

# <sup>1</sup> ChaProEV: Generating Charging Profiles for Electric Vehicles

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## Software

- [Review](#) 
- [Repository](#) 
- [Archive](#) 

## <sup>7</sup> Summary

<sup>8</sup> ChaProEV is

## <sup>9</sup> Statement of need

<sup>10</sup> Battery-electric vehicles (BEVs) as the fleets of EVs are poised to grow sharply in the future  
<sup>11</sup> and have a strong impact on the electric grid ([Smit et al., 2022](#); [Wilde et al., 2022](#)), and on  
<sup>12</sup> energy systems in general. ->

<sup>13</sup> It is therefore important that models that seek the optimisation of energy systems properly  
<sup>14</sup> ([Stralen et al., 2021](#)) ([TIMES-Europe, n.d.](#)) ([Brown et al., 2018](#))

<sup>15</sup> ([Özdemir et al., 2020](#)) ([Tejada-Arango et al., 2023](#)) ([LNEG et al., 2020](#)) ([Helistö et al., 2024](#))

- Profiles are good and useful, but optimisation modes might also need some underlying parameters to do optimisation computations as well
- Provide optimisation models with the boundary conditions they need
- ChaProEV provides the necessary parameters (as exemplified in COMPETES, Mopo/Ines, etc.) in a clear and accessible way, with the also allowing a clear way to modify them without touching code ([Sijm et al., 2022](#))

<sup>16</sup> tailored to supply optimisation models (list, but also actual implementations) through the model  
<sup>17</sup> below by explicitly supplying the necessary parameters [EV parameters for optimisation models](#)  
<sup>18</sup> and providing an option to change some settings parameters [creating new scenarios](#)

## <sup>25</sup> Conceptual innovations: Supporting optimisation models

### <sup>26</sup> Basic elements

<sup>27</sup> A commonly used aggregated EV formulation is ([Morales-España et al., 2022](#)):

$$e_t = e_{t-1} + \eta^{G2V} p_t^{G2V} \Delta - \frac{p_t^{V2G}}{\eta^{V2G}} \Delta - E_t^{\text{drive}} \Delta N \alpha \quad \forall t \quad (1)$$

$$\underline{E}N_t^{\text{plugged}} N \alpha \leq e_t \leq \bar{E}N_t^{\text{plugged}} N \alpha \quad \forall t \quad (2)$$

$$0 \leq p_t^{G2V} \leq \bar{P}_t^{G2V} N_t^{\text{plugged}} N \alpha \quad \forall t \quad (3)$$

$$0 \leq p_t^{V2G} \leq \bar{P}_t^{V2G} N_t^{\text{plugged}} N \alpha \quad \forall t \quad (4)$$

28 where  $t$  is the time index and parameter  $\Delta$  (h) is the duration of the time step. Variable  $e_t$   
 29 ( $\text{kWh}$ ) tracks the total state of charge of the plugged EVs to the grid. Variables  $p_t^{\text{G2V}}/p_t^{\text{V2G}}$   
 30 ( $\text{kW}$ ) are the power consumed/provided by the EVs from/to the grid. Parameters  $\eta^{\text{G2V}}/\eta^{\text{V2G}}$   
 31 (p.u.) are the charging/discharging efficiencies;  $E/\bar{E}$  ( $\text{kWh}$ ) are the minimum/maximum  
 32 storage capacity per vehicle;  $N$  is the total number of EVs; and  $\alpha$  (p.u.) is the share of  
 33 controllable EVs providing demand response to the system.

34 **Equation 1-Equation 4** model the demand response provided by controllable EVs through  $p_t^{\text{G2V}}$   
 35 and  $p_t^{\text{V2G}}$ . The total EV demand  $d_t^{\text{Tot}}$  ( $\text{kW}$ ), including the non-controllable load, is defined as

$$d_t^{\text{Tot}} = D_t^0 N(1 - \alpha) + p_t^{\text{G2V}} - p_t^{\text{V2G}} \quad \forall t \quad (5)$$

36 where  $D_t^0$  is the reference (non-demand response) profile given by ChaProEV (see Section ??),  
 37 and  $\alpha$  is the proportion of vehicles that are optimally providing demand response.

