

# Load Demand, Batteries, and Electric Vehicles Modelling to the Energy Management of Microgrids

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# Agenda

## ■ Energy Management of Microgrids

- Microgrids
- Energy Management

## ■ Load Demand

- Critical, Curtailable Load Demand, Reschedulable Load Demand
- Diffuse and Pre-Diffuse Load Demand

## ■ Batteries

- Lithion-ion Batteries

## ■ Electric Vehicles

## ■ Didactical Microgrid and Computational Results

- Didactical Microgrid and Input Data
- Computational Results

## ■ Conclusions



# Energy Management

## ■ It has similarities, at least in philosophy, with the classic problem of unit commitment for large power system, but also:

- might considers the use of other sources of energy besides electrical energy
- could consider the load demand control
- has faster dynamics for the DERs
- has differences in the planning horizon and the discretization step time
- has greater presence of intermittent generation

## ■ State of Art

- In most of the time the cost are represented by a linear function
- The maximum and minimum amount power is set for each step time for the purchase / sale of energy to the main grid
- In most cases, the horizon is 24 hours and is discretized at intervals of 1h, 30, 15 and 5 minutes
- Is assumed that the problem have a deterministic approach
- The size of this problem depends primarily on the following factors
  - Number and type of DERs
  - Number of lines
  - Size of the planning horizon and
  - Number of discretizations used over the horizon

# Load Demand Modelling

## Concept of Load as a Resource

# Load Demand Modelling

## ■ Critical Load Demand

- most important load demand;
- impossibility of supplying this type of demand is modelled as a deficit (expensive fictitious generator)

## ■ Curtailable Load Demand (CLD, also called shedable)

- load demand for every step time
- cost of discontinuous for the load
- maximum time of discontinuity of each load
- maximum frequencies of discontinuity
- minimum down time after the shed
- minimum up time after turned on

