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Additional Information

Influence of environmental conditions in the battery Thermal Runaway Process of different chemistries: Thermodynamic and Optical assessment

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Abstract

Thermal runaway is one of the main concerns of battery electric vehicles due to the hazard level that represents for the user and the surroundings. Several works studied different type of abuse in lithium-ion cells and packs, but the understanding is still insufficient in terms of the combustion process. In this study, three different lithium-ion cell chemistries (LCO, NMC and LFP) are studied in two environmental conditions with different oxygen content (0% and 21%) in a continuous flow vessel to understand if the use of inert atmosphere may be a pathway to avoid thermal runaway. In addition, detailed optical research is conducted together with temperature sensing to understand the venting through the vent cap before the thermal runaway. The combustion is recorded with a high-speed camera (6,000 fps) while the venting is visualized through a Schlieren technique with another high-speed camera (12,000 fps). The thermodynamic results show that the venting process can be detected by a cell surface temperature decrease of around 5°C, while the thermal runaway is seen as a battery self-heating (cell temperature higher than the ambient) and a suddenly increase of temperature until 700°C in the surface of the cell. The optical access to the combustion chamber allows to observe with detail the venting of liquid electrolyte among the gases generated by the thermal abuse. In addition, the combustion records show that with inert atmosphere the combustion it is not initiated, and the process is restricted to smoke ejection. By contrast, the case of air (21% O₂) resulted in combustion outside the battery cell with high increase of the air temperature. In terms of battery chemistry, the Lithium, Ferrum, Phosphate (LFP) shows the highest safety time and lowest chamber temperatures. LCO and Nickel Manganese Cobalt (NMC) had similar behavior in terms of safety time and temperature behavior, but Lithium Cobalt Oxygen (LCO) shows more variation with respect to the atmosphere (reactive and inert) than NMC.

Keywords

Battery Thermal Runaway; Electric Vehicles; Fire; Lithium-Ion Battery; Safety

43 1. Introduction

44 Alarming reports published in the last years have been reinforcing the need of
45 reducing the carbon dioxide emissions produced by human activities [1][2][3]. Recently,
46 the Intergovernmental Panel on Climate Change (IPCC) have provided light on the
47 possible scenarios that may occur in case of that no measures are applied to control de
48 CO₂ emissions, pointing that the average temperature in the earth could increase from
49 1.2°C to 1.9°C by 2040 [4]. Considering these studies, most of the countries are releasing
50 new pledges to avoid such a catastrophic scenario [5]. Specifically in the transportation
51 sector, which is responsible by 18% of the total CO₂ emissions emitted in the energy
52 sector in Europe [6], mandates that prone the fast introduction of battery electric
53 vehicles are being approved. As per, Europe has considered to ban the sales of new
54 internal combustion engine vehicles by 2030 [7]. However, this ambitious plan still faces
55 several contradictory arguments. First, electric vehicles still emit CO₂ in a life-cycle basis,
56 being heavily dependent on the energy matrix that is used for charging the batteries [8].
57 Additionally, the infrastructure needed must be fully deployed, requiring incentives to
58 install fast chargers in urban, highway and rural areas [9]. Nonetheless, one of the most
59 concerning issues relies on the safety matters that are related to this propulsion system.
60 Different reports and news have stressed the battery fire hazards that may occur during
61 vehicle operation or charging [10]. This alarming issue, generally originated by a
62 phenomenon called battery thermal runaway (BTR) has a devastating potential,
63 threatening the passenger life [11]. In this sense, it is considered that the understanding
64 of these phenomenon and how to mitigate it on a battery cell level is of utmost
65 importance to guarantee the successful deployment of battery electric vehicles in the
66 market [12][13].

67 In this sense, different investigations have been performed aiming at improving the
68 understanding of the BTR from kinetic based analysis to complete module response
69 [14][15][16]. On the kinetic side, Hatchard et al. [17] pioneered on proposing an
70 Arrhenius based description for the different decomposition reactions that may lead to
71 the thermal runaway occurrence. They identified that the SEI decomposition may
72 releases organic compounds that reacts with the oxygen with the cathode in an
73 exothermic way. As the temperature increases, the exponential dependence of the
74 reaction rates with the temperature leads to an accelerating process. In case of having
75 an excessive decomposition of the solid electrolyte interface, an internal short circuit
76 may occur, opening new pathways of the decomposition from the cathode and anode
77 reactions, which provides an abrupt energy release and possible fire occurrence.
78 Different authors [18] [19] have followed the modelling approach proposed by Hatchard
79 et al. [17], improving the number of reactions accounted for the thermal runaway
80 description or enhancing the modelling for other battery chemistries.

81 The battery chemistries play a dominant role on the thermal stability of the battery
82 cell and, consequently, on the battery thermal runaway occurrence [20][21]. Currently,
83 the most used battery cathode chemistries in the automotive sector are Nickel
84 Manganese Cobalt (NMC), Lithium, Ferrum, Phosphate (LFP) and Lithium Cobalt Oxygen

85 (LCO) [22]. While NMC cells present a high energy capacity they have a low thermal
86 stability compared to LFP battery cells. Investigations performed on accelerated rate
87 calorimeters have identified that both cell venting and the thermal runaway onset takes
88 places at lower temperatures for the NMC 811 compared to a LFP cell [20][23]. Another
89 factor that can influence the thermal runaway occurrence is the environment at which
90 the cells are exposed. Chen et al. [24] has assessed the influence of different
91 environment pressures aiming at simulating the utilization of 18650 LCO battery cells at
92 high altitudes. They have observed that the thermal runaway is highly dependent on the
93 ambient pressure. Low values of external pressure led to early thermal runaway
94 occurrence and higher peak temperatures. Guo et al. [25] have also investigated the
95 effect of the environment temperature on the thermal runaway occurrence, considering
96 18650 LCO batteries during the study. The results suggested that despite of achieving
97 the temperature onset in small times, high environment temperature values did not
98 change the thermal runaway onset, indicating that the chemistry of the battery plays a
99 dominant role on defining the thermal runaway occurrence.

100 Despite the different evaluations, the effect of the atmosphere composition was still
101 not addressed. It is believed that the use of inert atmosphere could offer a way to
102 decrease the impact of the thermal runaway of a battery cell over the pack. Recently,
103 Weng et al. [26] has identified that the reduction of the oxygen concentration reduces
104 the thermal runaway propagation speed by 44%. Nonetheless, no extra evidence is
105 found in the literature, at the best of the authors knowledge, where comparisons
106 between inert and reactive environments are used during the cell evaluation.
107 Additionally, most of the studies are restricted to provide only temperature and voltage
108 measurements of the battery cell for a unique battery chemistry [27]. Although the
109 importance of these parameters is clear, changes in the environment may change not
110 only the battery related parameters but also the succession of phenomena that may
111 occur with the vented gases in the environment at which the battery is exposed. For this
112 type of analysis, more sophisticated assessment techniques rather than only
113 temperature measurements should be used such as fast imaging. However, the
114 application of this techniques is still restricted in the battery investigation field.

115 In this sense, this work aims at evaluating the effect of the environment composition
116 on the thermal runaway evolution for different battery chemistries by means of both
117 thermodynamic and optical measurement techniques. 18650 LCO, NMC and LFP battery
118 cells with 100% of SOC were tested in a continuous flow vessel (CFV) test bed using a
119 temperature ramp of 11°C/min for all the cases. The continuous flow allows enhance
120 the visualization of the battery venting and combustion. Inert and reactive environment
121 were promoted inside of the vessel by using N₂ or synthetic air (O₂+N₂) as working gas,
122 respectively. Schlieren and natural luminosity techniques were employed to identify the
123 venting pattern of the ejected flow from the battery cell as well as its nature (liquid or
124 solid) and to compare the evolution of the combustion process for each case. In spite of
125 that in the literature can be found several works studying inert atmosphere and different
126 cathode materials [28][29] as well as battery thermal management [30][31], the main
127 novelty of this work is the study through detailed venting and thermal runaway images

128 that can help to understand how the phenomena initiate and propagate outside the
 129 battery cell. Up to the knowledge of the authors, this work includes a unique thermal
 130 runaway description by high speed visualization and there are no works in the
 131 bibliography that have this information.

132 2. Experimental tools

133 This section intends to describe in detail the experimental facilities used during this
 134 investigation as well as the different optical techniques to assess the BTR phenomenon.

135 2.1. Lithium-Ion battery cell

136 For this study, three different cells were used to understand the effect of the battery
 137 chemistry and electrical characteristics in the thermal runaway process. Lithium Cobalt
 138 Oxide (LiCoO₂) also named as ICR or LCO, Lithium Manganese Nickel (LiNiMnCoO₂) also
 139 named as INR or NMC and Lithium Iron Phosphate (LiFePO₄) also named as IFR or LFP were
 140 taken for the study. Samsung 26J (LCO), Samsung 20R (NMC) and NX 9073 (LFP) commercial
 141 lithium-ion batteries are used. Among the cathode chemistry differences, the nominal
 142 capacity and electrical characteristics changes with a range from 2.6 to 1.8 Ah. The size is
 143 maintained, being all cylindrical cells 18650 (18 mm diameter and 65 mm height) with
 144 similar total weight (≈ 43.5 grams). In terms of safety, the battery cells have a vent cap to
 145 release the pressure when submitted to an abuse. In this case, the LCO Samsung 26J has 6
 146 symmetric holes and the other two cells have 3 holes. For this study all cells are tested in
 147 maximum state of charge (SOC = 100%), charged by a constant current of 1C until reaching
 148 the maximum voltage and then charged at maximum voltage until the current goes to zero
 149 as suggested by the manufacturers. During the charging, the ambient temperature is
 150 maintained at 20°C and the battery under natural convection cooling ($h \approx 5$ W/m²K).
 151 Detailed information about the battery cells can be found in Table 1.