### 38 Further modelling

39 The formulation **Equation 1-Equation 4** has several shortcomings because there is no clear  
 40 distinction between plugged and unplugged EVs. For example, suppose that plugged EVs  
 41 were fully charged and the unplugged EVs were near to being empty, equation **Equation 1**  
 42 allows that unplugged EVs could be charging while they should be unavailable to the system.  
 43 ([Momber et al., 2014](#)) shows this and more detailed cases where the traditional EV aggregated  
 44 formulation fails.

45 To overcome the above shortcomings, ([Momber et al., 2014](#)) proposed a more rigorous  
 46 formulation, in which inventories for plugged/unplugged EVs are clearly distinguished from  
 47 each other. This formulation ensures that only EVs plugged to the grid are charged/discharged  
 48 from the electric system. It also guarantees that unplugged EVs cannot further charge while  
 49 driving.

50 The state of charge of EVs in **Equation 1** is now replaced by the separated plugged **Equation 6**  
 51 and unplugged **Equation 7** state of charges. Additionally, **Equation 2** is replaced by **Equation 8**  
 52 and **Equation 9**.

$$\begin{aligned} e_t^{\text{plugged}} &= e_{t-1}^{\text{plugged}} + \eta^{\text{G2V}} p_t^{\text{G2V}} \Delta - \frac{p_t^{\text{V2G}}}{\eta^{\text{V2G}}} \Delta \\ &\quad + N_{t-1}^{\text{plugging}} N \alpha e_{t-1}^{\text{unplugged}} - N_{t-1}^{\text{unplugging}} N \alpha e_{t-1}^{\text{plugged}} \quad \forall t \end{aligned} \quad (6)$$

$$\begin{aligned} e_t^{\text{unplugged}} &= e_{t-1}^{\text{unplugged}} - E_{t-1}^{\text{drive}} \Delta N \alpha \\ &\quad - N_{t-1}^{\text{plugging}} N \alpha e_{t-1}^{\text{unplugged}} + N_{t-1}^{\text{unplugging}} N \alpha e_{t-1}^{\text{plugged}} \quad \forall t \end{aligned} \quad (7)$$

$$\underline{E}N_t^{\text{plugged}} N \alpha \leq e_t^{\text{plugged}} \leq \bar{E}N_t^{\text{plugged}} N \alpha \quad \forall t \quad (8)$$

$$\underline{E}N_t^{\text{unplugged}} N \alpha \leq e_t^{\text{unplugged}} \leq \bar{E}N_t^{\text{unplugged}} N \alpha \quad \forall t \quad (9)$$

### 53 Software innovations

54 No code parameters and profiles modification (explain what kind of modifications are possible)  
 55 Scenarios

- 56 1. *Demand for next leg (kWh) (from network)*: The charge that the vehicles leaving in the  
 57 next time step need to pull from the network for the leg they are about to undertake,  
 58 corrected by the charger efficiency.
- 59 2. *Demand for next leg (kWh) (to vehicles)*: The part of the above that vehicles get.  
 60 ( $E_t^{\text{drive}}$  in **Equation (1)**)
- 61 3. *Connected vehicles*: The share of vehicles that are connected to a charger ( $N_t^{\text{plugged}}$  in  
 62 **Equation (2)**)

- 63     4. *Charging Power from Network (kW)*: Maximum power that connected vehicles can  
 64     potentially draw from the network. ( $\bar{P}_t^{\text{G2V}}$  in Equation (1))
- 65     5. *Charging Power to Vehicles (kW)*: Maximum power that can potentially go to vehicles  
 66     go to vehicles (i.e. the same as above with a charger efficiency correction).
- 67     6. *Vehicle Discharge Power (kW)*: The amount of power connected vehicles can discharge  
 68     to the network.
- 69     7. *Discharge Power to Network (kW)*: How much of that discharged power can go to the  
 70     network. ( $\bar{P}_t^{\text{V2G}}$  in Equation (1))
- 71     8. *Effective charging efficiency*: Ratio between charging power going to the vehicle and  
 72     power coming from the network. This can vary in time, as the location of the charging  
 73     vehicles (and thus the efficiency of the involved chargers) changes as they move around.  
 74     ( $\eta^{\text{G2V}}$  in Equation (1))
- 75     9. *Effective discharging efficiency*: Same as above, but for discharging (it is the power going  
 76     out of the vehicles divided by the power going into the network). ( $\eta^{\text{V2G}}$  in Equation (1))
- 77     ChaProEV also provides charging sessions (in case they are not obtained from energy system  
 78     models). This provides another description of the system that could be used for models and  
 79     analyses that focus on charging sessions rather than profiles (which are aggregates of such  
 80     sessions). Sessions include (in addition the elements that a profile gets):
- 81       1. *Location*: Where the session takes place
- 82       2. *Start time*: At which moment the vehicles in the session can start charging (i.e. when  
 83       they arrive).
- 84       3. *End time*: At which moment the vehicles in the session must stop charging (i.e. when  
 85       they leave).
- 86       4. *Demand for incoming leg (kWh) (to vehicle)*: How much the incoming vehicles have  
 87       spent on the leg arriving to the session.
- 88       5. *Maximal Possible Charge to Vehicles (kWh)*: How much the vehicles could charge if they  
 89       used the available power during their whole session.
- 90       6. *Charge to Vehicles (kWh)*: How much of the vehicles actually charge during the session.  
 91       This is based on the charging strategy of the vehicles and can be used to derive a  
 92       charging profile.
- 93       7. *Charge from Network (kWh)*: The same as above, but corrected for charging efficiency  
 94       (i.e. how much the network provides)

