



# **Review The Importance of Optical Fibres for Internal Temperature Sensing in Lithium-ion Batteries during Operation**

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**Abstract:** Lithium-ion batteries (LiBs) are widely used as energy storage systems (ESSs). The biggest challenge they face is retaining intrinsic health under all conditions, and understanding internal thermal behaviour is crucial to this. The key concern is the potentially large temperature differences at high charge/discharge rates. Excess heat created during charge/discharge will accelerate irreversible aging, eventually leading to failure. As a consequence, it is important to keep battery states within their safe operating range, which is determined by voltage, temperature, and current windows. Due to the chemically aggressive and electrically noisy environment, internal temperature measurement is difficult. As a result, non-invasive sensors must be physically stable, electromagnetic interference-resistant, and chemically inert. These characteristics are provided by fibre Bragg grating (FBG) sensors, which are also multiplexable. This review article discusses the thermal problems that arise during LiB use, as well as their significance in terms of LiB durability and protection. FBG-based sensors are described as a technology, with emphasis on their importance for direct temperature measurement within the LiB cell.

**Keywords:** lithium-ion batteries; thermal management; temperature measurement; optical fibre sensors; fibre Bragg grating

# 1. Introduction

Lithium-ion batteries (LiBs) are commonly used as energy storage systems (ESSs) in portable devices, and hybrid and pure electric vehicles due to their high specific capacity, long life cycle, low self-discharge and compatibility with existing electric infrastructure [1–5]. The first and foremost challenge in developing a LiB device is to maintain its intrinsic stability under both normal and irregular circumstances. Awareness of internal thermal activity is key to this [6–8]. The main issue is the substantial temperature increase at elevated charge/discharge rates [5,9–11]. Excess heat produced during charge/discharge or in the presence of short circuits can cause irreversible cell damage and eventually lead to explosion or combustion [12,13]. Therefore, maintaining battery states within their healthy operating range, which is bounded by voltage, temperature, and current windows [14], is critical. A Battery Management System (BMS), including Thermal Management System (TMS), is a critical component for tracking and managing these states to ensure safe, stable and long-lived battery activity.

Literature indicates that the temperature near the cathode is higher than near the anode due to the lower electrical conductivity of most cathode active materials and the local reversible heat effects [7,15]. To establish a satisfactory thermal management strategy and increase LiB efficiency and lifespan, monitoring and management of both internal and external temperature is essential [16,17]. LiBs are typically thermally controlled on or near their surface using thermocouples or electro-mechanical sensors [18,19]. However,



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**Copyright:** © 2021 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). external surface sensors do not provide an accurate measurement of the specific internal thermal gradients and can be influenced by the external environment [20]. Internal control is difficult due to the chemically hostile and electrically noisy atmosphere. Therefore, non-invasive sensors that are mechanically robust, immune to electromagnetic interference and chemically inert are required. Fibre Bragg grating (FBG) sensors exhibit these characteristics and are also very thin, mobile, and have multiplexing capabilities. Moreover, these are chemically inert and have the ability of monitoring multiple points in the same optical fibre at once [10]. Many of these features make them ideal for tracking LiBs and fuel cells [8,21–25]. FBG sensors have also been used to track electrode strain in LiBs [26].

Previous reviews have covered different temperature indication methods applicable to LiBs extensively [27]. Still, the specific case of measuring the internal temperature with fibre-optic sensors should be addressed further, as this is where the optical sensors are considered to be superior over the electrical alternatives. Therefore, the challenge with the temperature/strain cross-sensitivity in the fibre-optic sensors requires additional study to achieve accurate internal temperature measurement. This is especially important in larger LiBs (e.g., in cars), where there is limited information on the thermal distributions available in the literature.

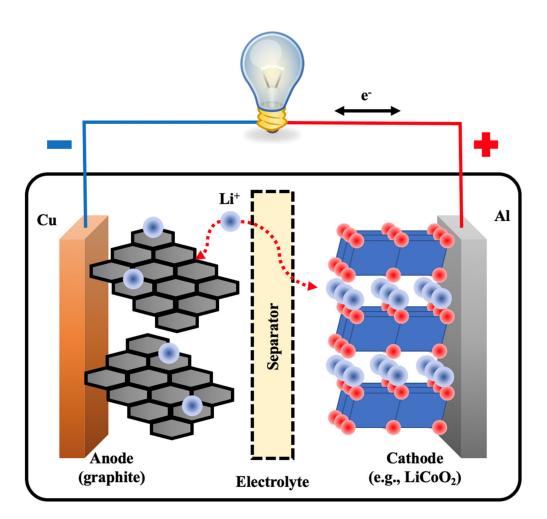
This review article covers the thermal issues related to LiB operation, and their importance with regard to LiB longevity and safety. A presentation of FBG-based sensors is given discussing their implementation into LiBs for direct measurement of temperatures within the cell. Finally, areas of research that need attention that are required to improve the utilisation of FBGs in LiBs are discussed in order to improve implementation of optical fibre sensors into battery cells.

