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Nernstian  $\text{Li}^+$  intercalation into few-layer graphene and its use for the determination of  $\text{K}^+$  co-intercalation processes

Uncovering the thermodynamic and kinetic properties underlying ion intercalation on ultrathin carbon electrodes through versatile voltammetric inspection, from which the resulting Nernstian slopes as function of ion activity help discern the simultaneous insertion of alkali ions of interest for next generation energy storage technologies.

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# Nernstian $\text{Li}^+$ intercalation into few-layer graphene and its use for the determination of $\text{K}^+$ co-intercalation processes†

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Alkali ion intercalation is fundamental to battery technologies for a wide spectrum of potential applications that permeate our modern lifestyle, including portable electronics, electric vehicles, and the electric grid. In spite of its importance, the Nernstian nature of the charge transfer process describing lithiation of carbon has not been described previously. Here we use the ultrathin few-layer graphene (FLG) with micron-sized grains as a powerful platform for exploring intercalation and co-intercalation mechanisms of alkali ions with high versatility. Using voltammetric and chronoamperometric methods and bolstered by density functional theory (DFT) calculations, we show the kinetically facile co-intercalation of  $\text{Li}^+$  and  $\text{K}^+$  within an ultrathin FLG electrode. While changes in the solution concentration of  $\text{Li}^+$  lead to a displacement of the staging voltammetric signature with characteristic slopes ca. 54–58 mV per decade, modification of the  $\text{K}^+/\text{Li}^+$  ratio in the electrolyte leads to distinct shifts in the voltammetric peaks for (de)intercalation, with a changing slope as low as ca. 30 mV per decade. Bulk ion diffusion coefficients in the carbon host, as measured using the potentiometric intermittent titration technique (PITT) were similarly sensitive to solution composition. DFT results showed that co-intercalation of  $\text{Li}^+$  and  $\text{K}^+$  within the same layer in FLG can form thermodynamically favorable systems. Calculated binding energies for co-intercalation systems increased with respect to the area of  $\text{Li}^+$ -only domains and decreased with respect to the concentration of  $-\text{K}-\text{Li}-$  phases. While previous studies of co-intercalation on a graphitic anode typically focus on co-intercalation of solvents and one particular alkali ion, this is to the best of our knowledge the first study elucidating the intercalation behavior of two monovalent alkali ions. This study establishes ultrathin graphitic electrodes as an enabling electroanalytical platform to uncover thermodynamic and kinetic processes of ion intercalation with high versatility.

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## Introduction

Alkali ion batteries (AIB) based on  $\text{Li}^+$ , and emerging technologies based on  $\text{K}^+$ , are important high-performance

rechargeable energy storage devices.<sup>1–3</sup> Considerable recent efforts have been devoted to the fabrication of new electrode materials,<sup>4</sup> discovery of energy storage mechanisms,<sup>5</sup> electrochemical reactions at electrodes and interphases,<sup>6,7</sup> and towards improving the cell capacity, stability, and cyclability.<sup>8</sup> Upon AIB cycling, alkali ions are reversibly stored within both anode and cathode in the battery. Therefore, microscopic understanding of the alkali ion intercalation processes under different external environments plays a vital role in deciphering the key aspects for future energy storage devices with improved performance.

Previous studies of alkali ion intercalation processes have unveiled the intercalation thermodynamics *via* slow scan rate cyclic voltammetry (CV)<sup>9</sup> (e.g. at scan rates  $\ll 1 \text{ mV s}^{-1}$ ) and galvanostatic charge–discharge<sup>7,10</sup> techniques. It is well-known that the  $\text{Li}^+$  intercalation process in graphitic materials follows a staging-type mechanism, where  $\text{Li}^+$  ions are progressively inserted within graphene planes to form multiple highly ordered layer structures, such as Stage 4 ( $\text{LiC}_{36}$ ), Stage 3 ( $\text{LiC}_{27}$ ), Stage 2 ( $\text{LiC}_{12}$ ), and Stage 1 ( $\text{LiC}_6$ ), respectively.<sup>11,12</sup> Numerous research works focus on using various electrochemical,

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spectroscopic and scattering techniques to determine  $\text{Li}^+$  intercalation mechanisms as a bulk.<sup>13–15</sup> Similarly to  $\text{Li}^+$ , staging-type mechanisms have been described for  $\text{K}^+$  or  $\text{Na}^+$  as well,<sup>10,16,17</sup> yet these systems still demonstrate limited device properties when compared to the well-established  $\text{Li}^+$  systems.<sup>18</sup> Alkali ion co-intercalation with solvents such as diglymes is a commonly used strategy for activating  $\text{Na}^+$  and  $\text{K}^+$  intercalation,<sup>19–21</sup> but consequently leads to exfoliation of the anode material and limits the number of sites for active ion storage.<sup>22</sup>  $\text{Li}^+$  and  $\text{K}^+$  have been used as synergetic co-intercalation components to improve the sluggish  $\text{Mg}^{2+}$  intercalation kinetics on  $\text{Li}_4\text{Ti}_5\text{O}_{12}$ ,<sup>23</sup>  $\text{VS}_4$  cathodes,<sup>24</sup> and  $\text{Ti}_3\text{C}_2$ ,<sup>25</sup>  $\text{V}_2\text{C}_6$  MXene anodes. However, to the best of our knowledge, the electrochemical co-intercalation of two alkali ions, and its corresponding voltammetric study, has not been demonstrated for graphitic carbon anodes.

