



The 27th INTERNATIONAL
ELECTRIC VEHICLE
SYMPOSIUM & EXHIBITION.

Barcelona, Spain
17th-20th November 2013

Dynamic Range Prediction for an Electric Vehicle

João C. Ferreira^{1,2}, Vitor Monteiro², João L. Afonso²

¹ISEL, Lisbon, Portugal; ²Centro Algoritmi, Univ. Minho, Guimarães, Portugal

jferreira@deetc.isel.ipl.pt, *vmonteiro@dei.uminho.pt*, *jla@dei.uminho.pt*



Universidade do Minho

Organized by



Hosted by



In collaboration with



Supported by



- EVs have limited autonomy (e.g., 160 km)
- EV charging process is slow
- Missing EV charging infrastructures



Range Anxiety Problem ↘
Fear that an electric vehicle (EV) will run out of charge before it reaches its destination

Organized by



Hosted by



In collaboration with

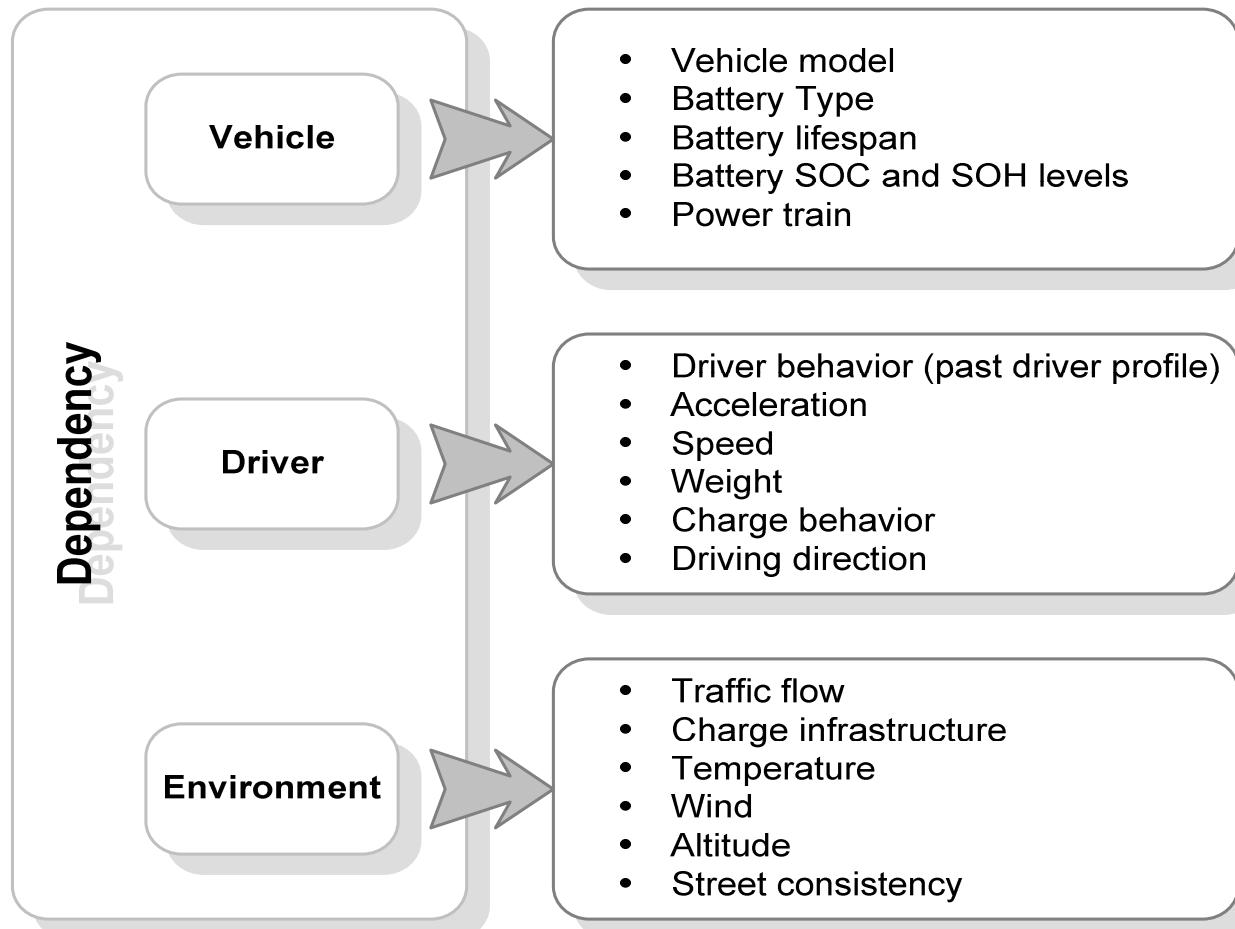


Supported by



European
Commission

Range autonomy is based on



Organized by



Hosted by

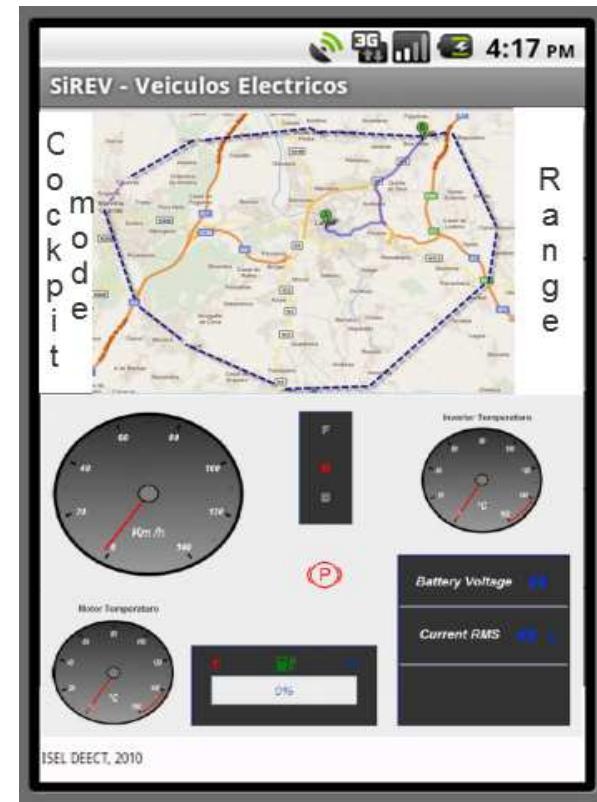


In collaboration with

Supported by



- Personalized Range Prediction
- Range Presentation on a Map
- Information in Real Time on a Mobile Device
- Creation of a Driver Profile