# Load Demand Modelling

## Equations for the CLD

$$CC_{ct} \cdot pdc_{ct} \quad (1)$$

$$-pdc_{ct} - uc_{ct} \cdot DC_{ct} \leq -DC_{ct} \quad (2)$$

$$pde_t + uc_{ct} \cdot (10000) \leq 10000 \quad (3)$$

$$uc_{c,t-1} - uc_{ct} + zc_{ct} \leq 0 \quad (4)$$

$$-uc_{c,t-1} + uc_{ct} + yc_{ct} \leq 0, \quad (5)$$

$$\sum_{t=1}^{ND} zc_{ct} \leq NDC_c^{st} \quad (6)$$

$$-\sum_{t=1}^{ND} uc_{ct} \leq -ND + NC_c^{\max} \quad (7)$$

$$yc_{ct} + \sum_{i=1}^{OFF_c} zc_{c,t-1+i} \leq 1 \quad (8)$$

$$zc_{ct} + \sum_{i=1}^{ON_c} yc_{c,t-1+i} \leq 1 \quad (9)$$

$$0 \leq pdc_{ct} \leq DC_{ct} \quad (10)$$

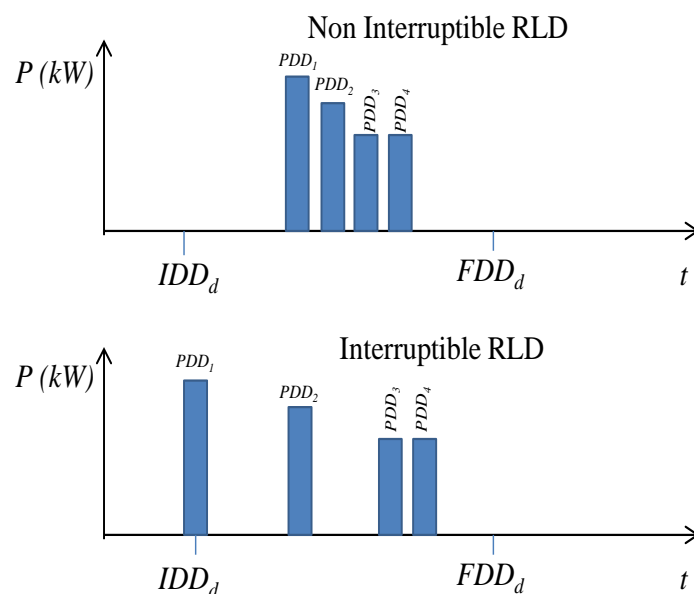


# Load Demand Modelling

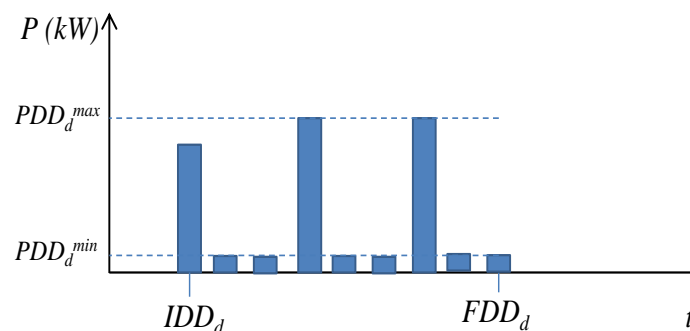
## ■ Reschedulable Load Demand (RLD, also called Shiftable)

- load demand for every step time
- maximum acceptable shift time
- cost of load shifting (not all models consider)
- planning time required for warning the load reschedule
- total energy for the continuous variables approach

a) Model with binary variables



b) Model with continuous variables





# Load Demand Modelling

## RLDB (Binary)

$$\sum_{i=1}^{UDD_{dd}} PDD_{ddi} \cdot ud_{dd,t-i+1} - pdd_{ddt} = 0 \quad \text{for } IDD_{dd} \leq t \leq FDD_{dd} \quad (12)$$

$$pdd_{ddt} = 0 \quad \text{for } FDD_{dd} < t < IDD_{dd} \quad (13)$$

$$\sum_{t=IDD_{dd}}^{FDD_{dd}-UDD_{dd}} ud_{ddt} = 1 \quad (14)$$

$$ud_{ddt} \in \{0,1\}, \quad (15)$$

## RLDC (Continuous)

$$\sum_{t=IDD_{dc}}^{FDD_{dc}} pdd_{dct} \cdot H / ND = EDD_{dc}^{total} \quad (16)$$

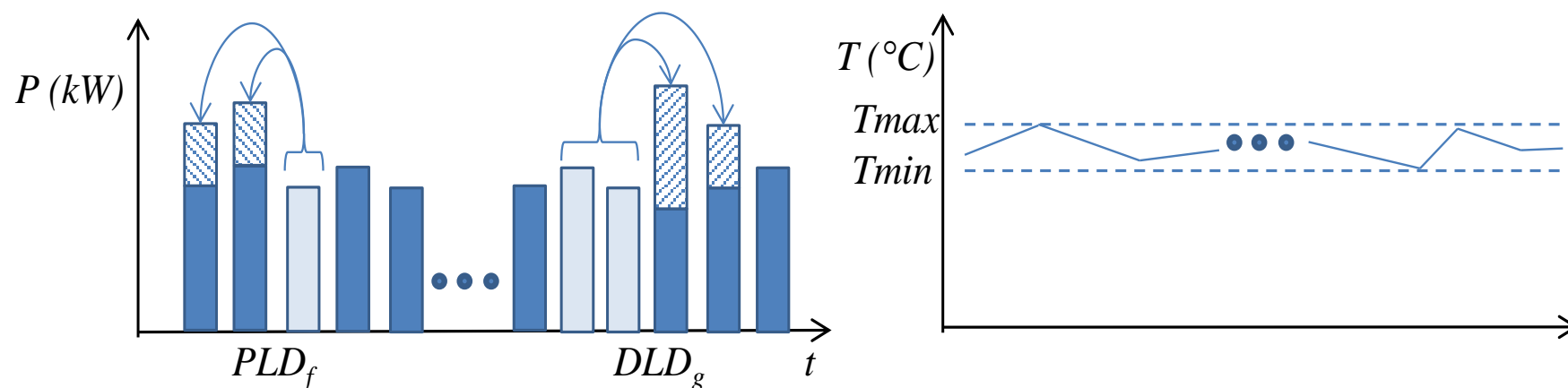
$$pdd_{dct} = 0 \quad \text{for } FDD_{dc} < t < IDD_{dc} \quad (17)$$

$$PDD_{dc}^{\min} \leq pdd_{dct} \leq PDD_{dc}^{\max} \quad \text{for } FDD_{dc} > t > IDD_{dc} \quad (18)$$