Charge transfer in electrochemical systems is fundamentally explained by the Nernst equation and expressions deriving from it, as shown for the hypothetical process in eqn (1) *via* (2):



$$E = E^0 + \frac{RT}{nF} \ln \frac{a_{\text{A}}^a a_{\text{B}}^b}{a_{\text{C}}^c} \quad (2)$$

which relates the potential of a redox process ( $E$ ) to a standard reduction potential ( $E^0$ ) and the logarithm of the reaction quotient expressed by the activities ( $a$ ) of the involved species raised to their stoichiometric coefficients through the slope described by  $T$  the temperature,  $R$  the universal gas constant,  $F$  Faraday's constant and  $n$ , the number of electrons exchanged during reaction. The analysis of the Nernstian slope in eqn (2) displayed by voltammetric features as a function of species activity enables the experimenter to unravel mechanistic details of electrochemical reactions, including charge stoichiometry and ion-coupled electron transfer mechanisms. For instance, analysis of the response of solution and surface voltammetric peaks occurring as a function of pH, *i.e.* in systems depending on the activity of protons, is commonplace in electrocatalysis and molecular electrochemistry.<sup>27,28</sup>

Surprisingly, we could not find studies focused on experimentally determining that the  $\text{Li}^+$  intercalation charge transfer process responds in a Nernstian fashion. In fact, on the basis of open circuit voltage measurements in Li-ion batteries, discrepancies between the staging mechanism and the Nernstian description have been found for bulk graphite.<sup>29,30</sup> Furthermore, knowledge gaps exist regarding the evaluation of charge transfer kinetics for ion intercalation at a microscopic scale; in part because this requires challenging electrode charge and discharge rates that are uncharacteristic in the battery literature. Our group recently reported on the mechanistic study of  $\text{Li}^+$  intercalation in electrodes made with few-layer graphene (FLG),<sup>31</sup> as well as the preconditioned solid-electrolyte interphase (SEI) layer for facile  $\text{K}^+$  intercalation into this ultrathin graphitic carbon material.<sup>16</sup> Mechanistic analysis using FLG electrodes is advantageous because there is no need to use extraneous materials such as binders. The geometry of these electrodes circumvents mass transfer limitations and enables

voltammetric inspection at scan rates up to few  $\text{V s}^{-1}$ . These rates are equivalent to 100–1000C (1C is fully discharge in 1 h), thus making the experimentation less cumbersome and enabling the direct exploration of kinetic limitations.<sup>16</sup>

Here, we turn to FLG electrodes as model interfaces to explore the Nernstian-type relationship of  $\text{Li}^+$  intercalation on a graphitic material. With this knowledge in hand, we show the signatures for  $\text{Li}^+$  and  $\text{K}^+$  co-intercalation, and explore for the first time the dependencies of the voltammetric staging behavior<sup>9,32</sup> on the solution composition. Using CV analysis rooted in our Nernstian findings, we show that co-intercalation displays a single group of waves with two distinct behaviors for  $\text{Li}^+$ -rich and  $\text{K}^+$ -rich regions. We further determined their apparent alkali ion diffusion coefficients determined *via* potentiostatic intermittent titration technique (PITT),<sup>33</sup> which were a function of  $\text{Li}^+$  content. We further studied the  $\text{Li}^+$  and  $\text{K}^+$  co-intercalation mechanism using periodic density functional theory (DFT) calculations. Through this approach, we were able to investigate the geometric changes, electronic structure tuning, and thermodynamic properties with respect to the  $\text{Li}^+/\text{K}^+$  co-intercalation ratio. Combining theoretical calculations with experimental results, we propose a  $\text{Li}^+/\text{K}^+$  ratio-dependent staging mechanism and calculated the apparent diffusion coefficient for the  $\text{Li}^+$  and  $\text{K}^+$  co-intercalation process. The present study shows a multi-faceted approach for identifying and predicting the thermodynamics and kinetics of alkali ion co-intercalation properties for advanced alkali ion-based energy storage. We believe the methodology described here can be extended to other systems where ion co-intercalation is suspected in order to understand mechanistic aspects of ion co-intercalation using Nernstian concepts.

## Experimental section

### Materials and supplies

All chemicals were purchased as A.C.S. reagent grade or better and used as received without further purification. Ethylene carbonate (EC, anhydrous, 99%), propylene carbonate (PC, anhydrous, 99.7%), lithium tetrafluoroborate ( $\text{LiBF}_4$ , 99.99%, trace metals basis), potassium hexafluorophosphate ( $\text{KPF}_6$ , 99.5%, trace metals basis), lithium hexafluorophosphate ( $\text{LiPF}_6$ , 99.99%, trace metals basis) were obtained from Sigma-Aldrich. 3 inch Si wafer with 300 nm wet thermal oxide ( $\text{Si}/\text{SiO}_2$  wafer) was purchased from University Wafer. Few layer graphene (FLG) samples were fabricated *via* atmosphere pressure chemical vapor deposition (CVD) method with previously reported recipes.<sup>16</sup>

### Sample characterization

FLG samples were characterized through several techniques including scanning electron microscopy (SEM, Hitachi S-4800), Raman spectroscopy (Nanophoton Laser Raman Microscope RAMAN-11), and optical transmittance microscopy (Leica SP8 UV/Visible Laser Confocal Microscope). The optical transmittance image was obtained using a 561 nm laser line with constant intensity. Transmittance intensity of a blank glass



$I\sqrt{t}$  is the Cottrell slope of amperometric titration curve,  $\Delta Q(E)/\Delta E$  is the charge at each potential step.