#### 2. LiBs and Thermal Issues

## 2.1. LiB Structure

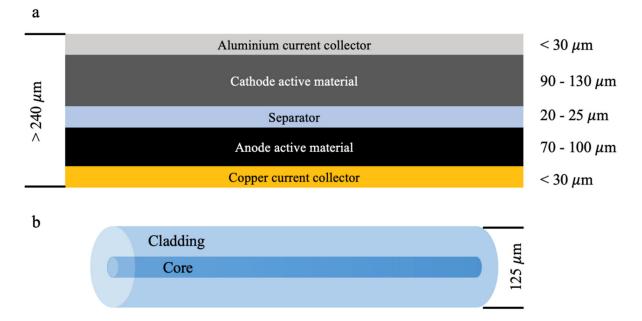
Rechargeable LiBs (i.e., secondary batteries) come in a number of shapes and sizes. These are generally in the form of cylindrical, prismatic or pouch cells. The battery electrodes and separator are folded up in such cells to form the battery. Several cells can be within such battery formats. For cylindrical and prismatic cells, the components are rolled up together and placed inside a cylinder or prismatic case. For pouch cells, the sheet stack is enclosed in a pouch. Prismatic and pouch cell batteries provide greater power density for cell phones, laptops, vehicles, or other heavy-duty systems due to the reduced packaging weight.

Secondary LiBs have an anode and a cathode, specified by the discharge phase (Figure 1). The anode is known as the electrode where the oxidation process occurs during discharge (e.g., a carbon-based intercalation anode for a LiB). This ensures that lithium ions provided by the electrolyte salt [e.g., lithium hexafluorophosphate; LiPF<sub>6</sub>) are deposited in the carbon-based anode during charging. During discharge, Li is oxidized and removed from the anode. The freed lithium ions migrate to the cathode via the electrolyte-separator field. Transition metals in the mixed metal oxides on the cathode are reduced and lower their oxidation number. The first commercial secondary LiB was composed of LiCoO<sub>2</sub> when fully discharged, and Li<sub>0.45</sub>CoO<sub>2</sub> when completely charged [28]. Cobalt changes oxidation number in the cathode reduction reaction (from 3.55 to 3). The lithium-cobalt oxide battery is commonly called LCO. When cobalt is partly substituted by nickel and manganese for a combination of nickel, manganese and cobalt, it is called NMC. Moreover, when manganese is replaced by aluminium, it is called NCA, and when the entire mixed metal oxide-lithium mixture is replaced by lithium iron phosphate (LiFePO<sub>4</sub>), it is called LFP.



**Figure 1.** Schematic of a LiB. The lithium ions are moving from the anode to the cathode during discharge, and from the cathode to the anode during charging. Correspondingly, the electrons circulate through the external circuit.

LiB architecture is based on the electrode, current collectors and the separator (Figure 2). Usually, the anode current collector (copper) is 30  $\mu$ m or less, and the active anode carbon layer is 70–100  $\mu$ m thick [29]. For the cathode, the active coating is usually a mixed metal oxide with an aluminium current collector [29]. The aluminium current collector is also 30  $\mu$ m or less, and the thickness of the active cathode material is 90 to 130  $\mu$ m [29]. The separator usually is between 20–25  $\mu$ m [30,31], and separates the two active electrodes. This configuration for electrodes and separators is conventional for LiBs; however, the thicknesses can vary much more than this in some applications. For in situ and in operando temperature measurements inside a LiB, the sensor must be small, ideally in a range smaller than the separator (i.e., 20–25  $\mu$ m). Modifying optical sensors to suit this form of geometric restriction will allow measurements that have negligible interaction with the battery's normal functioning.



**Figure 2.** Schematic of LiB component thickness. LiB cell component thickness comparison (**a**) to a typical optical fibre used for temperature detection (**b**).

# 2.2. Thermal Issues in LiBs

The thermal balance between produced and dissipated heat together with the heat capacity of the cell influence the internal LiB temperature both at transient and steady state. If the heat cannot be dissipated fast enough, the LiB temperature will rise, leading to increased ageing, failures and unsafe conditions. Defects and misuse during processing and operation may also cause internal and external short-circuits, overcharge, over-discharge or overheating. This can lead to thermal runaway, combustion, and possible LiB explosion [32]. Therefore, LiB ageing is truly the most important parameter, and can be directly influenced by the thermal balance within a cell.

