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# **PAPER**



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# Understanding the crystal structure-dependent electrochemical capacitance of spinel and rock-salt Ni-Co oxides *via* density function theory calculations†

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The spinel  $NiCo_2O_4$  and rock-salt  $NiCoO_2$  have been well established as attractive electrodes for supercapacitors. However, what is the intrinsic role of the congenital aspect, *i.e.*, crystal structure and the surface and/or near-surface controlled electrochemical redox behaviors, if the acquired features (*i.e.*, morphology, specific surface area, pore structure, and so on) are wholly ignored? Herein, we purposefully elucidated the underlying influences of unique crystal structures of  $NiCo_2O_4$  and  $NiCoO_2$  on their pseudocapacitance from mechanism analysis through the density function theory based first-principles calculations, along with the experimental validation. Systematic theoretical calculation and analysis revealed that more charge carriers near the Fermi-level, stronger affinity with  $OH^-$  in the electrolyte, easier deprotonation process, and the site-enriched characteristic for low-index surfaces of  $NiCoO_2$  enable its faster redox reaction kinetics and greater charge transfer, when compared to the spinel  $NiCo_2O_4$ . The in-depth understanding of crystal structure-property relationship here will guide rational optimization and selection of appropriate electrodes for advanced supercapacitors.

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# 1 Introduction

To date, supercapacitors have shown great potential for electrochemical energy storage due to their higher power density and longer lifespan than rechargeable batteries.¹ From the intrinsic energy storage mechanism point of view, supercapacitors are typically categorized into electric double-layer capacitors (EDLCs) depending upon fast ad/desorption of ions on the electrode surface, and pseudocapacitors originating from rapid faradaic redox reactions on/near the surface of the electrodes.².³ However, the low specific capacitances (SCs) of EDLCs, to a great extent, limit their utilization in high energy applications. As a result, enormous amounts of research have been greatly stimulated to develop high-performance electrode materials with pseudocapacitive characteristics.⁴,⁵

Binary transition metal oxides (BTMOs) have been intensively investigated as active materials for supercapacitors due to their easy availability, environmental friendliness, and multiple oxidation states for efficient charge storage. Especially, spinel  $\text{NiCo}_2\text{O}_4$  and rock-salt  $\text{NiCoO}_2$ , stand out from others, owing to their more than two orders of magnitude higher electrical conductivity than their parent cobalt oxides. In general,

inherent electronic conductivity and ionic adsorption capability of abundant active sites are key points influencing electrochemical performance of pseudocapacitive electrodes, except for the acquired aspects including specific surface area (SSA) and pore structure. 10,11 Although extensive investigations into structural and/or compositional designs towards enhancing electrochemical properties of NiCo2O4 and/or NiCoO2 electrodes have already been made, 6,12-17 no any reports can be retrieved to figure out which one possesses even better electrochemical activities. In fact, it is yet difficult to draw a definitive conclusion according to the previous contributions about the two for supercapacitors, since all the reported electrochemical properties are based on their different acquired characteristics (i.e., morphology/SSA/pore structure).6,9,12-17 In this regard, a thought-provoking question comes to the fore: what is the role of the congenital aspect, *i.e.*, crystal structures of spinel NiCo<sub>2</sub>O<sub>4</sub> and rock-salt NiCoO<sub>2</sub>, in their surface and/or near-surface controlled electrochemical redox behaviors if the aforementioned acquired features are wholly ignored? There is no doubt that the in-depth understanding of crystal structureproperty relationship will render instructive insights into future optimal choice of appropriate electrodes for advanced supercapacitors.

With comprehensive considerations above in mind, herein, we elucidated the underlying influences of unique crystal structures of  $NiCo_2O_4$  and  $NiCoO_2$  on their pseudocapacitances from mechanism analysis through the density function theory

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(DFT) based first-principles calculations, along with the experimental validation. Systematic theoretical calculation and analysis revealed that more charge carriers near the Fermi-level, stronger affinity with hydroxyls in the electrolyte, easier deprotonation process, and the site-enriched characteristic for low-index surfaces of NiCoO $_2$  enable its faster redox reaction kinetics and more charge transfer, when compared to the spinel NiCo $_2$ O $_4$ . As expected, the NiCoO $_2$  exhibited enhanced electrochemical behaviors especially at high rates.

