Novel experimental approach for the characterisation of Lithium-Ion cells performance in isothermal conditions.

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Abstract

Lithium-Ion cells performance is sensitive to the cell temperature. Therefore, experimental evidence is needed to identify the optimal cell isothermal condition to be achieved by a Thermal Management System (TMS). Previous studies have experimentally investigated the cells electrical performance under adiabatic or controlled environmental temperature (i.e. isoperibolic) thermal boundary conditions. Notably, however, these conditions do not impose a uniform cell's surface temperature, especially at high discharge rates (DR), or a controlled cooling rate, as a TMS would. This research study proposes a novel experimental test rig replicating an active TMS based on a thermal chamber, forced air convection, a micro wind tunnel, and a control system for testing cells in set isothermal conditions. The test rig is proposed in two cooling configurations (single-sided, double-sided). The double-sided configuration, characterised by a superior heat transfer coefficient of $128 \frac{W}{m^2 K}$, guarantees a stable cell average surface temperature, equal to the set value, and a temperature disuniformity lower than 5K for DRs of up to 2C and set temperatures in the range of $0^{\circ}C$ - $40^{\circ}C$. Moreover, the electrical, thermal, and electrochemical performance of a pouch cell is investigated at DR and at uniform and constant cell temperatures.

Keywords: Thermal Management System, Li-Ion Cells, Isothermalisation, Heat Generation Rate, Electrochemical Efficiency, Micro-Wind Tunnel

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Graphical Abstract



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Acronyms

BEV Battery Electric Vehicle 8
BMS Battery Management System 7
CAES Compressed Air Energy Storage 6
CC Constant Current 13, 14, 20
COPs Conference of the Parties 6
CR Charge Rate 13, 14, 20
CTA Constant Temperature Anemometer 8, 12, 13
CV Constant Voltage 13, 14, 20
DAQ Data Acquisition 7, 9, 11
DOD Depth Of Discharge 21–24
DR Discharge Rate 1, 7, 8, 13–27
EESS Electrical Energy Storage System 6
ESS Energy Storage System 6

EV Electric Vehicle 6
HEV Plug-in Hybrid Electric Vehicle 8
HFS Heat Flux Sensor 8, 10–13, 15–17
HR Heat Ratio 14, 21–25
HTF Heat Transfer Fluid 5
MFC Mass Flow Controller 12
PHS Pump Hydro Storage 6
PLA PolyLactic Acid 8
RET Renewable Energy Technologies 6
SMU Power Measure Unit 8, 11, 13, 14, 23
TMS Thermal Management System 1, 3, 6–8, 10, 14, 16–21, 25, 26
VI Virtual Instruments 13

Nomenclature									
Dimensionless Symbols									
Nu_x	Local Nusselt number								
Re_x	Local Reynolds number								
Pr	Prandtl number								
Pe_x	Local Peclet number								
Greek Symbols									
η_I	First-law Efficiency	[-]							
μ	Dynamic Viscosity	$[Pa \cdot s]$							
ν	Kinematic Viscosity	$[m^2 \cdot s]$							
ρ	Density	$\left[\frac{kg}{m^3}\right]$							
α	Thermal Diffusivity	$[m^2 \cdot s]$							
Roma	an Symbols								
c_p	Specific Heat Capacity	$\left[\frac{J}{kgK}\right]$							
A	Surface	$[m^2]$							
k	Thermal Conductivity	$\left[\frac{W}{m K}\right]$							
h	Specific Enthalphy	$\left[rac{J}{kg} ight]$							
m	Mass	[kg]							

\dot{m}	Mass Flow	$\left[\frac{kg}{s}\right]$
p	Absolute Pressure	[Pa]
T	Temperature	[K]
t	Time	[s]
\dot{V}	Volumetric Flow Rate	$\left[\frac{m^3}{s}\right]$
V	Volume	$[m^3]$
\dot{Q}	Heat Flow Rate	[W]
Q	Heat	[J]
q	Heat Flux	$\Big[\frac{W}{m^2}\Big]$
S	Entropy	$\left[\frac{J}{K}\right]$
8	Specific Entropy	$\left[\frac{J}{kgK}\right]$
Subsci	ript	

Surface

Ambient

Film

HTF

Total

 \mathbf{s}

 \mathbf{f}

 \mathbf{a}

htf

 tot

5

1. Introduction

Energy-related CO_2 emissions must be lowered if the 187 countries who ratified the Paris Agreement at the 22^{nd} Conference of the Parties COPs [1] are to meet the commitment to keep the global temperature rise within at least $2^{\circ}C$ of pre-industrial levels and pursue even a better target of $1.5^{\circ}C$ [2]. Renewable energy technologies (RET) and systems can contribute to decarbonise the energy mix [3]. However, renewable energy sources such as wind and solar, even if more predictable compared to the past [4, 5], are still inherently intermittent. Therefore, energy storage is essential to match demand with supply [6].

Energy Storage Systems (ESS) are chosen for each application in terms of capacity, discharge period, response time, and power rating for electrical storage, and output temperature and capacity for thermal energy storage [6]. As reported by REN21 [7], the development of electrical RETs is dependent on Electrical Energy Storage Systems EESS which can capture electricity during off-peak or RET overproduction periods and release it during high peak. Also, EESS can be employed for energy arbitrage and demand response [7].

The most developed EESS are Pumped Hydro Storage (PHS), Compressed Air Energy Storage (CAES), and electrochemical cells [8]. These storage technologies serve different storage demands in terms of power (MW_e for PHS and CAES, kW_e for cells) and durations (days/weeks for PHS and CAES, hours for cells) [9].