The worst thermal situation is thermal runaway, which can occur under inadequate cooling or abusive usage, leading quickly to gasification, flames, blow-outs or explosions. While thermal runaway can be discussed extensively in six stages [33], a three-stage mechanism [32,34–40] is more commonly described. Thermal runaway occurs when the cell has reached a temperature at which the self-heating rate is equal to or higher than the heat removal rate. From this point on, reactions within the LiB are exothermic and induce significant temperature changes. The solid electrolyte interphase (SEI) begins decomposing exothermically at temperatures around 90 °C. This results in electrolyte reduction at the exposed anode surface. Around 120 °C, this reaction sequence becomes much more rapid. The separator may also start melting, leading to a sudden voltage drop, further raising the heat generation. Then, the heat generation increases faster due to electrolyte reduction and oxidation at the anode and cathode. Gas can then vent or even release smoke. Further internal heating causes high-rate electrode reactions that induce incredibly rapid temperature changes, eventually contributing to the thermal runaway. This is primarily due to decomposition of the cathode material, creating oxygen gas that interacts exothermically with the organic materials within the LiB [41].

Thermal runaway phenomena rely on different properties such as electrode materials, cell design and electrolyte composition [42]. Experiments have showed that self-heating also relies on the state-of-charge (SoC) [35,43–45], as the temperature onset typically declines as SoC increases. As SoC increases, the electrodes become less thermally stable. The voltage displays a sharp decline at temperatures of 125 °C due to separator melting. Thermal stability of the electrodes also depends on the particle size in the electrodes, as the active surface area becomes greater with smaller particles, which creates a larger con-

tact area between the electrode and the electrolyte [46,47]. To avoid risky conditions like thermal runaway, the voltage, current and temperature must be monitored and included in the BMS to take preventative action before thermal runaway occurs. Despite this, BMS cannot always shield LiBs from abusive situations. Additionally, protective sensors that are integrated in or on LiBs and may be damaged before the BMS can take evasive action. Overall, careful design precautions must be taken into account to avoid or stop thermal runaway in a single LiB and the propagation through a full LiB pack. Once a LiB pack is used in an application, it is critical that all LiBs within a module or pack are monitored for performance purposes as well as safety purposes.

# 3. Thermal Aspects of LiBs

While LiBs have very high coulombic performance [48,49], lithium (de-)intercalation in both electrodes and all related processes do not occur with 100 percent energy efficiency. This property produces irreversible heat while the battery is charged or discharged. The heat generated flows through the materials to the battery surface, dissipating to the surroundings.

#### 3.1. Generation of Heat in LiBs

Due to different internal impedances, battery terminal voltage deviates from the open cell voltage (OCV) at a given SoC [28,50]. This is best known as the battery overpotential ( $\eta_{battery}$ ):

$$\eta_{battery} = E_{battery} - E_{battery}^{eq} \tag{1}$$

where  $E_{battery}^{eq}$  is the electromotive force (EMF) and  $E_{battery}$  is the voltage at the battery terminals. Different methods can experimentally determine the EMF [51–53]. The overpotential is negative during discharge and positive during charging. Similarly, electrode overpotentials (positive and negative) can be defined. Total overpotential is induced by various processes occurring in a LiB, such as charge-transfer reactions at electrode/electrolyte interfaces ( $\eta_{charge\ transfer}$ ) [54], diffusion and migration of Li-ions across the electrolyte ( $\eta_{electrolyte}$ ) [55], diffusion and migration of Li-ions in the electrodes ( $\eta_{diffusion}$ ) [56] and other ohmic losses ( $\eta_{ohm}$ ) [57]. The overall battery potential can be expressed as:

$$\eta_{battery} = \eta_{charge\ transfer} + \eta_{electrolyte} + \eta_{diffusion} + \eta_{ohm} \tag{2}$$

Charge-transfer, diffusion, migration and ohmic losses occur in both the anode and cathode. In order to calculate the irreversible heat production ( $Q_\eta$ ), the battery overpotential can be multiplied by the current [27,58–61]:

$$Q_{\eta} = \eta_{battery} \cdot I(t) \tag{3}$$

or by including the resistance and charge transfer overpotential:

$$Q_{\eta} = I(t)^2 \cdot R_{battery}(t, T) \tag{4}$$

Here, *I* represents the battery current and *R* is the resistance. It is clear that if the battery current or resistance increases, more irreversible heat is generated. Therefore, to minimize these thermal losses, keeping the battery resistance as low as possible is the key. Generally, these resistances increase with decreasing state-of-health (SoH) during cycling and calendar aging, leading to more heat generation during the battery life [62–64].

