



The 27th **INTERNATIONAL  
ELECTRIC VEHICLE  
SYMPOSIUM & EXHIBITION.**

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17th-20th November 2013



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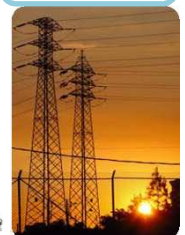
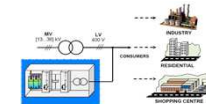
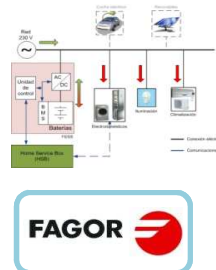
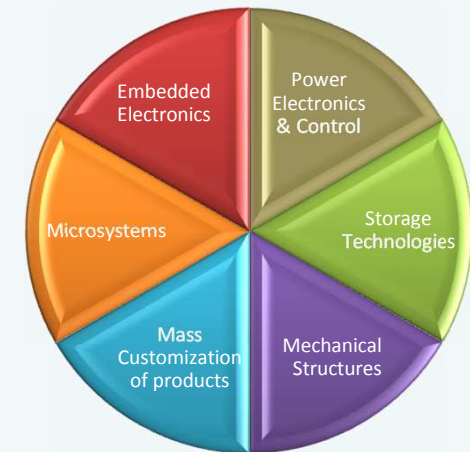
# MODELLING OF LI-ION BATTERIES DYNAMICS USING IMPEDANCE SPECTROSCOPY AND PULSE FITTING: EVs APPLICATION

## Technology Research Centre

- Multidisciplinary Applied Research & Product Development (250 people, 20.2M€ income)
- Specialists in power electronics, energy storage and control



## Specialized in Multi-Technology Integration



Component

Cell

Module

Battery Pack

Integration

End user

## 1. Introduction

## 2. Characterization of the cell model

## 3. Experimental validation

## 4. Conclusions

## Battery Management

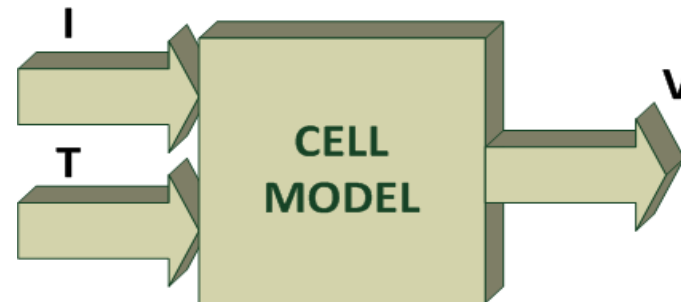
- In Li-ion batteries a BMS is required
- Battery state diagnosis is a key point (SOC, SOH)

## State diagnosis algorithms

- Advanced techniques for accurate estimation
- Necessity of a battery model

## EVs

- An accurate SOC determination is critical
- Specially challenging in HEVs
- A wide variety of dynamics must be modelled according to accelerations and decelerations



## Targets

- Low voltage error
- Valid in all SOC and temperatures

## Objectives

- Compare the main characterization techniques for obtaining a cell model.
- Propose a cell model suitable to be used in state estimation algorithms.
- Validate the performance of the model using experimental tests with real profiles.

## 1. Introduction

## 2. Characterization of the cell model

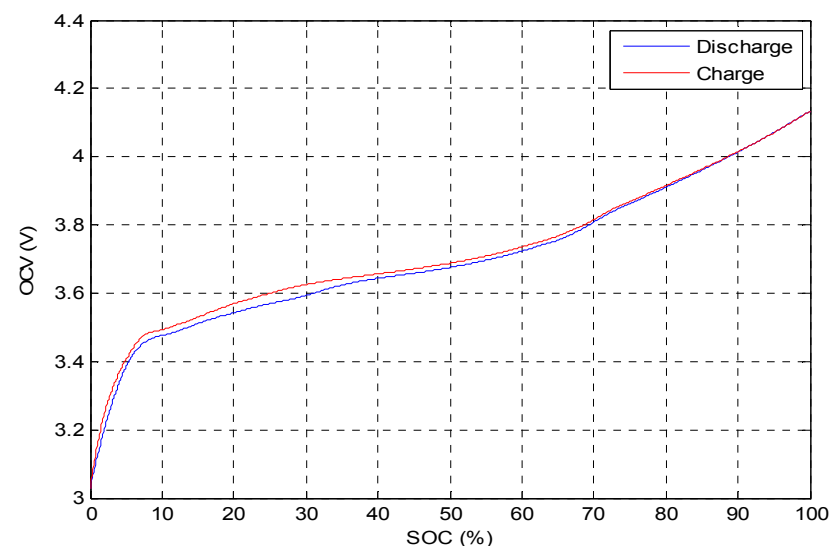
## 3. Experimental validation

## 4. Conclusions

## Characterization of the cell model

### Statics sub-model

- OCV-SOC relationship
- Use of look-up tables
- Requires:
  - Hysteresis modelling
  - Dependence with temperature