The global grid-connected storage power by 2018 was 166.6 GW_e , with 96% being PHS [8]. The advanced (i.e. non-PHS) EESS installed power increased by 12% compared to 2017 [8]. Interestingly, electrochemical cells (mainly Li-Ion) account for 50% of the advanced EESS and grew by 43% compared to 2017 [7]. This steep expansion was mainly attributed to the manufacturing costs decrease by 65% in the period 2010-2015 driven by the Electric Vehicles (EV) market growth. However, 310 GW_e additional grid-connected electrical storage power is needed to sustain future decarbonised scenarios [6].

The operating temperature of a Li-Ion cell influences its performance [10]. At low temperatures, cells lose storage, power, energy capacity, and charge acceptability. At high temperatures, their reliability decreases and the risk of thermal runaway rises. Further, extreme temperatures compromise the cell's cycle life. These factors increase the cells' capital, operation and maintenance costs when integrated in an energy system, leading to higher unit price of energy on a full life cycle analysis [11, 12].

The effective thermal management of Li-Ion cells, which are exothermic during discharge and subjected to different environmental conditions depending on their application, is therefore essential to reduce the cost of renewable energy [11, 14, 13, 15]. The aims of an effective thermal management system (TMS) are twofold: to maintain a battery at an optimal average temperature and minimise temperature disuniformity. This isothermal condition helps to avoid localised cell deterioration and performance reduction [10, 16].

Many studies [17, 18, 19, 20, 21, 22, 23, 24, 25, 26, 27, 28, 29] have experimentally investigated the electrical performance of Li-Ion cells under controlled environmental temperatures; notably however, these conditions do not impose a uniform cell surface temperature or a controlled cooling rate, as a TMS would. As it is, the previous literature did not evaluate the sensitivity of the cell performance to the cell temperature but to the ambient

temperature. Most importantly, by not imposing any specific surface heat flux, cells were typically tested at operating conditions which strongly differ from the ones imposed by a battery management system (BMS).

Previous studies [17, 18, 19, 20] have made contributions in terms of cell electro-thermal characterisation under thermal boundary conditions that were either adiabatic or constant environment temperature, the latter defined as isoperibolic. The current work, however, employs a different approach, as originally proposed in Landini et al. [10], that has specific relevance in many applications, where the battery needs an active TMS. The proposed study characterises the performance of Li-Ion cells under a thermal boundary condition where the surface heat transfer coefficient h is kept constant on the cell and, by dynamically tuning the environment temperature to control the temperature difference between cell and cooling medium, a dynamic surface heat flux is imposed to balance the unstable cell heat generation rate. This guarantees a constant cell surface temperature (not environment temperature) both temporally and spatially. This is crucial, as this is the likely operational scenario for any active cooling approach, as part of a Li-Ion cells TMS. Importantly, this is significantly different from:

- 1. an adiabatic condition, where the cell body and surface temperature would increase with time [17]
- 2. a uniform environmental condition (isoperibolic) where the surface temperature and critically the rate of heat transfer from the cell would be significantly different from an active TMS [18, 19, 20]

The current paper does not suggest that previous studies are less relevant, just that the current approach has applications for the bespoke engineering design of TMS specifically for Li-Ion batteries at a cellular level. In addition, a ratio of the heat generation rate to the electrical power, i.e. an equivalent electrochemical efficiency, is proposed here as a metric to advance research in this technological area.

Therefore, this research study proposes a novel experimental apparatus to replicate a TMS based on a thermal chamber, forced air convection, a micro wind tunnel and a control system for testing Li-Ion cells in fixed isothermal conditions. The TMS is proposed in two cooling configurations: single-sided and double-sided. Both TMS configurations ability to maintain isothermal conditions are evaluated throughout a wide range of discharge rates (DR, from 1C to 5C) and temperature settings (from $0^{\circ}C$ to $40^{\circ}C$). Moreover, electrical, thermal, and electrochemical performance of a Li-ion pouch cell are investigated at different DR and uniform temperatures. Heat generation rate, electrochemical efficiency, and cell surface temperature dis-uniformity are reported.

2. Methodology

2.1. Li-Ion Cells

The specifics of the Li-Ion cell are reported in Table 1. This cell has been chosen as representative of a common geometry (pouch) and chemistry (cathode $LiCoO_2$, anode graphite, electrolyte $LiPF_6$) available commercially. Details are reported in the manufacturer's safety data-sheet [30].

2.2. Test Rig

This section identifies the main components of the test rig, including Li-Ion cell cycler, TMS and DAQ. The cycling procedure to charge and discharge a Li-Ion cell is explained. The aim of the test rig is to cycle cells at different DR

Component	Li-Ion cell			
Provider	Reichelt Elektronik			
Manufacturer	AKKU			
Application	MP3, iPod Nano 1G			
Technology	Li-Ion Polymers			
Voltage $[V]$	3.7			
Capacity $[mAh]$	300			
Length $[mm]$	32			
Width $[mm]$	21			
Height $[mm]$	4.8			
Mass $[g]$	7			
Density $[kg/m^3]$	2170			
Specific Heat Capacity* $[J/kg K]$	$1479\ (1274,\ 1685)$			

Table 1: Li-Ion cell specifics [30].

* Estimated at Heriot-Watt University

(up to 5C) at isothermal conditions (i.e. cell surface temperature stable and uniform) with a target temperature in the range of $0^{\circ}C$ - $40^{\circ}C$. DRs in the range of 1C-3C are experienced by cells within battery packed employed in HEV and BEV [31] while a DR of 5C was used to test the TMS in an extreme condition.

Along with the cell electrical quantities (i.e. voltage, current, power), heat flux, heat dissipation rate, enthalpy variation, heat generation rate, and electrochemical efficiency are acquired throughout the cycles. A heat flux sensor HFS is used to evaluate the heat transfer coefficient, $h\left[\frac{W}{m^2 K}\right]$, between the cell surface and the cooling medium. The design and geometry of the test rig guarantees the validity of this unique h throughout the cell surface.