In addition to the irreversible heat generation source resulting from resistances, there is a reversible heat source due to entropy changes in the chemical reactions [65–67]. Entropic heat generation can be either endothermic or exothermic and depends on the electrode reaction direction and the SoC. The entropy change ( $\Delta S$ ) of the battery can be derived from enthalpy change ( $\Delta H$ ) and free energy change [68,69].  $\Delta S$  can be represented after further derivations:

$$\Delta S = n \cdot F \cdot \left(\frac{\partial E_{battery}^{cq}}{\partial T}\right)_{\xi,p}$$
(5)

where *T* is the battery temperature,  $\xi$  is the progress of the reaction (SoC) and *p* is the pressure. Generally, entropy change is obtained by potentiometric or calorimetric measurements [70]. Once the entropy change is known, the reversible heat ( $Q_S$ ) can be calculated as follows:

(

$$Q_S = -I \cdot \frac{T \cdot \Delta S}{n \cdot F} \tag{6}$$

The contribution of the entropic heat can be significant, and therefore it is essential for thermal modelling purposes [59,69,71]. Entropic heat generation or absorption may occur on both electrodes, and its magnitude differs for the various electrode materials. Without the entropic term, the model cannot accurately depict temperature behaviour. Therefore, including the entropic term in the model leads to better modelling accuracy [69].

#### 3.2. Conduction of Heat in LiBs

The generated heat flows through the conductive battery materials. This only happens when temperature differences exist (i.e., thermal gradients are apparent). The corresponding heat flux  $(\vec{q}_{conduction})$  in isotropic materials can be defined as [72–74]:

$$\vec{q}_{conduction} = -k \cdot \nabla T \tag{7}$$

where *k* is the thermal conductivity (can be seen as a function of battery location) and  $\nabla T$  the temperature gradient. Equation (7) is also known as Fourier's Heat Conduction Law. The minus-sign infers the thermal conduction from high to low temperatures.

#### 3.3. Dissipation of Heat in LiBs

When a LiB operates in a gas or liquid-filled environment, there is a convective heat exchange between the surface and surroundings. Moreover, emitting infrared radiation cools down the LiB surface. Convective ( $Q_{convection}$ ) heat exchange can be shown as follows [27]:

$$Q_{convection} = h \cdot A \cdot (T - T_{\alpha}) \tag{8}$$

and radiative heat exchange  $(Q_{radiation})$  can be shown as follows [27]:

$$Q_{radiation} = \sigma \cdot \varepsilon \cdot A \cdot \left( T^4 - T_{\alpha}^4 \right) \tag{9}$$

where *h* is the heat transfer coefficient, *A*, the battery surface area, *T*, the battery surface temperature,  $T_{\alpha}$ , the ambient temperature,  $\sigma$ , the Stefan–Boltzmann constant and  $\varepsilon$ , the surface material emissivity. The heat transfer coefficient depends on natural or forced convection, location, geometry, surface roughness and the LiB properties. To increase heat transfer from the battery surface to the surrounding environment, different external cooling methods may be applied (e.g., air and liquid cooling). Besides external cooling, which only removes heat from the battery surface, internal cooling can also be used. For internal cooling can be more effective than traditional cooling, as unwanted temperature increases, and thermal gradients are easier to control. Additionally, internal cooling prolongs battery life and is safer. Despite these advantages, internal cooling is much harder to implement as the standard internal battery construction must be significantly changed.

#### 3.4. Balance of Heat in LiBs

Once the generation, conduction and dissipation of heat in a LiB are known, a heat balance equation can be defined to calculate the LiB's temperature evolution. Considering a uniform temperature, the equation is defined as:

$$m \cdot C_P \cdot \frac{dT}{dt} = Q_{in} - Q_{out},\tag{10}$$

where *m* is the LiB's mass and  $C_P$  is the LiB's specific heat capacity.  $Q_{in}$  includes all heat-generating processes:

$$Q_{in} = Q_{\eta} + Q_S \tag{11}$$

 $Q_{out}$  represents the heat dissipation from the LiB:

$$Q_{out} = Q_{convection} + Q_{radiation} \tag{12}$$

The main advantage of this model is the simplicity to predict and integrate temperature changes into temperature models. However, due to the simplicity of this general thermal model, the assumption that the whole LiB has a uniform temperature presents a weakness. In reality, the temperature varies spatially and must be extended into a two or three-dimensional heat expression. The 3D heat equation is defined as [79]:

$$\rho \cdot C_P \cdot \frac{\partial T}{\partial t} = \nabla \cdot (k \cdot \nabla T) + q_{in} \tag{13}$$

where  $\rho$  is the density of the LiB material and the heat-generation density ( $q_{in}$ ) is now location-dependent (see Equations (6) and (11)). The total heat-generation power  $Q_{in}$  in the heat-balance equation (Equation (10)) can be obtained by integrating  $q_{in}$  over the battery volume (V):

$$Q_{in}(t) = \int_{V} q_{in} \cdot (t, x, y, z) \cdot dx \cdot dy \cdot dz$$
(14)

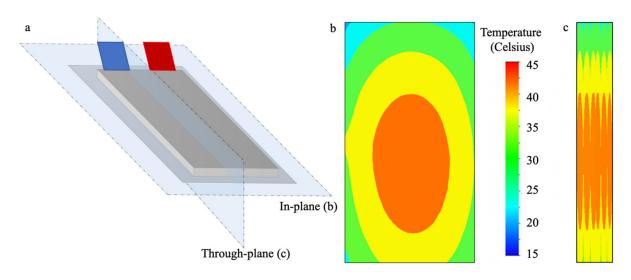
Heat dissipation for each point of the cell surface (outer boundary) is formed as:

$$-\overrightarrow{n}\cdot(k\cdot\nabla T) = h\cdot(T-T_{\alpha}) + \sigma\cdot\varepsilon\cdot\left(T^{4}-T_{\alpha}^{4}\right)$$
(15)

where  $\nabla T$  is the temperature gradient and  $\vec{n}$  is the normal vector (outer) at the boundary. Using this model, three-dimensional thermal gradients can be simulated and validated. Still, these models rely on detailed experiments, as measured overpotentials or resistances are required to calculate heat generation. In addition, LiB predictions can be used in real-life applications, facilitating BMS and TMS with determining states such as SoC and SoH. By using models, the number of sensors can be reduced, saving cost and space.

# 3.5. Gradients of Heat in LiBs

Due to internal heat generation, thermal conduction and heat dissipation in individual LiBs, temperature gradients develop on the module- and pack-level. Temperature gradients in LiB packs is a key issue that cannot be underestimated and can cause serious complications. One such complication is the challenges related to LiB temperature monitoring. Substantial heat is generated internally under extreme conditions like overcharge and over-discharge, high current loads or short-circuiting. Therefore, the surface temperature does not reflect the actual temperature production inside the LiB. With internal monitoring, it can be seen that the LiB core temperature is significantly higher than the surface (Figure 3). It is clear that additional internal temperature monitoring provides more accurate information that will improve LiB performance, SoH and safety.



**Figure 3.** Schematic of temperature within a pouch cell. A LiB pouch cell (**a**) dimensions for the in-plane and through-plane geometries, temperature distribution of a LiB in-plane (**b**) and temperature distribution through-plane (**c**).

Other complications resulting from temperature gradients are non-uniform current density, local SoC differences as well as non-uniform and accelerated degradation [80,81]. Temperature gradients cause varying electrochemical impedances; therefore, varying current density distributions [27]. SoC inhomogeneities result from both non-uniform current density distributions and EMF temperature dependence. These effects lead to local aging differences, followed by global LiB aging [59]. Additionally, LiBs perform differently in the presence of a temperature gradient compared to a uniform temperature [82,83]. Besides temperature gradients within individual LiBs, temperature gradients also develop in LiB packs where multiple LiBs are connected. Gradients in LiB packs results in unbalanced charge and discharge currents for LiBs [84,85]. In addition, LiBs that are not closely connected to cooling systems run at higher temperatures.

With low atmospheric temperatures (i.e., low LiB starting temperature) and high C-rates, high temperature increases and high thermal gradients will occur within the LiB due to higher internal resistance [86]. Therefore, stronger cooling is required at high C-rates. Stronger cooling results in lower temperature increases, but can result in higher temperature gradients [5,20,87]. The cooling method employed affects the thermal gradient behaviour (e.g., tab cooling leads to a higher uniformity of the temperature distribution compared to surface cooling [88]; however, lower amounts of heat can be removed through the tabs due to the smaller area). Internal LiB cooling is better at reducing thermal gradients than external cooling [89]; however, internal cooling is much more complicated and increases the mass of the LiB, reducing the specific energy density.