Organized by



Hosted by

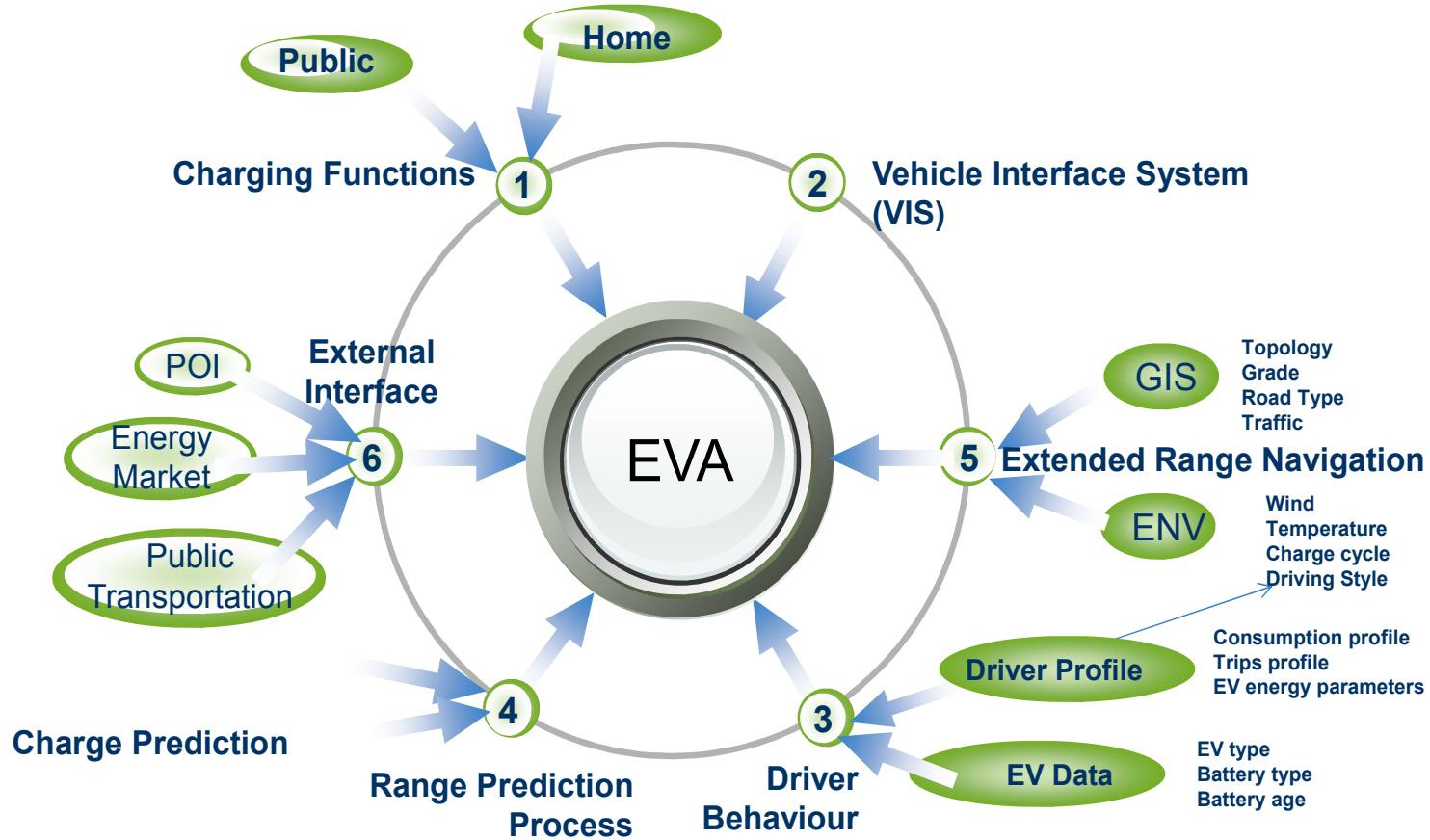


In collaboration with



Supported by





Organized by



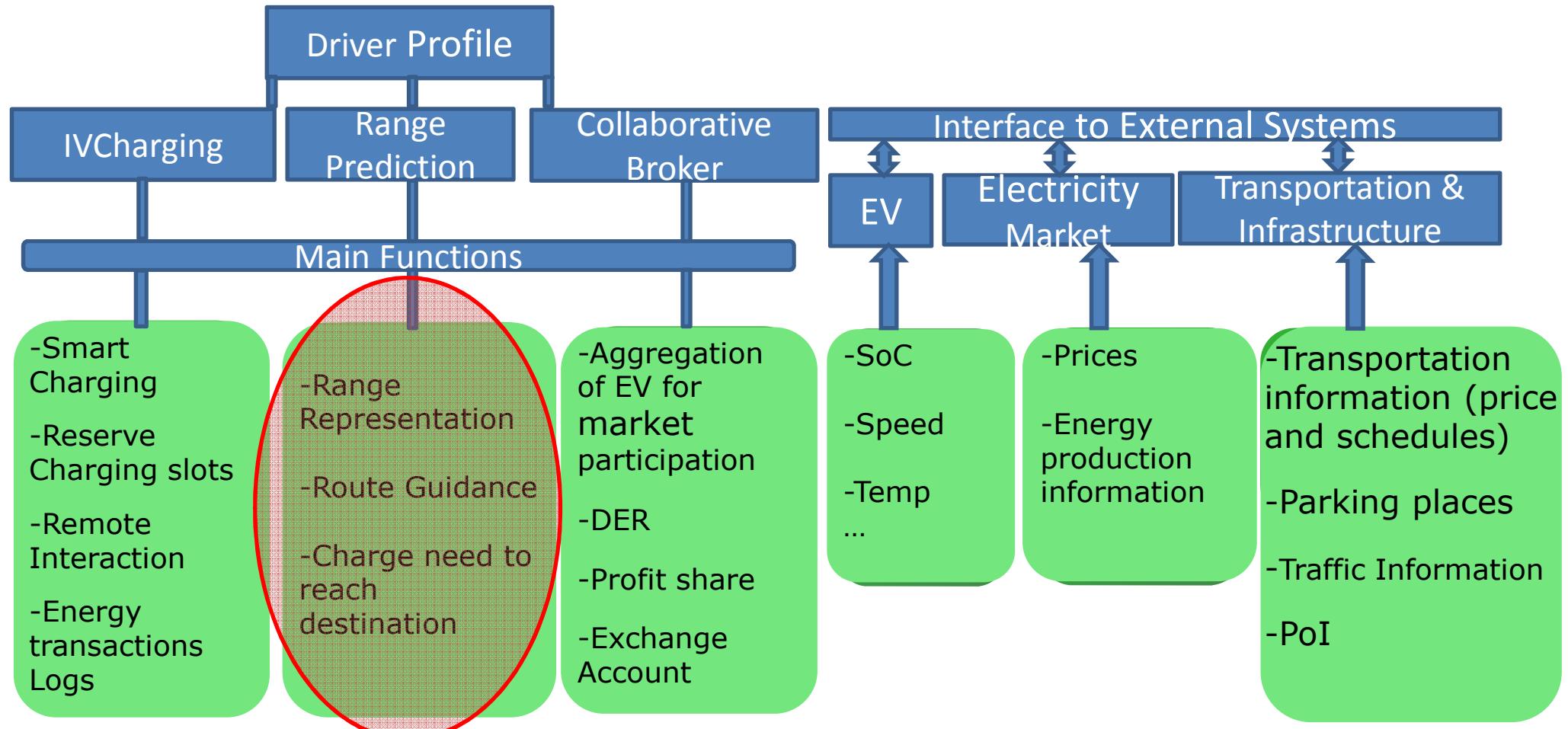
Hosted by

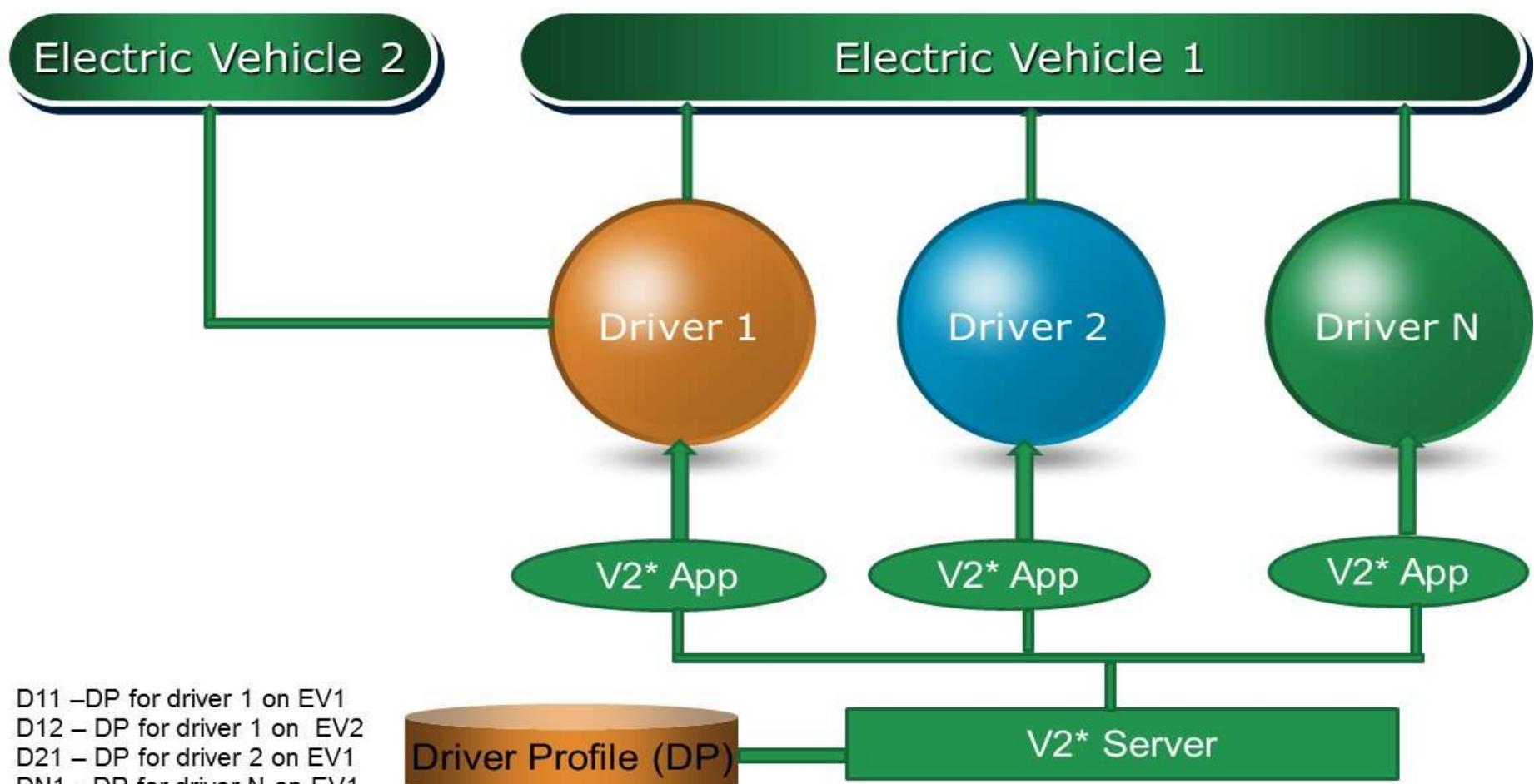


In collaboration with

Supported by







Organized by



Hosted by



In collaboration with

Supported by



Charging Log File

- Charging Point
- Start Date
- Finished Time
- Total Cost

Information from EV

- Battery SoC Level
- Voltage and Amperes
- Battery Temperature
- Speed

Control to Charging Device

- Start Charging
- Stop Charging
- Program Charging
- Discharging

Analyses of transactions data can be useful information for future charging or discharging processes, taking into account a smart charging strategy to combine distribution network limitation and low prices. All of this information is stored on the information repository on the central server. If internet communication is available, the driver can check remotely the home charging process, and interact with it, if he wants to.