152 Overall, LCO are the most common type of Lithium-Ion cell with a high energy content
 153 but low charge and discharge current. On the other hand, NMC has less capacity and
 154 available energy but can deliver higher current rates. Lastly, LFP is characterized by a
 155 low voltage operation and similar discharging rate than the LCO.

156 Table 1 – Main Lithium-Ion Samsung 26J battery cell properties.

Parameter	ICR (Samsung 26J)	INR (Samsung 20R)	IFR (NX 7063)
Cell Origin [-]	Purchase in free market		
Cell format [-]	18650		
Dimensions [mm]	18.3 x 65.0		
Cathode Chemistry [-]	LCO	NMC	LFP
Weight [g]	44.18 ± 0.19	43.21 ± 1.16	40.87 ± 0.02
Nominal Capacity [Ah]	2.6	2.0	1.8
Nominal Voltage [V]	3.6	3.6	3.2
Current Charge Continuous/Peak [A]	1.3/2.6	1.0/4.0	1.8/NA
Charging Time Normal/Rapid [min]	180/150	180/50	110/NA
Current Discharge Continuous/Peak [A]	5.2/NA	22/NA	5.4/10@5s
Energy [Wh]	9.36	7.20	5.76
Energy density gravimetric [Wh/kg] / volumetric [Wh/L]	210/566	162/435	139/348

<i>Vent Cap holes</i>	6 holes	3 holes	3 holes
<i>Voltage at 100% SOC [V]</i>	4.02	4.15	3.65
<i>Cut-off voltage [V]</i>	2.75	2.50	2.50
<i>State of Charge for testing in CFV [%]</i>	100		

*Energy [Wh]= Nominal Capacity [Ah] x Nominal Voltage [V]

157

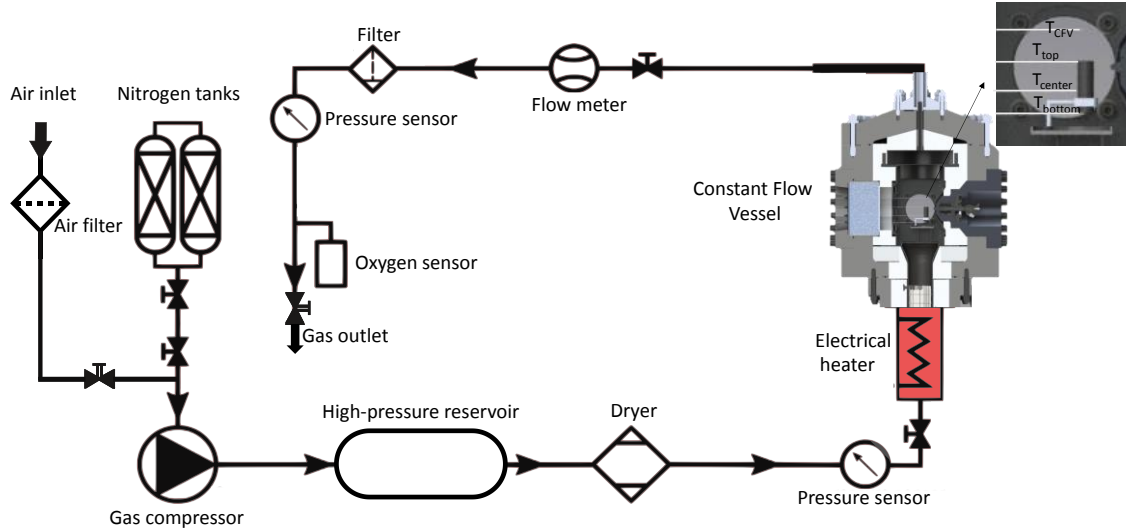
158 2.2. Continuous Flow Vessel

159 Each one of the battery cells described previously were exposed to controlled
160 environments regarding temperature, pressure, and composition. This was attained by
161 means of using a continuous flow vessel (CFV). This vessel is well documented and has
162 been used in different fundamental evaluations for spray and combustion analysis at
163 controlled conditions [32][33]. For this study, the CFV was adapted by building a new
164 holder for the battery and supports for thermocouples to monitor the battery
165 temperature. The holder enhances the air homogeneity while protects the direct impact
166 of the hot air with the battery prior the mixing inside the vessel. This experimental
167 apparatus was designed to support temperatures up to 1370°C and an internal pressure
168 of 150 bar, presenting approximately 40 L in volume. A scheme of the experimental set
169 up is shown in Figure 1. Thermocouples type K were used to monitor the temperature
170 increase at three different locations of the battery cell (bottom, center and top) and on
171 the continuous flow vessel Environment. The thermocouples present a measurement
172 range from -200 °C to 1260 °C and a total uncertainty of ±2.5°C.

173 This device offers several benefits such as the ability of controlling the heating rate, mass
174 flow rate and composition of the internal volume at which the battery is inserted. The
175 mechanisms behind each actuation are illustrated in **¡Error! No se encuentra el origen
176 de la referencia..** Both temperature and pressure in the chamber are controlled by
177 means of a closed loop actuation based on proportional integral derivative (PID)
178 controllers. The feedback signals (temperature and pressure) to feed the PID are
179 obtained inside of the vessel. In particular, the temperature is increased by external
180 heaters and the pressure by regulating the compressor outlet pressure and the valve
181 downstream the vessel. Therefore, for this CFV it is possible to achieve 1370°C and a
182 range of pressure between 2.6 bar to 150 bar. The minimum pressure cannot be
183 decreased in the CFV due to the minimum amount of gas in the inlet to protect the
184 resistance. As in this experiment is wanted to replicate real battery application, the
185 minimum is set. The system contains different safety management devices that
186 guarantees a minimum coolant flow output, maximum heater output temperature, and
187 a minimum gas flow value to protect the heaters.

188 Different external devices support the proper operation of the CFV. The feeding system
189 of the CFV allows the operation with different gases. This can be attained by modifying
190 the gas bottle that is added to the system. Its standard operation consists of using dried
191 air. This air is compressed by a set of compressors and then stored in high-pressure
192 vessels. Next, the temperature of the air can be controlled by means of a power
193 regulated electric heating system with maximum capacity of 30 kW. It is important to
194 remark that the CFV structure is composed of several layers aimed at reducing the heat

195 transfer to the environment. Finally, this device is designed to enable the application of
 196 simultaneous optical techniques. For this, it has three flat optical windows made by
 197 quartz, which allows no optical distortion. The main characteristics of the CFV vessel as
 198 well as the conditions used for the test are presented in Table 2.



199

200 Figure 1 – Scheme of the experimental set up in the Continuous Flow Vessel (CFV).

200

201 Table 2 – Main test rig parameters for the battery thermal runaway study.

201

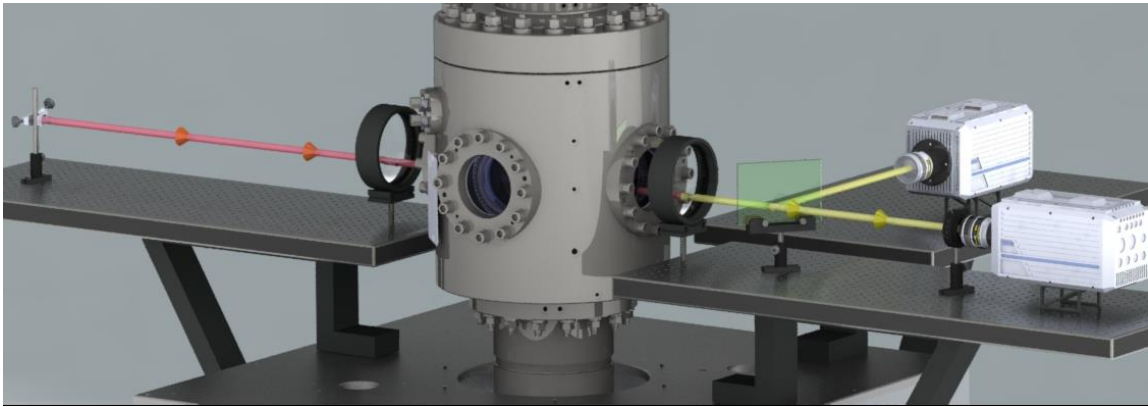
Parameter	Value
<i>Thermocouples Type K, 1 mm diameter and 300 mm length, Range [°C]</i>	Up to 1100
<i>Volumetric flow meter, Brooks Models SLA5863S, Flow rate [l/min]</i>	0-2000
<i>Chamber pressure sensor, WIKA IS-20-S-BBP, Pressure range [bar]</i>	0-160
<i>Continuous Flow Vessel Messkammer CMT from Advanced Combustion GmbH, max pressure [bar] and max chamber temperature [°C]</i>	150/1373
<i>Control Volume Size [L]</i>	40
<i>Heating resistance power [kW]</i>	30
<i>Volumetric flow during experiment [m³/h]</i>	54
<i>Pressure during experiment [bar]</i>	2.6
<i>Heating ramp for thermal abuse [°C/min]</i>	11.0
<i>Inlet gas [-]</i>	Air/N ₂

202 In this study, to investigate the thermal runaway occurrence at both inert and reactive
 203 conditions, the CFV was operated with the minimum allowable flow. This was found to
 204 be the best compromise between flame distortion and vessel scavenging in previous
 205 work [34]. A single heating ramp of 11°C/min was considered for all the cases evaluated
 206 and was maintained for the whole analysis. This means that the heating device is never
 207 turned off during the experiment. The resistance power is controlled to maintain the
 208 11°C/min in the chamber temperature including after the thermal runaway episode to
 209 fully understand the cell behaviour in all the temperature range. This differs from the
 210 operation in accelerated rate calorimeters, which generally run on a heat-wait-search
 211 method. The higher heating levels also allows to decrease the experiment time in one
 212 order of magnitude compared to ARC and oven tests. In general, the total time spent
 213 during the evaluations is 25 min. More information about heating ramp effect can be
 214 seen in previous publication of the research group [34].