# 2 Computational methods

Spin-polarized density functional theory calculations were carried out based on the Cambridge Sequential Total Energy Package known as CASTEP,18 using the projector augmented wave (PAW) potentials.<sup>19</sup> we used the Perdew-Burke-Ernzerhof with Hubbard U (PBE + U) form within the generalized gradient approximation (GGA) for exchange-correlation energy. 19,20 Notably, different values between U = 0 and 8 have been used in the Ni/Co compounds in the literature. Herein, we have chosen U values of 5.5 for Ni ions, and 4.5/3.3 eV for Co ions at tetrahedral/octahedral sites, respectively, to obtain the correct electronic and magnetic state of bulk NiCoO2 and NiCo2O4. The number of plane wave was collected by a 500 eV. The Brillouin zones were represented by a Monkhorst–Pack mesh of  $7 \times 7 \times 7$ k-points for crystals and  $3 \times 3 \times 1$  k-points for studied surface slabs.<sup>21</sup> The stoichiometric surfaces were modeled by a  $(1 \times 1)$ unit cell for NiCo2O4 and (2 × 2) for NiCoO2, which were separated in the z-direction by a 15 Å vacuum. The convergence criterion of Hellmann-Feynman forces and total energy were  $0.015 \text{ eV Å}^{-1}$  and  $10^{-5} \text{ eV}$ , respectively. For accurate results, we compared band structures between NiCo<sub>2</sub>O<sub>4</sub> and NiCoO<sub>2</sub> using HSE06 hybrid functional.22 To model the magnetic state of NiCo<sub>2</sub>O<sub>4</sub> and NiCoO<sub>2</sub>, we used antiparallel spins for Co and Ni atoms in NiCoO2 due to its high Néel temperature according to Du et al.23 In addition, the Co atoms at tetrahedral sites have antiparallel state with Ni atoms for NiCo<sub>2</sub>O<sub>4</sub>, where the Co ions at octahedral sites have no spin polarization due to the fully occupied t<sub>2g</sub> states.24

The surface energy  $(\gamma)$ , was computed as  $\gamma = (E_{\rm slab} - nE_{\rm bulk})$ 2A, where  $E_{\text{slab}}$ ,  $E_{\text{bulk}}$ , n and A were the energy of the slab supercell, the bulk energy per unit cell, the number of bulk cells contained in the surface slab, and the surface area of each side for the slab, respectively. For the surface with different hydroxyl coverage, the average adsorption energy could be defined as  $E_{ads}$ =  $[E_{(nOH/slab)} - E_{(slab)} - nE_{(OH)}]/n.^{25,26}$  The deprotonation energy was calculated by  $E_{\text{de}} = [E_{\text{(O/slab)}} - E_{\text{(nOH/slab)}} + 0.5nE_{\text{(H_2)}}]/n$ , where  $E_{(nOH/slab)}$ ,  $E_{(O/slab)}$ ,  $E_{(slab)}$ ,  $E_{(OH)}/E_{(H_2)}$  and n were the energies of the adsorbed systems, the energy of the deprotonation system, the energy of the clean surface, the energies for an isolated hydroxyl/H2 molecules, and the number of adsorbed hydroxyls or desorbed protons, respectively. To have a profound understanding about charge transfer, the Bader charge method, where an amount of each charge was considered in the region separated by the minimum of electronic charge density between each atom, was used.27,28