2.2.1. Main Components

The main components of the test rig (Figure 1) are reported in Table 2. The cell is positioned on a stand located within the test section (Figure 1) of a micro wind tunnel (Figure 2). The wind tunnel has been 3D-printed by using commercial PLA as it was a cheaper and time-saving manufacturing method compared to metals machining, especially for the test section (Figure 1). Also, PLA is less thermally conductive than metals. This allowed to insulate the cell from the test section and made it exchange heat exclusively with the wind flow, minimising the heat dissipation calculation error.

Five K-type thermocouples and a heat flux sensor (HFS) are applied on the surface of the cell (Figure 3). By measuring surface temperatures and heat flux, heat dissipation rate, enthalpy variation, and heat generation rates can be computed. A constant temperature anemometer (CTA) is positioned at the beginning of the test section (Figure 1) to measure the upstream wind speed. A 4-wire technique is used to measure voltage and current at the cell electrodes by a source measure unit SMU. The extraction fan of the wind tunnel guarantees a stable wind speed of around 20 m/s and a consequent stable turbulent forced convection heat transfer regime. The incident wind

temperature is controlled by activating heating and cooling elements by means of a control system. The cooling element is a commercial refrigeration chamber while the heating element is a heater comprising four 50W resistors, finned holder, and a heater fan. All units are connected to a National Instrument DAQ and controlled by LabView software. Sampling rate is fixed to 1Hz.



Figure 1: Test rig Overview.



Figure 2: TMS Wind Tunnel (A): diverger with extraction fan (B), cell test section (C), converger with honeycomb filter (D).



Figure 3: Li-Ion cells TMS: location of thermal sensors (HFS=Heat Flux Sensor, T=Thermocouple). The insulating layer (super-wool) is used exclusively for the single-sided cooling TMS configuration.

2.2.2. Thermal Sensors Calibration

A calibration campaign was done following standard procedures [32] on the K-type thermocouples (RS PRO K-type) used in the test rig. A stirred thermostatic bath Grant GD100 was used as temperature reference to calibrate all thermocouples. Data were collected for specific temperature levels (X) in range 20 °C - 55° C with 1 °C step and

Table 2: Test Rig Components: Overview

Unit	Model
Modules Chassis	NI cDAQ-9174
HFS Voltage DAQ	NI-9211
Thermocouples DAQ	NI-9213
SMU Chassis	NI PXI-1033 ExpressCard-8360
SMU	NI PXI-4130
HFS	GreenTeg GSkin-XP-26-9C
Thermal Chamber	
Cooling	Indesit OF1A100UK: 250W, Vol 100L
Heating Resistor	$4 \ge ARCOL HS50 \ 2K2 \ J: 50 \ W$
Heating Fan	Multicomp MCSF23080A/2083HSL.GN: 18W

55 °C - 80°C with 5 °C step. The results are reported in Table 3. All temperature measurements are therefore reported within $\pm 0.2^{\circ}C$ at 95% confidence.

Table 3: Calibration results for K-type thermocouples (RS PRO K-type): regression analysis of absolute residuals $R = T - T_{ref}$

T [°C]	p1* [-]	p2* [°C]	RMSE [°C]	U** [°C]
20-80	0.001709	-0.0978	0.0964	0.1928

* Residuals: $R = T - T_{ref} = p_1 * T + p_2$

^{**} Uncertainty: $U = 2 \cdot RMSE$ [33]

A GreenTeg gSKIN®-XP269C HFS was calibrated by reproducing a force convection on a horizontal iso-heat flux flat plate with a thermally-insulated lower face [34]. A RS Flat Strip Heater 9210035 5"-2" 400W connected to a Power Supply TENMA 72 8340 was used. The flat plate was located on a stand within a wind tunnel with wind speed capability up to 26 m/s. The HFS was flush mounted on the heater (Figure 4) using thermal paste to minimise the thermal contact resistance and the other side was insulated by 3 mm thick layer of insulating wool. Four thermocouples were positioned around the HFS to estimate its temperature (Figure 4). Different wind speeds (up to 13 m/s) and resistor powers (up to 30 W) were imposed. Heat flux and temperatures were sampled at steady state condition and the local Reynolds number $Re_x = \frac{\rho vx}{\mu}$, the Prandtl number $Pr = \frac{c_p \mu}{k}$, the local Nusselt number $Nu_x = \frac{h_x x}{k}$, and the local heat transfer coefficient h_x were computed from theoretical correlations (refer to [35]). Then, h_x was compared with the h_{HFS} calculated from the heat flux measurements, to compute the relative error $e_{h_x} = \frac{h_{HFS} - h_x}{h_{HFS}}$. The e_{h_x} was analysed for Re_x in the range of $4.09 \cdot 10^3$ to $6.06 \cdot 10^4$, where a Re_x of $2 \cdot 10^4$ corresponds to the beginning of a fully turbulent regime.

An uncertainty analysis following standard procedures [33] (refer to [35]) on e_{h_x} was done to consider the uncertainty introduced by the thermocouples (Table 3) and the wind speed anemometer $(3\% \pm 0.02m/s)$. Being this uncertainty dependent on the flow regime, laminar and turbulent regimes correlations were considered. The relative uncertainties of e_{h_x} for laminar and turbulent regimes were of 1.76% and 2.03% respectively. This information was used to



Figure 4: HFS location on the flat heater.

evaluate a 95% confidence bounds for the relative error e_{h_x} for the two flow regimes by adding and subtracting twice the value of $U_{e_{h_x}}$. The results are reported for the turbulent regime in the supplementary material [35]. Overall, the HFS had a consistent agreement with turbulent heat flux correlations, with a relative error e_{h_x} statistically close to the manufacturer accuracy of 3%. All heat flux measurements are therefore reported within \pm 3% at 95% confidence.