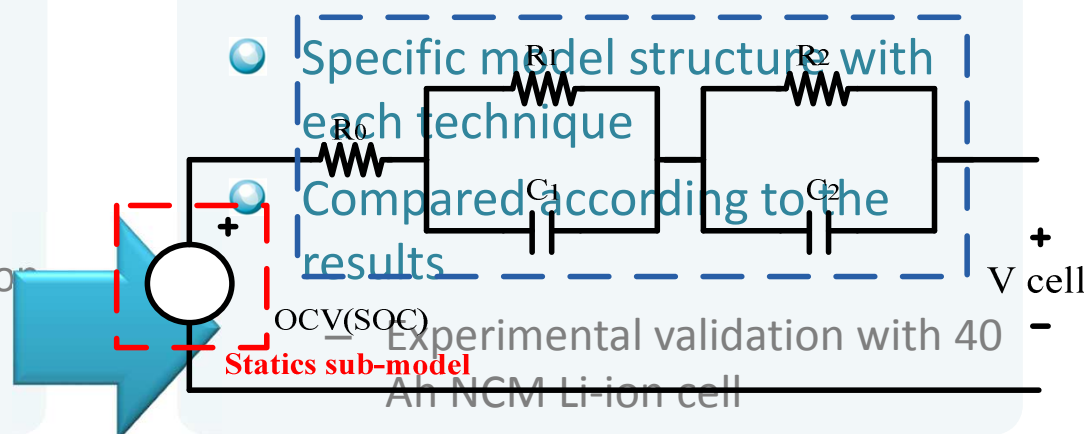


### Dynamics sub-model

- Which model must be used?
- How characterize it?
  - Time domain identification
  - Frequency domain identification

### Characterization techniques

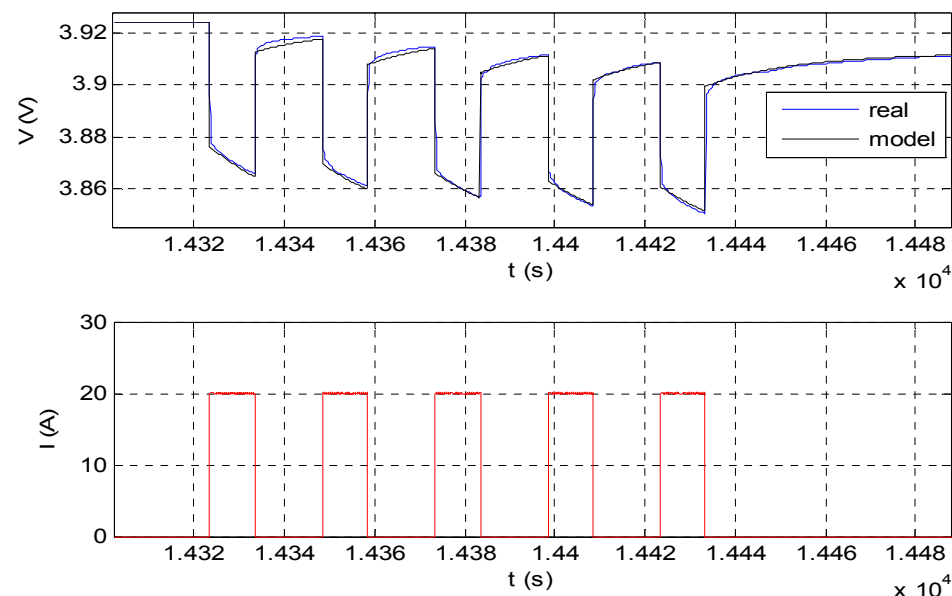
- Specific model structure with each technique
- Compared according to the results



## Characterization of the cell model

### Time domain characterization

- Second order Randles model
- Parameters fitted according to the time response of the cell
- Use of least squares technique
- 20 A, 10 s discharge pulses at 25°C
- Test required at different SOC