# 3 Results and discussion

### 3.1 Crystal structures

As schematically shown in Fig. 1a and b, the crystal structures of NiCo2O4 and NiCoO2, typically contain 56 and 8 atoms in the unit cells, respectively. According to the site performance theory, the crystal structure of NiCo2O4 and NiCoO2 can be constructed by substituting cobalt atoms located at octahedral sites in spinel Co<sub>3</sub>O<sub>4</sub> and rock-salt CoO unit cells with elemental nickel, respectively. 7,24,29 Evidently, the spinel NiCo<sub>2</sub>O<sub>4</sub> contains two kinds of Co atoms located at octahedrally coordinated sites (Co<sup>o</sup>) and tetrahedrally coordinated sites (Co<sup>t</sup>), respectively, coupled with alternating layers of -Co<sup>o</sup>-O- and -Ni-O- along the z direction,  $^{24}$  as described in Fig. 1a. The rock-salt NiCoO<sub>2</sub>, as shown in Fig. 1b, only possesses the octahedral sites both for Co and Ni atoms. The optimized lattice constant values of NiCo<sub>2</sub>O<sub>4</sub> and NiCoO<sub>2</sub> (Table S1, ESI†) are 8.22 and 4.26 Å, just with  $\sim 1.4\%$  and  $\sim 0.5\%$  error, respectively, when compared to their standard files. In addition, the computed magnetic moments of Co<sup>t</sup> and Ni are 2.77 and  $-1.43 \mu_B$  in spinel NiCo<sub>2</sub>O<sub>4</sub>, respectively, and 2.74 and  $-1.80 \mu_B$  for Co and Ni in rock-salt NiCoO2, which are in good agreement with the reported calculational and/or experimental values.24,30

### 3.2 Electronic properties

According to the pseudocapacitive system, the electrolyte ions diffuse from the electrolyte to the electrode/electrolyte interface under the effect of external circuit in the charging process, and then, the redox reaction occurs. Thus, the states near the Fermilevel, especially the contribution of d-orbital of metal ions, are considered to be related with the charge storage ability.31,32 As discerned from the total band structures of NiCo<sub>2</sub>O<sub>4</sub> (Fig. 1c) and NiCoO<sub>2</sub> (Fig. 1d), the occupied and unoccupied electronic states are visualized near the Fermi-level, favoring for their rapid electronic transport. To gain more insights into specific electronic structure around the Fermi-level, the projected band structures of d-orbital from the active Ni/Co atoms were calculated. Clearly, the bands near the Fermi-level are mainly contributed by the d-orbital of Co atoms, in which the Ni atoms contribute little. In addition, for spinel NiCo2O4, two kinds of atoms, i.e., Co<sup>o</sup> and Co<sup>t</sup> both contribute the bands near the Fermi-level (Fig. S1, ESI†), where the contribution of Co<sup>t</sup> can be wholly negligible. One thing worth noting is that the contributions of d-orbital near the Fermi-level are greatly conducive to the enhanced electron mobility for rapid redox process of pseudocapacitive electrodes.33,34 On account of more contributions from d-orbital of metal atoms to the bands near the Fermilevel of rock-salt NiCoO2, it can be rationally anticipated that the NiCoO2 will exhibit higher electroactivities than spinel NiCo2O4.35

### 3.3 Charge-storage mechanism analysis

As for the surface modeling, we here consider three low-index, (100), (110) and (111), planes of  $\rm NiCo_2O_4$  and  $\rm NiCoO_2$  with the largest interplanar spacing, as they are predicted to be the most stable in the cubic crystals. <sup>36,37</sup> Among the three surfaces, the

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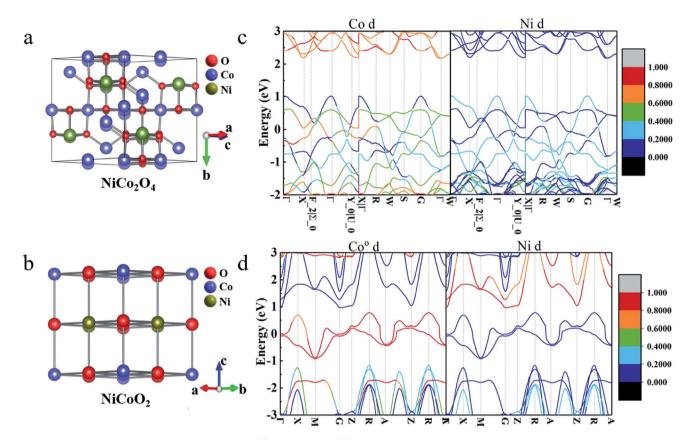


Fig. 1 Optimized crystallographic constructions of (a)  $NiCo_2O_4$  and (b)  $NiCoO_2$ . Red, blue and green represent the oxygen, cobalt and nickel atoms. The contributions of d-orbital of all Co/Ni atoms to the band structure in (c)  $NiCo_2O_4$  and (d)  $NiCoO_2$ . The energy zero is set at the Fermi-level.