215

216 2.3. Optical techniques and experimental setup

217 The CFV contains three optical accesses, as shown in Figure 2. Two simultaneous optical
 218 techniques (Schlieren and Natural Luminosity) were employed during this investigation
 219 in the two optical accesses of 128 mm diameter located in a line-of-sight arrangement.
 220 The third window was replaced to include a thermocouple holder, which enabled to
 221 track the temperature evolution at different battery locations as well as in the interior
 222 of the CFV. A detailed description of the CFV can be found in previous works of the
 223 research group [34][35]. The Schlieren optical technique was applied aiming to visualize
 224 and characterize the venting of both gaseous and liquid phases. Additionally, the natural
 225 luminosity (NL) was recorded to investigate the combustion development through the
 226 thermal radiation emitted by the combustion process. Figure 2 illustrates the
 227 experimental setup used for this investigation, whereas Table 3 provides the most
 228 significant characteristics of the optical setup.



229

230 Figure 2 – Scheme of the optical techniques Continuous Flow Vessel (CFV).

231 Table 3 – Visualization components for Schlieren, Natural Luminosity and OH* tracking.

Component	Quantity	Specifications
High Speed Camera Photron Fastcam NOVA	2	12-bit image, up to 16000 fps in max resolution.
Lens Carl Zeiss Makro-Planar	1	Focal length 100 mm, f/2 lens
Lens Nikon UV	1	Focal length 105 mm, UV, f/4.5 lens
Beam splitter	1	178x127 mm 50%T/50%R with a range from 450 to 750 nm.
Light Source Karl Storz Nova 300	1	Xenon lamp 300 Watts.
Spherical lens	1	f = 450 mm, D = 150 mm.
Spherical UV lens	1	f = 750 mm, D = 150 mm, UV.
Iris diaphragm	2	Metal iris diaphragm of diameter max 13 mm. Open diameter for experiment 5 mm.

232 The refraction theory says that whenever a light ray that travels through a medium that
 233 has different refractive index gradients, it can suffer a deflection. This phenomenon is
 234 the basis of the Schlieren technique [36]. The same variation of refractive index can be
 235 found on density variations of a flow. Therefore, this phenomenon can be translated in
 236 as different grey levels in an image, allowing to observe the density field that is

237 originated by the venting process. To obtain this, the light from the light source crosses
238 the vessel from one window to the other and, consequently, through the venting gases
239 and liquids, which generates the Schlieren visualization. To visualize the vent gas and
240 liquid ejected during the venting process, a high-speed single pass schlieren setup was
241 developed. The illumination was attained by means of xenon lamp, driven with a liquid
242 light guide. This allowed to create a point light source at the focal length plane of a
243 spherical lens ($f = 450$ mm, $D = 150$ mm). In this sense, the area to be measured is
244 illuminated with a collimated beam. The lens is separated from the light by 450 mm,
245 while the CFV window and the lens are 5 mm apart. At the opposite side of the CFV, a
246 spherical UV lens ($f = 750$ mm, $D = 150$ mm) was positioned near to the optical access (5
247 mm of the CFV window). The objective of this lens is to focus the light onto the Fourier
248 plane where an iris diaphragm with a cut-off diameter of 5 mm was located. The UV lens
249 and the iris diaphragm were separated by a distance of 750 mm. To quantify the process
250 with values as the spray distance, speed penetration and spray angle, an image
251 postprocessing was done by means of an in-house MATLAB code that is capable to
252 subtract the background and define the spray contours by using a threshold of 60% of
253 the maximum light. The penetration of the spray is quantified by the average distance
254 of the further point of each jet during venting. The speed of the spray is calculated by
255 derivation the spray penetration due to the temporal resolution of the images. Lastly,
256 the cone angle is measured by the angle between opposite jets. The passage from pixel
257 to millimetres is done with a spatial resolution calibration. As it is possible to observe,
258 this calibration was checked with the diameter of the cell (18 mm).

259 Images were recorded at 12000 fps (0.083 ms) using a Photron Fastcam NOVA high
260 speed CMOS camera close to the iris diaphragm. The camera was equipped with a Carl
261 Zeiss Makro-Planar T 100 mm f/2 ZF2 camera lens (Carl Zeiss, Aalen, Germany). The
262 shutter time was kept constant in 1.66 μ s for all the experiments while the resolution
263 was kept at 640 \times 784 pixel with a total magnification of 6.8 pixel/mm. The combination
264 of the frame rate and resolution gives a total recording time of 2.0 s. An end trigger was
265 used to obtain the precise moment of the venting. Post processing of the images to
266 calculate spray distance and speed penetration, as well as angle of the spray, was carried
267 out in a MATLAB code. Details about the code and the assumptions used in the post
268 processing such as the threshold levels are presented in a previous work [34].

269 The Natural luminosity signal has as source the thermal radiation emitted during the
270 combustion process by the lithium ion cell [37]. This technique provides a way to
271 investigate the propagation of the flame, its stabilization and quenching during the
272 thermal runaway. This technique uses a Photron Fastcam NOVA high speed CMOS
273 camera with an exposure time of 0.208 μ s and a frame rate of 6000 fps (0.166 ms) was
274 used. A Carl Zeiss Makro-Planar T 100 mm f/2 ZF2 lens was installed in the camera. The
275 image resolution was 768 \times 720 pixels with a spatial resolution of 6.6 pixels/mm. This
276 camera was positioned in perpendicular to the field of view as shown in Figure 2. A beam
277 splitter is used to reflect the light to the camera which is manually triggered to record
278 images from the start of the combustion.

279

280 3. Results

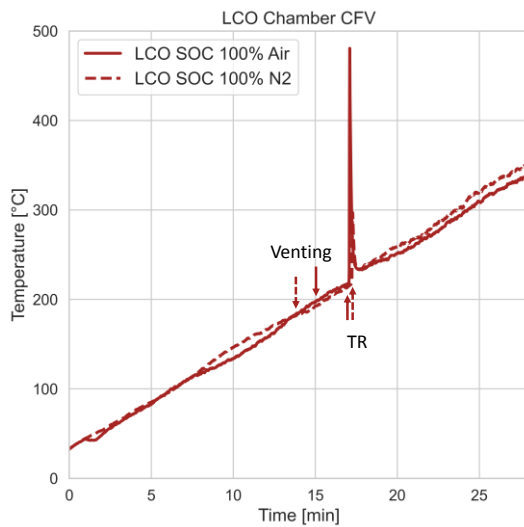
281 The results section is divided into two different parts. First, the thermodynamic results
282 are presented, illustrating the effect of the different battery chemistries and
283 environmental conditions on the temperature evolution and characteristic parameters
284 of the thermal runaway process. Finally, the optical results from the schlieren and
285 natural luminosity in the venting and combustion process are discussed in detail.

286 3.1. Thermodynamic Results

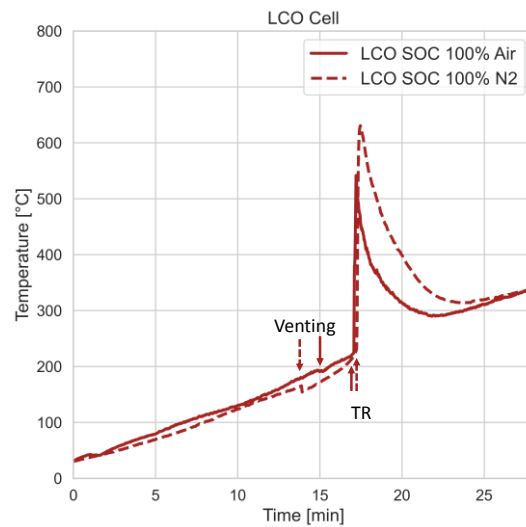
287 Six experimental tests were done with three battery chemistries and two oxygen
288 concentrations in the continuous flow chamber (21% and 0%). Figure 3 shows the
289 temperature evolution comparison for the same battery chemistry with Air (21% O₂) and
290 N₂ (inert condition, 0% O₂). The sensor located in the chamber shows the temperature
291 evolution of the ambient that surrounded the battery cell and the cell temperature
292 sensor shows the average temperature of three sensors located in the center and
293 extremes of the cylindrical cell. Figure 3a and Figure 3b shows the LCO (Samsung 26J)
294 cell in which is possible to observe that the instant of initiate the TR as well as the venting
295 is similar between air and N₂. The first phenomenon is identified by a suddenly increase
296 of temperature with a peak above 300°C in the chamber and cell and the second
297 phenomenon by a small decrease of surface temperature of the cell before the TR. Both
298 processes will be described in the image section analysis with more details. Initially, it
299 can be observed that the thermal runaway temperature onset is maintained,
300 independently on the atmosphere that is used outside of the battery. This result agrees
301 with the phenomenological explanation of the thermal runaway, where the main driver
302 is attributed to the temperature increase. External temperatures may modify the heat
303 transfer rate from the battery to the environment and vice-versa. But, since the
304 temperature is maintained during the heating phase for both cells, the heat transfer
305 phenomena is not very much dominant on the early phases of the TR. During the
306 thermal runaway evolution, the case with air (oxygen presence) achieves a higher
307 chamber peak. Both cases show a similar temperature increase in the first instant, but
308 the inert case had a higher temperature cell along all the TR process. The maximum
309 internal temperature achieved during the thermal runaway is dependent on several
310 factors. First, the SOC of the battery dictates the amount of intercalated lithium-ion that
311 are charged (reactive mass) and may react during the thermal runaway. In addition, the
312 venting process dictates the quantity of mass that is released in the early phases of the
313 battery decomposition. Since this mass is expelled to the environment, it will not
314 contribute to the internal temperature increase. State-of-charge differences are
315 discarded in this case, since each of the cells were conditioned by means of a rigorous
316 process using charge controller devices. In this sense, the differences observed in the
317 temperature evolution might be related to the amount of mass that remains inside the
318 battery during the thermal runaway as well as the heat transfer from the cell to the
319 environment for high temperature conditions, i.e., conditions were the CFV
320 temperature is modified by the TR. The former is hypothesized to be the most relevant
321 parameter in this case, since the CFV temperature profiles does not demonstrates any
322 direct behavior with what is seem in the cell temperature. It is evident that the mass
323 expelled during the thermal runaway occurrence cannot be assured to be the same from