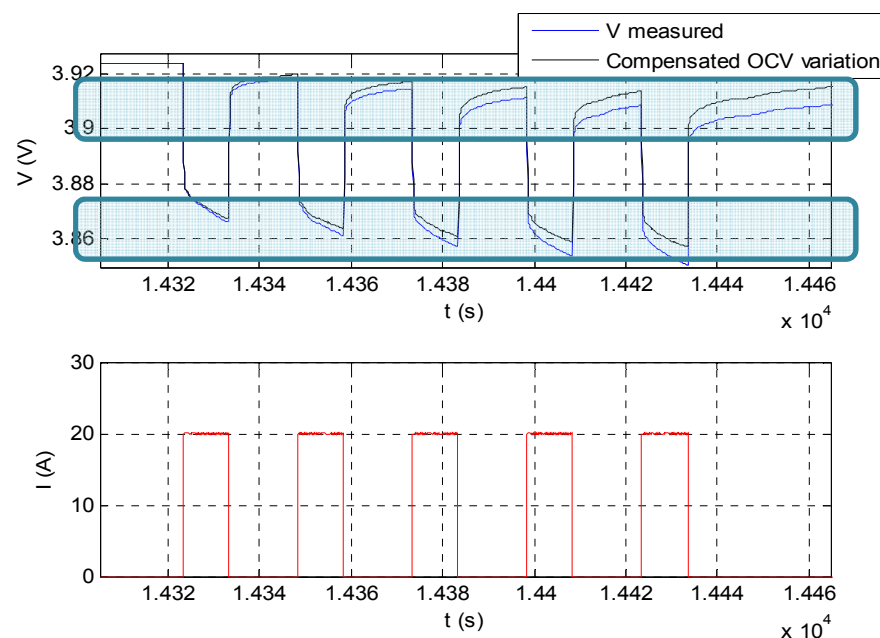


$$V_{cell}(k+1) = OCV(SOC(k+1)) - R_0 I(k+1) - [V_{RC1}(k) e^{-\frac{T_s}{R_1 C_1}} + R_1 I(k)(1 - e^{-\frac{T_s}{R_1 C_1}})] - [V_{RC2}(k) e^{-\frac{T_s}{R_2 C_2}} + R_2 I(k)(1 - e^{-\frac{T_s}{R_2 C_2}})]$$



## Relevant considerations

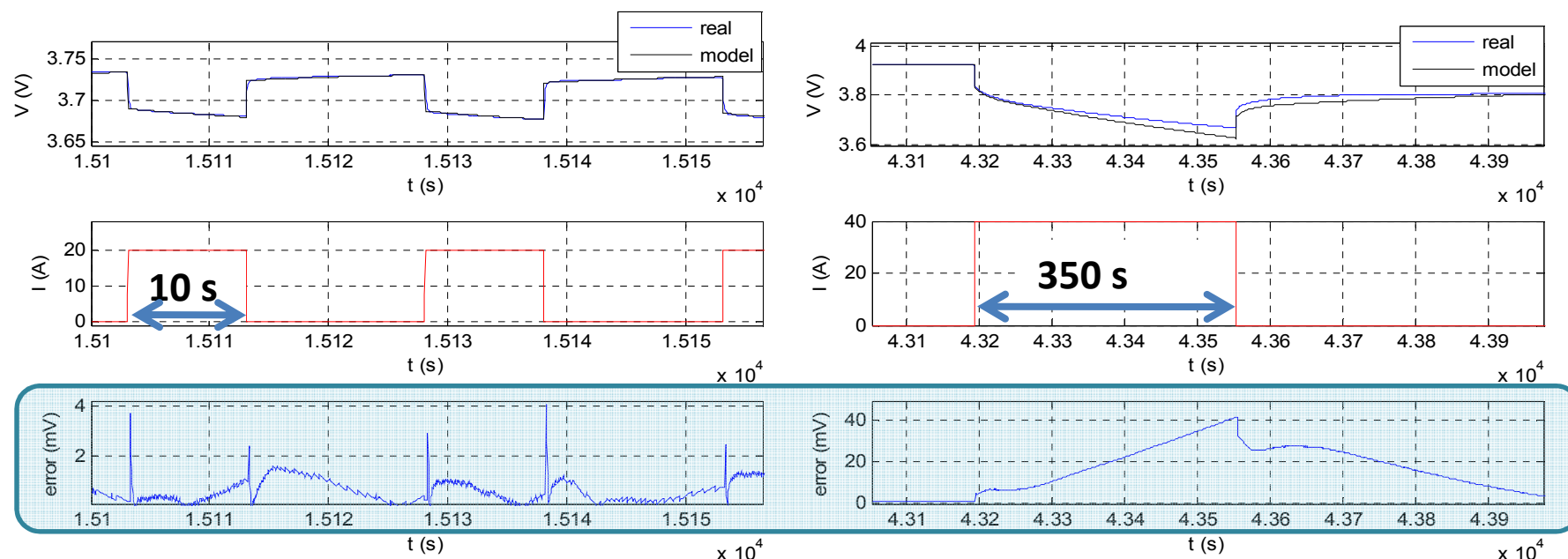
- The compensation of the OCV variation due to the small changes in the SOC during the tests is essential (0.8% SOC  $\rightarrow$  4.7 mV)