Organized by



Hosted by



In collaboration with



Supported by



The screenshot shows the Microsoft Data Mining Toolkit interface with the following components:

- Mining Structure** tab: Shows a tree structure with nodes for 'Battery Type', 'Car Model', 'Date', 'Distance', 'Id', 'Latitude', 'Login', 'Longitude', 'Soc Diff', 'Speed Median', 'Temperature Median', and 'Weather'.
- Mining Models** tab: Selected tab, showing the 'Range_Prediction' model structure.
- Mining Model Viewer** tab: Shows the 'Microsoft_Dcision_Trees' structure with nodes for 'Input', 'Ignore', 'PredictOnly', 'Key', and 'Input'.
- Mining Accuracy Chart** tab: Shows a chart for the 'Range_Prediction' model.
- Mining Model Prediction** tab: Not selected.

The 'Range_Prediction' model structure is displayed in the center:

```

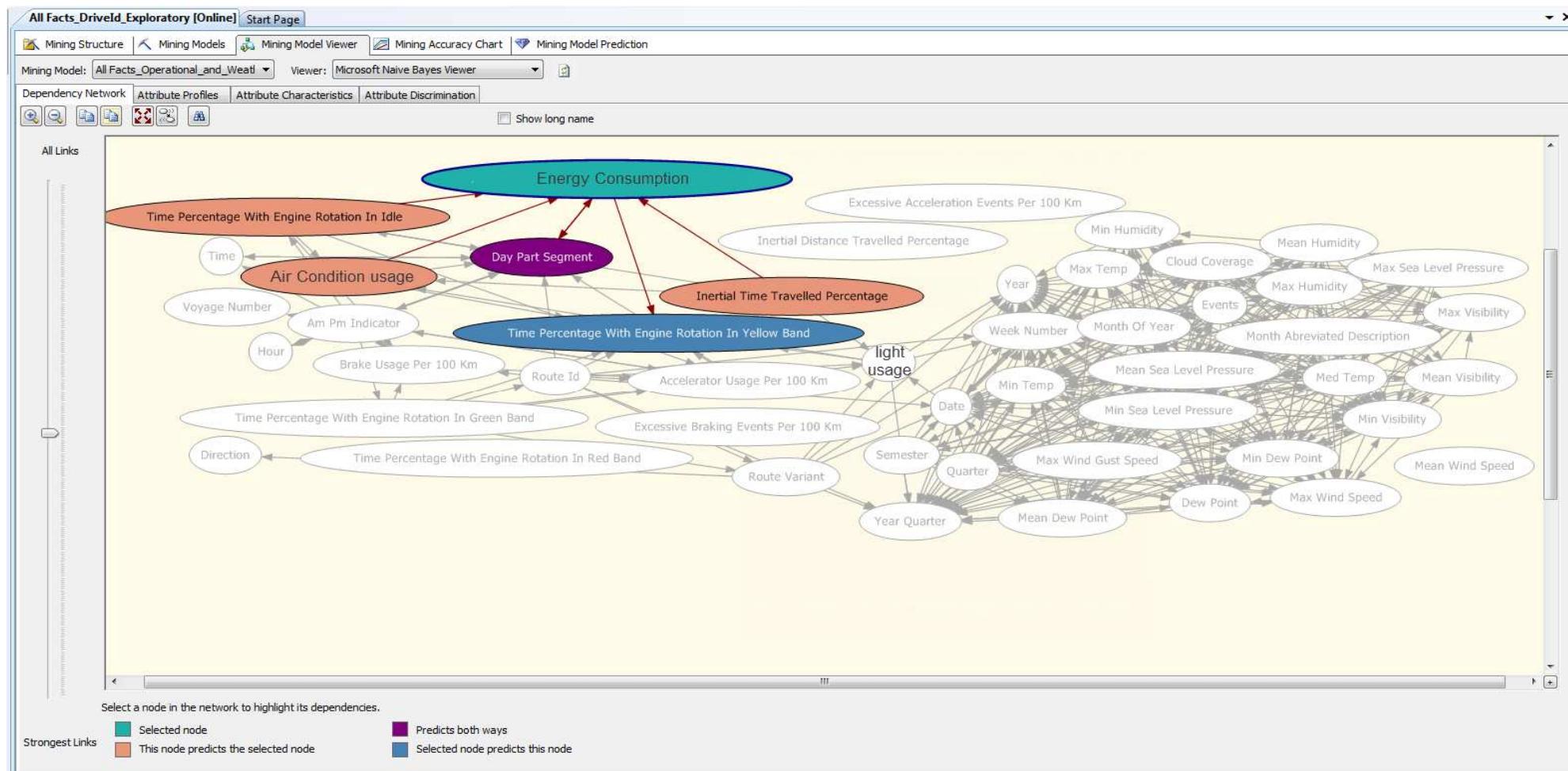
Range_Prediction
  Microsoft_Dcision_Trees
    Input
    Input
    Ignore
    PredictOnly
    Key
    Input
    Input
    Ignore
    Input
    Input
    Input
    Input
    Input
  
```

The 'Prediction' table at the bottom shows the following data:

	DISTANCE_PREDICTION	distance	soc_diff	speed_median	temperature_median	weather	battery_type	car_model
9	10	103	23	23	Partly Cloudy	Lead	P01JS	
9	2	8	15	109	25	Clear	Lead	P01JS
10	3	10	11	111	26	Cloudy	Lead	P01JS
10	4	10	12	93	22	Clear	Lead	P01JS
10	5	10	14	90	23	Cloudy	Lead	P01JS
10	6	5	20	92	27	Clear	Lead	P01JS
12	7	11	8	99	24	Partly Cloudy	Lead	P01JS
13	8	13	8	91	26	Clear	Lead	P01JS
10	9	10	9	104	23	Cloudy	Lead	P01JS
9	10	8	16	106	22	Clear	Lead	P01JS

Data mining approach combines past data of driver profile, with current information of EV (speed, SOC level), weather information and traffic.