324 cell-to-cell experiments, since the main driver of the mass flow (pressure gradient) is a
 325 consequence of the geometry of the nozzles, the rupture of the safety disk, the
 326 deposition of material along the nozzles, etc. In this sense, it is believed that the
 327 modifications of the environment conditions and the avoidance of flame outside of the
 328 cell, could be a factor that influenced the release of mass from the battery to the
 329 environment during the high temperature phase of the thermal runaway. It is important
 330 to notice that the battery cell was heated with a constant heat ramp of 11°C/min until
 331 the TR finish. This means that the cell temperature reaches the chamber temperature
 332 after the suddenly increase.

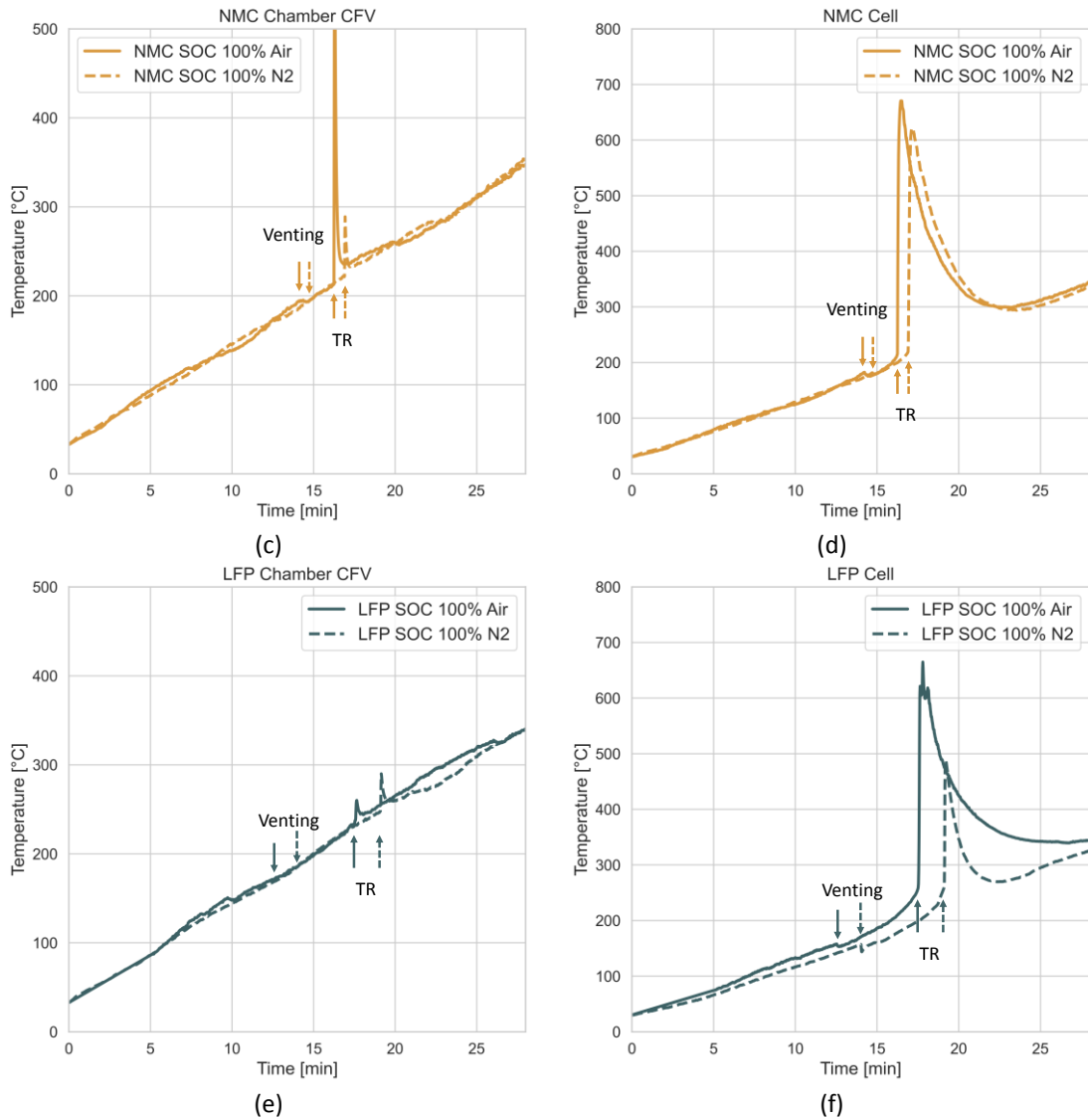
333 Similar investigation was done for the NMC (Samsung 20R) and the LFP (NX9073). Figure
 334 3c and Figure 3d shows that the venting was seen at similar time for both cases, but the
 335 TR was first for the oxygen content case. Despite the cell temperature peak was close
 336 for both conditions, the chamber temperature was 2 times higher for the air case than
 337 in inert conditions as seen for the NMC cell. The increase of the temperature of the
 338 environment due to the combustion of the expelled gases modifies the conditions for
 339 heat transfer from the cell to the environment. In this scenario, the Newton cooling law
 340 results in a deteriorated heat transfer from the cell to the environment, requiring more
 341 time to transfer the heat generated inside the battery to the environment and also
 342 resulting in higher peak temperatures. This is also subjected to the assumptions made
 343 for the LCO chemistry (same quantity of vented gases). Lastly, the LFP was the cell with
 344 more variation between both ambient conditions (Figure 3e and Figure 3f). The TR starts
 345 first for the air case and the cell peak temperature was higher than inert case. However,
 346 the most noticeable difference with the other presented cases is the chamber temperature
 347 similar for both cases. This will be explained in the next section due to the
 348 presence or not of flame in the top of the battery cell.



(a)



(b)