# Characterization of the cell model

## Time domain characterization drawbacks

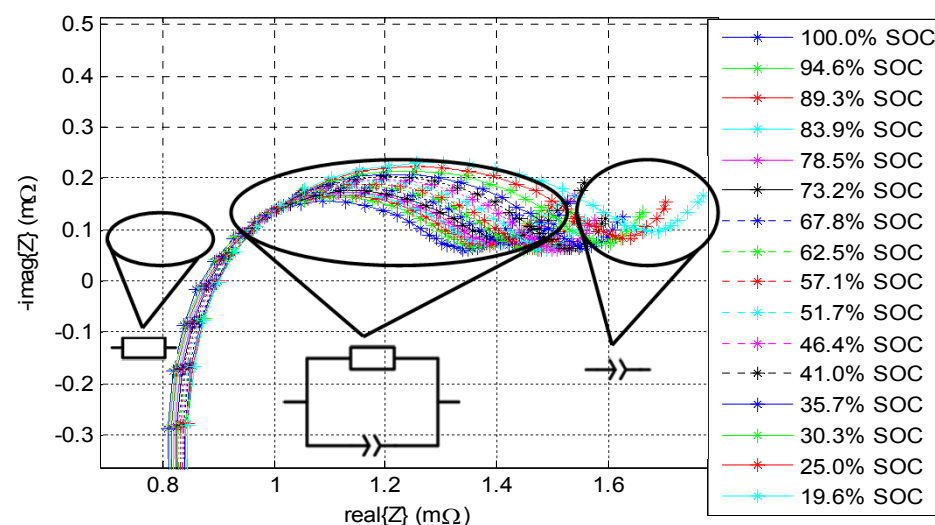
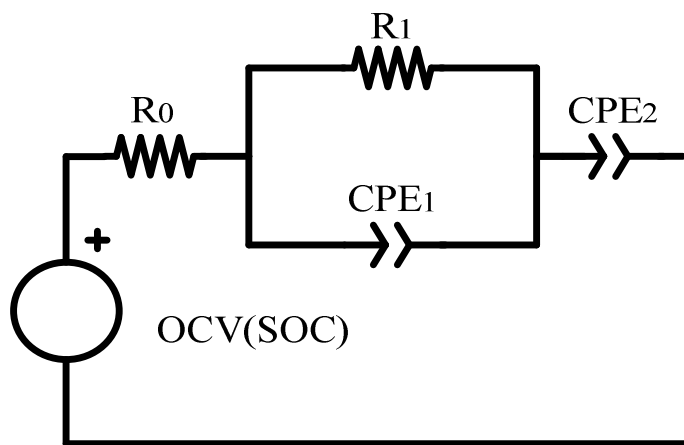
- Sensitive to initialization and changes in the length of the set of samples
- Dependence on the width of the used pulses in the characterization
- Variable parameters between different characterizations, making difficult the result comparison and the data interpolation



## Characterization of the cell model

### Frequency domain characterization

- Cell impedance measured at several frequencies
- Requires EIS in all SOC and temperature range
- Circuit elements adjusted to the measured impedance



$$Z_{CPE} = \frac{\sigma}{(j\omega)^\alpha}, \quad 0 < \alpha < 1$$

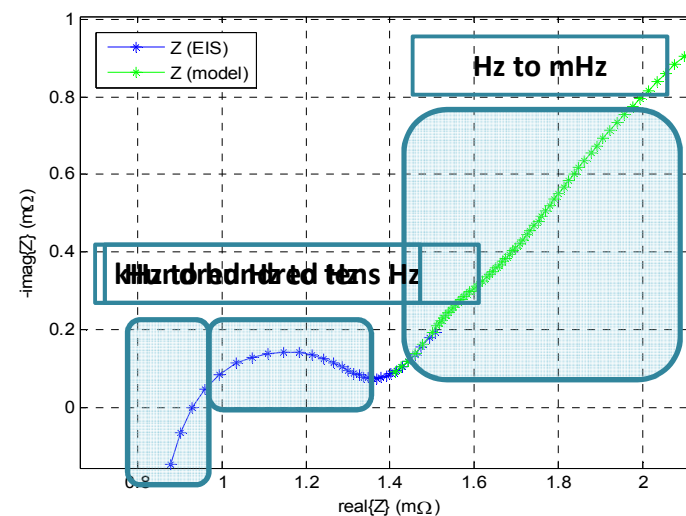
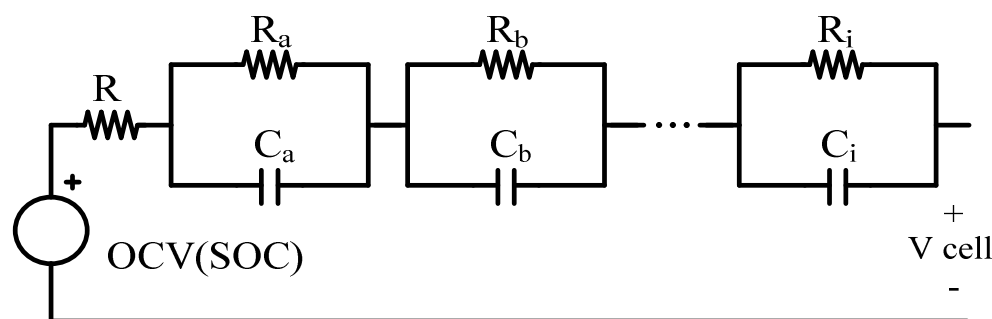
## Characterization of the cell model