Average Energy Consumption key influencing factors



Organized by



Hosted by



AVERE

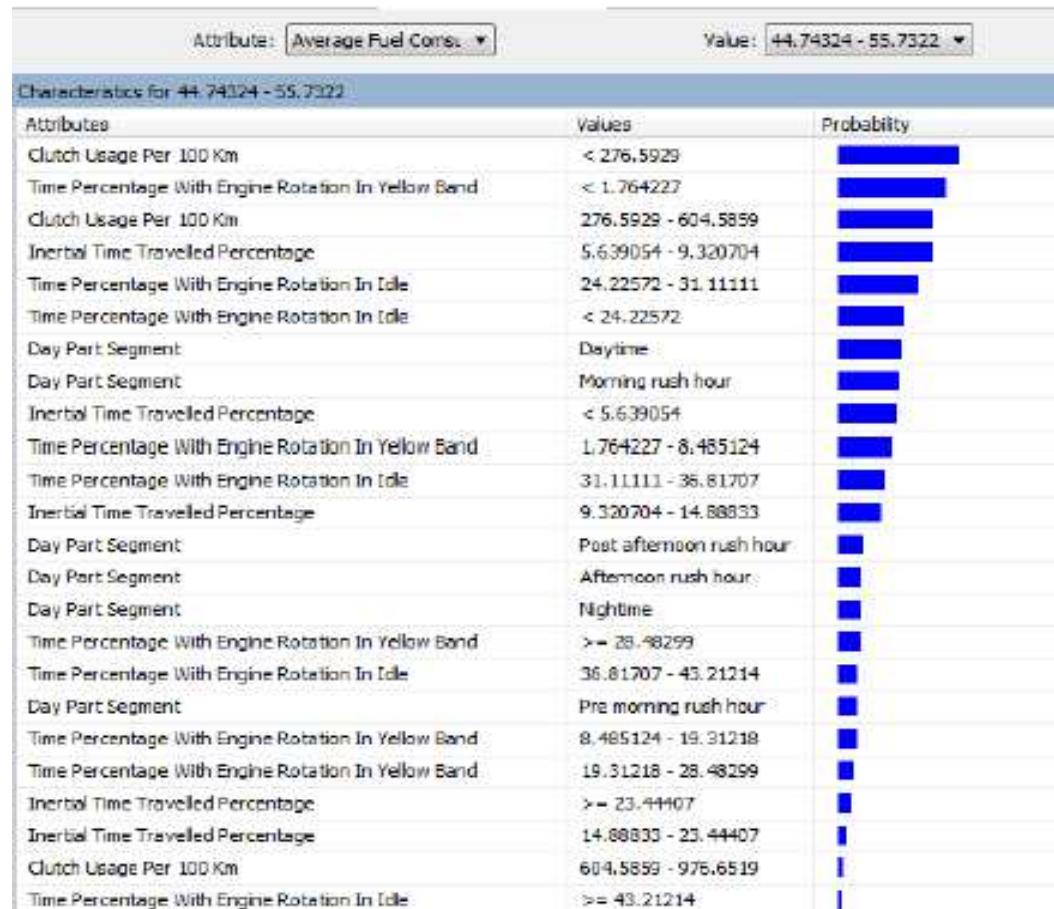


In collaboration with



Supported by





Organized by



Hosted by



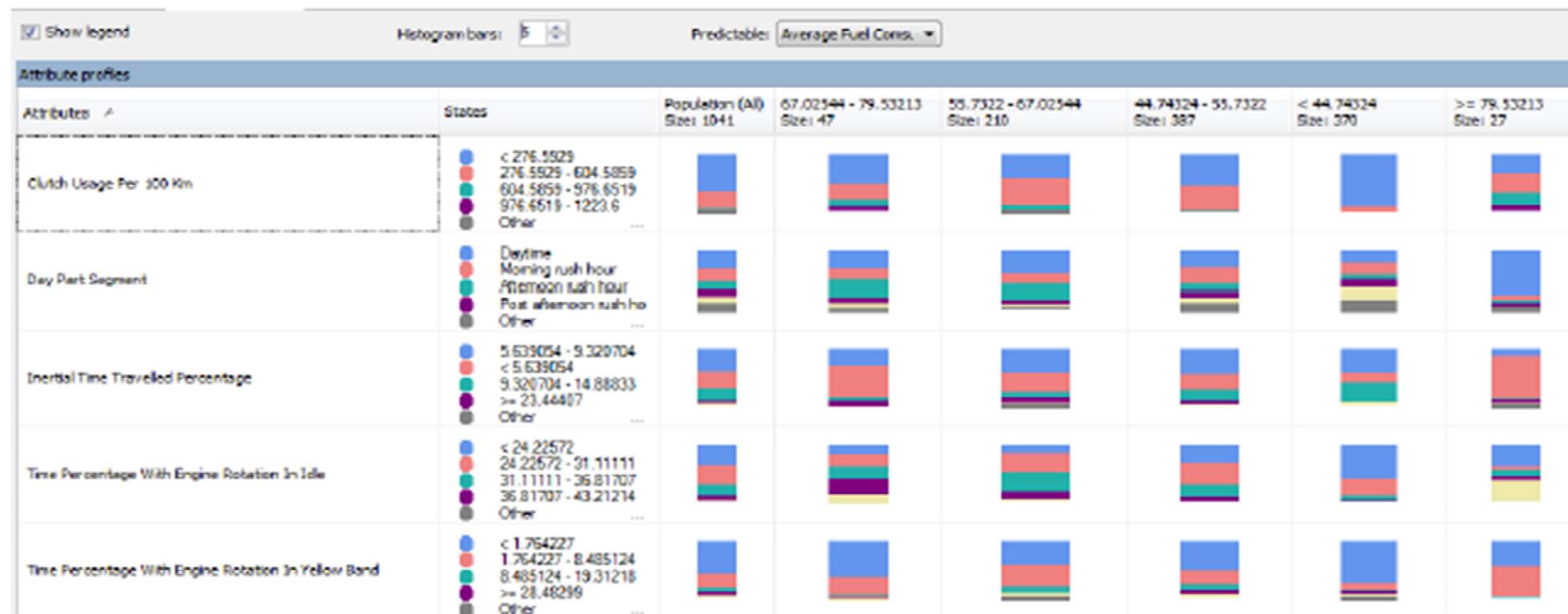
In collaboration with

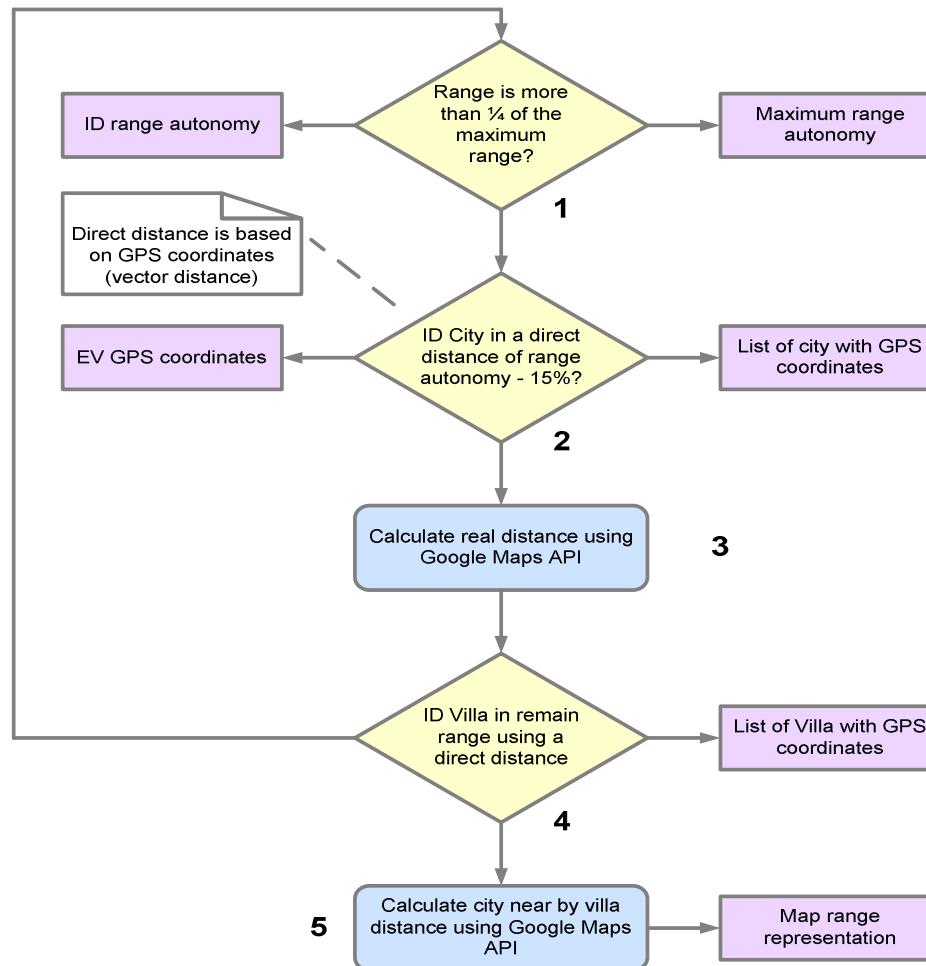


Supported by



European
Commission





Organized by



Hosted by

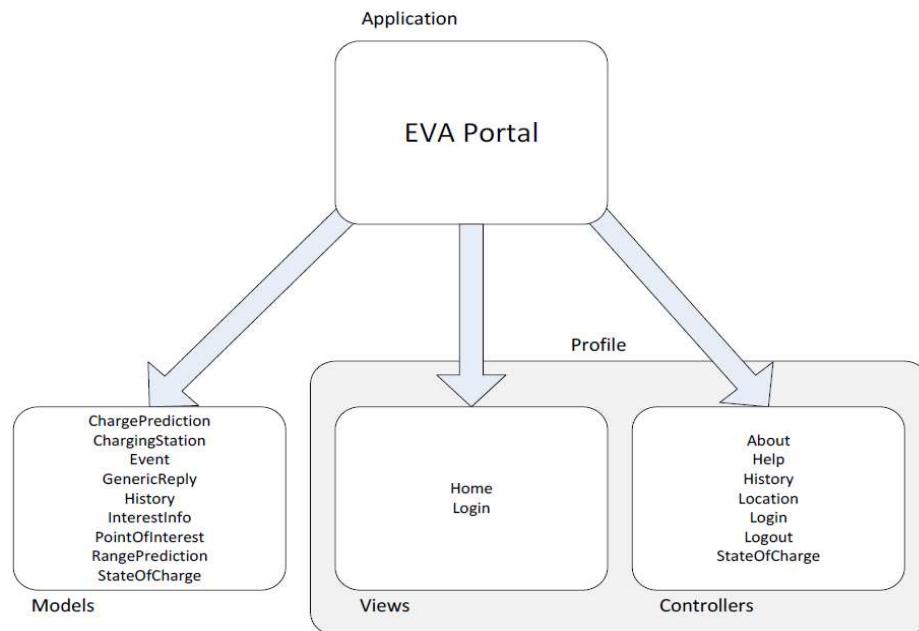


In collaboration with

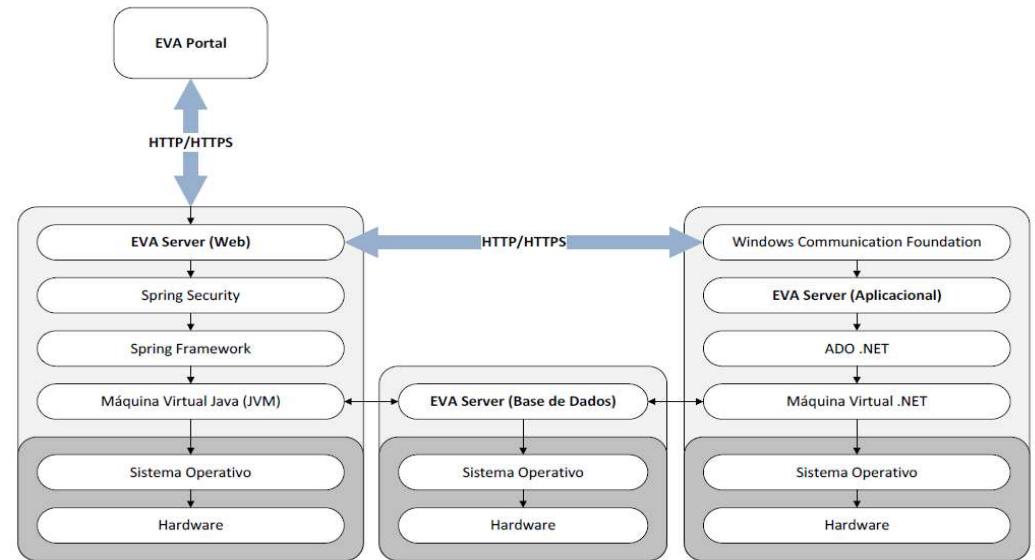


Supported by





EVA Portal in MVC (Model View Controller) approach.



EVA Server and Application architecture.

Organized by



Hosted by



In collaboration with



Supported by



European
Commission



Range Representation in a trip:

- 1) Starting point of the EV with full charge
- 2) After 25 km of trip
- 3) After 100 km of trip
- 4) After 150 km of trip

Organized by



Hosted by

AVERE

WEA



In collaboration with

EVAA

EDTA



Supported by



The red shadow is a range that is possible to achieve, but for which the driver needs to perform driving optimization (with air conditioner off and avoiding big accelerations). This could be a helpful information, because the driver can customize his behavior in function of the range he needs to achieve in his trip. This process can be continuously updated, and thus, when the SOC level is low, this uncertainty is also low.