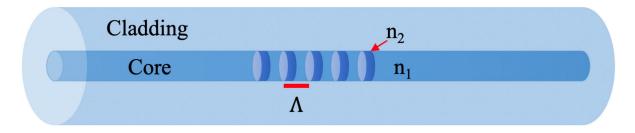
The thermal issues discussed here accentuate the importance of temperature control in LiBs. Fibre Bragg gratings are ideal for in situ temperature measurements, as previously discussed. These are described in the next section, followed by an overview of the relevant literature.

#### 4. Fibre Optic Internal LiB Temperature Monitoring

There are many different methods to measure LiB temperature [27]. These include thermistors [90], thermocouple devices [91], resistance temperature sensors [92], impedancebased temperature measurements [93], Johnson noise thermometry [94], thermal imagery [95], liquid-crystal thermography [96] and estimation with model-based observers [71]. In situ temperature measurements are attractive for safety and control purposes, as LiB core temperatures are usually higher than external temperatures. Moreover, electrochemical inert, corrosion resistant and non-invasive sensors are essential to gaining insight into internal temperatures while avoiding interruptions to the LiB mechanisms. Optical-fibre sensors (e.g., FBGs) are therefore an attractive option, as they are made of chemically inert glass with micrometer dimensions.

# Fibre Bragg Grating Temperature Sensors

The fibre Bragg grating (FBG) sensor is a type of fibre-optic sensor commonly used to measure temperature and strain. The grating exhibits a strong reflectivity at a wavelength ( $\lambda_B$ ), which shifts due to changes in external conditions. The gratings can be inscribed into a photosensitive fibre using UV light, producing permanent periodic changes in the core refractive index [97], (Figure 4).



**Figure 4.** Schematic of an FBG. An optical fibre with inscribed fibre Bragg grating labelling the cladding and the core, the grating spacing and the two different refractive indices within the core.

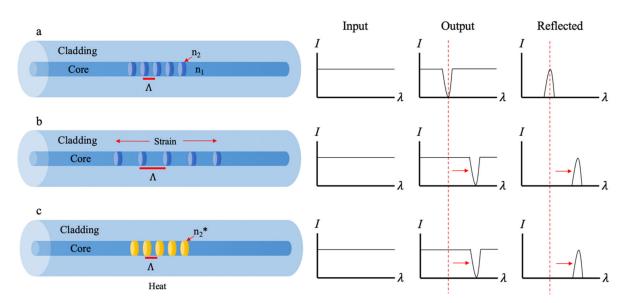
As a spectrum of light propagates through the fibre, a narrow range of wavelengths are reflected, while the remaining light is transmitted. The centre-wavelength of the reflected signal (Bragg wavelength) is given by:

$$\lambda_B = 2 \cdot n_{effective} \cdot \Lambda \tag{16}$$

where  $n_{effective}$  is the effective refractive index of the grating and  $\Lambda$  is the period of the index modulation or grating spacing [11,98,99]. A change in  $n_{effective}$  or a difference in  $\Lambda$  (or a combination of both) culminates in a change in the reflected Bragg wavelength. Measuring this wavelength change is the basis for FBG sensors [100]. As a fibre is compressed or extended (i.e., subject to strain), the grating spacing varies, leading to a change in the Bragg wavelength that can be probed with a light source and a spectrometer. Changes in temperature also affect the Bragg wavelength due to the temperature-dependency of the refractive index, known as the thermo-optic effect [101]. The role of thermal expansion is very limited (ca. 5%) and changes in the grating spacing can be neglected (i.e., the thermo-optic effect is the most dominant effect in an FBG) [102]. Figure 5 gives a schematic representation of how the strain and temperature alter the Bragg wavelength.

FBG sensors are becoming increasingly common due to their small scale, light weight, passive design, electromagnetic and radio frequency interference tolerance, high sensitivity and long-term reliability [103–105]. Another advantage is that FBG sensors can be multiplexed, meaning multiple FBGs can be inscribed in a single optical fibre making it possible to construct a matrix of temperature sensors in 3D [106]. Additionally, the Bragg wavelength changes with temperature linearly, as shown in Figure 6 [107].

The FBG's temperature range depends on what materials are used in the construction [108]. Silica is the most typical material used in optical fibres and can endure temperatures between -273 to 1190 °C before softening, yet the gratings within the fibre degrade rapidly above 200 °C [109]. If protective coatings are used, there are additional drawbacks in terms of the temperature window (e.g., acrylate is a standard optical fibre coating which is stable from -40 to 85 °C). Therefore, coatings of polyimide should be used as they have a larger temperature window (-190 to 385 °C). It is possible to obtain accuracies of  $\pm 0.2$  °C in a temperature range of approximately 20–60 °C [107,110], with a standard temperature sensitivity of 10 pm wavelength shift per °C [99,111].