### Frequency domain characterization

- The inductive behaviour at high frequencies is negligible
- The dynamics represented in the  $R_1//CPE_1$  can be also neglected

$$Z = R + \frac{\sigma}{(j\omega)^\alpha} \quad (R = R_0 + R_1)$$

- The CPE can be approximated using a Foster structure



## Characterization of the cell model

### Frequency domain characterization advantages

- Easy to obtain a high order model
- Accurate representing a wide range of dynamics
- Less variable parameters between different characterization tests
- Suitable for linear interpolation

### Frequency domain characterization drawbacks

- Time and equipment required
- Reconnections of the cell to the EIS equipment can produce a variation in the impedance

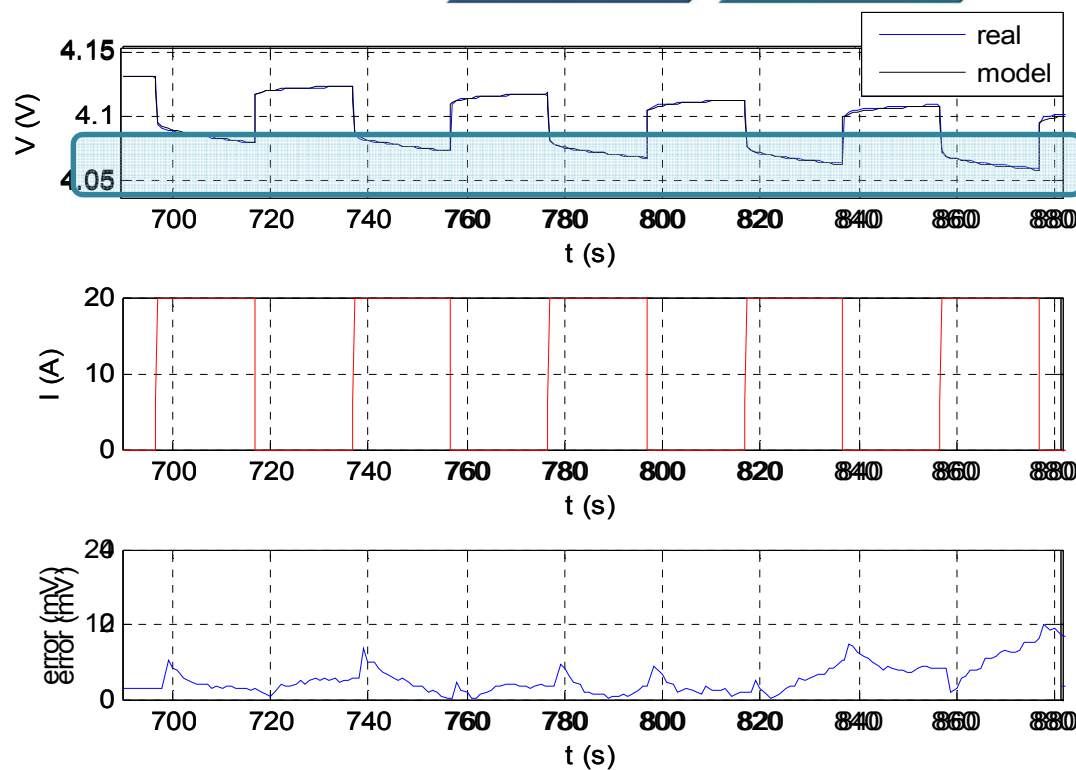
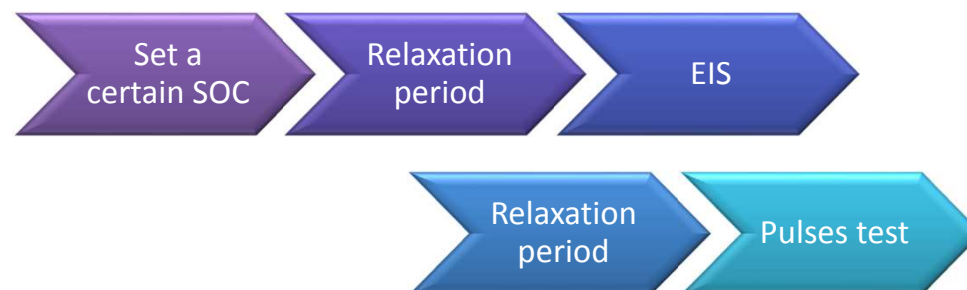
## Characterization of the cell model

### Proposed combined methodology

- Requires EIS and pulse tests
- Capable of modelling a wide range of frequencies
- Test repeated over all SOC