2.2.3. Constant Temperature Anemometer Calibration

A constant temperature anemometer CTA sensor dedicated to the measurements of the Li-ion cells upstream air flow speed within the micro wind tunnel was calibrated by using: a Dantec Dynamics Hot-Wire Calibrator (Jet-Flow Simulator and mini-CTA single channel voltage module), a MKS Mass Flow Controller MFC GE50A Air Mass Flow Controller, a NORGREN air flow filter/regulator, a NORGREN pressure gauge 18-015-989, and two RS 363-0250 k-type thermocouples. The CTA sensor (DANTEC Miniature wire probe, straight) was coupled with a NI 9215 voltage module (± 10 V, 16 Bit) to measure the voltage across the tungsten filament of the CTA. The calibration curve resembled a typical King's Law ($E^2 = a \cdot v^b + c$), where E is the CTA voltage [V], v is the real air jet-flow velocity [m/s] and a, b, c are the regression coefficients.

All tests have been done by manually regulating the air main supply valve to guarantee a constant supply pressure of 4 bar, read by the pressure gauge. The air flowed through the filter/regulator and entered in the MFC, where its temperatures was measured by the first k-type thermocouple. The MFC digitally controlled the flow rate to a value imposed by the user; response times were typically on the order of 500 milliseconds and accuracies are around 1%. Then, the air was injected in the jet flow calibrator. Here, the jet-flow temperature was also measured by a second k-type thermocouple. The CTA sensor was suspended above the jet-flow nozzle and, by means of the Mini CTA Sensing module, sends a voltage reading (typically in the range of 1-3 V) to the NI 9215 voltage module. Therefore, by tuning the set volumetric flow rate with the MKS MFC from 1,000 up to 50,000 SCCM (Standard Cubic Centimetre per Minute, standard reference $0^{\circ}C$ and 1 atm) and keeping the main supply pressure constant at 4 bar, it was possible to set different jet-flow velocity from 0.2 m/s up to 8 m/s and read the CTA voltage signal.

The results lead to a curve in the form of $E^2 = a \cdot v^b + c$, with a=0.967, b=0.392, c=1.334. This law can be rewritten

as $v = \left(\frac{E^2 - c}{a}\right)^{\frac{1}{b}}$. The uncertainty analysis on the velocity lead to a calibration curve relative error of $\pm 4.36\%$. In the range of the Li-ion cells test rig (up to 20 m/s), this leads to a typical uncertainty lower than 0.872 m/s. For flow temperatures different to the calibration flow temperature (18.82°C), a correction factor for the voltage of $\left(\frac{T_{wire} - T_{ref}}{T_{wire} - T_{flow}}\right)^{0.5}$ must be applied on the CTA voltage readings before using the calibration curve.

2.3. Test Rig Uncertainty Analysis

Table 4: Test Rig Components: Accuracies and Calibration Range.

Component	Reading	Accuracy	Range
Thermocouple	Temperature	0.1928^oC	20-55 °C
HFS	Heat Flux	3%	$Re_x=2-6 \cdot 10^4$
CTA	Air Speed	4.36%	$0-30 \mathrm{~m/s}$
Scaler	Weight	$0.01 \ \mathrm{gr}$	0-1 kg
Vernier Caliper	Length	$0.01 \mathrm{~mm}$	$150\mathrm{mm}$
SMU	Voltage	0.03% + 1.5 mV	0-6 V
	Current	0.12% + 200 $\mu\mathrm{A}$	0-2 A

All calibration results and accuracies were collected (Table 4) and used to evaluate the uncertainty analysis of the test rig. For the scaler, caliper, and SMU the manufacturer accuracies have been used. The methodology is reported in the supplementary material [35]. Table 5 report the final results with absolute and relative uncertainties. All quantities in the results section are therefore reported within these uncertainties at 95% confidence.

2.4. Li-Ion cells Cycling Procedure

A CC-CV charge method (i.e. Constant Current - Constant Voltage), being the best known technique to charge a Li-Ion cell [36, 37], was implemented using a SMU PXI-4130 commanded by a LabView VI. The same unit can act as a power supply (charge) and as a electronic load (discharge) in a constant current (CC) mode. The overall cycle procedure is reported in Table 6.

The values of the charge and discharge currents are typically expressed by using two parameters called Charge Rate (CR) and Discharge Rate (DR) which are based on the C-rate. This is defined as the constant current which charges/discharges the entire nominal capacity of the cell in one hour. For instance, a cell of capacity equal to 1Ah under a DR of 1C/2C/3C is operated at a discharge current of 1A/2A/3A.

Figure 5 shows a voltage and current profile for a cycle at CR=DR=1C and CV cut-off current of C/30. The cell is charged first at constant current (CC) until the maximum voltage is reached. Then, the cell is charged at constant voltage (CV) until the current drops below the cut-off current. A period of 30-minute rest follows to cool the cell. Then, a discharge at constant current (CC) is operated until the voltage drops below the minimum voltage.

Quantity	Symbol	Unit	Uncertainty	Uncertainty
			(absolute)	(relative)
Temperature	Т	^{o}C	0.1928	-
Temperature Average	T_{av}	^{o}C	0.0862	-
Temperature Difference	$T_i - T_j$	^{o}C	0.2727	5.45%
Temperature Disuniformity	ΔT	^{o}C	0.2727	5.45%
Voltage	V	mV	2.76	0.0667%
Current	Ι	mA	2	0.13%
Heat Flux	q	$\frac{W}{m^2}$	15	3%
Specific Heat Capacity	c_p	$\frac{J}{kgK}$	205	13.9%
Heat Transfer Coefficient	h	$\frac{W}{m^2 K}$	-	6.22%
Area	А	m^2	-	0.29%
Electrical Power	Р	mW	9.4	0.15%
Heat Dissipation Rate	\dot{Q}_{loss}	mW	-	8.28%
Enthalpy Variation	$\frac{\partial H}{\partial t}$	mW	-	14.9%
Heat Generation Rate	\dot{Q}	mW	-	8.12%
Total Power	P_{tot}	mW	-	0.82%
Electrochemical efficiency	η	-	-	0.83%
HR	HR	-	-	8.12%

Table 5: Uncertainty Test Rig.