(111) plane, both for spinel and rock salt structure, is not truly stable surfaces, which can be expected to undergo surface reconstruction. Therefore, we finally study the (100) and (110) surfaces. The surface energy values of (100)/(110) for NiCo<sub>2</sub>O<sub>4</sub> and NiCoO<sub>2</sub> are 1.03/1.25 and 0.95/1.99 J m<sup>-2</sup>, respectively. Notably, the (110) surface, both for NiCo<sub>2</sub>O<sub>4</sub> and NiCoO<sub>2</sub>, has two different stable non-polar surface configurations (Fig. 2). Accordingly, we choose the Oh(top) (Fig. 2a) of the NiCo<sub>2</sub>O<sub>4</sub>(110) for further calculation, since its total energy is 0.23 eV, lower than those of Th/Oh(top) (Fig. 2b) according to the DFT calculation. And the Co(top) (Fig. 2c), whose total energy is 0.66 eV, lower than that of Ni(top) (Fig. 2d), is chosen for the NiCoO<sub>2</sub>(110). Corresponding surface lattice constants are summarized as well (Table S1, ESI†).

According to the established charge-storage mechanism of NiCo<sub>2</sub>O<sub>4</sub> and NiCoO<sub>2</sub> in alkaline KOH solution, the pseudocapacitance always takes place as following two steps. <sup>10,14,39,40</sup> First, the redox reaction occurring on the exposed surface generally starts from the OH<sup>-</sup> adsorption, thus leading to the formation of \*OH species. And then, the reaction of adsorbed \*OH with the OH<sup>-</sup> in the solution partially forms the adsorbed \*O species, and releases a H<sub>2</sub>O molecule meanwhile, which is generally ascribed as a deprotonation process. Since the pseudocapacitance originates from the fast redox reactions through the chemisorption of electrolyte ions, the binding energy can act as one of the descriptors for evaluating electrochemical performance. After simple analysis, there are two kinds of stable adsorbed sites, that is, the top sites of Co and Ni atoms both in

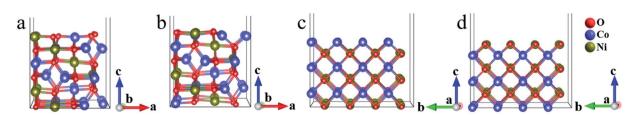


Fig. 2 Side views for the two kinds of (110) slabs of NiCo<sub>2</sub>O<sub>4</sub>: (a) Oh(top), (b) Th/Oh(top), and (110) slabs of NiCoO<sub>2</sub>: (c) Co(top), (d) Ni(top). The Oh(top) contains only octahedral metal ions while Th/Oh(top) contains both tetrahedral and octahedral metal ions on the top surface. Co(top) and Ni(top) are Co atoms and Ni atoms on the top surface.

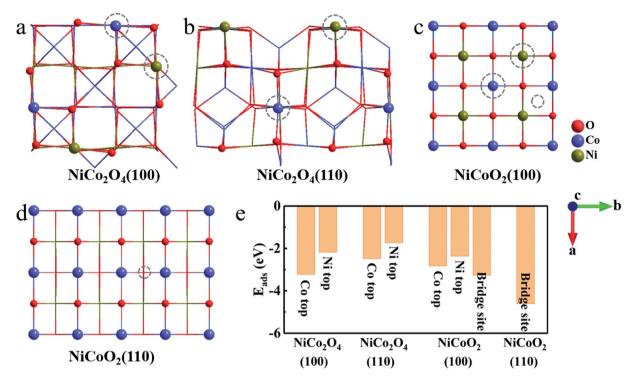


Fig. 3 Top view of the (a)  $NiCo_2O_4(100)$ ; (b)  $NiCo_2O_4(110)$ ; (c)  $NiCoO_2(100)$  and (d)  $NiCoO_2(110)$ . The dotted circles represent the stable adsorbed sites for hydroxyl. (e) Corresponding energy analysis for hydroxyl adsorption at different sites.