**Figure 5.** Schematic of FBG measuring modes. The physical changes during strain and heating of a FBG are shown with their respective input, output and reflected light spectra. A FBG with no strain and ambient heat will have a specific output and reflected profile (**a**); as strain is applied the grating spacing will change causing a shift in the output and reflected profile (**b**); and if heat is applied the effective refractive index of the gratings ( $n_2^*$ ) will change causing a shift in the output and reflected profile and changes in the spacing between the grating will also occur due to thermal expansion (**c**).

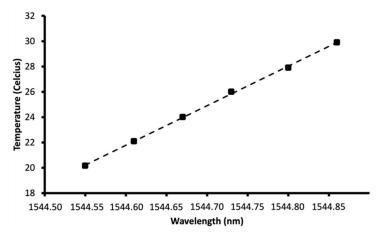


Figure 6. Measured temperature response of the Bragg wavelength of a FBG sensor.

Although optical FBG sensors have already been investigated in electrochemical systems such as PEM fuel cells [22,112], Yang et al. [8] were the first to investigate FBG sensors on LiBs. Three coin-cell LiBs were used to measure the temperature on all flat surfaces. In addition, the temperature was measured in a cylindrical LiB's flat and lateral face. FBG sensor calibration showed a linear response in temperature from 0 to 60 °C. These calibration measurements found a typical sensitivity of 10 pm wavelength shift per °C. Following this contribution, research activities with LiB optical FBG sensors increased. Nascimento et al. [23] applied FBG sensors to a 18,650 cylindrical LiB. Two Bragg gratings were used for temperature measurements at two positions on the LiB. An additional fibre was connected along the longitudinal axis to track strain variations. They found that temperature and strain variations were higher at a high C-rate (1.33 C) relative to a low C-rate of 0.25.

Novais et al. [113] continued their study by examining FBG temperature measurements in LiB pouch cells. Two optical fibres with two Bragg gratings were used for internal and external temperature measurement. They also tested the chemical resistance of the fibre with LiPF<sub>6</sub>. After two weeks of electrolyte storage, only a very small amount of Si was dissolved, suggesting that this form of fibre is not susceptible to the electrolyte in short time windows. They observed an average sensitivity of 8.40 and 10.255 pm wavelength shift per °C for external and internal FBG sensors (in a temperature range of 10 and 35 °C), respectively. Nascimento et al. [114] then compared FBG temperature readings to industrial thermocouples attached on the external surface of the battery. It was found that FBG sensor reaction rate is around 1.2 times faster than the thermocouples used. The discrepancy between FBG peak temperatures and thermocouples was up to 5.7 °C at a C-rate of 8.25. This observation is supported by McTurk et al. [115], allowing unprecedented thermo-electrochemical data from the LiB internal environment. Quick thermal evolutions occur at high C-rates, which thermocouples cannot completely observe due to the slow response time. The faster thermal response of fibre-optic sensors may be attributed to the lower thermal mass, compared to the industrial thermocouples. The thermocouples can be made thinner, but challenges related to the heat-sealing may occur [116]. The optical fibres also have the advantage that the area that the electrode area that is covered by the sensor, and hence blocks the flow of ions, is minimal compared to electrical sensors created on thin-films.

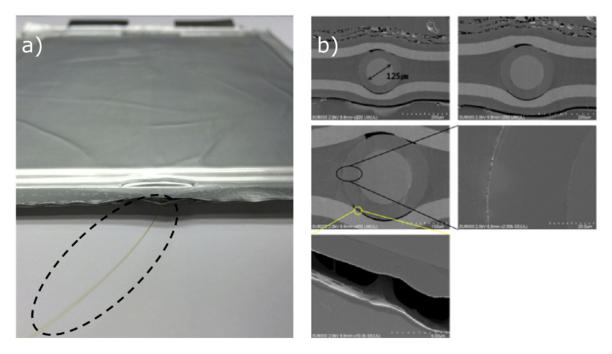
Raghavan et al. [117] and Ganguli et al. [118] embedded FBG sensors for precise internal LiB monitoring status. They showed that seal integrity, power retention and estimated battery life with embedded FBG sensors are highly comparable to batteries without FBG sensors [117]. It has also been demonstrated that batteries with embedded sensors can be incorporated into existing modules. Therefore, they deemed it possible to embed FBG sensors in large-format LiBs as a low-cost, field-deployable internal state monitoring option. They also focused on using internal FBG measurements for tracking SoC and SoH at various temperatures [118]. It was found that SoC can be calculated with an error of less than 2.5% using the strain determined by FBG sensors by measuring the lithiation and delithiation as a function of cathode swelling.

