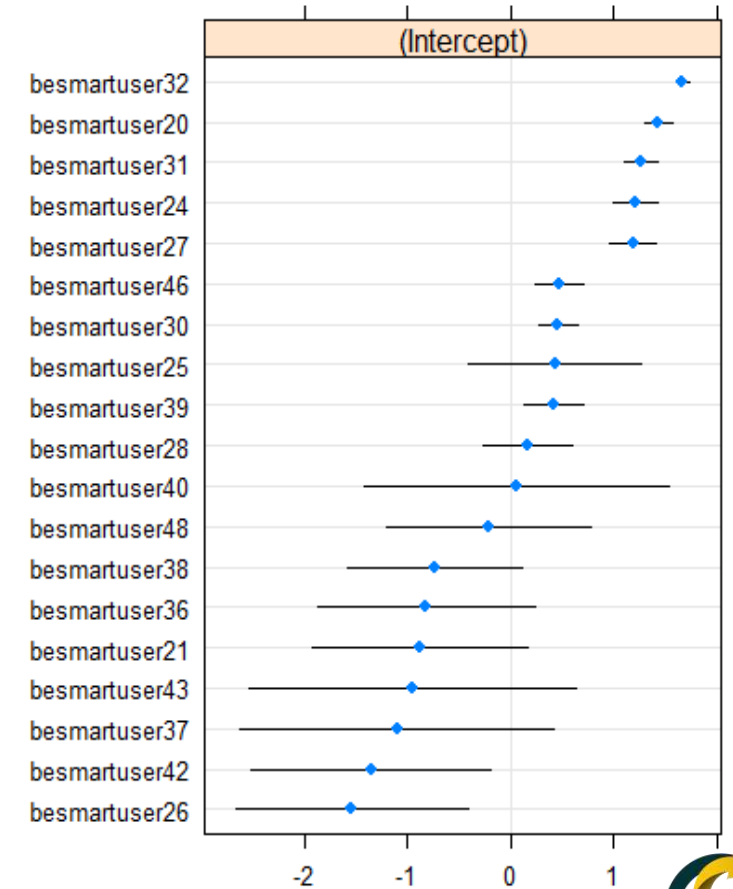
Trip characteristic	Estimate	s.e.	p-value	Sig.	Rel. Risk Ratio
Intercept	-3.531	0.341	0.000	***	-
Competition	-1.054	0.219	0.000	***	0.348
Trip Duration	0.444	0.026	0.000	***	1.558
Weekend	-0.414	0.175	0.000	*	0.661



# Results (3/3)

GLMMs for the frequencies of harsh braking events per trip

Trip characteristic	Estimate	s.e.	p-value	Sig.	Rel. Risk Ratio
Intercept	-2.384	-8.161	0.000	***	-
Competition	-0.907	-7.738	0.000	***	0.404
Trip Duration	0.447	45.106	0.000	***	1.564
Weekend	-0.290	-3.432	0.001	***	0.748