(100) and (110) surfaces of NiCo<sub>2</sub>O<sub>4</sub> (Fig. 3a and b). For the case of NiCoO<sub>2</sub>(100), the OH<sup>-</sup> can be adsorbed stably both on the top sites of Ni/Co and bridge site between them (Fig. 3c). In contrast, the OH adsorbs only on the bridge site of two Co atoms in NiCoO<sub>2</sub>(110) (Fig. 3d). As collected in Fig. 3e, the binding energy between hydroxyls and active surfaces of NiCo<sub>2</sub>O<sub>4</sub>/NiCoO<sub>2</sub> is an exothermic and spontaneous process, due to their negative adsorption energy. The Co sites in NiCo<sub>2</sub>O<sub>4</sub> display stronger absorption capacity for OH- on both two surfaces, as indicated by even more negative  $E_{ads}$  for (100) (-3.23 eV) and (110) (-2.48 eV) than those of Ni sites (-2.18 eV)and -1.74 eV) (Fig. S2a-d, ESI†). As regards the NiCoO<sub>2</sub>(100), the bridge site between Co and Ni (Fig. S2e, ESI†) is a more preferred site, which shows the  $E_{\rm ads}$  of -3.26 eV for OH<sup>-</sup>, lower than those at the top of single Co (-2.83 eV) and Ni (-2.37 eV)ions (Fig. S2f and g, ESI†). The NiCoO2(110) shows the most negative  $E_{\rm ads}$  of -4.62 eV when adsorbed on the bridge site between two Co atoms (Fig. S2h, ESI†). Clearly, compared with those of  $NiCo_2O_4$ , the (100) and (110) surfaces of  $NiCoO_2$  both exhibit more negative  $E_{ads}$  in the case of low coverage (Fig. 3e), which indeed favors for high faradaic reaction kinetics, thanks to the fast and stable OH adsorption on the two surfaces.

Then, we investigate how  $OH^-$  pattern varies when its coverage is changed. Fig. 4a presents the  $E_{\rm ads}$  as function of hydroxyl coverage for the most stable adsorption sites of the  $NiCo_2O_4$  and  $NiCoO_2$ . It's clear that the  $E_{\rm ads}$  decreases as the hydroxyl coverage increases for both the (100) and (110) surfaces due to the gradual saturation of the surface. The  $E_{\rm ads}$  values of the (100)/(110) surfaces for  $NiCoO_2$  are larger than those of

 ${\rm NiCo_2O_4}$  at all values of hydroxyls coverage. Corresponding relaxation configurations (Fig. S3a–d, ESI†) are summarized as well. According to the coordination configurations of the surface atoms, the Ni/Co atoms display octahedral coordination geometry when the  ${\rm OH^-}$  coverage is full (Fig. 4b). Evidently, two hydroxyls are adsorbed on each Ni and Co sites in  ${\rm NiCo_2O_4(110)}$  due to two oxygen atoms loss in the coordination of octahedral Ni and Co.

Besides the binding ability between electrode surfaces and electrolyte ions, a superior electrode material fundamentally requires rich active sites and high electron-donating capability, 35 which are always related to the charge transfer originating from the hydroxyl adsorption. From the lattice constants aforementioned (Table S1, ESI†), the exposed surfaces of NiCoO2 own higher concentration of active atoms (CAAs) of Ni and Co, which will bond directly to the hydroxyls in the reaction process. The CAAs are calculated as  $\sim$ 11.02 and  $\sim$ 7.57 atoms per nm for (100) and (110) surfaces of NiCoO<sub>2</sub>, respectively, approximately twice of those for (100) (5.92 atoms per nm) and (110) (4.19 atoms per nm) of NiCo<sub>2</sub>O<sub>4</sub> (Fig. S4a, ESI†). Therefore, the preponderant reaction surface of NiCoO2 promotes a greater proportion of Ni and Co atoms involved in electrochemical reactions, which would provide high electron-donating capability. By performing the calculations on charge density difference (Fig. S4b-e, ESI†), we can deduce that most electrons tend to transfer from electrodes to hydroxyls when the Ni/Co TMOs are charged, indicating that the adsorption process is an oxidation process of surface metal atoms. We further explore the charge transfer  $(\Delta Q_1)$  versus the hydroxyl coverage according Paper RSC Advances