## Computational methods

We used the plane-wave density functional theory (DFT code Vienna *Ab initio* Simulation Package (VASP)<sup>37,38</sup> to calculate the structural, electronic, and thermodynamic properties of alkali ion intercalated/co-intercalated FLG anodes. The generalized gradient approximation of DFT as proposed by Perdew, Burke, and Ernzerhof (GGA-PBE)<sup>39</sup> that includes the spin-polarization effects was used. The core electrons and ion-electron interactions were treated by the projector-augmented wave (PAW) pseudopotentials methods.<sup>40</sup> A plane wave cutoff of 550 eV, energy convergence criterion of  $10^{-4}$  eV, and a force convergence criterion of 0.01 eV were utilized for the geometry optimizations. Grimme's empirical dispersion correction scheme (D3 method)<sup>41</sup> was incorporated with the DFT calculations to account for the long-range effects in geometries and thermodynamic properties.

Because the FLG sample used in the electrochemical experiments contained  $\sim 12$ – $18$  layers of graphene, we used a bulk graphene model in the calculations except for a few specific benchmark studies. Previous theoretical studies have shown that the computational setups employed here are suitable for the calculation of thermodynamics of alkali ion insertion in graphitic materials with good accuracy.<sup>10,42,43</sup>

When only a single-type of M is intercalated in FLG, the binding energy per metal (M = Li, K) atom is calculated by eqn (4).

where  $\Delta E_{\text{M-FLG}}/n$  represents the binding energy (BE) per alkali atom (M) for the M intercalated FLG.  $E_{\text{M-FLG}}$ ,  $E_{\text{FLG}}$ , and  $E_{\text{M}}$  are the energies of metal intercalated FLG, the free FLG, and energy of a single metal atom in the bulk form, respectively. Similarly, the average metal intercalation BE for FLGs with the co-intercalation of two types of M atoms is calculated using eqn (5).

where,  $m = a + b$ ;  $a, b$  = number of Li, K ions intercalated, respectively.  $E_{\text{Li}}$  and  $E_{\text{K}}$  are the energies of a single Li and K atom in the bulk metal, respectively.

## FLG characterization

The FLG electrodes were grown using the CVD technique with a recipe from our previous report.<sup>16</sup> Fig. 1a is the SEM of our FLG graphene sample. Overall, the CVD grown FLG yields large area continuous sheet with polycrystalline nature, with  $0.133 \pm 0.064 \mu\text{m}^2$  average grain size and  $206 \pm 50 \text{ nm}$  radius. Based on the calculated FLG layer number distribution obtained *via* optical transmittance microscopy, the majority of FLG grains consist of 12–18 layers graphene stacks over a continuous graphene sheet of 1–2 layers thick (Fig. 1b). This thickness distribution was

where  $D$  is the ion diffusion coefficient in the host,  $l$  is the characteristic diffusion length (*i.e.* average FLG grain radius),





Fig. 1 FLG electrode characterization. (a) SEM image of FLG. (b) FLG layer number distributions. (c) Raman spectra of thick and thinner graphene areas.

further validated *via* Raman scattering (Fig. 1c), where the thicker grains have a Raman G/2D ratio larger than 1 (black trace), while thinner graphene regions reveal a characteristic G/2D ratio less than 1 (red trace).<sup>44</sup> Overall, the thicker FLG grains serve as host of alkali ions while the thinner graphene serves as conductive base to collect current generated due to the (de)intercalation processes, making them good candidate platforms for fast analysis of  $\text{Li}^+$  intercalation and  $\text{Li}^+/\text{K}^+$  co-intercalation processes.

### $\text{Li}^+$ intercalation kinetics

We conducted a Nernstian-slope analysis to determine the number of charges transferred during  $\text{Li}^+$  (de)intercalation in FLG, by testing the  $\text{Li}^+$  insertion CV profile at various concentrations. In order to accurately obtain the Nernstian-slope, we prepared  $\text{Li}^+$ -containing solutions in which concentrations ( $C_{\text{Li}}$ ) differed by 2 order of magnitude in the range between 0.6 mM and 0.1 M. To ease the quantification of the Nernstian slope, “ $p\text{Li}$ ” (logarithm of the reciprocal of  $C_{\text{Li}}$ , as an approximation to the ion activity) was applied as a numerical measure of the overall  $\text{Li}^+$  content, hence above solutions equivalent to  $p\text{Li}$  range of 3.2 to 1.0.

The commonly used salt in organic carbonates, TBAPF<sub>6</sub>, was chosen as supporting electrolyte to reduce the resistance and balance the charge migration. Alkyl ammonium cations are known to easily intercalate and exfoliate graphite at less negative potentials than  $\text{Li}^+$ .<sup>45</sup> In our experiment, a preconditioned  $\text{Li}^+$ -based SEI layer (Fig. 2a) was used to protect our FLG from the damage caused by  $\text{TBA}^+$  induced exfoliation.<sup>45</sup> Previous work in our group has demonstrated that this preformed SEI layer can exclude the transportation of larger  $\text{TBA}^+$  through it, while allowing  $\text{Li}^+$  and  $\text{K}^+$  to diffuse at ease.<sup>16</sup> The intercalation

profiles at various  $C_{\text{Li}}$ , 0.6 mM to 0.1 M, are shown in Fig. 2b. Each individual  $\text{Li}^+$  intercalation CV demonstrated similar staging-type signature with clearly defined (de)intercalation peaks compared to previous studies.<sup>9,31</sup> Progressively negative (de)intercalation peak potential shifts were observed as  $C_{\text{Li}}$  decreased ( $p\text{Li}$  increased) (Fig. 2b). The robust CV shapes and current intensities evidenced the favorable FLG electrode condition was maintained throughout the tests (Fig. 2b). Hence these observed CV peak potential shifts directly represent the thermodynamic influence of  $C_{\text{Li}}$  on  $\text{Li}^+$  (de)intercalation.