Table 6: Cell Cycle Procedure

1	Setting cell average surface temperature T_{set}
2	Wait for cell thermal equilibrium [*]
3	Charge CC with SMU until $V_{max} = 4.2V$
4	Charge CV with SMU until current drops down to $\mathrm{CR}=C/30$
5	Rest: cell thermal equilibrium [*]
6	Discharge CC until $V_{min}=2.75$ V

* Average cell temperature T_{av} in range $[T_{set} \pm 0.1K]$ and at least 30 minutes Heating $(T_{av} < T_{set} - 0.1K)$: resistors and heating fan ON Cooling $(T_{av} > T_{set} + 0.1K)$: cooling chamber ON

3. Results and Discussions

3.1. Single-Sided Cooling TMS

This section evaluates the sensitivity of the cell isothermalisation by a single-sided cooling TMS to different DRs and T_{set} . Isothermalisation is a stable cell average surface temperature T_{av} , equal to the set value T_{set} , and a minimum in-cell temperature gradient ΔT (disuniformity) below 5 K [38, 39])



Figure 5: Cycle: voltage and current (positive when charging).

The experimental apparatus is composed of a cooling element, a heating element, and a micro wind tunnel (Figure 1, Figure 2). The wind tunnel guarantees a turbulent forced convection with $Re_x > 2 \cdot 10^4$ on the cell upper surface (Figure 3). Throughout each cycle, by measuring the HFS heat flux (q), HFS temperature T_{HFS} (average of T_1 , T_3 , Figure 3) and wind temperature (T_A), a heat transfer coefficient h was computed by statistical regression of q vs. $T_{HFS} - T_A$ (Figure 6).

Importantly, by guaranteeing a fully turbulent forced convection, with a median free-wind speed, free-stream Re and localised Re_x at $25^{\circ}C$ of 20 m/s, $1.16 \cdot 10^5$ and $3.31 \cdot 10^4$ respectively, h was independent from the cell surface temperature and therefore valid for the entire surface, unlike for natural convection [40]. This assumption neglects the dependency of h to the distance from the leading edge (x) due to the thermal boundary layer thickness increase. However, the HFS is positioned in the centre of the cell surface and here the h_x is measured and assumed equal to average integral \bar{h} [34]. This introduces a negligible error as the average \bar{h} , calculated by assuming $Nu_L = 0.037 \cdot Re_L^{0.8} \cdot Pr^{0.43}$ [40], would be only 5% different from the h_x evaluated at the centre of the cell.

Several cycles have been conducted on the cell for DR=1, 1.5, 2, 3, 4, 5 C and T_{set} in range $0^{\circ}C$ -40°C with step of 5°C. The overall results are reported in the supplementary material [35]. As shown in Figure 6, the h_{HFS} has been calculated for each test by linear regression of q_{HFS} vs $T_{HFS} - T_A$. Overall, h has an average, median, and standard deviation of 86.8 $W/m^2 K$, 88.4 $W/m^2 K$, and 5.3 $W/m^2 K$ respectively.

The regressed h_{HFS} , being constant and not dependent on $T_{HFS} - T_A$, can be used throughout each single test for the calculation of the total heat generation. However, a dependency of h on the absolute T_{set} is present due to the variation of the air thermo-physical properties as predicted by theoretical correlations. For instance, assuming $Nu_x = 0.032 \cdot Re_x^{0.8} \cdot Pr^{0.43}$ [40], the standard deviation of the h_x with a temperature in the range of 0-40°C with



Figure 6: Heat Flux (q_{HFS}, A) and heat transfer coefficient (h_{HFS}) , the latter in function of T_{set} (B) and DR (C).

wind speed of 20m/s would be 3.05 $\frac{W}{m^2 K}$. This is close to the standard deviation of 5.3 $\frac{W}{m^2 K}$ experimentally observed (Figure 6, centre).

Figure 7 shows the cell temperature profiles at DR=1C for different set temperatures (T_{set}) , giving minimum (A), maximum (B), average (C) compared to T_{set} and the temperature gradient $\Delta T = T_{max} - T_{min}$ (D), the latter defined as the difference between maximum and minimum temperatures. The profiles are composed by data sampled at 1Hz and reported without piecewise correction. The uncertainty is represented by error bars. Tests conducted at higher DR are reported in the supplementary materials [35].

Overall, the TMS guarantees a constant cell average temperature close to T_{set} (i.e. the criteria of the control system) when DR is lower than 3C, even if cell average temperature spikes were observed for DR=1.5 at $T_{set}=0^{\circ}C$ and DR=2 at $T_{set} < 20^{\circ}C$ [35]. For all tests, the temperature gradient increases with lower temperatures as the heat generation rate increases, due to a higher cell internal resistance, while the heat transfer coefficient is stable. The temperature gradient is kept below a safe value of 5 K when DR=1C for all T_{set} . The overall performance are reported in the supplementary materials [35].

3.2. Double-sided Cooling TMS

Compared to the previous system, a modified TMS was proposed based on a double-sided cooling implemented within the test section of the micro wind tunnel (Figure 8). This increased the heat transfer coefficient and the heat exchange area, leading to lower in-cell thermal gradients and a better cell thermal regulation.