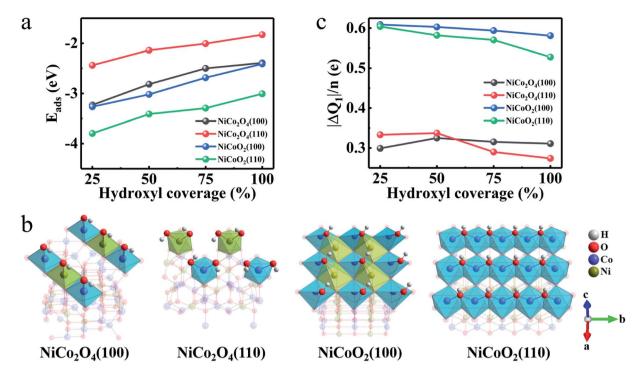


Fig. 4 (a) Hydroxyl adsorbed energy ( $E_{ads}$ ) at different hydroxyl coverage. (b) Coordination configurations at full coverage of all studied surfaces. (c) Charge transfer ( $\Delta Q_1$ ) at different hydroxyl coverage.

to the Bader charge analysis (Fig. 4c). The average charge values  $(\Delta Q_1/n)$ , that is the adsorbed OH<sup>-</sup>, obtained on the NiCoO<sub>2</sub>(100) and (110) surfaces are larger than those in the NiCo<sub>2</sub>O<sub>4</sub>(100) and NiCo<sub>2</sub>O<sub>4</sub>(110) at any hydroxyl coverage. It confirms a tendency

that a better electron donation of surface Ni/Co atoms ensures their higher oxidation states. All analysis above therefore can deduce the exceptionally high pseudocapacitance of the rock-salt  $\rm NiCoO_2$  in alkaline KOH electrolyte.

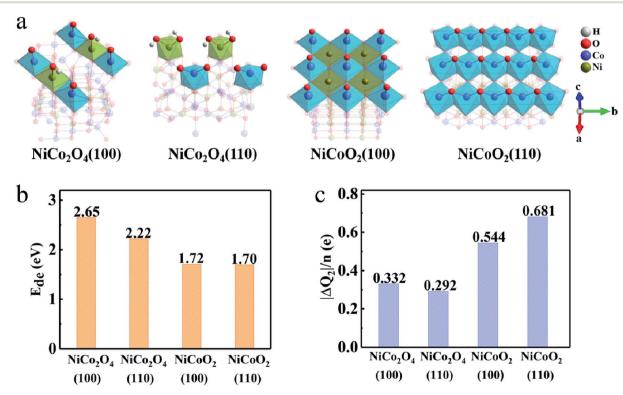


Fig. 5 (a) Surface configuration, (b) average deprotonation energy ( $E_{\rm de}$ ) and (c) charge transfer ( $\Delta Q_2$ ) after the complete deprotonation.

The deprotonation process can be described as MOOH +  $OH^- \leftrightarrow MO_2 + H_2O$  (M is Co or Ni). However, the general observation is that the deprotonation process cannot occur at octahedral coordinate Ni ions, at the limited work potential window for supercapacitors, due to the higher transition potential than that of Co ions. 40,41 As shown in Fig. 5, the deprotonation, is a relatively unfavorable process compared to adsorption process due to the high deprotonation energy values  $(E_{de})$ , which means that the reaction involved in the second step needs even higher driving force. The DFT calculation also authenticates that the  $E_{de}$  values on (100) (1.72 eV) and (110) (1.70 eV) surfaces of NiCoO<sub>2</sub> are lower than those of NiCo<sub>2</sub>O<sub>4</sub>, i.e., 2.65/2.22 eV for the (100)/(110) surfaces (Fig. 5b). Hence, the formed \*OH has much more opportunities to desorb protons from the surfaces of NiCoO<sub>2</sub> than the NiCo<sub>2</sub>O<sub>4</sub> to form \*O. While, there are more electrons transfer from electrodes to adsorbed molecules due to the deprotonation process, which demonstrates that the surface/subsurface metal atoms are further oxidized. But for NiCoO2(100), the number of charge transfer decreases after hydrogen desorption, which is related to the fact that the adsorption sites deviate from the bridge sites to the top of cobalt, decreasing the charge donation of nickel atoms (Fig. 5c).

