

# Analyzing road safety indicator data across Europe: describing, explaining and comparing

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*Session 8*

**4<sup>th</sup> IRTAD CONFERENCE**

***Road safety data: collection and analysis  
for target setting and monitoring performances and progress***

**Seoul, 16-17 September 2009**

# Overview

1. Introduction
2. Data description
3. Method and results:
  - 3.1. Regression
  - 3.2. Clustering
  - 3.3. Footprint methodology
4. Conclusion

} Detailed  
look at  
Belgium

# 1. Introduction

## Introduction

## Data description

## Method and results

- Regression
- Clustering
- Footprint

## Conclusion

- The road safety problem (WHO, 2009):
  - 1.3 million people killed
  - 20 to 50 million injured
- How to improve the level of road safety in a country?
  - Studying various influencing indicators:
    - Understand the current road safety situation
    - Compare the road safety situation with other countries
    - Formulate policy recommendations
  - Here, we formulate indicators, collect indicator data and perform analyses to describe, explain and compare countries

# 2. Data description

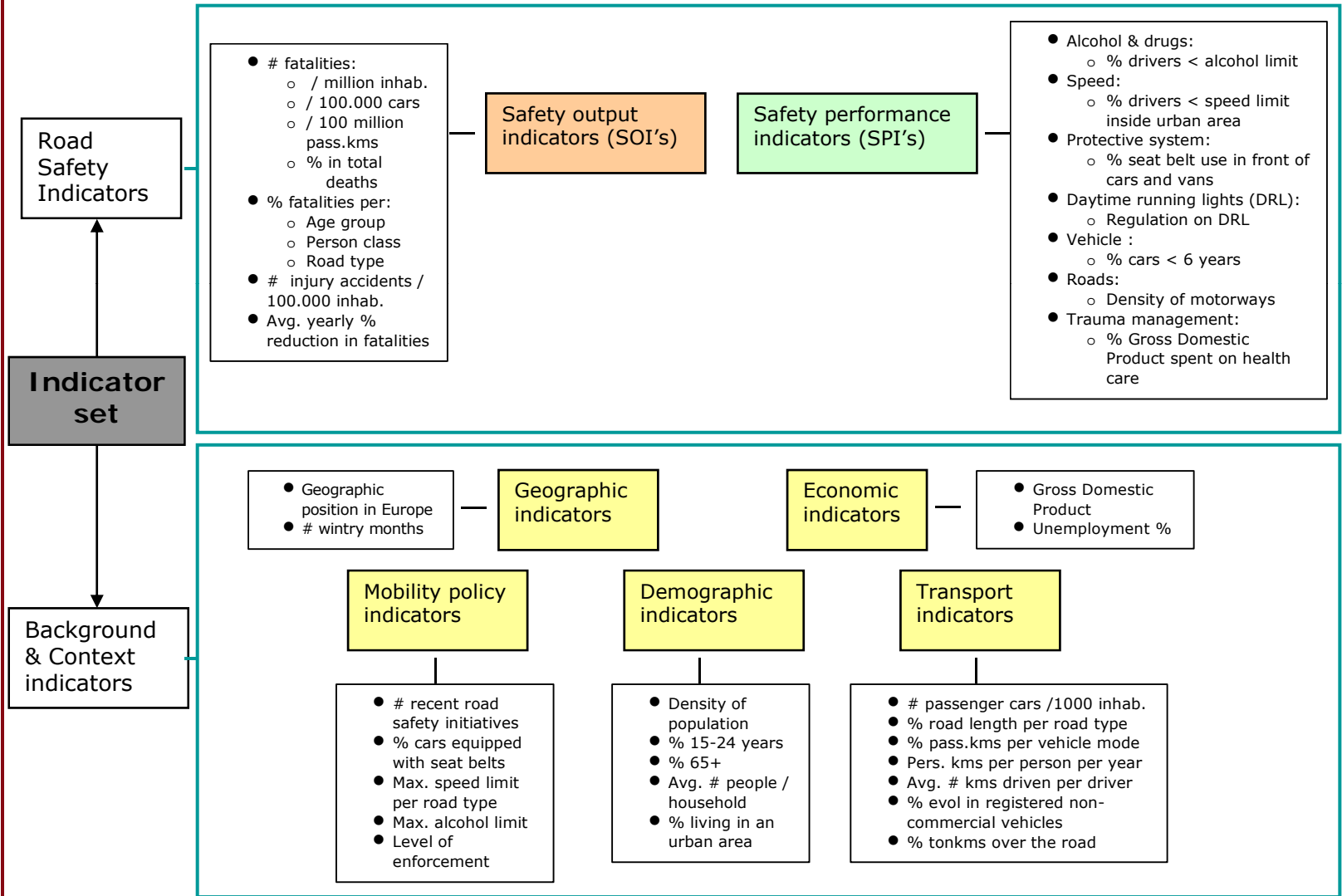
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## 2. Data description (2)