# Load Demand Modelling

## ■ Diffuse and Pre-Diffuse Load Demand

- the electrical load demand is known for each step time
- the load could be turned off for a specific number of step times if a previous/posterior known increment (%) of the load is performed without trespassing the temperature limits



# Load Demand Modelling

## Equations for the Diffuse Load Demand

$$\sum_{i=1}^{SDL1_g} VDL1_{gi} \cdot DLD_{gi} \cdot udg_{g,t-i+1} + \sum_{j=1+SDL1_g}^{SDL1_g+SDL2_g} VDL2_{gj} \cdot \sum_{i=1}^{SDL1_g} DLD_{gi} \cdot udg_{g,t-j+1} - dld_{gt} = 0, \quad (19)$$

$$\sum_{t=1}^{ND} udg_{gt} \leq DLD_g^{\max}, \quad (20)$$

$$udg_{gt} \cdot 0.01 \leq DLD_{g,t+SDL1_g+SDL2_g}, \quad (21)$$

$$\sum_{i=1}^{IDL D_g^{\max}} udg_{g,t+i-1} \leq 1, \quad (22)$$

$$udg_{gt} \in \{0,1\} \quad (23)$$

# Battery Modelling

## Lithium-ion Batteries

# Battery Modelling

## ■ **ESS are important to Microgrids especially due to:**

- The intermittent characteristics of wind and solar generation
- The possibility to supply the rapid changes in demand
- The possibility of islanded operation of microgrids

## ■ **Regarding the modelling of the costs and constraints for the problem of EM of a microgrid some basic information are needed, such as**

- cost of use
- capacity
- maximum power charge and discharge
- efficiency
- self-discharge

# Battery Modelling

## Lithion-Ion Batteries

- Cost of use (F. Fortenbacher, J. L. Mathieu, G. Andersson, 2014)

$$J_{\text{bat}} = \underbrace{b(\text{SOC} - a)^2}_{\text{deviation of the SOC}} + \underbrace{cu_{\text{gen}}^{\text{bat}}}_{0 \text{ (zero)}} + \underbrace{du_{\text{load}}^{\text{bat}} + eu_{\text{load}}^{\text{bat}^2}}_{\text{cost of charge (approximation by piecewise linearization)}}$$

- deviation of the SOC

$$CDB_e \cdot deb_{et}, \quad eb_{et} - deb_{et} \leq EB_e^{st}, \quad -eb_{et} - deb_{et} \leq EB_e^{st}$$

- cost of charge (approximation by piecewise linearization)

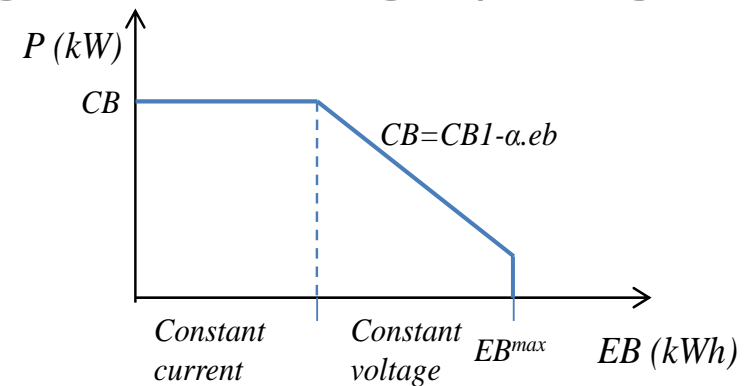
## Battery discharge characteristics

- the performance decreases with cold temperature and increases with heat; heat shortens battery life
- cannot over-discharging
- deploy a larger battery if repetitive deep discharge cycles cause stress
- moderate DC discharge is better for a battery than pulse and aggregated loads