The  $\text{Li}^+$  intercalation process in FLG can be simplified as eqn (6) below:



The Nernst equation of the above reaction at room temperature is:

$$E = E^0 + \frac{0.0592}{x} \log C_{\text{Li}} \quad (7)$$

The value of Nernstian slope,  $0.0592/x$ , can be used to calculate the number of electrons transferred ( $x$ ) upon  $\text{Li}^+$  (de)intercalation. The relationships of peak potential and  $C_{\text{Li}}$  at logarithmic scale ( $p\text{Li}$ ) were chosen to elucidate the number of  $\text{Li}^+$  transferred during  $\text{Li}^+$  (de)insertion processes (Fig. 2c), where the data was chosen from two pairs of representative (de)intercalation peaks as indicated in the figure inset. All peaks displayed a homogeneous linear relationship with  $\text{Li}^+$  concentration throughout the whole  $C_{\text{Li}}$  range, regardless of the phase transition between stages (Fig. S1a†). The Nernstian-slope of peak F-3, F-4, B-3, and B-4 were 57, 58, 54, and 55 mV per decade, respectively (Fig. 2c), which are all in close vicinity to 59 mV per decade for  $x = 1$ . We further carried out control experiments to unambiguously demonstrate that the observed shifts were not a product of potential drift at the reference electrode (Fig. S3†). Hence, we conclude that the  $\text{Li}^+$  (de)intercalation in FLG is a relatively isolated process, where the individual  $\text{Li}^+$  (de)insertion is not influenced by the surrounding  $\text{Li}^+$ . Despite the complicity of multiple stage transition during  $\text{Li}^+$  (de)intercalation, it is not surprising to see only one  $\text{Li}^+$  participates at each step due to the relatively simple environment where only one type of ion intercalates.

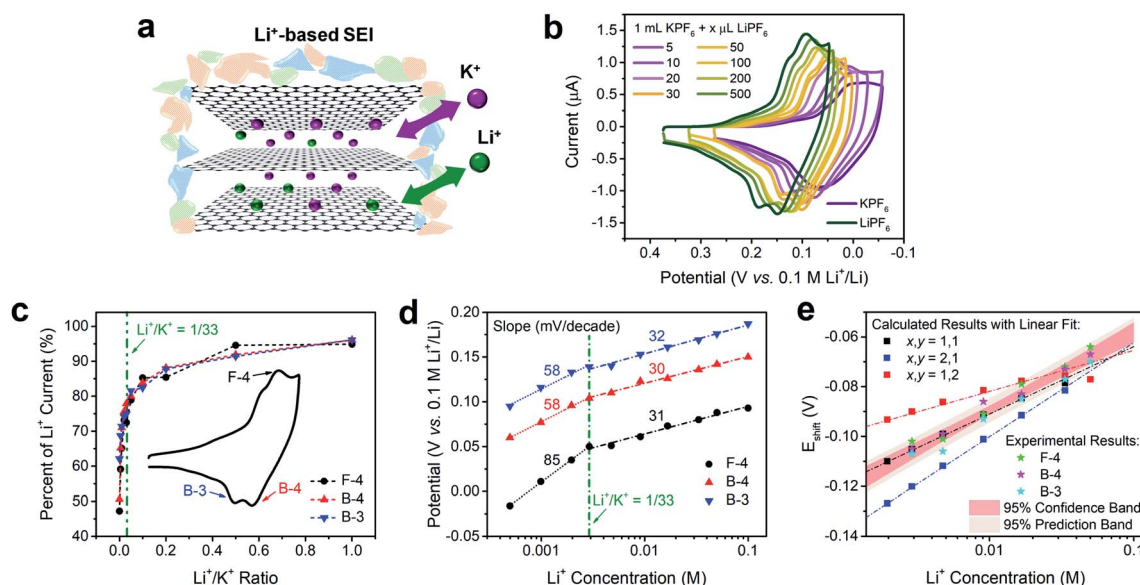
### Experimental evidence of $\text{Li}^+$ and $\text{K}^+$ co-intercalation

The intercalation behaviors of pure  $\text{Li}^+$  and  $\text{K}^+$  have been analyzed previously using CV and Raman spectroscopy.<sup>9,16,46</sup> When the FLG sample surface is passivated by a fully-formed  $\text{Li}^+$ -based SEI layer, both  $\text{Li}^+$  and  $\text{K}^+$  are able to intercalate in a facile and reversible electrochemical process (Fig. 3a).<sup>16</sup> We note however, that there are similarities and differences between  $\text{Li}^+$  and  $\text{K}^+$  intercalation. Both  $\text{Li}^+$  and  $\text{K}^+$  have identical charge state and similar electrostatic interaction with graphene planes,<sup>47</sup> and consequently fill the graphene interlayer spacing with the same staging-type order. Detailed DFT calculations on the thermodynamics of  $\text{Li}^+$  and  $\text{K}^+$  intercalation within a 4-layer graphene (4LG) at different stages and with different





**Fig. 2** Voltammetric characterization of  $\text{Li}^+$  intercalation on FLG at various concentrations. (a) Depiction of  $\text{Li}^+$  intercalation process in FLG with a  $\text{Li}^+$ -based SEI. (b) Comparison of  $\text{Li}^+$  intercalation CVs at selected  $\text{Li}^+$  concentration ( $C_{\text{Li}}$ ). (c) Relationship of  $\text{Li}^+$  intercalation peak potential and  $C_{\text{Li}}$  at logarithmic scale ( $p\text{Li}$ ) in panel (b) with labeled Nernstian-slopes, the inset CV indicates the selected peaks, F = forward/intercalation & B = backward/deintercalation.  $\text{Li}^+$  intercalations at various  $C_{\text{Li}}$  were tested by spiking different amount of 0.1 M TBAPF<sub>6</sub> into 0.1 M LiPF<sub>6</sub> PC-EC solution, on 7.1 mm<sup>2</sup> FLG working electrode at 1 mV s<sup>-1</sup>.