The cell lower side heat transfer coefficient could be known exactly if an additional HFS was applied locally. However,



Figure 7: Li-Ion cell temperature profiles at DR=1C for different single-sided cooling TMS set temperatures: minimum (A), maximum (B), average (C), gradient (D).

the modified cell stand was designed to be symmetric in respect to the incoming wind, leading to a symmetric heat transfer regime [34]. This symmetry condition was tested by repeating 200 times a discharge test at DR=2C and T_{set} of 25°C. Two identical HFS were positioned on both upper and lower sides of the cell to measure their heat fluxes synchronously. The h was calculated by linear regression of q vs $T_{HFS} - T_A$ for both upper (h_{upper}) and lower (h_{lower}) side. A 2-sample t-test was employed to evaluate the difference between the means at 95% confidence. The results are reported in Table 7. While there is strong evidence (p value < 0.001) that h_{upper} and h_{lower} differ, there is 95% confidence that this difference is between 11.75 and 16.19 $\frac{W}{m^2 K}$, i.e. less than 10%. Therefore, for the double-side cooling TMS h_{lower} could be assumed equal to the h_{upper} and a single HFS on the upper side is applied Figure 3).

As shown in Figure 9, the h_{HFS} has been calculated by linear regression of q_{HFS} vs $T_{HFS} - T_A$, with typically R^2 values greater than 90%. The results show that h has an average, median, and standard deviation of 130 $W/m^2 K$, 128 $W/m^2 K$ and 9.4 $W/m^2 K$ respectively. Moreover, h_{HFS} is independent from the cell surface temperature and DR. Compared to the one-sided TMS (average/median of 86.8/88.4 $W/m^2 K$), the average/median heat transfer coefficient increased by around 50/44% and the exchange area doubled.

The results of the TMS tests at DR=1C are reported in Figure 10 for each T_{set} . Tests conducted at higher DR are reported in the supplementary materials [35] together with an evaluation of the performance (mainly the temperature

Statistics	Upper Side	Lower Side		
Samples	200	200		
Mean	167.62	153.65		
95% Confidence Range	(165.9, 169.3)	(152.2, 155.1)		
Standard Deviation	12.7	10.5		
Statistics	Absolute	Relative		
Mean Difference	13.97	8.3%		
95% Confidence Range	(11.75, 16.19)	(7%, 9.7%)		

Table 7: 2-sample t-test on the heat transfer coefficient mean $\left[\frac{W}{m^2 K}\right]$ for upper and lower sides of the cell.



Figure 8: Double-side cooling TMS symmetric test section. Compared to the TMS (Figure 2), both upper and lower side of the cell are exposed to forced convection cooling.

gradient) of this system compared to the previous one.

The double-sided TMS leads to an average/median decrease of the maximum (99% quantile) in-cell temperature gradient ($\Delta T^{Q_{99}}$, refer to the supplementary material [35]) of 55/66%. This is indeed an improvement towards the cell isothermalisation goal by means of the TMS. Moreover, compared to the previous system, the double-sided cooling TMS can thermally manage a discharge regime of DR=2C, having a maximum gradient $\Delta T^{Q_{99}}$ in the worst case scenario ($T_{set}=0^{\circ}C$) of 4°C. However, DR=1C still remains a better discharge condition, leading in the worst case scenario ($T_{set}=0^{\circ}C$) to a temperature gradient lower than 3.5°C. The overall performance are reported in the supplementary materials [35].



Figure 9: Heat Flux (q_{HFS}, A) and heat transfer coefficient (h_{HFS}) , the latter in function of set temperature (B) and DR (C).



Figure 10: Li-Ion cell temperature profiles at DR=1C for different double-sided cooling TMS set temperatures: minimum (A), maximum (B), average (C) distance from T_{set} , gradient (D).

Overall, the double-sided cooling TMS results in better isothermalisation compared to single-sided cooling TMS. Isothermalised tests at DR=2C for all T_{set} range evaluated (0°C-40°C) are possible. Therefore, the results reported in the following sections, unless otherwise stated, are based on the experimental data collected with the upgraded double-sided cooling TMS test rig.



Figure 11: Li-Ion cell surface temperature profiles under a CCCV cycle at CR=1C and DR=2C at: A) constant thermal chamber temperature of $10^{\circ}C$, i.e. isoperibolic condition, B) constant cell average surface temperature of $10^{\circ}C$, i.e. isothermal condition imposed by the double-sided cooling TMS.

In addition, to evaluate the isothermalisation capability of the novel double-sided cooling TMS compared to a typical isoperibolic thermal boundary condition imposed by thermal chambers or calorimeters as in previous literature [18, 19, 20, 21, 22, 23, 24, 25, 26, 27, 28, 29], the cell surface temperature profiles under a cycle comprehending a CCCV charge at CR=1C, a 30-minute rest, and a CC discharge at DR=2C are reported in Figure 11 and Table 8 for two cases:

- A) constant thermal chamber temperature of $10^{\circ}C$, i.e. isoperibolic condition
- B) constant cell average surface temperature of $10^{\circ}C$, i.e. isothermal condition imposed by the double-sided cooling TMS.

It is clear how imposing an isoperibolic thermal boundary condition (A in Figure 11 and Table 8) and a truly isothermal boundary condition (B in Figure 11 and Table 8) on the cell surface differ. Due to the effect of self-heating, the cell under isoperibolic boundary condition (A) increases its average surface temperature and temperature disuniformity during the discharge phase, leading to performance quantitatively different from a cell under isothermal condition (B), where the self-heating effect is annihilated.

Therefore, the novel approach proposed in this study can guarantee a truly isothermal condition and should be employed in future studies if parametric analyses on the cell performance and ageing tests must be done at the same cell average temperature. The current approach based on an isoperibolic thermal boundary condition using thermal chambers or calorimeters, which do not control the cell surface temperature by imposing a controllable heat flux, leads to an inevitable interdependence between CR, DR, and temperature therefore prohibiting analysis under separation of parameters. Moreover, studies from different authors, even if carried out at an identical thermal chamber or calorimeter temperature (i.e. isoperibolic condition), cannot be truly compared as the cells were inevitably tested at different cell temperature, especially at high DR.