Organized by



Hosted by



In collaboration with

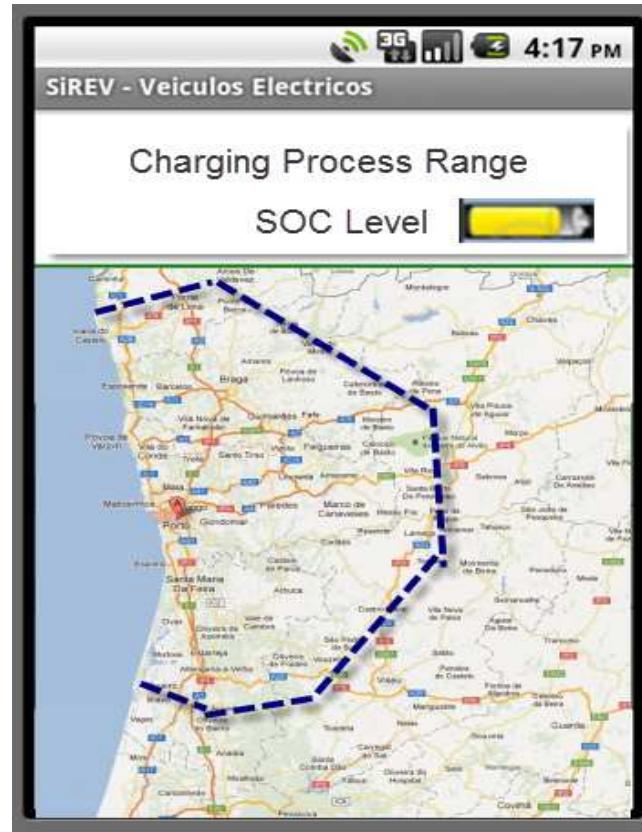


Supported by





Range Representation with
SOC level in 5%



Range Representation with
SOC level in 80%

Organized by



Hosted by

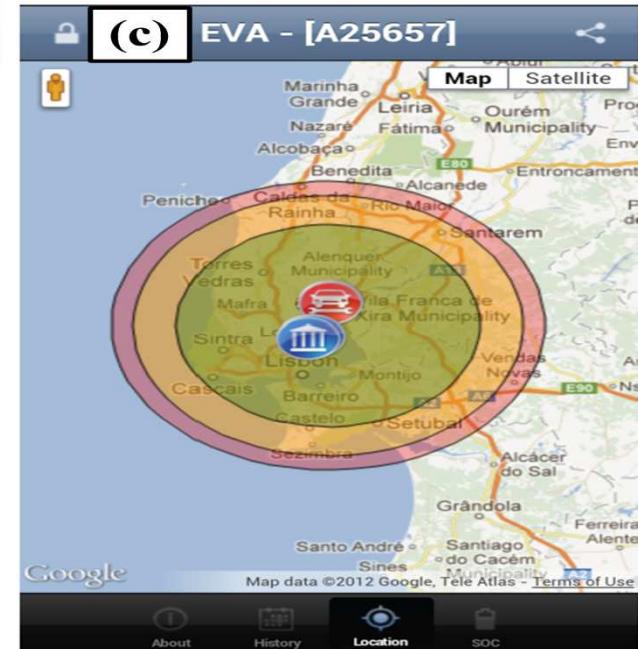
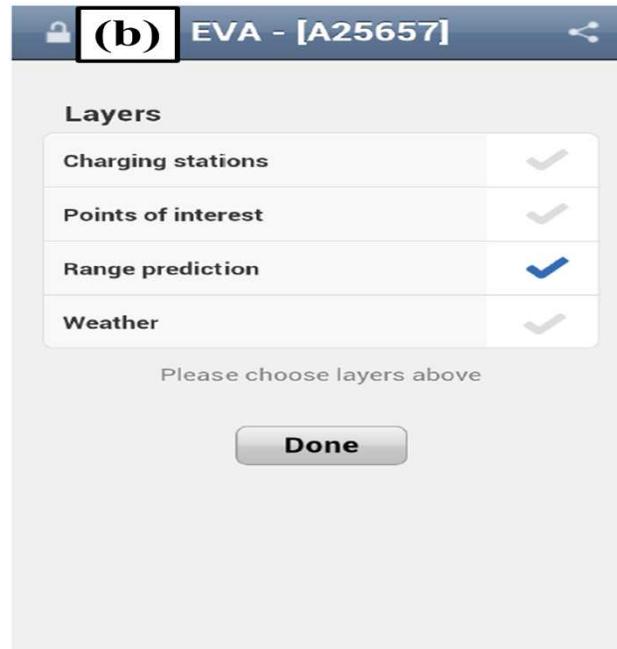
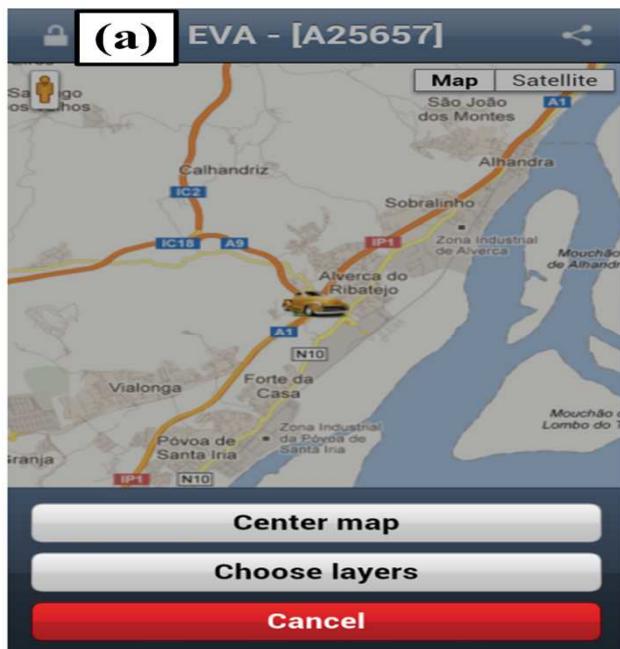


In collaboration with



Supported by





(a) EV position; **(b)** Available functions; **(c)** Range representation.

Organized by



Hosted by

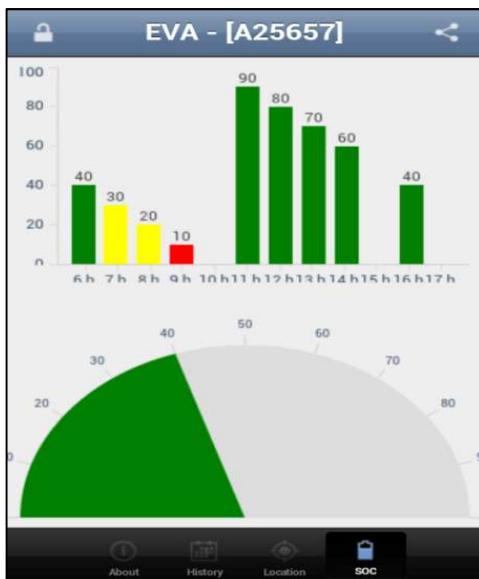


In collaboration with



Supported by





Screens of the EVA mobile application of the route paths near the limit of the EV range autonomy.

Screens of the EVA mobile application related with details about Charging Stations (CS) and Points of Interest (POI).

Organized by



Hosted by

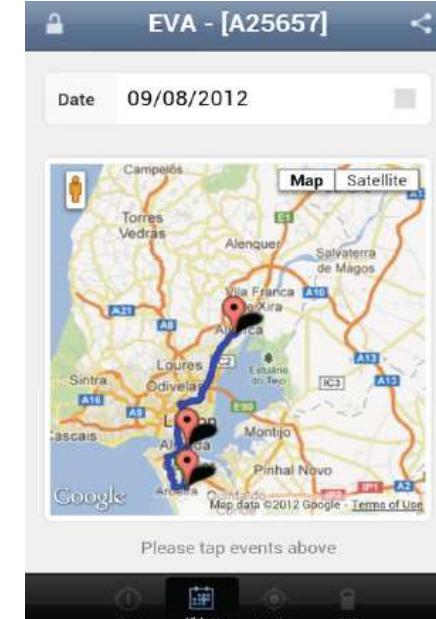


In collaboration with



Supported by





Screens of the EVA mobile application:
 (a) Guidance to Charging Stations (CS) and Points of Interest (POI);
 (b) Alert of insufficient charge to reach a desired destination.

Screens of the EVA mobile application getting past information from historical events data.

Organized by



Hosted by



In collaboration with



Supported by



- The current work has as main goal to minimize the driver range anxiety problem by:
 - (1) an accurate EV range prediction based on past driver behavior, batteries SOC level and external parameters, like road characteristics, traffic conditions and weather;
 - (2) range representation on a map taking into account current driver position with an uncertainty associated with driver behavior.
- Other important work output is the historical driver profile data that can be used to establish driver communities profiles (drivers with similar behavior), and from this information start driver education towards energy savings.

Organized by



Hosted by



In collaboration with



Supported by



evs|27

The 27th INTERNATIONAL
ELECTRIC VEHICLE
SYMPOSIUM & EXHIBITION.

Barcelona, Spain
17th-20th November 2013

Thank you for your attention.



Universidade do Minho



Organized by



Hosted by

AVERE

WEA



EVAAp

EDTA



European
Commission

In collaboration with

Supported by