### Allows

- Validation in time domain
- Correction of the internal resistance value
- Simple to calculate the dependence of the internal resistance with current



**1. Introduction**

**2. Characterization of the cell model**

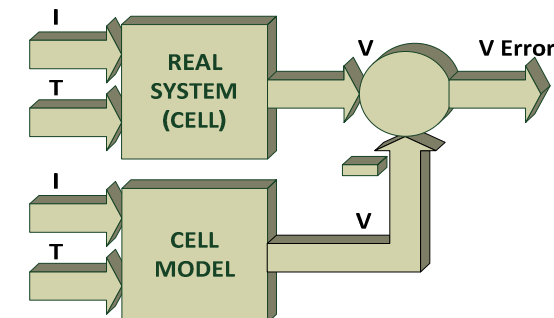
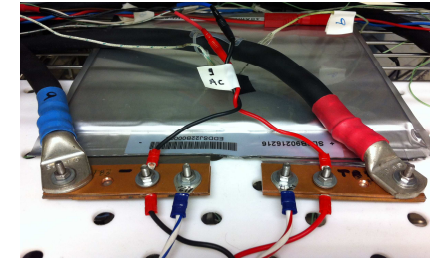
**3. Experimental validation**

**4. Conclusions**

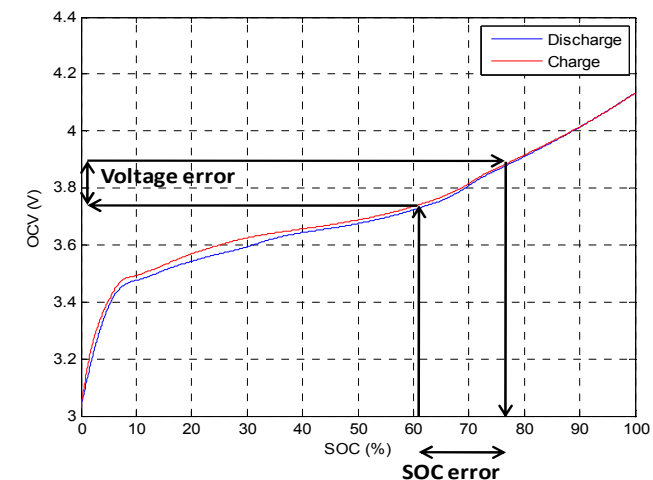
## Experimental validation

### Considerations

- Tests with a 40 Ah NCM Li-ion cell
- Results of the combined methodology
- Model can be directly used for an open loop SOC estimation
- Equivalent SOC error



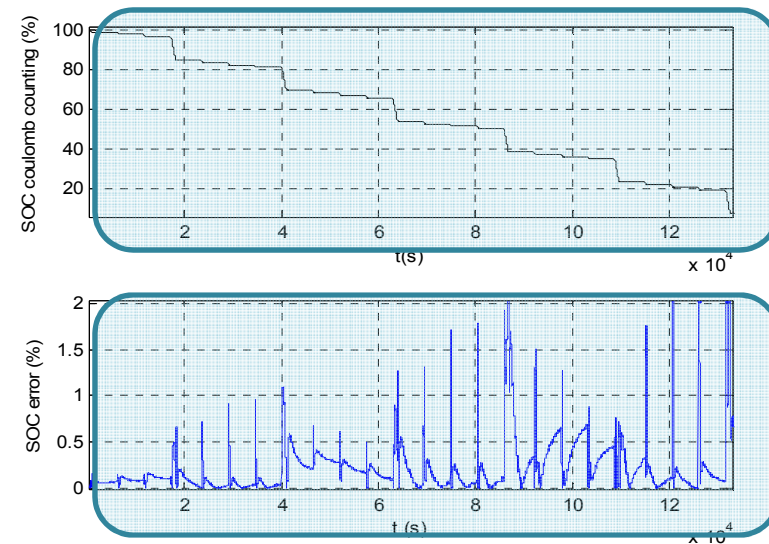
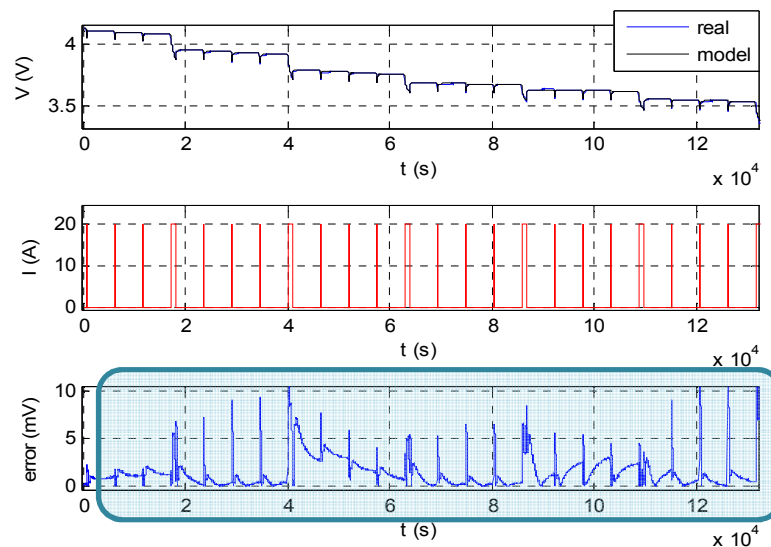
**IK4-IKERLAN storage laboratory**