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- 60 indicators
- Data collected from publications & online databases
- 2003
- 21 European countries
- Missing values: mainly for Switzerland, Hungary, Cyprus and Estonia
- For some analyses indicator data were standardized

## 3.1. Regression

Introduction

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• Regression

*Goal*

*Methodology*

*Results*

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- Goal: Determine the indicators that explain the number of road fatalities per million inhabitants
- Methodology:
  - 1: Standardizing the indicator data set
  - 2: Determining approaches (3) to enter variables in the model (=> generating 3 models) and performing the linear multiple regression analyses
  - 3: Testing each model on the assumptions concerning the error term
  - 4: Studying the statistical significance of each model and the degree of multicollinearity
  - 5: Assessing the explanatory power of each model
  - 6: Interpreting the regression results

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# 3.1. Regression (2) Results

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<b>Model 1:</b>	
FATAL = 0.183 - 0.774 E1 - 0.440 ALC + ε	R <sup>2</sup> : 78 %
<b>Model 2:</b>	
FATAL = 0.046 - 0.378 E1 - 0.376 PS + 0.413 D4 + 0.284 T1 - 0.264 T12 + ε	R <sup>2</sup> : 83.9 %
<b>Model 3:</b>	
FATAL = 0.109 - 0.336 PS - 0.369 VEH + 0.535 D4 + ε	R <sup>2</sup> : 71 %
<b>Legend:</b>	
<ul style="list-style-type: none"> <li>• <b>FATAL</b>: number of road fatalities per million inhabitants</li> <li>• <b>E1</b>: GDP</li> <li>• <b>ALC</b>: % drivers &lt; alcohol limit</li> <li>• <b>PS</b> : % seat belt use in front of cars or vans</li> <li>• <b>VEH</b>: % cars &lt; 6 years</li> </ul>	<ul style="list-style-type: none"> <li>• <b>D4</b> : Avg. # people / household</li> <li>• <b>T1</b>: # passenger cars /1000 inh.</li> <li>• <b>T12</b>: Avg. # kms driven per driver</li> </ul>

# 3.1. Regression (3)

## Conclusion

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Conclusion

- The final models contain:
  - 3 SPI's
    - share of drivers respecting the legal alcohol limit
    - seat belt wearing rate in front of cars or vans
    - share of cars < 6 years
  - 4 background and context indicators
    - gross domestic product (E)
    - average number of persons within a family (D)
    - number of passenger cars per 1000 inhabitants (T)
    - average number of kilometers travelled by a driver (T)
- These indicators affect the road safety output level
- Background and context indicators are less controllable
- Improving the scores on the SPI's will have a direct effect on the number of road fatalities per million inhabitants

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## 3.2. Clustering

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*Groups based  
on SPO's*

*Groups based  
on SPI's*

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Conclusion

- Goal: Identify similarly performing countries
- Methodology:
  - 1: Standardizing the indicator data set
  - 2: Determining the algorithm(s)
    - Here, first Ward's algorithm to determine the ideal number of groups; then, k-means algorithm
  - 3: Performing the cluster analyses
    - Hierarchical clustering based on Ward's algorithm
    - Non-hierarchical k-means clustering
  - 4: Interpreting the clustering result