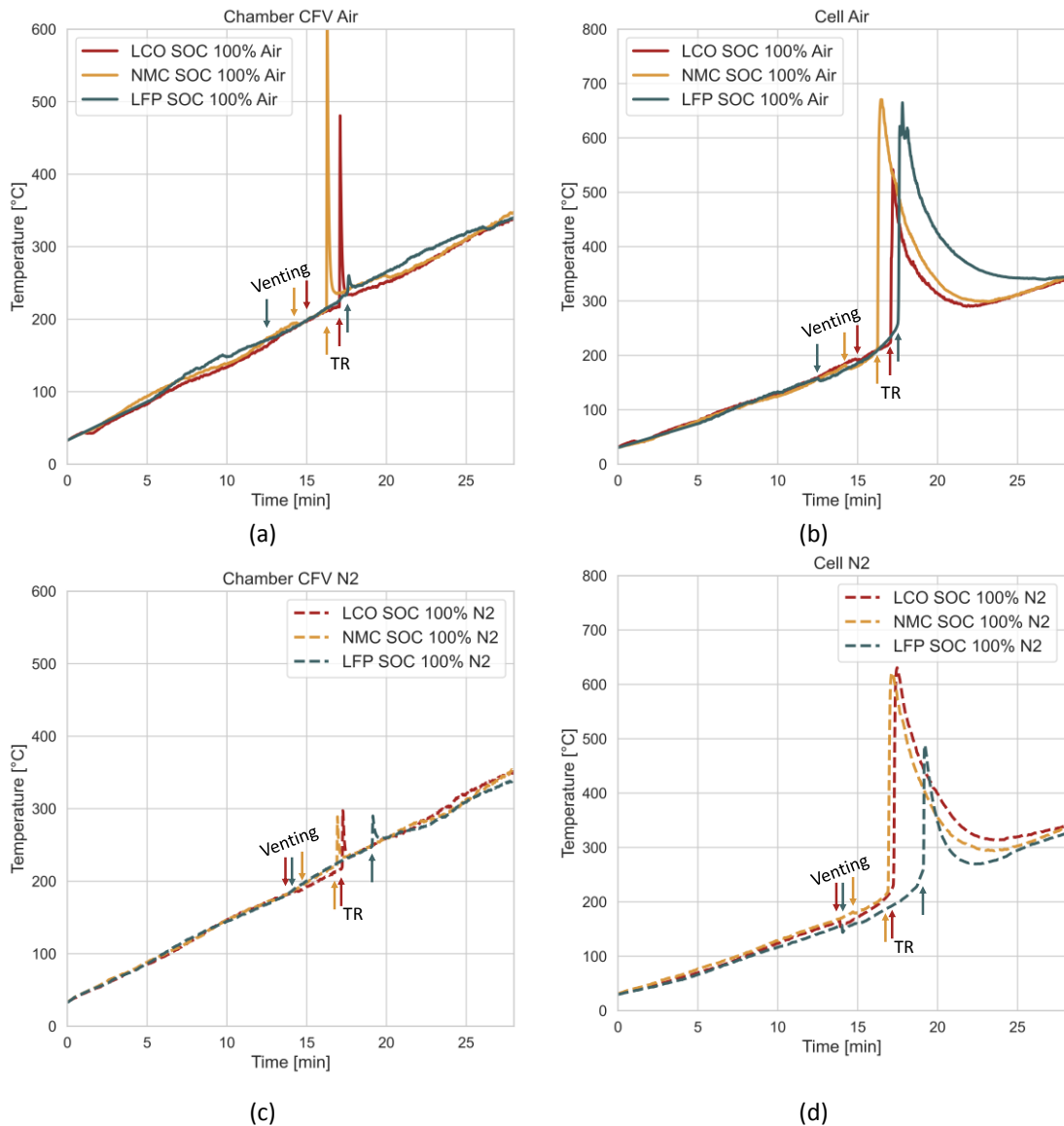


349 Figure 3 – Comparison between Air and inert N₂ atmosphere for three cell chemistries. Continuous flow
 350 vessel (CFV) chamber temperature and battery cell temperature for a heating ramp of 11.0°C/min.

351 To better understand the differences between chemistries, Figure 4 depicts the previous
 352 temperature profiles but compared by cell type in the same ambient conditions. This
 353 graph allows to observe that the NMC is the first cell to enter in TR, followed by the LCO
 354 and lastly the LFP. This result concurs with the observations from Yuan et al. [23] and it
 355 is attributed to the intrinsically stable nature of Fe and the low oxygen generation by
 356 the cathode decomposition. Also, the peak temperature follows the same trend when
 357 the chamber sensor is seen. For the cell average temperature, the maximum value is
 358 similar between NMC and LFP and a slightly lower for the LCO. Despite the delayed TR
 359 for the LFP, it is the first cell in venting followed by the LCO and NMC. This means that
 360 the LFP has the largest safety time (defined as time between venting and TR).

361 For the inert case, the NMC and LCO shows similar TR trend with close time event and
 362 peak temperature on the chamber and cell surface. The LFP shows, as in the O₂ content
 363 case, a delay in the TR and an early venting with respect to the Samsung LCO and NMC
 364 cells. The chamber and average cell temperature were lower than the other two
 365 chemistries. This confirms that for both ambient scenarios the LFP shows the highest
 366 safety time and lower ambient temperature. For a safety perspective, this is a positive

367 point due to the impact that this may have on other cells, battery case and prevention
 368 system.

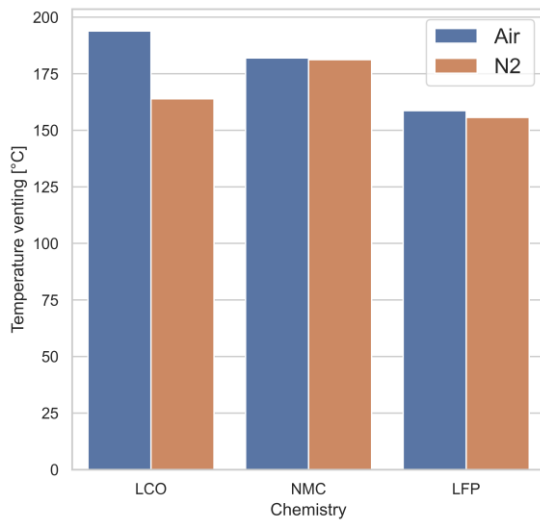


369 Figure 4 – Comparison between cell chemistries when is tested with Air and inert N₂ atmosphere.
 370 Continuous flow vessel (CFV) chamber temperature and battery cell temperature for a heating ramp of
 371 11.0°C/min.

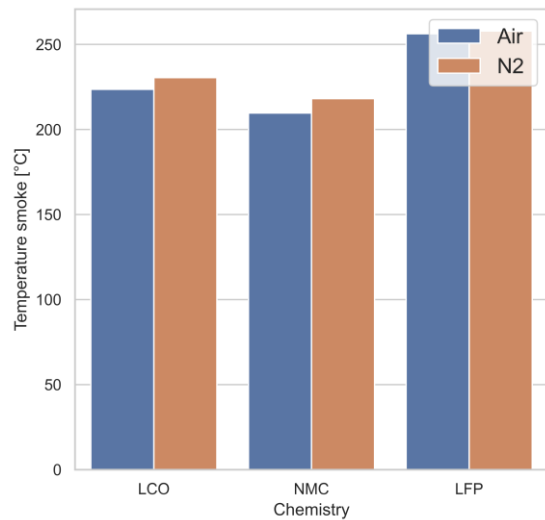
372 The details of the main significant parameters of the venting and TR seen in Figure 4
 373 (previous) are summarized in Figure 5 and Figure 6. These figures are interesting since
 374 they allow to identify both processes in terms of temperature and time. For the three
 375 cells, the average venting temperature was 173°C with a standard deviation of 14°C.
 376 Separating in air and N₂, the average values are 178°C and 167°C, respectively, with a
 377 similar standard deviation around 11°C. Focusing on the battery chemistry, the LCO,
 378 NMC and LFP shows: 179°C, 182°C and 157°C, respectively. Observing the battery
 379 chemistry in both ambient conditions the standard deviation is drastically reduced
 380 below 2°C. The case that did not reduce this variation is the LCO with 15°C. Despite the
 381 LCO shows different trend, the ambient conditions do not have a strong influence in the
 382 moment and temperature that the venting is produced. The main change is the battery
 383 chemistry.

384 The smoke event, which marks the start of the thermal runaway shows average values
385 of 230°C and 236°C for air and N₂, respectively, with a similar standard deviation around
386 18°C. Focusing on the battery chemistry, the LCO, NMC and LFP shows smoke at: 227°C,
387 214°C and 257°C, respectively. As was seen for the venting, the battery chemistry is the
388 most influencing parameter due to the drastically reduced of the standard deviation
389 below 4°C for the three cases.

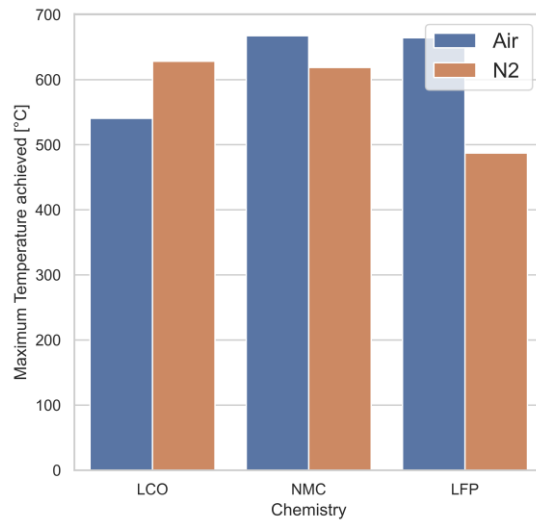
390 These results are strongly influenced by the cathode layering and composition and by
391 the cell manufacturing. The former promotes the stability of the cell, as previously
392 referred in this section. For example, the addition of Fe in the cathode layer provides
393 much higher stability than low Cobalt chemistries such as NMC and NCA. This dictates
394 the onsets of the battery thermal runaway, i.e., the temperatures where the exponential
395 temperature increase is realized. Nonetheless, another important battery feature needs
396 to be accounted in these comparisons. Each battery cell is unique in terms of safety vent
397 cap production since it is not possible to assure an exactly equal production process.
398 Moreover, each cathode chemistry can have its own vent cap opening pressure. This
399 seems to be the case, for example, for the LFP chemistry, where the first venting event
400 is evidenced much earlier in temperature compared to the NMC and LCO, despite being
401 a much stable cathode chemistry. The proper definition of the vent cap opening
402 pressure requires dedicated experiments and instrumentation and will be introduced in
403 future investigations.