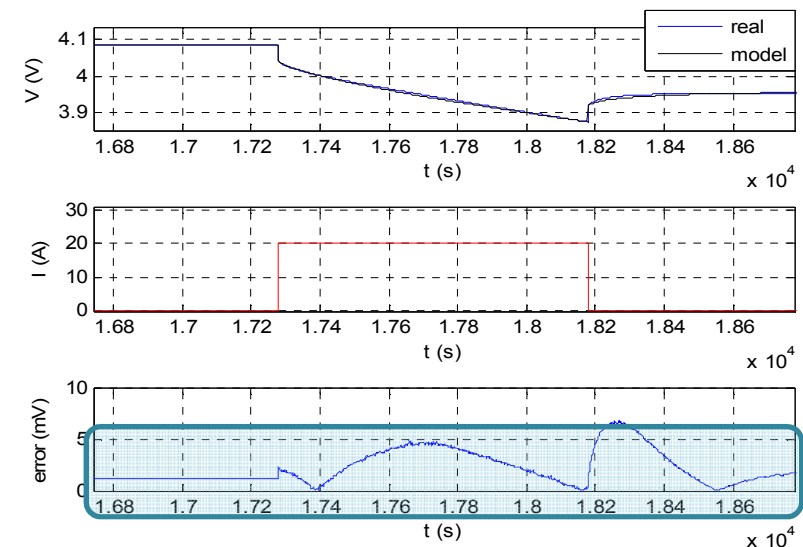
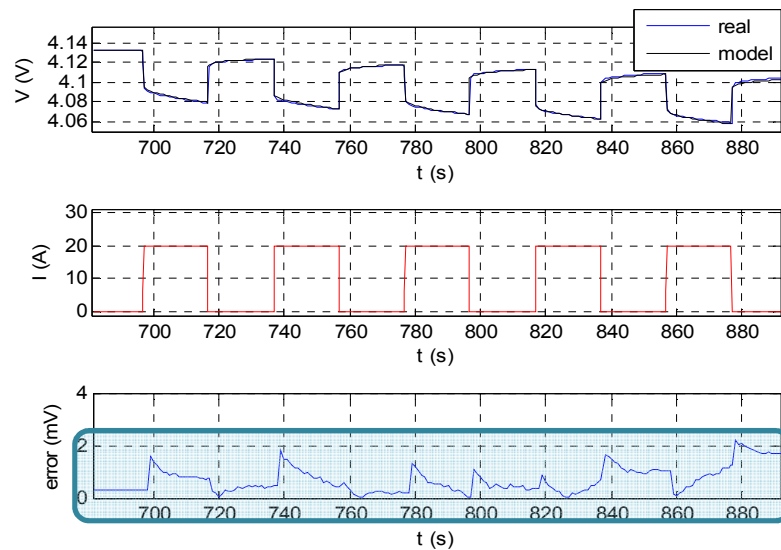
## C/2 Pulses from 10 s to 900 s all SOC