# Battery Modelling

## Battery charge characteristics

- Li-ion cannot accept overcharge
- the charge is between 0.5 and 1C in stage of constant current
- Li-ion does not need to be fully charged and avoiding it prolongs battery life
- Charge characteristic



## Other battery characteristics

- efficiency is very high for the charge and discharge
- self-discharge is very low



# Battery Modelling

## Li-ion Battery constraints

$$\begin{aligned}
 eb_{e,t+1} - eb_{et} + \left( \frac{pbd_{et}}{\eta_e^{bd}} - \eta_e^{bc} \cdot pbc_{et} \right) \cdot \frac{H}{ND} &= -PB_e^L \cdot \frac{H}{ND}, \\
 eb_{e2} + \left( \frac{pbd_{e1}}{\eta_e^{bd}} - \eta_e^{bc} \cdot pbc_{e1} \right) \cdot \frac{H}{ND} &= -PB_e^L \cdot \frac{H}{ND} + EB_e^I, \\
 eb_{eND} - \left( \frac{pbd_{eND}}{N_e^{bd}} - N_e^{bc} \cdot pbc_{eND} \right) \cdot \frac{H}{ND} &= PB_e^L \cdot \frac{H}{ND} + EB_e^F, \\
 -eb_{et} + \sum_{i=1}^{RB} \frac{rb_{e,t+i}}{\eta_e^{bd}} \cdot \frac{H}{ND} &\leq -EB_e^{\min}, \quad eb_{et} \leq EB_e^{\max}, \\
 0 \leq pbc_{et} \leq CB_e, \quad 0 \leq pbc_{et} \leq CB1_e - eb_{et} \cdot \alpha_e \\
 0 \leq pbd_{et} \leq DB_e, \quad 0 \leq rb_{et} \leq DB_e, \\
 pbc_{et} - ub_{et} \cdot CB_e &\leq 0 \\
 ub_{et} \cdot DB_e + pbd_{et} &\leq DB_e \\
 ub_{et} &\in \{0,1\}
 \end{aligned}$$

## Without controlling the charge

$$\begin{aligned}
 -pbc_{et} + ub_{et}^{aux1} \cdot CB_e + ub_{et} \cdot 10000 &\leq 10000 \\
 -pbc_{et} - \alpha_e \cdot eb_{et} + ub_{et} \cdot 10000 + ub_{et}^{aux2} \cdot CB1_e &\leq 10000 \\
 -ub_{et}^{aux1} \cdot 0.7 \cdot EB_e^{\max} + eb_{et} &\leq 0.7 \cdot EB_e^{\max}, \\
 -ub_{et}^{aux2} \cdot 0.7 \cdot EB_e^{\max} - eb_{et} &\leq -0.7 \cdot EB_e^{\max}, \\
 ub_{et}^{aux1} + ub_{et}^{aux2} &= 1
 \end{aligned}$$

# Plug in Electrical Vehicles (PHEV) and Vehicles to Grid (V2G)

# PHEV and V2G

## ■ Classified by the technology used

- the hybrid or the fuel cell technology which could be used as a conventional controllable microgeneration
- the photovoltaic vehicles which could be connect to the grid and used as a renewable generation
- and the plug-in hybrid (PHEV) or the battery-powered vehicles which could be used as an ESS or a electric load demand