**Fig. 3** Voltammetric characterization of intercalation on FLG in solutions containing both  $\text{Li}^+$  and  $\text{K}^+$  electrolytes. (a) Depiction of  $\text{Li}^+/\text{K}^+$  co-intercalation process in FLG with a  $\text{Li}^+$ -based SEI. (b) Comparison of intercalation CVs of  $\text{Li}^+$ ,  $\text{K}^+$  and selected  $\text{Li}^+/\text{K}^+$  ratios. (c) Relationship of current percent change and  $\text{Li}^+/\text{K}^+$  ratio from selected (de)intercalation peaks in panel (b). The percent changes were normalized to the pure  $\text{Li}^+$  intercalation peak (dark green trace in panel (b)). (d) Relationship of  $\text{Li}^+/\text{K}^+$  co-intercalation peak potential and  $\text{Li}^+$  concentration of selected (de)intercalation peaks in panel (b) with labeled Nernstian-slopes. (e) Comparison of calculated potential shift ( $E_{\text{shift}}$ ) and  $\text{Li}^+$  concentration relationship at various  $\text{Li}^+$  and  $\text{K}^+$  participation number ( $x,y$ ), and their comparison with experimental  $E_{\text{shift}}$  at high  $\text{Li}^+$  concentrations. The 95% confidence and prediction bands come from the averaged results of experimental data.  $\text{Li}^+/\text{K}^+$  co-intercalation relationship at various  $\text{Li}^+/\text{K}^+$  ratio were tested by spiking different amounts of 0.1 M TBAPF<sub>6</sub> into 0.1 M LiPF<sub>6</sub> PC-EC solution, on 19.6 mm<sup>2</sup> FLG working electrode at 500  $\mu\text{V s}^{-1}$ .

stoichiometries showed that both intercalation processes are thermodynamically favorable with clear staging behavior on FLG.<sup>16,31</sup> However, the size difference between  $\text{Li}^+$  and  $\text{K}^+$  leads to stoichiometric change from  $\text{LiC}_6$  to  $\text{KC}_8$ , thus resulting in a 1.33-fold decrease of the  $\text{K}^+$  intercalation charge when compared to its  $\text{Li}^+$  analogue.

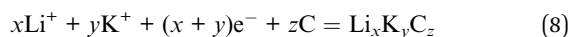
In contrast, when  $\text{Li}^+$  and  $\text{K}^+$  co-existed in solution (Fig. 3a), we observed a distinct behavior that is not explained by the sum of individual intercalation processes. Increasing the concentration of  $\text{Li}^+$  into a  $\text{K}^+$  solution (Fig. 3b) leads to a continuous increase in peak currents and immediate positive shift in peak potentials of all intercalation and de-intercalation peaks. Using

$\text{Li}^+$  intercalation CV as reference (Fig. 3b, dark green trace), we obtained the normalized peak current changes at each  $\text{Li}^+/\text{K}^+$  ratio. As shown in Fig. 3c, a sharp increase in the peak currents at low  $\text{Li}^+$  content was observed for three representative processes; an intercalation (F-4) and two deintercalation (B-3 and B-4), with a plateau behavior at the higher  $\text{Li}^+/\text{K}^+$  ratios. One possible explanation of this phenomenon is the gradual stoichiometric transition of intercalated compounds with increasing  $\text{Li}^+/\text{K}^+$  ratio, e.g., changing from  $\text{MC}_8$  to  $\text{MC}_6$  ( $M = \text{Li}, \text{K}$ ) for Stage 1 alkali intercalation. Furthermore, the potential of (de)intercalation peaks approached to pure  $\text{Li}^+$  intercalation case as well (Fig. 3d). Using Nernstian-relationship analysis, we

noticed a progressive positive shift of the peak potentials as we increase the  $C_{\text{Li}}$ . Compared to the monotonic changes in potential vs.  $\text{Li}^+$  concentration plot for pure  $\text{Li}^+$  intercalation case, the  $\text{Li}^+/\text{K}^+$  co-intercalation system revealed two-stage incremental behavior with different slopes. Each addition of  $\text{Li}^+$  resulted in a positive shift which revealed two linear regimes, occurring at either  $\text{Li}^+$ -rich or  $\text{K}^+$ -rich conditions and denoted by the olive dashed vertical line in Fig. 3d. This transition between regimes happen at few mM of  $\text{Li}^+$  concentration, equivalent to a  $\text{Li}^+/\text{K}^+$  atomic ratio of around 1/33 (Fig. S4†). These results were scan-rate independent as well (Fig. S5†), suggesting that these observations do not arise from kinetic or diffusion-related effects. With less than 5 mV shift of the  $\text{Ag}^+/\text{Ag}$  reference at all test conditions (Fig. S3†), the influence of an unstable reference can be excluded as well.