Table 8: Li-Ion cell performance under a CC discharge at DR=2C at: A) constant thermal chamber temperature of $10^{\circ}C$, i.e. isoperibolic condition, B) constant cell average surface temperature of $10^{\circ}C$, i.e. isothermal condition imposed by the double-sided cooling TMS.

Test	BC	Δt	$T_{A,av}$	T_{av}	T_{max}	DOD	Cap	Е	P_{av}	Q	\dot{Q}_{av}	h	η	$^{\rm HR}$
А	Isoperibolic	1184	9.95	22.61	25.29	66%	197	654	1989	97	295	17.9	87%	15%
В	Isothermal	682	6.87	10.02	12.14	38%	114	372	1965	78	409	190.2	83%	21%

BC=Boundary Condition, Δt [s]=period, $T_{A,av}[^{o}C]$ =average ambient temperature

 $T_{av}[^{o}C]$ =average cell temperature, $T_{max}[^{o}C]$ =maximum cell temperature,

Cap [mAh]=capacity, E [mWh]=energy, P_{av} [mW]=average power

Q [mWh]= heat dissipation, \dot{Q}_{av} [mW]= average heat dissipation rate, $h [W/m^2 K]$,

 η =electrochemical efficiency, HR=heat ratio

3.3. Thermodynamic analysis procedure

Once the heat transfer coefficient h is evaluated and assumed uniform on the cell surface, the total heat generation rate \dot{Q} can be computed. As reported in Equation 1 and Equation 2, \dot{Q} is equal to the sum of the heat dissipation \dot{Q}_{loss} and the enthalpy variation $\frac{\partial H}{\partial t}$ of all cell sections (5 in these study, see Figure 3). An explicit method as time discretisation numerical technique [41] is used as shown in Equation 2, where k represents the time step (function of the 1 Hz sampling rate).

$$\dot{Q} = \sum_{i=1}^{n} \dot{Q}_i \bigg|_{n=5} \tag{1a}$$

$$\dot{Q}_i = \dot{Q}_{loss,i} + \frac{\partial H_i}{\partial t} \tag{1b}$$

$$\dot{Q}_{loss,i} = h \cdot A_i \cdot (T_i - T_a) \tag{1c}$$

$$\frac{\partial H_i}{\partial t} = m_i \cdot c_p(T) \cdot \frac{\partial T_i}{\partial t} \tag{1d}$$

$$\dot{Q}^k = \sum_{i=1}^n \dot{Q}_i^k \bigg|_{n=5}$$
(2a)

$$\dot{Q}_{i}^{k} = \dot{Q}_{loss,i}^{k} + \frac{\partial H_{i}^{k}}{\partial t}$$
(2b)

$$\dot{Q}_{loss,i}^{k} = h \cdot A_{i} \cdot (T_{i}^{k-1} - T_{a}^{k-1})$$
(2c)

$$\frac{\partial H_i^k}{\partial t} = m_i \cdot c_p(T_i^{k-1}) \cdot \frac{T_i^k - T_i^{k-1}}{\Delta t}$$
(2d)

Once the heat generation rate \dot{Q} is calculated, the electrochemical efficiency η and heat ratio HR can be computed as shown in Equation 3:

$$\eta = \frac{P}{P + \dot{Q}} = \frac{1}{1 + HR} = \frac{P}{P_{tot}}$$
(3a)

$$HR = \frac{Q}{P} = \frac{1 - \eta}{\eta} \tag{3b}$$

where P [W] is the electrical power, \dot{Q} [W] is the heat generation rate calculated by Equation 1, P_{tot} [W] is the total chemical power discharged by the battery (defined as $P_{tot} = P + \dot{Q}$), η is the battery electrochemical efficiency and HR is the heat ratio. These two parameters are instantly determined (i.e. based on power), i.e. for each operating condition (DR, ambient temperature) and specific DOD.

The equivalent total discharge performance (i.e. based on energy) can be evaluated by the overall factors determined by Equation 4:

$$\eta_{overall} = \frac{E}{E+Q} = \frac{1}{1+HR_{overall}} = \frac{E}{E_{tot}} = \frac{P_{av}}{P_{av} + \dot{Q}_{av}}$$
(4a)

$$HR_{overall} = \frac{Q}{E} = \frac{1 - \eta_{overall}}{\eta_{overall}} = \frac{\dot{Q}_{av}}{P_{av}}$$
(4b)

$$E = \int_{t=0}^{t=\tau} P(t) dt, \quad Q = \int_{t=0}^{t=\tau} \dot{Q}(t) dt, \quad \tau = \frac{1}{DR}$$
(4c)

$$P_{av} = \frac{E}{\tau} \quad , \dot{Q}_{av} = \frac{Q}{\tau} \tag{4d}$$

where E [Wh] is the total electrical energy discharged, Q [Wh] is the total heat generated, P_{av} [W] is the average electrical power, \dot{Q}_{av} [W] is the average heat generation rate, $\eta_{overall}$ is the overall electrochemical efficiency and $HR_{overall}$ is the overall heat ratio.

3.4. Li-Ion Cells Electrical, Thermal and Electrochemical Performance



3.4.1. Instant Performance

Figure 12: Voltage (A) and volumetric heat generation (B) in function of DOD and average Li-Ion surface temperature T_{av} at DR=1C.

Figure 12 and Figure 13 evaluate the effect of the isothermal conditions imposed to the cell for discharge tests at DR=1C. Voltage, volumetric heat generation rate \dot{Q}_{vol} , electrochemical efficiency η , and heat ratio HR are shown in function of DOD and T_{set} , where DOD is the Depth Of Discharge (DOD), defined as the ratio between the capacity



Figure 13: Electrochemical efficiency η (A) and HR (B) in function of DOD and average Li-Ion surface temperature T_{av} at DR=1C.

discharged and the nominal capacity. The DOD can be interpreted as a non-dimensional time. The profiles are composed by data sampled at 1Hz and reported without piecewise correction. The uncertainty of the measurements is reported as error bars.