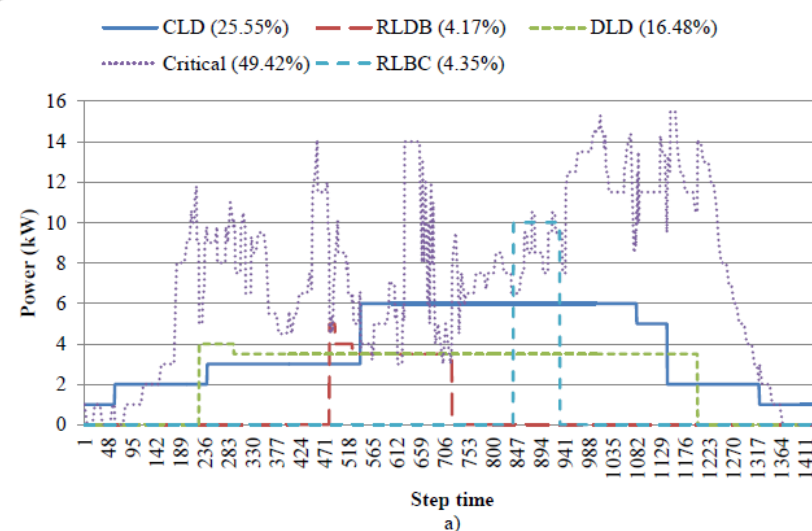
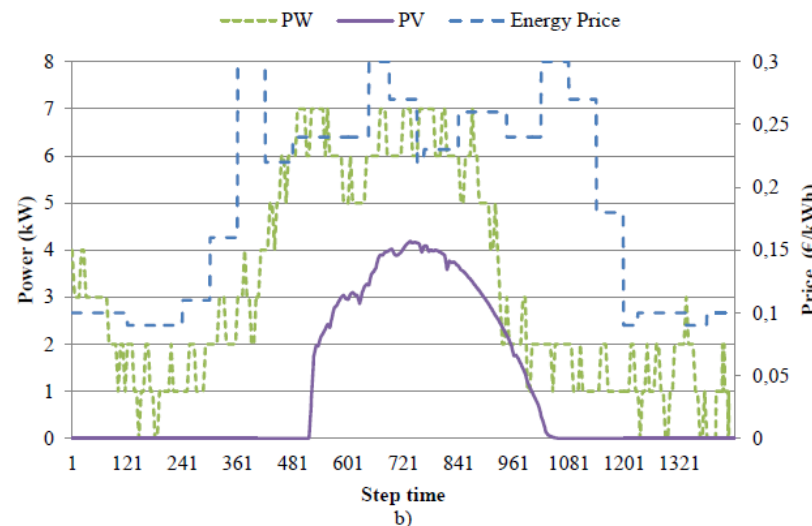
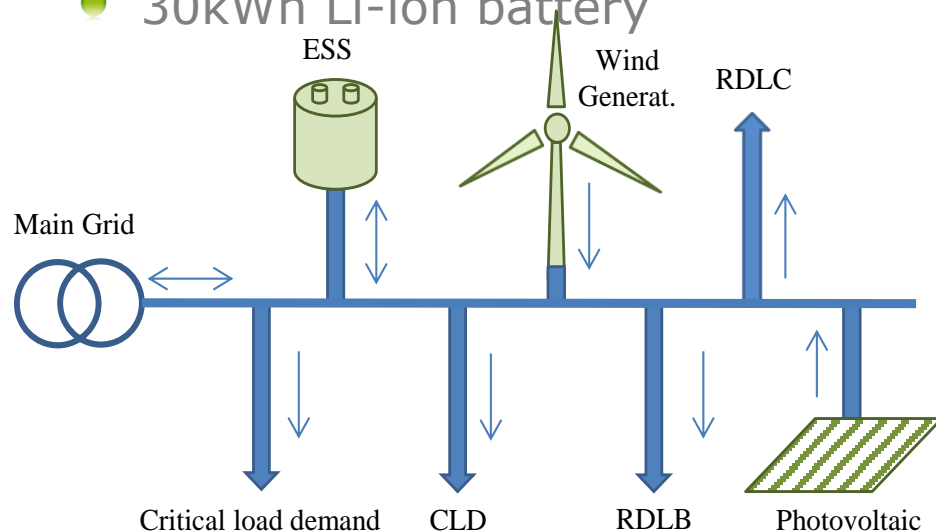
## ■ In this paper we proposed the modelling as an electrical load demand or as a battery