Changes in Nernstian slopes between low and high  $\text{Li}^+$  concentration regimes revealed a strong sensitivity to the ratio of this ion (Fig. 3d). This is expected since the potential for  $\text{Li}^+$  intercalation is at least 100 mV more positive than  $\text{K}^+$  intercalation.<sup>16</sup> Once spiked, even at low  $\text{Li}^+$  concentration, the thermodynamically more favorable  $\text{Li}^+$  insertion process starts participating in the bulk  $\text{K}^+$  dominated intercalation. In  $\text{K}^+$ -rich regime, two deintercalation processes (Fig. 3d, B-3 and B-4 trace) revealed well-matched Nernstian-slopes of 58 mV per decade, indicating the single electron charge transfer processes during  $\text{Li}^+$  desertion. As a comparison, when the  $\text{Li}^+$  content in  $\text{Li}^+/\text{K}^+$  mixture reached a certain threshold, *i.e.* 1/33  $\text{Li}^+/\text{K}^+$  ratio, the Nernstian-slope between apparent peak potentials and  $\text{Li}^+$  concentration for both intercalation and deintercalation process is reduced to *ca.* 30 mV per decade. With the Nernstian-slope decreased to half, it is evident that the  $\text{Li}^+$  intercalation mechanism has changed, from an independent  $\text{Li}^+$  intercalation at low  $\text{Li}^+/\text{K}^+$  ratio regime (less than 1/33) to a  $\text{Li}^+/\text{K}^+$  co-intercalation mechanism at high  $\text{Li}^+/\text{K}^+$  ratio regime (more than 1/33). The intercalation process at this dilute  $\text{Li}^+$  concentration (Fig. 3d, F-4 trace) showed an 85 mV per decade slope, which is larger than a Nernstian slope of 59 mV per decade for the transfer of a singly charged species. Super-Nernstian responses have been reported potentiometrically during the ion exchange process for divalent alkaline-earth ions on singly charged anionic sites on polymer membranes and explained using models involving phase boundary equilibria.<sup>48</sup> In our case, it is possible that simultaneous charging of  $\text{Li}^+$  and  $\text{K}^+$  on the graphene host, which creates distinct  $\text{LiC}_6$  and  $\text{KC}_8$  stoichiometries, leads also to structural or charge imbalances that widen the expected Nernstian response.

One possible explanation for the change of Nernstian slope at low/high  $\text{Li}^+$  concentration region is the potential cooperative co-intercalation process of  $\text{Li}^+$  and  $\text{K}^+$  with multiple electron transfer, as indicated by eqn (8) below:



The  $\text{Li}^+$  and  $\text{K}^+$  coefficient values ( $x,y$ ) will affect their (de) intercalation potentials, which can be rationalized in eqn (9), by the  $E_{\text{shift}}$  vs.  $\text{Li}^+$  concentration trends (Fig. 3e) at various ( $x,y$ ):

$$E_{\text{shift}} = E - E^0 = \frac{0.0592}{(x+y)} \log C_{\text{Li}}^x C_{\text{K}}^y \quad (9)$$

The detailed calculation procedure for theoretical co-intercalation  $E_{\text{shift}}$  and experimental  $E_{\text{shift}}$  can be found in the ESI (Tables S2 and S3†), where the theoretical  $E^0$  and experimental  $E^0$  at 1 M  $C_{\text{Li}}$  were used as inner reference points, respectively. The variation of  $\text{Li}^+$  and  $\text{K}^+$  participation in the co-intercalation reaction generated distinctive  $E_{\text{shift}}$  responses. Interestingly, the ( $x,y$ ) = (1,1) co-intercalation case holds a Nernstian-slope of 26 mV per decade (Table S2†), which is similar to experimentally obtained results at high  $\text{Li}^+$  concentration (Fig. 3d). Furthermore, Fig. 3e (1,1) co-intercalation trace merged well with the experimental  $E_{\text{shift}}$  trend for all three representative peaks and their averaged result (Fig. S6†). Therefore, it is reasonable to assume that  $\text{Li}^+$  and  $\text{K}^+$  interact during the co-intercalation. In contrast to the work of Zheng *et al.* who reported a minor  $\text{Li}^+$  contribution on the  $\text{K}^+$  intercalation in a  $\text{K}_2\text{NiFe}^{\text{II}}(\text{CN})_6$  cathode,<sup>49</sup> our samples demonstrate participation from both ions in a mixed system. In addition, the facile transport of both alkali ions creates opportunities for concurrent insertion of both  $\text{Li}^+$  and  $\text{K}^+$  into graphene sheets. Nonetheless, questions emerge regarding the feasibility of  $\text{K}^+$  intercalation in the presence of a lithiated phase, as expected by a  $\text{Li}^+$  intercalation potential that is more positive. For this purpose, we turned to DFT methods to elucidate the energetics of this process.