(a)



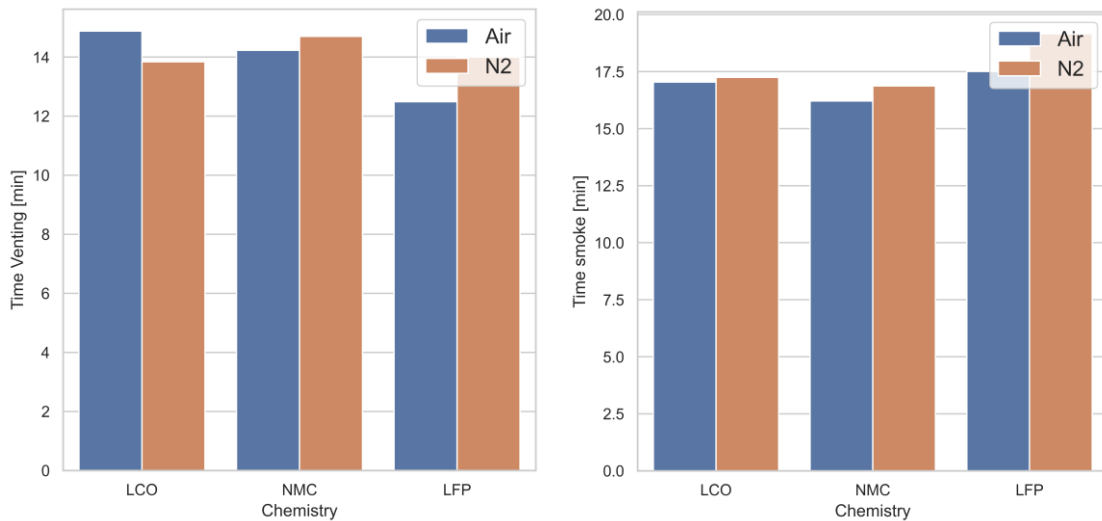
(b)



(c)

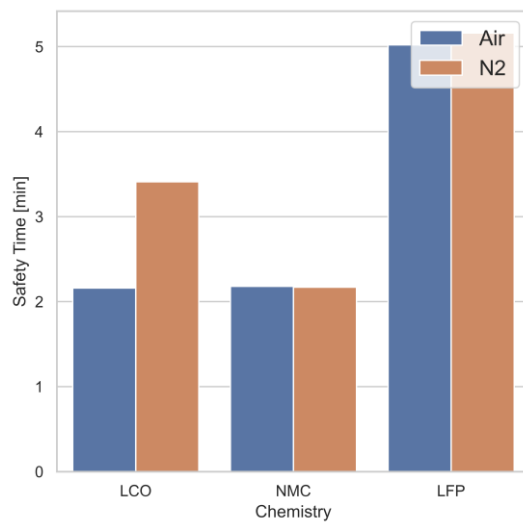
404
405

Figure 5 – Main parameter of thermal runaway by thermal abuse in terms of temperature measured in the battery cell.



(a)

(b)



(c)

406
407

Figure 6 – Main parameter of thermal runaway by thermal abuse in terms of time measured in the battery cell.

408

3.2. Visualization results

409 The visualization section is separated in two parts due to the two main events during
410 the battery thermal abuse. The first event is the venting of the liquid electrolyte and all
411 gases generated by the decomposition of the different layers. In the thermodynamic
412 analysis, it was seen a decrease of the battery surface temperature of around 5°C
413 without any relevant change in the chamber temperature measurement. The second
414 event is the thermal runaway, seen in the previous analysis as a self-heating phase
415 where the battery cell temperature increases progressively until a suddenly increase of
416 the temperature. A peak is reached in both, the cell, and the chamber, followed by a
417 cooling phase of the battery cell with the ambient temperature that continues
418 increasing with the heating ramp set.

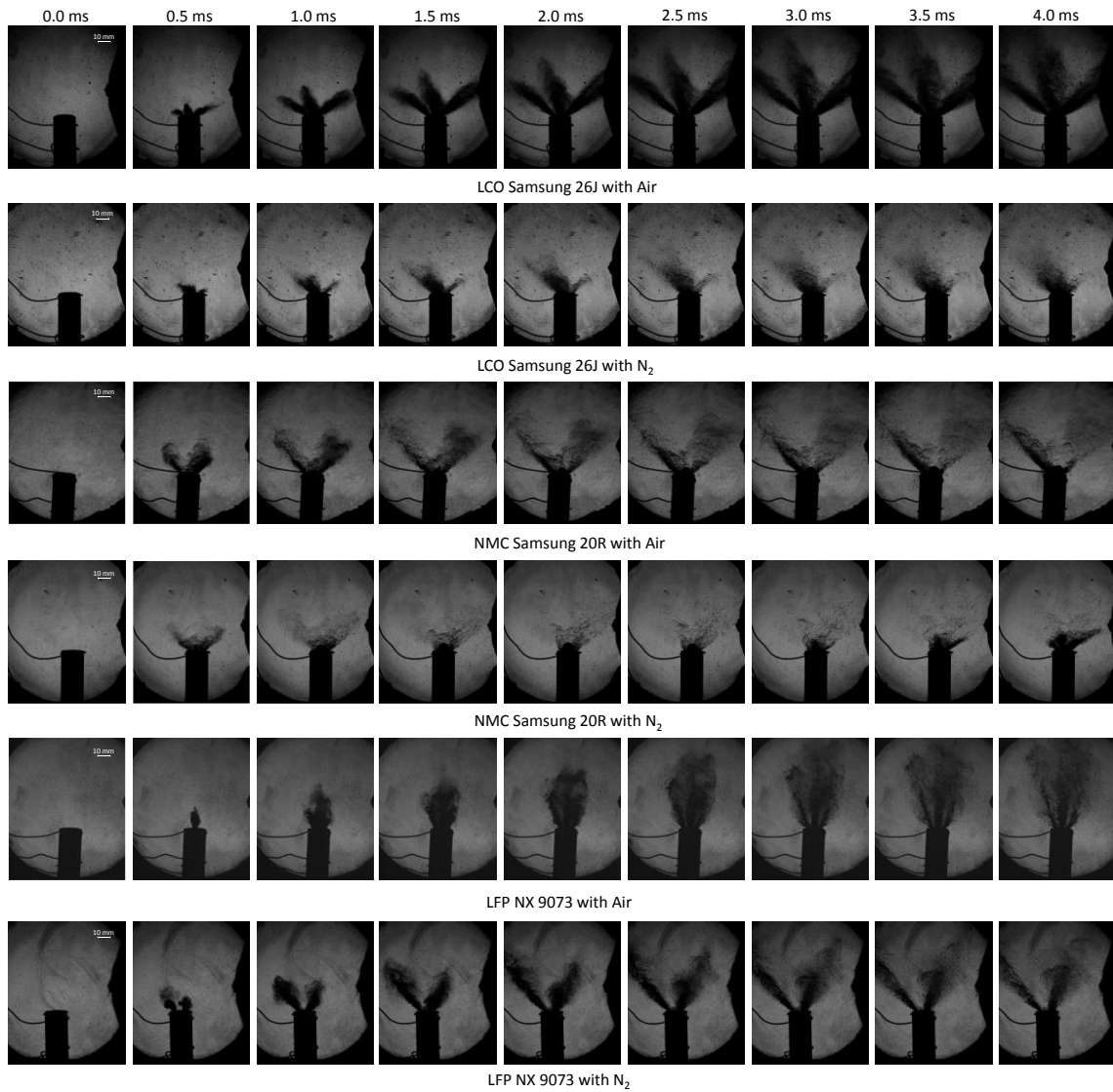
419 Based on a previous work of the research, group [34], during the venting process both
420 liquid and gas are expected to be released by the venting cap . Therefore, the Schlieren
421 technique is applied as shown in the methodology. On the other hand, on the thermal
422 runaway is generally seen a flame formed in the surrounding of the cell due to the fuel
423 gases and the hot temperature of the chamber and cell surface. Therefore, the natural
424 luminosity optical technique is applied to identify the flame growth and development
425 along the event. To observe the smoke formation that can be found in some battery
426 chemistries, the light of the schlieren was maintained. Therefore, in the camera of NL
427 the smoke will be identify as an attenuation of this light.

428 Venting Process

429 The venting process was captured by means of the Schlieren technique for the 6 cases
430 (three chemistries and two oxygen contents). Figure 7 shows the first 4 ms since is
431 possible to see any ejection of liquid or gas. The frame rate used was 12,000 fps (0.0833
432 ms). Therefore, as the time step used in Figure 7 is 0.5 ms, there are 5 figures between
433 each figure showed below. This is mentioned to show the accuracy of the first instant
434 that is possible to see the venting of cell component. For the brevity of the manuscript,
435 all figures can be seen in the video on the supplementary material. From a qualitative
436 point of view, in Figure 7 it is possible to observe that the LCO have a wider spray cone
437 with more visible jets. This is mainly due to the double number of holes (six holes) than
438 the other two cells (3 holes). Due to the camera position, in the six holes vent cap of the
439 LCO is only possible to see three clear jets. For the other cells, NMC shows clear two jets
440 and the LFP in the beginning only on jet but after 2.5 ms is divided into three jets. After
441 the test ends, it is possible to see that the vent cap rupture obstructs one hole. This
442 explains the two visible jets.

443 Furthermore, for the same cell chemistry in different ambient conditions, the spray have
444 large changes. As the properties of gas density, diffusivity among other is close for Air
445 and pure N₂, the variation can be more related to the venting process and the cell
446 behaviors. The vent cap rupture in an irregular way can influence in the ejection of the
447 liquid, gas and, in less quantity, solid parts of the battery cell. In the first 4 ms it is
448 possible to see a large amount of liquid being released together with gases. This can be
449 appreciated for the dark color of the images instead of a simple grey variation when is
450 only gas detected.