# Didactical Microgrid and Computational Results

# Didactical Microgrid

## Didactical Microgrid

- 4 kW photovoltaic panel
- 7 kW wind generator
- possibility of buy/sell energy from/to the grid (20 kW)
- critical load demand; CLD; RLD with Binary approach (RLDB); RLD with the Continuous approach (RLDC); DLD
- 30kWh Li-ion battery



# Computational Results

## Solver and Dimensionality

- Matlab 2011b + Gurobi 5.5
- 20,160 continuous variables
- 11,520 binary variables
- 27,547 constraints

## Optimal Costs and Computational Time

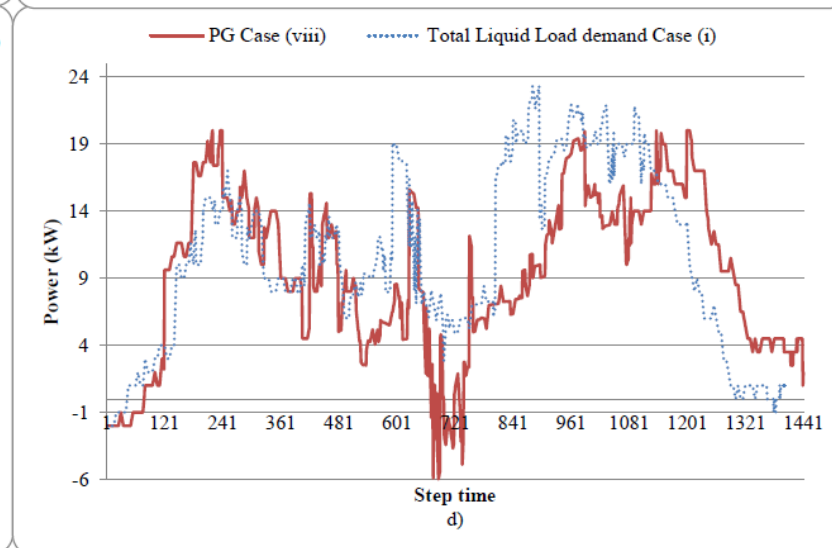
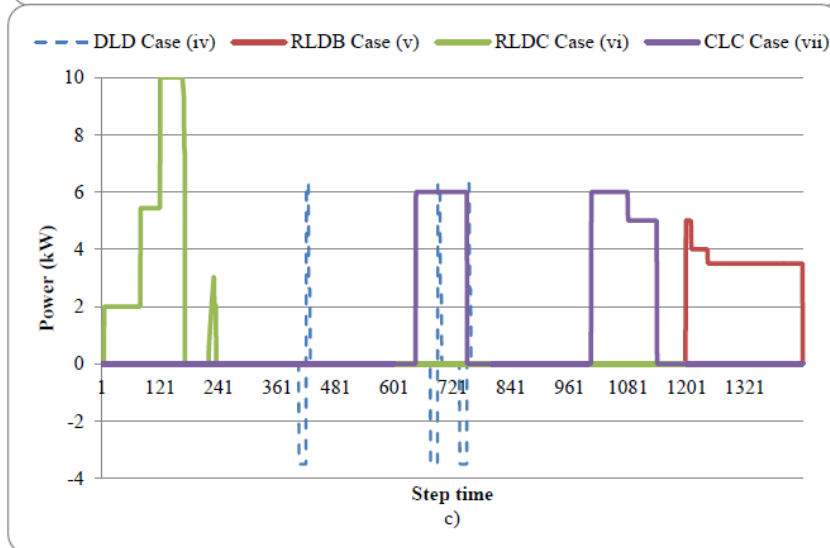
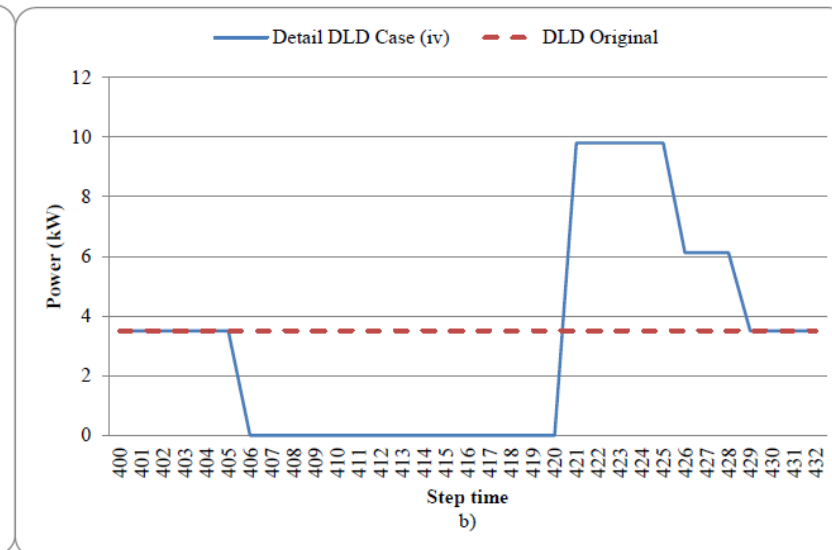
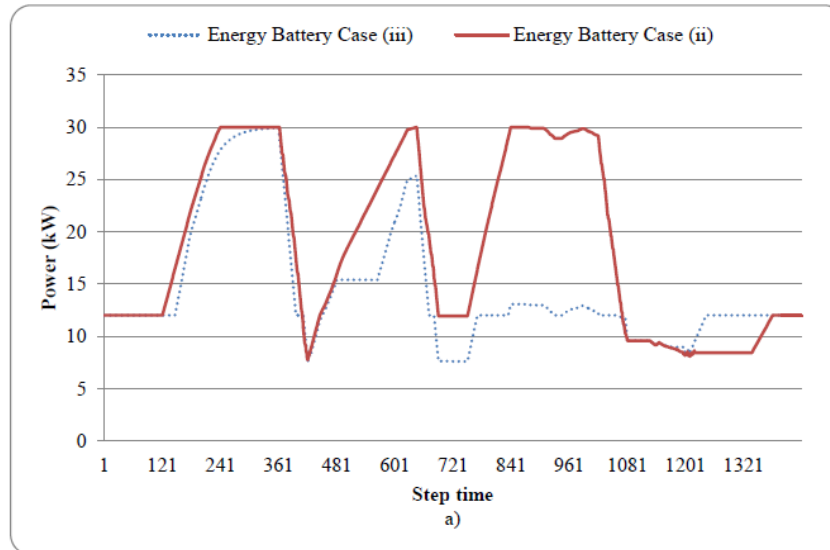
	Classic Battery	Li-ion Battery	DLD	RLDB	RLDC	CLC	Cost Function (€)	Comput. Time (s)	Comp Case (i)
Case (i)*	N	N	N	N	N	N	54,09	0,00	
Case (ii)	Y	N	N	N	N	N	48,68	59,06	-10,00%
Case (iii)	N	Y	N	N	N	N	50,17	19,80	-7,25%
Case (iv)	N	Y	Y	N	N	N	49,77	35,16	-7,99%
Case (v)	N	Y	Y	Y	N	N	47,49	60,08	-12,20%
Case (vi)	N	Y	Y	Y	Y	N	44,95	60,08	-16,89%
Case (vii)	N	Y	Y	Y	Y	Y	44,10	60,06	-18,47%
Case (viii)*	N	N	Y	Y	Y	Y	48,21	24,41	-10,87%

\* These cases do not consider the 10min reserve due to the absence of battery

P.s. The results with 60s have the error less than 0.03% from the optimal solution

# Computational Results

## Cases Results





# Main Conclusions / Future Works

- **The proposed models proved feasible to implement**
- **The models could be used to support the system operation, planning, policies and to quantify impacts**
- **The results may not have demonstrated all the potential for EM economy, being necessary tests in other systems**
- **Regarding the modelling of Li-ion batteries, this still needs more research on improving the modelling, especially due to the temperature, since they will be used in electric vehicles which are usually parked outdoors**
- **Future tests with 1/5/15 min for the step time interval and with 5, 10 and 15 % of error considered for the renewable generation**

# Thank You!

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