- 25 °C
- Low voltage error
- Low equivalent SOC error



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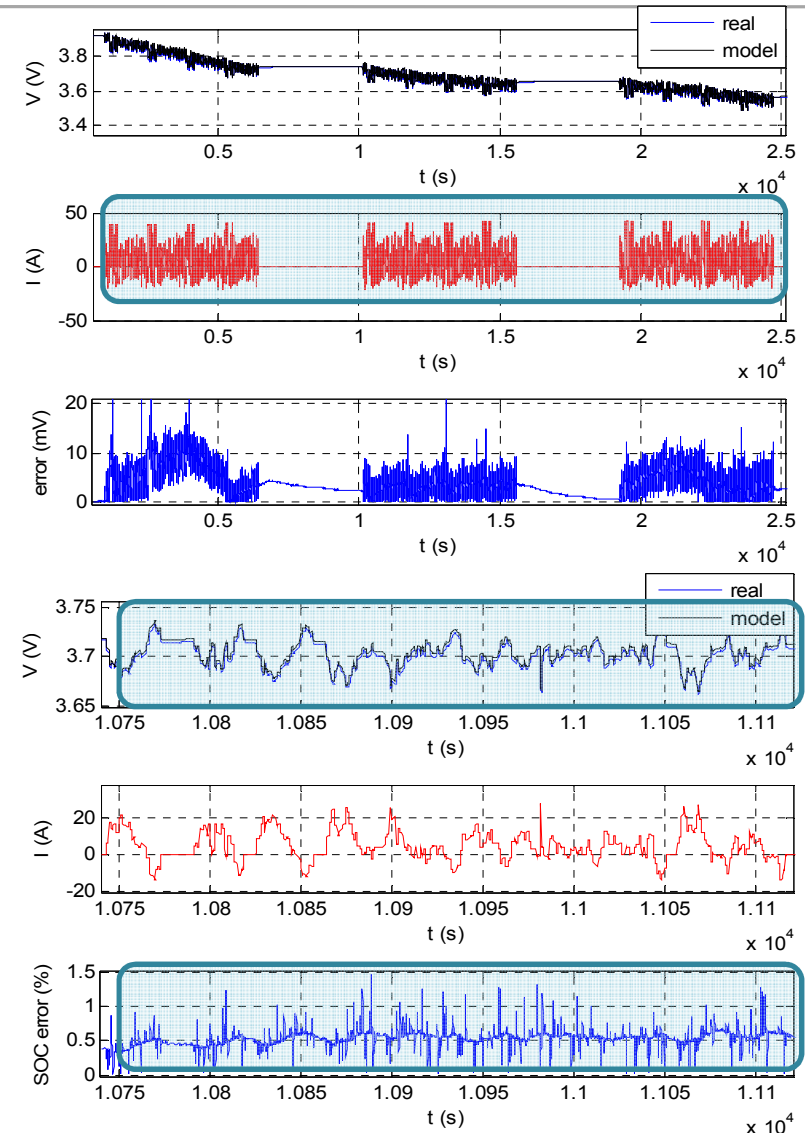
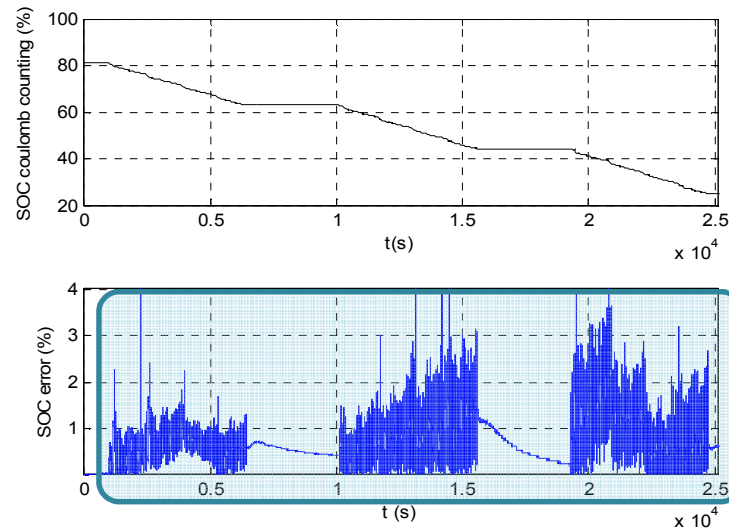
- 25 °C
- Low voltage error
- Low equivalent SOC error



## Experimental validation

### FUDS cycles @ 25°C

- less than 12 mV error
- Increasing offset error by hysteresis effect in OCV
- Low equivalent SOC error



**1. Introduction**

**2. Characterization of the cell model**

**3. Experimental validation**

**4. Conclusions**

### Conclusions

- 2 existing characterization methodologies analyzed and compared
- A combined methodology has been proposed
- Model validated in all SOC range and for different dynamics using pulses and FUDS driving cycles
- Suitable for a real time estimation in a BMS (Can be used in a closed loop algorithm like EKF)

### Future lines

- Validate the model at varying temperature and with other cell chemistries (LiFePO<sub>4</sub>)
- Analyze the degradation effect in the model parameters
- Integrate the model in a closed loop estimator for SOC and SOH

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Muchas gracias

Thank you

Merci beaucoup

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Dialogue session: Monday 2013-11-18, 13:00-15:00

***THERMAL MANAGEMENT SYSTEMS' DESIGN METHODOLOGY FOR TRANSPORT APPLICATIONS***

Nerea NIETO

Session 1B: Monday 2013-11-18, 15:15-16:35

***MODELLING OF Li-ION BATTERIES DYNAMICS USING IMPEDANCE SPECTROSCOPY AND PULSE FITTING: EVS APPLICATION***

Unai VISCARRET

Session 2B: Monday 2013-11-18, 16:50-18:10

***VALIDATION OF THE METHODOLOGY FOR LITHIUM-ION BATTERIES LIFETIME PROGNOSIS***

Elixabet SARASKETA ZABALA

Session 7B: Wednesday 2013-11-20, 09:00-10:20

***PROPOSAL AND VALIDATION OF A SOC ESTIMATION ALGORITHM OF  $\text{LiFePO}_4$  BATTERY PACKS FOR TRACTION APPLICATIONS***

Maitane GARMENDIA