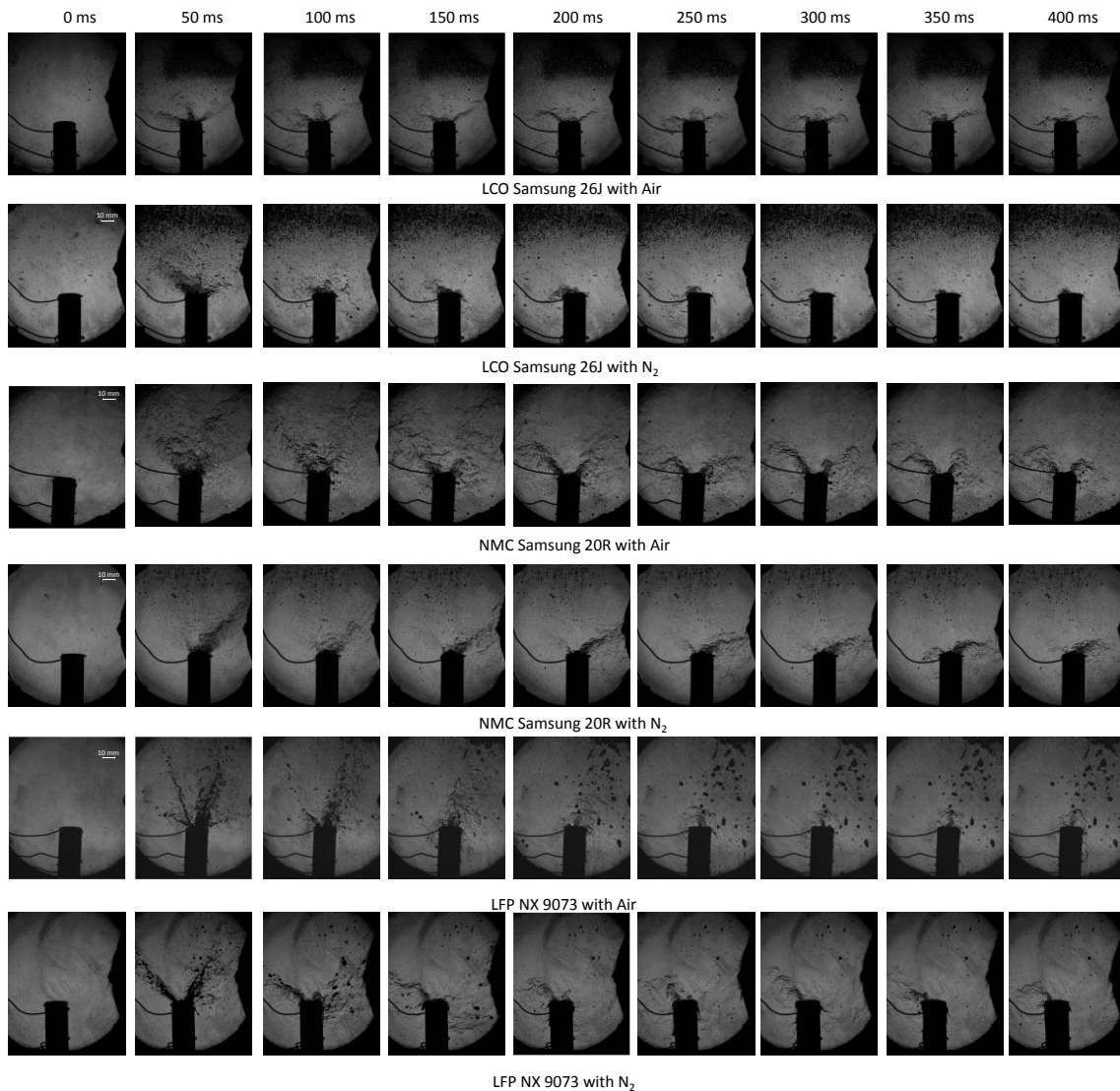
451 Figure 8 shows a sequence with 400 ms with a time step of 50 ms for better appreciate
452 all venting process. The LFP shows large time of liquid ejection with higher droplets size
453 for both air and N₂ cases. On the other hand, the NMC was the first to finish the
454 combined liquid-gas phase to continue only with gas ejection. After the 400 ms, all cells
455 continue ejecting gas but with low intensity until the thermal runaway.



456

457

Figure 7 –Schlieren Technique for venting process with 0.5 ms of step time.



458

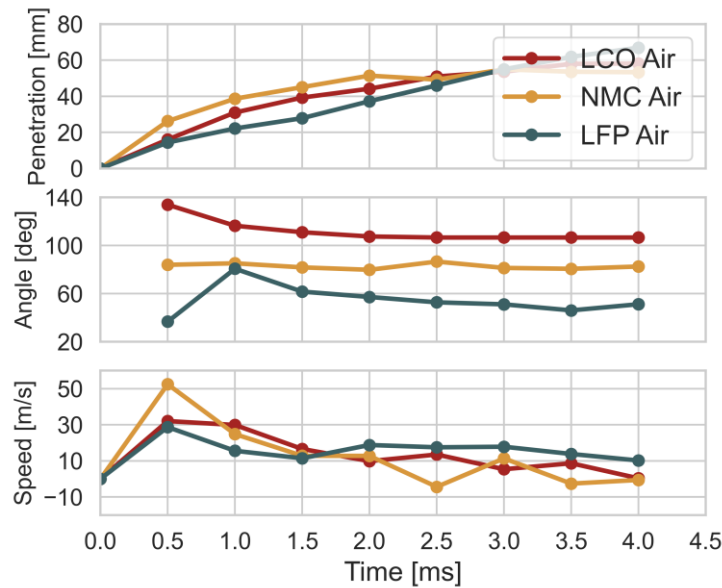
459

Figure 8 –Schlieren Technique for venting process with 50 ms of step time.

460 Figure 9 shows a quantitative analysis of the first instant of the venting process in which
 461 there is no wall interaction, and the ejection is mainly liquid phase for the three
 462 chemistries with air. The results shown in Figure 9a are the average of the jet distance
 463 from the vent cap center as well the speed derivative from the last measured parameter.
 464 The NMC has the fast growth in the beginning of the process (until 1 ms) with a peak
 465 speed of 50 m/s instead of 30 m/s for the LCO and LFP, but after 3 ms the trend is
 466 reverted. The NMC starts to have less ejected liquid. Therefore, the spray starts to
 467 decrease while for the LCO and LFP the spray is maintained. The other interesting
 468 parameter is the cone defined as the angle between the left and right jet (Figure 9b).
 469 The results show that LCO start with a wide angle and after 3 ms the three jets are closer
 470 with a constant angle around 110° . The NMC with two jets maintains an angle around
 471 85° for the entire process. Lastly, the LFP spray cone angle graph shows that start
 472 the three jets close to the vertical axis and then it opens with the three jets making a cone
 473 of 50° . It is possible to observe that despite the NMC and LFP have three holes the spray
 474 is different due to the fabricant design, vent cap rupture and liquid content.

475

476



477

478 Figure 9 –Schlieren Technique for venting process with 50 ms of step time in terms of average jet
479 distance from the vent cap, angle between right and left jets (cone angle) and average speed obtained
480 from the measured distance.

481 Combustion Process

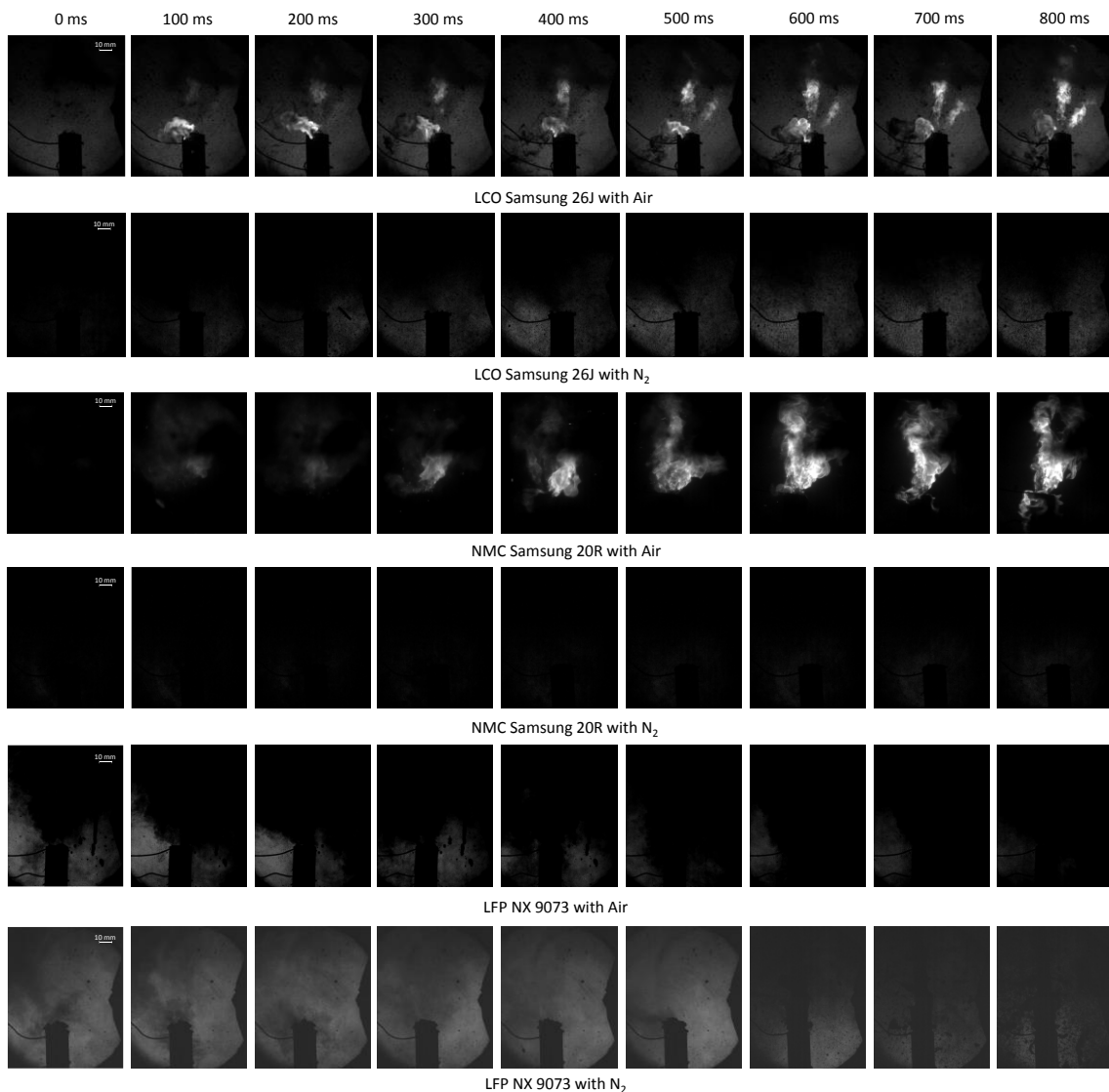
482 After the venting process seeing in the previous section, it exists a period of self-heating
483 until the point that the cell enters in thermal runaway. In the thermodynamic analysis
484 can be seen as a suddenly increase of the temperature with the cell surface up to 700°C
485 and chamber up to 500°C. This section shows the thermal runaway with a natural
486 luminosity technique taken with a frame rate of 6000 fps. As it was mentioned in the
487 methodology, the light source is maintained for the smoke visualization.