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## 3.2. Clustering (2)

### Identifying groups based on SOI's

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## 3.2. Clustering (3)

### Interpreting groups based on SOI's

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**Groups  
based on  
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Conclusion

- **Group 1:** SUN-countries, Denmark, Germany, Finland, France and Ireland  
+ Best performing countries
- **Group 2:** Belgium, Austria, Spain, Italy, Portugal, Slovenia and Estonia  
+/- Average performing countries
- **Group 3:** Czech Republic, Greece, Hungary and Poland  
- Worst performing countries

## 3.2. Clustering (4)

### Identifying groups based on SPI's

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***Groups  
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## 3.2. Clustering (5)

# Interpreting groups based on SPI's

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on SOI's*

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Conclusion

- **Group 1:** Czech Republic, Hungary, Poland and Estonia  
+ 'alcohol and drugs'  
- 'vehicle' and 'protective systems'
- **Group 2:** Belgium, Spain, Italy and Portugal  
+/- 'roads', 'trauma management' and 'vehicle'  
- 'alcohol and drugs' and 'speed'  
-/0 'protective systems'
- **Group 3:** Switzerland, Germany, France and Netherlands  
+ 'trauma management', 'roads' and 'protective systems'
- **Group 4:** Austria, Denmark, Finland, Ireland, Sweden, Slovenia and United Kingdom  
+ all risk domains except 'trauma management' and 'roads'

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## 3.2. Clustering (6) Conclusion

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Conclusion

- Countries were also grouped with respect to background and context indicators
- Belgium resembles the Netherlands on some background and context indicators but has a lower road safety level due to differences in SPI's
- The SUN-countries perform best and show some similarities concerning SPI's, economic and transport background

## 3.3. Footprint methodology

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• Clustering

• **Footprint  
Description**

*General  
footprint*

*Detailed  
footprint*

*Conclusion*

Conclusion

- Footprint (Morsink et al., 2005):
  - A schematic overview, valuable for describing and comparing countries
  - Provides a quick summary view on the road safety situation in a country
- 2 summary footprints for Belgium:
  - Comparing Belgium to the European average (*“general footprint”*)
  - Comparing Belgium to the average of the SUN-countries (*“detailed footprint”*)
- How?
  - 1: Determine boundaries for the colouring
  - 2: Visualize relative scores by red, orange and green

# 3.3. Footprint methodology (2)

## General footprint

Introduction

Data description

Method and results

- Regression
- Clustering

• **Footprint**  
*Description*

**General footprint**

*Detailed footprint*

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Conclusion

Organizational Background	Road Safety Performance Indicators	Road Safety Output Indicators
# recent road safety initiatives	<i>Per risk domain</i>	% fatalities per age group
Level of enforcement	<i>Alcohol &amp; drugs</i>	• 0-14y
<i>Max. speed limit</i>	• % drivers < max. alcohol limit	• 15-24y
• inside urban area	<i>Speed</i>	• 25-34y
• outside urban area	• % drivers < max. speed limit inside urban area	• 35-44y
• motorways	<i>Protective system</i>	• 45-54y
<b>Context</b>	• % seat belt use in front of cars and vans	• 55-64y
<i>Demographic background</i>	<i>Daytime running lights (DRL)</i>	• 65+
% 15-24y	• Regulation on DRL	• Age unknown
% 65+	<i>Vehicle</i>	% fatalities per person class
<i>Economic background</i>	• % cars < 6 years	• Vehicle occupant
Gross Domestic Product	<i>Roads</i>	• Motorized two-wheeler
Unemployment %	• Density of motorways	• Pedestrian
<i>Geographic background</i>	<i>Trauma management</i>	• Cyclist
• Geographic position in Europe	• Gross Domestic Product % spent on health care	• Unknown
• # wintry months		% fatalities per road type
<i>Transport background</i>		Inside urban area
% pass. kms		Outside urban area
• Car		• Motorway
• Motorized two-wheeler		• No motorway
• Bus		• Unknown
• Train		
<i>Pers. kms per person per year</i>		
• Bicycle		
• Walk		
<i>% road length</i>		
• Motorways		
• National		
• Secondary		
• Other		