Amietszajew et al. [119] used an FBG sensor to test a commercial, high-energy, 18,650 LiB's internal temperature. The FBG was placed in an aluminium tube with a fluorinated ethylene propylene heat-shrink, then completely sealed the aluminium tube to protect the FBG sensor from electrical, chemical and mechanical tension. The LiB surface and ambient temperatures were observed using standard thermocouples. They observed that the LiB can be charged 6.7 times faster than the manufacturer stated without violating the electrochemical and thermal protection limits.

Due to the ability of FBG sensors to detect both temperature and strain, it may be beneficial for detection of growth and contraction of the SEI, especially in LiBs containing silicon [120–122]. However, it is vital to be able to discriminate between signals due to either temperature or strain within the FBG sensor. Nascimento et al. [123] recently suggested the integration of a FBG and a Fabry–Perot cavity to allow discrimination between temperature and strain. Their findings prove that it is possible to integrate both detection methods within a single fibre and embed this within a LiB to obtained strain and temperature measurements.

To date, there has been limited published measurements for temperatures below 0 °C with FBG temperature sensors in LiBs [118], which is a critical range for operation. Despite this, the possibility to measure low temperatures between -20-0 °C has been shown [124,125]. The use of FBG sensors in LiBs is still in early stages of development, and research and detailed investigations are still required. This is also of particular importance for long-term measurements. It should also be observed whether strain and temperature measurements can be differentiated in LiBs using an FBG and Brillouin scattering sensor system [126], or potentially using tilted FBGs. In addition, it has been observed that FBG sensors can cause damage to cathode and separator material during embedding [127]; therefore, the embedding method for FBGs within a LiB requires further development. This could be through implementation directly into the active material during fabrication, or other components such as the pouch plastic.

Although the characteristics of optical-fibre sensors make them exceptional for internal sensing in LiBs, they also come with certain limitations. The intrinsic cross-sensitivity between temperature and strain requires additional measures to decouple, such as friction-free encapsulation [128] or a second sensor with different sensitivities [123]. Conventional optical fibres are also relatively thick compared to the individual layers in a battery (see Figure 2). This may cause damage to the cathode and separator [127], and thicker stacks are therefore recommended to alleviate the problem [27]. Thin-film based electronic sensors can be made thinner [116], but do not have the beneficial characteristics of an optical fibre. With all internal temperature sensors in complete LiB cells, an additional point of entry is required. This can be challenging and increases the probability of a leak [117], see Figure 7.



**Figure 7.** Images captured of a LiB pouch cell with an embedded fibre-optic sensor (**a**) and the cross-section that shows a potential leak around the fibre (**b**) [118]. Reprinted from [118]. Copyright 2017 Elsevier.

# 5. Conclusions

The thermal behaviour within LiB cells is detrimental to maintaining healthy and safe cell function. Excess heat created during charge/discharge will age cells irreversibly, eventually leading to failure. Traditional thermal measurements of LiBs are conducted on the surface of the cell, which yields limited thermal overview of the internal temperature profile. Additionally, the internal environment of a LiB is chemically and electrically aggressive, meaning that many traditional thermal sensors are not ideal for internal measurement. This review article has discussed the current developments in this field by implementing FBG-based optical fibre sensors into LiB cells. Due to the measurement method, these sensors are ideal for use in LiBs, as they are resistant to chemical degradation and are electrically inert. The use of FBG-based sensors in LiBs is a relatively recent development and still requires further development of the sensor technology to improve their integration into LiB cells. There is still a requirement to develop ideal methods for differentiating between FBG signals from temperature and strain. Although this is possible in a traditional FBG sensor, the size requirements for use in a LiB mean that further development is necessary. Furthermore, the current size of FBG-based sensors is rather thick in terms of the size of a LiB cell, and further size reduction or integration methods must be developed to reduce the interference the sensor may have on the LiB function. As with all physical sensors for internal temperature measurement, an additional point of entry is required, which increases the probability of a leak. Although there are large developments required

to perfect the application of FBG-based sensors into LiB cells, these optical fibre sensors have large potential for improving our understanding of thermal distribution within LiBs. This is especially the case with larger pouch cell formats and high charge/discharge rates becoming widely used.

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