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#### Benchmarking Analysis of Road Safety Levels for an Extensive and Representative Dataset of European Cities

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## Introduction

- 1,35 million people are killed in road accidents worldwide each year
- In the EU, in 2018, around 25.100 road fatalities were recorded
- Great discrepancies in road safety performance exist among the 28 EU countries
- At regional level, the disparities are even larger in the EU





### Objectives and Methodology

#### **Objective:**

 To evaluate the road safety performance of EU urban regions, taking into account the evolution of road safety, transport and economic characteristics over the time period 2008-2016

#### Methodology:

- **Two procedure concepts** of benchmarking analysis (DEA) together with Tobit regression
  - to identify the best and under-performing regions
  - to identify the factors affecting the efficiency of the region's road safety performance





# Data Description (1/2)

- Data for 101 NUTS 2 regions covering 13 European countries
- Data refer to the period 2008-2016
- Time-series data on:
  - Road accident fatalities
  - Population
  - Gross Domestic Product (GDP)
  - Vehicle Fleet
  - Length of road network
  - Length of motorways
- Sources of data: EU CARE database, Eurostat





# Data Description (2/2)

More than 100

75 - 100 50 - 75

25 - 50Less than 25

- A geographical variation of fatality rates is obvious
  - higher fatality rates in Southern and Eastern **European countries**
  - lowest fatality rates in Northern countries
- Accident fatality rates, however, vary at a large scale among the regions within the borders of a country



Fatalities per million population by NUTS 2 region in the EU, 2017





#### Data Envelopment Analysis

- To identify under and best-performing regions in terms of road safety
- DEA method:

$$min\sum_{i=1}^{p} w_i y_{i,s}$$

Subject to  $\sum_{i=1}^{p} w_i y_{i,s} \ge 1, s = 1, \dots, n$ 

$$w_i \ge 0, i = 1, ..., p$$

- where,  $y_{i,s}$ : i<sup>th</sup> indicator of the s<sup>th</sup> DMU (region)
  - w<sub>i</sub>: the weight attributed to indicator y<sub>i.s</sub>
  - n: total number of DMUs (i.e., 101)
  - p: total number of indicators



#### Tobit Analysis

- What determinants affect the efficiency of the region's road safety performance
- Mathematical formation of Tobit model

$$\begin{aligned} y_t &= X_t \beta + u_t & if \ X_t \beta + u_t > 0 \\ y_t &= 0 & if \ X_t \beta + u_t \le 0 \\ t &= 1, 2, \dots, N \end{aligned}$$

- where, N: number of observations (i.e., 101)
  - y<sub>t</sub>: dependent variable (efficiency scores),
  - X<sub>t</sub>: a vector of independent variables
  - β: a vector of unknown coefficients
  - u<sub>t</sub>: an independently distributed error term



# Results – DEA (1/2)

- Output: road fatalities
- Inputs: socio-economic, demographic and transport infrastructure characteristics
- 11 out of the 101 regions appeared to **best-perform** out of the years





# Results – DEA (2/2)

- For the different socioeconomic, demographic and road infrastructure characteristics we have different benchmark regions
- Explanatory variable
  "Motorcycles": An underperforming region should focus on the benchmarking regions (e.g. Cataluna, Lazio, etc.), which are best-performing





## Results – Tobit Regression

- Regions with a high population record more fatal accidents
- Regions with high **GDP** have also a good efficiency
- Motorway density in each region is positively correlated with the efficiency
- Number of vehicles and passenger cars are negatively correlated with efficiency