Figure 12 shows that the voltage reaches the safety limit of 2.75 V faster for lower temperatures. This can be explained by the fact that the cell open circuit voltage increases with temperature while the internal resistance decreases with temperature [42], the latter leading to lower ohmic voltage drops. Being the cell heat generation rate mostly proportional to the heat losses by Joule effect [21] caused by the internal resistance, it is expected to decrease with the temperature, as evident from Figure 12. Accordingly, the electrochemical efficiency and the HR respectively increases and decreases with the temperature.

Figure 14 and Figure 15 evaluate the effect of the DR imposed to the cell by the SMU for discharge tests at average cell surface temperature $T_{av}=25^{\circ}C$. Voltage, volumetric heat generation rate \dot{Q}_{vol} , electrochemical efficiency η , and heat ratio HR are shown in function of DOD and DR. Figure 14 shows that the voltage reaches the safety limit of 2.75 V faster for higher DRs, leading to final DODs of 87% at 1C and 5% at 5C. This can be explained by the fact that the cell open circuit voltage is independent from the DR while the ohmic irreversible losses increase quadratically with the current and therefore with the DR.

It is worthy to mention that a strong decrease of the discharged capacity with an increasing DR has been observed in previous studies for both cylindrical cells (50% decrease from DR of 1C to 3C, [43]) and pouch cells (30% decrease from DR of 1C to 5C, [44]). However, this phenomena was exacerbated by the proposed test rig as the cell was kept stable at the set temperature and therefore the fictitious gain of capacity by self-heating effect, which is typically experienced in cells tested under stable chamber temperature, was annihilated.



Figure 14: Voltage (A) and volumetric heat generation (B) in function of DOD and DR at average cell surface temperature $T_{av}=25^{\circ}C$.



Figure 15: Electrochemical efficiency η (A) and HR (B) in function of DOD and DR at average cell surface temperature $T_{av}=25^{\circ}C$.

Being the cell heat generation rate mostly proportional to the heat losses by ohmic effect [21, 45], it is expected to increase with the DR, as evident from Figure 12. Accordingly, the electrochemical efficiency and the HR respectively decreases and increases with the DR.

3.4.2. Overall performance

The overall electrical, thermal, and electrochemical performance were evaluated for DR from 1C to 5C step 0.5C and T_{set} in the range of $0^{\circ}C$ - $40^{\circ}C$ with step of $5^{\circ}C$. All overall quantities reported in the following are based on integral values calculated by integration of the instant properties (e.g. Figure 12 and Figure 13) in function of DOD, as exemplified in Equation 4. The overall results are reported in the supplementary materials [35].



Figure 16: Capacity [Ah] (top) and electrical energy E [Wh] (bottom) for discharge tests at different DR and T_{set} .

The discharged capacity (Figure 16, top) and the electrical energy E (Figure 16, bottom) increase with the cell temperature and decrease with the DR without showing a maximum. Differently, the average electrical power P_{av} (Figure 17, top) is mainly dependent on the DR; still, it increases appreciably with the cell temperature for high DR.

The average heat generation rate \dot{Q}_{av} (Figure 17, middle) strongly decreases with the T_{set} especially at high DR, mainly due to the change of internal resistance (higher at low temperature). The electrochemical efficiency η (Figure 17, bottom) follows a similar profile as the capacity and energy, increasing with higher temperatures and lower DR. For instance, the efficiency increases from 75% to 90% from 0°C to 40°C. The DR have a lower influence on the efficiency for higher temperatures. This could be due to a better isothermalisation effect of the TMS. The HR follows a symmetric profile compared to the efficiency, with higher HR for low cell temperatures and high DR.

4. Conclusions

Li-Ion cell performance is sensitive to temperature. Experimental evidence is needed to identify the optimal isothermal condition to be achieved by a Thermal Management System (TMS). Many studies have experimentally investigated the performance of Li-Ion cells under a controlled environmental temperature (i.e. isoperibolic boundary condition); notably however, this condition do not impose a uniform cell surface temperature or a controlled cooling rate, as a TMS would. As it is, the previous literature does not evaluate the sensitivity of the cell overall performance to the cell temperature but to ambient temperature. Most importantly, by not imposing any specific surface heat flux, cells were tested at operating conditions which strongly differ from the ones imposed by a TMS.

This research study proposes a novel experimental apparatus to replicate a TMS for testing Li-Ion cells under set isothermal conditions. The TMS has two cooling configurations: single-sided and d ouble-sided. Both configurations were tested at discharge rates from 1C to 5C and set temperatures from $0^{\circ}C$ to $40^{\circ}C$. The double-sided cooling TMS, having a superior heat transfer coefficient of 128 $\frac{W}{m^2 K}$, guarantees an ideal isothermal condition, i.e. stable cell average surface temperature and temperature disuniformity lower than 5K, for DRs of up to 2C and throughout the set temperature range.

Moreover, the proposed apparatus was employed to evaluate electrical, thermal, and electrochemical performance of a commercial Li-ion pouch cell at different DR and isothermal conditions. Results of heat generation rate, electrochemical efficiency, and cell surface temperature disuniformity are presented.

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6. Data Availability

Datasets related to this article can be found at http://dx.doi.org/10.17632/fddsp6nnwd.1, an open-source online data repository hosted at Mendeley Data [35].



Figure 17: Average Power P_{av} [W] (top), Average Heat Generation Rate [W] (middle), and Electrochemical Efficiency η (bottom) for discharge tests at different DR and T_{set} .

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