# 3.3. Footprint methodology (3)

## Detailed footprint

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Method and results

- Regression
- Clustering

• **Footprint**

*Description*

*General footprint*

**Detailed footprint**

*Conclusion*

Conclusion

Organizational Background	Road Safety Performance Indicators	Road Safety Output Indicators
# recent road safety initiatives	<i>Per risk domain</i>	% fatalities per age group
Level of enforcement	<i>Alcohol &amp; drugs</i>	• 0-14y
<i>Max. speed limit</i>	• % drivers < max. alcohol limit	• 15-24y
• inside urban area	<i>Speed</i>	• 25-34y
• outside urban area	• % drivers < max. speed limit inside urban area	• 35-44y
• motorways	<i>Protective system</i>	• 45-54y
<b>Context</b>	• % seat belt use in front of cars and vans	• 55-64y
<i>Demographic background</i>	<i>Daytime running lights (DRL)</i>	• 65+
% 15-24y	• Regulation DRL	• Age unknown
% 65+	<i>Vehicle</i>	% fatalities per person class
<i>Economic background</i>	• % cars < 6 years	• Vehicle occupant
Gross Domestic Product	<i>Roads</i>	• Motorized two-wheeler
Unemployment %	• Density of motorways	• Pedestrian
<i>Geographic background</i>	<i>Trauma management</i>	• Cyclist
• Geographic position in Europe	• % Gross Domestic Product spent on health care	• Unknown
• # wintry months		% fatalities per road type
<i>Transport background</i>		Inside urban area
% pass. kms		Outside urban area
• Car		• Motorway
• Motorized two-wheeler		• No motorway
• Bus		• Unknown
• Train		
<i>Pers. kms per person per year</i>		
• Bicycle		
• Walk		
<i>% road length</i>		
• Motorways		
• National		
• Secondary		
• Other		

## 3.3. Footprint methodology (4)

### Conclusion

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• **Footprint**

*Description*

*General*

*footprint*

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**Conclusion**

Conclusion

- Belgium underperforms in many areas
- <-> the EU average:
  - Concerning the SPI's: 'protective systems', 'alcohol and drugs' and 'speed'
  - Concerning the SOI's: 'share of fatalities between 15 and 44 years' and 'share of fatalities on motorways'
- <-> the SUN-average:
  - Concerning the SPI's: on all risk domains except 'roads'
  - Concerning the SOI's: 'share of fatalities between 25 and 44 years', 'share of fatalities inside urban areas' and 'share of fatalities on motorways'
- The footprint methodology can be applied to every country revealing its best and worst characteristics

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# 4. Conclusion

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- A data set of RS indicators was analysed using:
  - Regression analysis
  - Cluster analysis
  - Footprint methodology
- Indicators explaining the number of road fatalities per million inhabitants:
  - ‘alcohol and drugs’ (% drivers < alcohol limit)
  - ‘protective systems’ (% seat belt use in front of cars & vans)
  - ‘vehicle’ (% cars < 6 years)
  - ‘average number of persons within a family’
  - ‘gross domestic product’
  - ‘average number of kilometers traveled by a driver’
  - ‘number of passenger cars per 1000 inhabitants’

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## 4. Conclusion (2)

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- Clustering:
  - Belgium is often grouped with South-European countries
  - The SUN-countries show apart from their similar road safety level some resemblances concerning their economic and transport background
- The footprints revealed Belgium's most important problem areas and are a valuable instrument for policy makers and other users
- Future research:
  - Take more indicators into account
  - Gathering data for more countries
  - Impute missing data

Thank you for your attention!  
Questions?