Variables/Year	2008	2009	2010	2011	2012	2013	2014	2015	2010
Intercept	2.537e- 01***	2.75e- 01***	3.52e- 01***	2.38e- 01***	3.49e- 01***	2.39e- 01***	3.25e- 01***	1.36e-01**	2.11e 01**
	(5.05e-02)	(4.94e-02)	(4.93e-02)	(4.83e-02)	(5.13e-02)	(5.03e-02)	(4.97e-02)	(5.23e-02)	(4.66e-
Population	-1.490e-	-1.53e-	-1.53e-	-1.36e-	-1.88e-	-2.06e-	-1.92e-	-1.65e-	-1.56
	07***	07***	07***	07***	07***	07***	07***	07***	07**
	(3.65e-08)	(3.62e-08)	(3.67e-08)	(3.67e-08)	(4.49e-08)	(3.95e-08)	(4.59e-08)	(4.86e-08)	(4.57e-
Vehicles	-1.866e-06*	-2.078e-06*	-2.32e-06*	5.84e-07* (2.42e-07)	-	-	-	-	-1.72e-
	(9.44e-07)	(9.23e-07)	(9.23e-07)						(8.51e-
Lorries	2 4510 06*	2 700 06**	2 170 06**		1.19e-	1.10e-	1.14e- 1.01e-	1.01e-	2 500 0
	(0.042.07)	2.708-007	(9.73e-07)	-	06***	06***	06***	06***	2.59e-0 (8.93e-
	(9.946-07)	(9.758-07)			(2.89e-07)	(2.89e-07)	(2.87e-07)	(2.97e-07)	
Motorcycles	9.095e-07*	8 340e-07*	8.41e-07*	1.19e-	8.12e=07*	3 98e-07	8 33e=07*	9 08e-07**	6 42e-(
	(3.87e-07)	(3.69e-07)	(3 59e-07)	06***	(3.62e-07) (3.62e-07)	(2.30e-07)	(2.30e-07) (3.44e-07)	(3.51e-07)	(3.25e-
	(3.070 07)	(3.6,6 07)	(3.570 07)	(3.43e-07)		(2.500 07)			
Passenger	1.790e-06.	1.991e-06*	2.21e-06*	-8.43e-07**	-1.99e-07.		-1.86e-07.	-2.50e-07*	1.57e-
Cars	(10.00e-07)	(9.79e-07)	(9.82e-07)	(2.88e-07)	(1.17e-07)		(1.13e-07)	(1.15e-07)	(9.00e-
Buses	4.52e-05**	4.54e-05**	3.29e-05*	5.369e-	3.96e-05**	3.977e-	3.90e-05**	5.89e-	5.05
	(1.41e-05)	(1.38e-05)	(1.43e-05)	05***	(1.50e-05)	05**	(1.44e-05)	05***	05**
				(1.418e-05)	(1.500 05)	(1.403e-05)	(	(1.47e-05)	(1.39e-
Motorway Density	4.75e-	4.53e-	4.22e-	4.888e-	4.49e-	4.718e-	4.375e-	4.79e-	4.486
	03***	03***	03***	03***	03***	03***	03***	03***	03**
	(8.26e-04)	(8.09e-04)	(7.94e-04)	(7.987e-04)	(8.56e-04)	(8.365e-04)	(8.14e-04)	(8.47e-04)	(7.28e-
Other Roads	1.02e-	1.22e-	7.36e-	1.234e-	9.34e-	1.085e-	9.40e-	1.42e-	1.236
	05***	05***	06***	05***	06***	05***	06***	05***	05**
	(2.18e-06)	(2.13e-06)	(2.10e-06)	(2.029e-06)	(2.11e-06)	(2.031e-06)	(2.01e-06)	(2.10e-06)	(1.90e-
GDP	3.11e-06** (1.03e-06)	3.59e-	3.76e-	3.445e-	4.14e-	3.118e-	4.31e-	4.31e-	4.316
		06***	06***	06***	06***	06***	06***	06***	06**
		(1.05e-06)	(9.54e-07)	(8.982e-07)	(9.48e-07)	(8.086e-07)	(8.76e-07)	(8.77e-07)	(7.66e-
Log-Lik.	28.21	30.61	31.11	32.08	24.26	26.92	28.15	24.88	32.4
AIC	-34.42	-30.23	-40.22	-44.16	-28.52	-35.83	-36.29	-29.76	-42.9

Note: Parenthesis denotes the standard error of the variables

-: denotes the non-statistically variables that were omitted from the model



## Conclusions

- A straight forward methodological framework for assessing road safety performance at regional level
- Under- and best performing regions were identified, while for each variable examined different benchmark regions exist
- Depending on the priority areas of each region, the respective best-performing regions should be identified and their road safety policies should be followed as examples
- The high economic performance of the regions, the existence of upgraded road infrastructure network and the availability of public transport are associated with high road safety performance





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