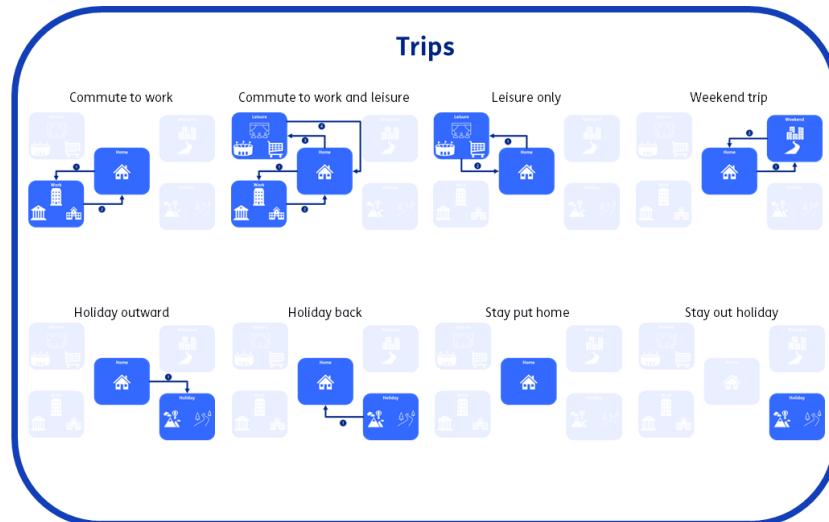


Figure 1: trips

95      Figure 1

96      **Acknowledgements**

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 98      and Environment Executive Agency under the European Union's HORIZON Research and  
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134        *paper introduces TIMES-Europe, a novel integrated multi-sectoral energy system optimization*  
135        *model for Europe based on the TIMES generator. We describe its main specifications*  
136        *and assumptions as well as its underlying methodology, and summarize the type of policy*  
137        *questions that it can help answering. TIMES-Europe can be used to analyze policy*  
138        *instruments designed for implementing the EU Green Deal and Fit-for-55 program, and*  
139        *to create strategic energy decarbonization and climate change mitigation insights for*  
140        *Europe against the backdrop of its interactions and relations with neighboring countries.*  
141        *Thanks to its technology richness across all main sectors—including power production,*  
142        *transport, industry and the commercial, agricultural and residential sectors—it allows for*  
143        *performing in-depth studies on the role of a large range of low-carbon options in the energy*  
144        *transition of all European countries, both jointly and individually. Three characteristics*  
145        *render TIMES-Europe particularly valuable: (1) it covers the entire European energy system*  
146        *and its main greenhouse gas emissions, (2) it includes all EU member states individually*  
147        *as well as a large set of countries in the EU's vicinity, and (3) it can be used to generate*  
148        *high-level strategic insights as well as detailed recommendations for both national and*  
149        *EU policies. TIMES-Europe is especially suitable for analyzing system integration, which*  
150        *makes it an ideal tool for assessing the implementation of the energy transition and the*  
151        *establishment of a low-carbon economy. We present several research and scenario examples,*  
152        *and characterize opportunities for future energy and climate policy analysis. Publisher =*  
153        *Springer Nature, author = Luxembourg, Stefan L. and Salim, Steven M. and Smekens,*  
154        *Koen and Dalla Longa, Francesco and van der Zwann, Bob, keywords = Energy transition*  
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