

Ph.D. in Civil and Environmental Engineering XXXVIII

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# Modelling and simulation of transport systems considering new trends in mobility: vehicle electrification and automation

## **RESEARCH CONTEXT AND PURPOSE**

In recent years, the circulating vehicle fleet has been rapidly changing. Electric-powered vehicles are gaining a significant share of the market, and in the meantime, vehicle automation is becoming a widely discussed topic. The main goal of my research activity is to analyze, using simulation and modelling techniques, the effects of vehicle evolution on user travel habits, traffic, and infrastructures. Specifically, I have delved into the study of electrifying mobility through analyses related to various aspects such as user purchasing behavior, consumption patterns, and charging choices.

## **Modelling EVs charging demand**

Application of a **nested logit model** aiming to estimate the zonal EVs charging demand in urban areas

- . The **Turin conurbation** was assumed as case study
- . **19 zones** were identified following administrative borders (municipalities)
- A zonal aggregate dataset including informations about charging infrastructures and population features was collected
- The model was applied considering **nested** logit structure
- Zones having high population density and attraction poles present high charging demand values
- It was observed that the distribution of the demand is strongly influenced by the sup**ply**, given the factors included in the models
- Population features, as education and income, have a meaningful influence on





## Factors effect analysis on EVs users behavior

Discrete Choice Model Experiment to understand the importance of the users' choice criteria/drivers and concerns related to EV purchase and recharging





- **16734 responses** recorded with a SP survey
- 4 European countries (Italy, Spain, Estonia, Netherlands) during the first months of 2023

$$U_{i} = V_{i} + \varepsilon_{i} = \beta * x_{i} + \varepsilon_{i}$$

$$(MNL) \quad p(i) = \exp(V_{i}) / \sum \exp(V_{i})$$





USER'S CHARACTERISTICS	STATED PREFERENCE ON CAR OWNERSHIP	STATED PREFERENCE ON CHARGING INFRASTRUCTURES
Driving habits	Car segment selection	SP_CASE 1 freeway/highway [at least 5/10 choice situations]
Sociodemographic characteristics	Stated preference [at least 5/15 choice situations]	SP_CASE 2 urban context [at least 5/14 choice situations]

**Discrete choice model** formulations were considered to investigate users behvaiour. Particularly, logit formulation was assumed.

#### charging behaviour

## **Modelling BEVs consumption**

Calibration of an energy **consumption model** for battery electric vehicle.



• The model formulation assumed includes variables as speed and gradient, and four parameters to calibrate:

$$FC = \left(\alpha + \frac{\beta}{V} + \gamma V + \delta V^2\right) * RGF$$

- Estimation of consumption for **different typo**logy of vehicles (BEVs or ICEs)
- Simulation of trips with estimation of BEVs state of charge level and possibility to estimate charging operations
- Comparative analysis of **costs** and **consumption** between ICE and BEV





— Cost stimato ZOE Cost ICE (panda euro 6)

(NL) 
$$p(i) = p(k) * p(i|k)$$

Calibration of a model aiming to investigate vehicle adoption among several powertrain.

- . Multinomial logit formulation assumed
- Included user-related, vehicle-related and **policy**-related attributes
- Expoloration of **several scenarios** to test the effect of specific attributes on users choice (incentives policies)
- Focus on **electric vehicle** penetration



To calibrate discrete choice model the python package **Biogeme** was used



Calibration of a model aiming to evaluate EVs users charging preferences in urban context.

- Multinomial logit and nested logit formulations assumed
- Included charging infrastructure-related attributes
- Expoloration of scenarios to evaluate the possible shifting of preferences on **public** infrastructures

### **FUTURE WORKS**

- . Contribution in project "INCIT-EV": Evaluation of impact assessement connected to the use of electric vehicles and the related charging structures in urban context.
- . Contribution in PRIN 2022 "Flash-FLOOD risk at crossings between ROAD and river networks.": Definition of road network model for topological and traffic flow analyses for large-scale scenarios considering congestion phenomena and road capacities during critical events.
- . Contribution to project "EPIGNOSIS": Virtual testing scenarios for ADAS through the use of microsimulation tools.

## PUBLICATIONS

- Sica, Lorenzo; Deflorio, Francesco (2023). Estimation of charging demand for electric vehicles by discrete choice models and numerical simulations: Application to a case study in *Turin*. In: Green Energy and Intelligent Transportation, vol. 2. ISSN 2773-1537
- Botta, Cristiana; Carboni, Angela; Deflorio, Francesco; Fappanni, Filippo; Sica, Lorenzo (2023). Factors identification for the user adoption of electrified powertrains through Discrete Choice Experiments. Presented at Euro Working Group Transportation 2023
- Botta, Cristiana; Carboni, Angela; Deflorio, Francesco; Fappanni, Filippo; Sica, Lorenzo (2023). Analysis of user preferences on electric mobility in four european countries. Presented at European Transport Conference 2023
- Botta, Cristiana; Carboni, Angela; Deflorio, Francesco; Sica, Lorenzo (2023). Electric vehicle recharging options in urban areas: discrete choice modeling to estimate user preference. In submission to Sustanible Cities and Society