### Theoretical mechanistic study of $\text{Li}^+$ and $\text{K}^+$ co-intercalation

Theoretically, both alkali ions can be intercalated either within the same or separate layers of the FLG. We performed DFT calculations to understand how  $\text{Li}^+$  and  $\text{K}^+$  would co-exist, either in the same layer or into separate layers. Specifically, we calculated the energetics corresponding to co-intercalated FLG systems with  $\text{Li}^+$  and  $\text{K}^+$  existing in a completely mixed form with random K-Li phases and for systems with separate  $\text{Li}^+$ -only and  $\text{K}^+$ -only domains (Fig. 4a–c). In the latter systems, large boundaries will separate the  $\text{Li}^+$  and  $\text{K}^+$  domains (Table 1). Depending on forward and reverse processes; *i.e.*, substituting  $\text{Li}^+$  by  $\text{K}^+$  in a completely Li intercalated system and the *vice versa*, these domains can be formed at different time scales. The calculations show that for a hypothetical co-intercalation system with 50% each  $\text{Li}^+$  and  $\text{K}^+$  intercalation with all –K–Li– phases, the system is thermodynamically unstable by 0.30 eV per atom. When the concentration of –K–Li– phases decreased for larger  $\text{K}^+/\text{Li}^+$  ratio, the system becomes thermodynamically stable starting from  $\text{K}_5\text{LiC}_{48}$ . For  $\text{K}_{29}\text{LiC}_{240}$  the energy gain due to intercalation is –0.16 eV per atom. This ratio is already close to the experimentally observed kinetic transition point at  $\text{K}_{33}\text{Li}$  system (Fig. S4†). We also note that the fully potassiated  $\text{KC}_8$  has a calculated binding energy (BE) of –0.20 eV. These calculations clearly show that substituting  $\text{Li}^+$  for  $\text{K}^+$  within the same layer in a FLG is thermodynamically favorable when intercalated  $\text{K}^+$  and  $\text{Li}^+$  are separated as far as possible or when  $\text{K}^+$  only and  $\text{Li}^+$  only domains exist within the FLG layers. This situation arises due to the size-difference between  $\text{Li}^+$  and  $\text{K}^+$  ions, which will disfavor the simultaneous binding of both ions with graphene for –K–Li–







**Fig. 4** Different co-intercalation configurations and corresponding metal binding energies. (a and b) Selected models showing unique Li and K co-intercalation within the same or different layers, respectively. (c) Plot of the metal binding energies corresponding to co-intercalated metals ratio of Li/K (in a logarithmic scale) within the same or different layers, respectively. (d) Charge density difference plot in a section of  $K_{19}LiC_{160}$ . Only the positive isosurface is shown for clarity. (e) Projected density of states (pDOS) in  $K_{29}LiC_{240}$ . Colouring atom scheme: Li; green, K; purple.

**Table 1** DFT calculated energetics for  $K_{x-1}LiC_{8x}$  type bulk models, in which the  $K^+/Li^+$  ratio ( $x - 1 : 1$ ) in any interlayer has been kept constant. For comparison, energies for  $LiC_8$  and  $KC_8$  are also presented

System	$K^+/Li^+$ intercalation patterns within the same layer	BE/M atom <sup>a</sup> , eV
$LiC_8$	–Li–	–0.26
$KLiC_{16}$	–K–Li–	0.30
$K_2LiC_{24}$	–K <sub>2</sub> –Li–	0.14
$K_3LiC_{32}$	–K <sub>3</sub> –Li–	0.07
$K_4LiC_{40}$	–K <sub>4</sub> –Li–	0.00
$K_5LiC_{48}$	–K <sub>5</sub> –Li–	–0.02
$K_6LiC_{56}$	–K <sub>6</sub> –Li–	–0.06
$K_7LiC_{64}$	–K <sub>7</sub> –Li–	–0.07
$K_9LiC_{80}$	–K <sub>9</sub> –Li–	–0.09
$K_{14}LiC_{120}$	–K <sub>14</sub> –Li–	–0.13
$K_{19}LiC_{160}$	–K <sub>19</sub> –Li–	–0.15
$K_{24}LiC_{200}$	–K <sub>24</sub> –Li–	–0.16
$K_{29}LiC_{240}$	–K <sub>29</sub> –Li–	–0.16
$KC_8$	–K–	–0.20

<sup>a</sup> w.r.to M atom in its stable crystal.

phases. However, when  $Li^+$  and  $K^+$  domains could form at large  $Li^+/K^+$  ratios, both ions can favorably interact with the graphene layers.

Co-intercalation at large  $Li^+/K^+$  ratios were further investigated by modelling  $Li^+$  and  $K^+$  intercalation in separate layers of FLG (Fig. 4b). We note that using the model systems with  $Li^+$  and  $K^+$  intercalation in separate layers significantly reduce the computational time while replicating the effects of co-intercalation phases such as  $-Li_aK_b-$  ( $a, b > 33$ ) in the same graphene layer. We found that the intercalation of  $Li^+$  and  $K^+$  in separate layers (or  $Li^+$ -only and  $K^+$ -only domains formation in

same layer) is always thermodynamically stable.  $Li^+$ -domains and  $K^+$ -domains are expected to form  $LiC_6-$  and  $KC_8$ -type configurations to maximize the stability. In fact, the calculations predict that at 4 : 3 ratio of  $Li^+/K^+$  ions, a Stage 1 co-intercalation configuration with both  $C_6Li-$  and  $C_8K$ -type stoichiometries could exist with a binding energy of  $-0.29 \text{ eV M}^{-1}$ , which is even more stable compared to individual  $C_8Li$  and  $C_8K$  intercalation systems. To summarize, the DFT calculations clearly showed that the co-intercalation is stable for a range of  $Li^+/K^+$  ratios and explained the corresponding experimental findings. We note that in addition to the binding energies discussed here, the entropy could be important to understand certain features for staging mechanisms during Li ion intercalation.<sup>50–52</sup> However, such contributions could be neglected safely with non-significant errors when computing the general thermodynamic properties of intercalation phenomena, especially at room temperature.<sup>14,53</sup>