# Conclusions (1/2)

## Impact of detailed trip parameters

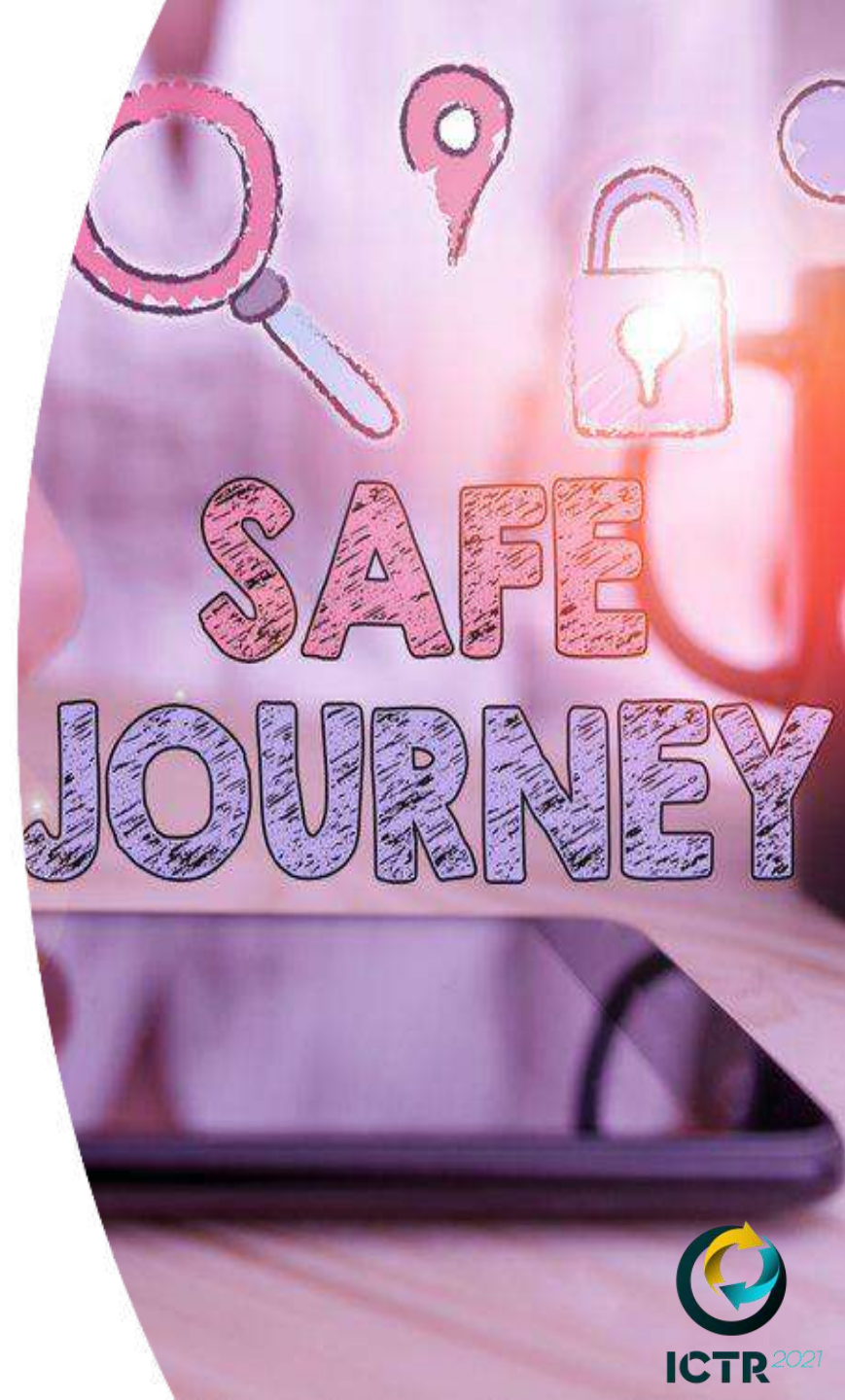
- **Trip duration** has a different impact on speeding (negative correlation) compared to harsh events (positive correlation)
- **Driving during the weekends** seems to reduce the frequency of harsh events; both accelerations and brakings
- **Harsh accelerations** are associated with the odds of someone exceeding the speed limits, outlining a pattern of an overall **unsafe driving behavior**



# Conclusions (2/2)

## Impact of incentives and motivations

- The present research quantifies the **positive impact of the 30-day competition** on all the three examined human risk factors
- Rewarding safe driving behavior and providing drivers with **motivations and incentives within a social gamification scheme** has successful results
- State-of-the-art interventions can include approaches for **driver training and support** through driver behavior monitoring and feedback tools





# Future research

- Analysis of **different driving behavior parameters** identified by the road safety literature as risk factors (e.g. mobile phone distraction)
- Analyses per **gender, age, history of accidents**, self-assessment, driving experience and more demographic characteristics
- **Comparative analysis** of drivers using different vehicle types





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