488 Figure 10 shows the six cases with a time step of 100 ms to observe almost one second
489 of the thermal runaway process. The LCO and NMC cells in air environment show flame
490 propagation from the vent cap. Despite being a continuous flow, the gas and
491 temperature were enough high for the combustion ignition and maintenance. The LCO
492 did not show smoke period and the flame propagates in the same three jets observed
493 during the venting process (see Figure 7). The NMC did not show a clear preferential
494 flame propagation, being all around the vent cap. The other information that can be
495 obtained is that to perform a spatial characterization, as was done with the spray during
496 the venting process, is not an easy task. The flame has random propagation with changes
497 due to the inlet CFV gas and gas flow from inside the battery. For the LCO, the flame is
498 sustained in three clear jets. However, the NMC shows a not defined flame with part
499 being downstream.

500 The main different behaviour was seen in the LFP, which in presence of oxygen did not
501 show flame. For this cell, the smoke is less intense than the inert case. In addition, a

502 characteristic of this test is that the vent cap was totally ruptured and the interior of the
503 cell was expelled to the outside. The reader is invited to see the supplementary material
504 to observe the final state of the cell.

505 The inert cases (no oxygen content) did not show flame. Despite several studies show
506 that the vent gas contains oxygen, but it is not enough for the flame ignition. All cells
507 show an intense smoke generation with difficulties to observe the cell after 500 ms. This
508 drops the conclusion that using a battery package without air content inside can be a
509 good alternative to avoid flame propagation. However, the temperature increase cannot
510 be avoided with inert atmosphere as shown in the thermodynamic analysis. For the
511 three cells, the smoke is intense and cannot be removed easily in spite of the high CFV
512 volumetric flow of inlet gas.

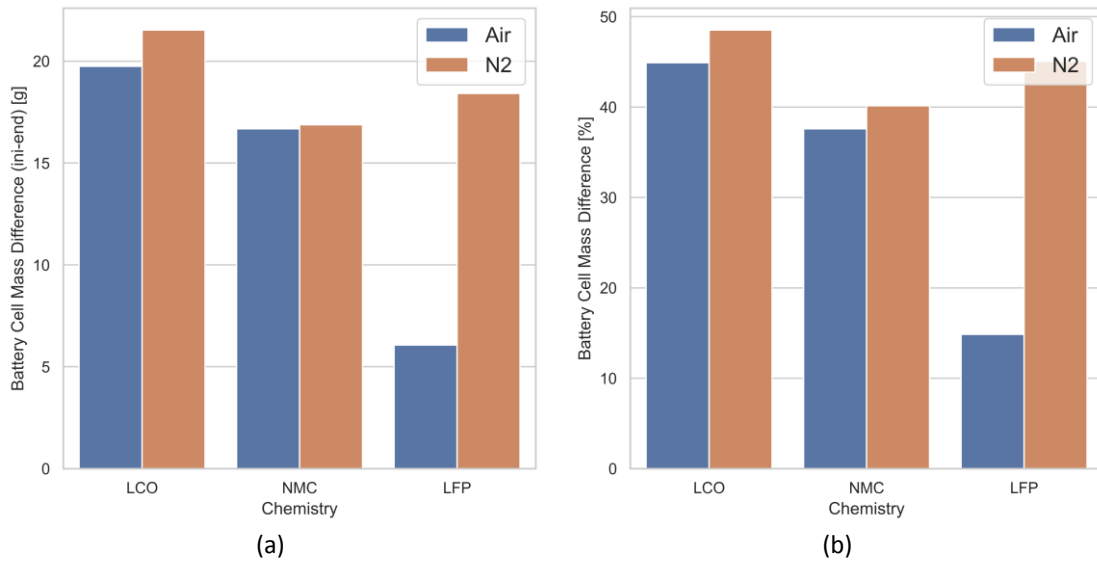


513
514

Figure 10 – Natural Luminosity during thermal runaway with 100 ms of step time.

515 Lastly, Figure 11 shows the mass lost of each cell during the experiment. The mass is lost
516 in the venting process due to the material expulsion, gas generation by the chemical reaction
517 and liquid expulsion. In addition, the thermal runaway additional mass is lost. These values
518 are calculated by difference between the mass cell before and after the experiment by a high

519 precision scale. Figure 11 depicts that the main difference was seen for LFP in air content. The
 520 images shows that the venting is like the case in inert condition, but the smoke event and
 521 absence of fire will end in a less amount of mass loosed. For the others cases the mass loss is
 522 similar with around 43% of the initial mass.



523 Figure 11 – Mass difference after and before the test (a). The mass percentage loss (b) is calculated as
 524 the mass difference divided by the initial mass. The graphs present the results for LCO, NMC and LFP
 525 batteries in Air and N₂.

526 4. Conclusion

527 This study analysed the behaviour of different commercial 18650 lithium-ion cells in
 528 inert and air atmosphere in a continuous flow vessel. The cells were heated with a
 529 constant ramp of 11.0°C/min until the thermal runaway occurrence. Different
 530 thermocouples were attached to the cell surface as well as the chamber. An optical set
 531 up was used for the venting and combustion record during the cell heating. The
 532 combination of both thermodynamic and optical analysis has allowed to obtain
 533 interesting insights considering both the different cathode chemistries and CFV
 534 environments. The main conclusions can be summarized as:

535 Cathode Chemistry:

- 536 • The NMC showed the fastest spray with top speed of 50 m/s in the first 1 ms
 537 while rapidly reduce the amount of liquid and gas ejected compared to the LCO
 538 and LFP. In addition, for this cell only two jets of the three holes could be saw.
- 539 • The LCO and LFP showed similar initial speed 20 m/s and maintained a constant
 540 speed of around 12 m/s until 4 ms. After that, the speed starts to decrease and

541 from this point until the thermal runaway, the gas ejection occurred in a low
 542 proportion.
 543 • The safety time measurements show that LFP allows for up to 5 min compared
 544 to the NMC, which showed only 2 min of safety time.
 545 • The LCO showed a variation of 1.1 min between the air and inert cases with an
 546 average safety time of 2.7 min. The venting was produced after 13 min of heating
 547 and the thermal runaway vary from 17 to 19 min after the experiment starts.

548 Environmental condition:

- 549 • In the cases with air, the LCO and NMC showed a high increase of the
 550 temperature chamber gas (increase of 300°C), while for LFP was only around
 551 50°C.
- 552 • The optical technique allowed to identify this difference by the absence of fire in
 553 the case of LFP. The inert atmosphere prevented the fire. Other studies show
 554 that the vent gas has oxygen as part of the gas composition. However, from the
 555 results of this investigation, it could be concluded that the oxygen released from
 556 the cell inside is not enough to initiate the combustion process.
- 557 • Despite not having external combustion, the cell surface temperature is still high
 558 for the N₂ environment, reaching levels comparable to the air atmosphere cases.

559 The individual observations allow to conclude that the absence of reactive environment
 560 outside the battery cells offers an effective pathway to suppress the combustion initiation
 561 of the vented gas. This does not offer only a way of reducing the damage of the battery
 562 case but also reduces the heat transfer from the battery entering in thermal runaway to
 563 those of the vicinity by both convective and radiative heat transfer. This certainly offers
 564 an edge on avoiding the progressing of the thermal runaway process to other cells.
 565 Finally, the use of inert atmospheres also allows to extend the venting and smoke times,
 566 providing extra opportunities for system actuation and for leaving the vehicle.

567 Future studies will focus on studying the gas and liquid composition of the vent gas as
 568 well as a spectroscopy optical technique to understand the chemical species generated
 569 in the thermal runaway when oxygen is present in the atmosphere.”

570

571 Abbreviations

LFP	Lithium <i>Ferrum</i> Phosphate	ICR	Lithium Cobalt Rechargeable
BEV	Battery Electric Vehicles	LCO	Lithium Cobalt Oxide
BTR	Battery Thermal Runaway	Li	Lithium Ferrum Phosphate
C.V	Control Volume	mm	Millimeter
CFV	Continuous Flow Vessel	ms	Millisecond
deg	Degree	NCA	Nickel Cobalt Aluminium Battery Cell Cathode Material
f	Focal Length	NL	Natural Luminosity
f/	Focal Number	nm	Nanometer
fps	Frame Per Second		Nickel Manganese Cobalt Battery Cell Cathode Material
		NMC	Material

Gr	Graphite	OH*	OH Radical
	Graphite And Silicon Oxide		
Gr+SiOx	Composite	S	Sulphur
ICCD	Intensified Charged-Coupled Device	SEI	Solid Electrolyte Interface
ICE	Internal Combustion Engine	UV	Ultra Violet
	Internal Combustion Engine		
ICEVs	Vehicles		

572

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