DFT calculated average atomic charges on  $Li^+$  and  $K^+$  ions in co-intercalated systems (Table S4†) showed that the charge on  $K^+$  remains consistent ( $0.80$ – $0.82e^-$ ) for all concentrations compared to a value of  $0.82e^-$  in the bulk  $KC_8$ . The magnitude of atomic charge on  $Li^+$  fluctuates from  $0.84$ – $0.91e^-$ , depending on the size of  $-K-Li-$  phases. The maximum value of  $Li^+$  charge ( $0.91e^-$ ) was predicted for thermodynamically unstable  $KLiC_{16}$  system. For larger  $K^+/Li^+$  ratio, the charge on  $Li^+$  becomes consistent with the values of  $0.84$ – $0.86e^-$  compared to  $0.84e^-$  in bulk  $LiC_8$ . Overall, both alkali ions exist in monovalent ionic forms in all co-intercalation systems studied. Calculated charge density difference plot of co-intercalation systems suggest stronger charge transfer interactions of the graphene layers with  $K^+$  than  $Li^+$  when the  $-K-Li-$  phases exist in the same layer (Fig. 4d). This support our prediction that the  $K^+$  and  $Li^+$  will likely form separate domains in co-intercalation systems. Calculated projected DOSs



demonstrated the metallic nature of the co-intercalation systems and substantiated the conclusions drawn from the calculated atomic charges and charge density plots (Fig. 4e).

### Diffusion coefficient for co-intercalation

We note that the change of external environment, *i.e.*,  $\text{Li}^+/\text{K}^+$  ratio, may also cause changes in the apparent diffusion coefficient of alkali ions at each intercalation stage. During (de)insertion, the  $\text{Li}^+$  and  $\text{K}^+$  are constrained within the gap between two graphene planes. The larger  $\text{K}^+$  (1.4 Å) leads to a larger expansion of the graphene interlayer distance, from 3.35 Å to 5.32 Å at Stage 1  $\text{KC}_8$  compound, while the smaller  $\text{Li}^+$  (0.76 Å) leads to a smaller expansion of 3.61 Å at Stage 1  $\text{LiC}_6$  compound.<sup>54</sup> Hence, it is possible that the  $\text{Li}^+$  and  $\text{K}^+$  exhibit different diffusion rates within graphene planes. Thus, we used the potential intermittent titration technique (PITT) to examine the apparent diffusion coefficient in various  $\text{Li}^+$  and  $\text{K}^+$  containing solutions.<sup>35</sup>

Fig. 5a displays the CV of conditions chosen to measure diffusion coefficients. In agreement with the previously determined voltammetric peak displacements (Fig. 3b), similar positive potential shift upon addition of  $\text{Li}^+$  into bulk  $\text{K}^+$  electrolyte is observed (Fig. 5a). The calculated diffusion coefficients at each potential were also plotted in Fig. 5b. Overall, the apparent diffusion coefficient demonstrated a stage-dependent

behavior with values in the range of  $1 \times 10^{-10}$  to  $1 \times 10^{-12} \text{ cm}^2 \text{ s}^{-1}$ , which is comparable with previous reports of alkali ion insertion in graphite.<sup>55,56</sup> For comparison purposes, the diffusion coefficient distribution at different  $\text{Li}^+/\text{K}^+$  co-intercalation conditions was overlaid by properly shifting their potentials (Fig. 5c). While all co-intercalation systems held similar staging-type behavior of the apparent diffusion coefficient, the earlier stages (FLG to Stage 3) exhibited 1 order of magnitude faster ionic diffusion than later stages (Stage 3 to Stage 1). This can be explained by the concentration difference of intercalated alkali ions inside FLG. This is, as more alkali ions inserted within graphene planes, the scattering of newly intercalated alkali ions increases, hence reducing the mean free path of intercalated ions. Therefore, the dilute region has relatively larger diffusion coefficient than the concentrated region, as shown in Fig. 5c. The values of the average diffusion coefficient in the dilute and concentrated regions can be found in Table S5.†

The diffusion coefficients in co-intercalation systems also revealed a component-dependent behavior. As shown in Fig. 5b and Table S4,† increasing  $\text{Li}^+$  content leads to larger apparent diffusion coefficient. In fact, the pristine  $\text{K}^+$  (Fig. 5b red-trace) diffuses  $\sim 3.2$  times slower than pristine  $\text{Li}^+$  case (Fig. 5b black-trace), which correlates with the size difference between smaller  $\text{Li}^+$  and larger  $\text{K}^+$ . As presented in the overlaid results (Fig. 5c), all co-intercalation systems followed similar stage-



Fig. 5 Diffusion coefficient of co-intercalation system. (a)  $\text{Li}^+$ ,  $\text{K}^+$  intercalation and co-intercalation behavior at various ratio. (b) Diffusion coefficients of alkali ions at various  $\text{Li}^+$  and  $\text{K}^+$  ratio. The value of diffusion coefficients was obtained via PITT analysis at different  $\text{Li}^+$ ,  $\text{K}^+$  solution mixture. (c) Illustration of the method of merge potentials of different responses in  $\text{Li}^+/\text{K}^+$  co-intercalation systems for diffusion coefficient comparison. We defined here the potential range for the "dilute" and "concentrated" regions for future calculation. (d) The ratio of diffusion coefficient of deintercalation at concentrated region vs. that of the pure  $\text{K}^+$  system. Diffusion coefficient ratio  $R = D_x/D_K$ ; Li number concentration  $N_{\text{Li}} = n_{\text{Li}}/(n_{\text{Li}} + n_{\text{K}})$ . All experiments were tested in 0.1 M  $\text{LiBF}_4$ ,  $\text{KPF}_6$  or  $\text{LiPF}_6$  in PC-EC, on 4.9 mm<sup>2</sup> FLG working electrode at 1 mV s<sup>-1</sup>.



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