The first-principles calculation results, as discussed above, corroborate more attractive innate merits of NiCoO<sub>2</sub> serving as

the electrode material for supercapacitors as follows. First, the large electronic state contribution from Co atoms of NiCoO<sub>2</sub> near the Fermi-level provides more charge carriers for faradaic redox reactions, thus enhancing the redox activities. Second, the much easier OH $^-$  adsorption and deprotonation processes will accelerate the surface reaction dynamics. The two aspects synergistically facilitate the rate behaviors of the NiCoO<sub>2</sub> electrode. Third, the surfaces of NiCoO<sub>2</sub> show high concentration of redox active sites and higher electron donation capability than NiCo<sub>2</sub>O<sub>4</sub>, realizing a large degree of oxidation after reaction, which is helpful to obtain large SCs. It is thanks to these appealing congenital advantages that the rock-salt NiCoO<sub>2</sub> can be reasonably anticipated with even better electrochemical performance than the spinel NiCo<sub>2</sub>O<sub>4</sub>.

### 3.4 Electrochemical properties

To experimentally support the above viewpoint, we purposefully chose our synthesized two Ni–Co binary oxides, *i.e.*, flower-shaped NiCoO<sub>2</sub> (ref. 14) and NiCo<sub>2</sub>O<sub>4</sub> (Fig. S5 and S6, ESI†), and comparatively study their capacitive performance. The distinct redox peaks in cyclic voltammetry (CV) curves of both NiCo<sub>2</sub>O<sub>4</sub> (Fig. 6a) and NiCoO<sub>2</sub> (ref. 14) verify their typical pseudocapacitance mainly, which typically results from fast and reversible redox processes of Co<sup>2+</sup>/Co<sup>3+</sup>/Co<sup>4+</sup> and Ni<sup>2+</sup>/Ni<sup>3+</sup> in

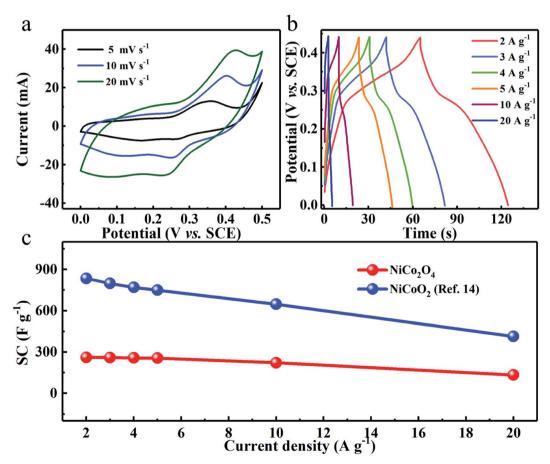


Fig. 6 (a) CV and (b) CP curves of the  $NiCo_2O_4$  electrode. (c) Comparison of SCs between  $NiCo_2O_4$  and  $NiCoO_2$  electrodes at various current densities.

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2 M KOH aqueous solution.  $^{9,14,15,42,43}$  As derived from the chronopotentiometry (CP) plots (Fig. 6b), the spinel NiCo<sub>2</sub>O<sub>4</sub> electrode with a mass loading 5 mg cm<sup>-2</sup> exhibits reversible SCs of  $\sim$ 262,  $\sim$ 260,  $\sim$ 258,  $\sim$ 256,  $\sim$ 222 and  $\sim$ 133 F g<sup>-1</sup> at the current densities of 2, 3, 4, 5, 10 and 20 A g<sup>-1</sup>, respectively. By sharp contrast, the rock-salt NiCoO<sub>2</sub> obtains ultrahigh SCs of  $\sim$ 836 and  $\sim$ 415 F g<sup>-1</sup> at 2 and 20 A g<sup>-1</sup>, respectively,  $^{14}$  which are both higher than three times those of the NiCo<sub>2</sub>O<sub>4</sub> electrode, as plotted in Fig. 6c.

# 4 Conclusions

In summary, we have comprehensively conducted the first-principle DFT calculations to shed light on the distinguished advantages of rock-salt NiCoO<sub>2</sub> from its crystal structure. The faster hydroxyls adsorption/deprotonation kinetics and higher electron donation capability enable the rock-salt NiCoO<sub>2</sub> as a more competitive electrode for supercapacitors when compared to its spinel counterpart of NiCo<sub>2</sub>O<sub>4</sub>. Furthermore, electrochemical evaluation experimentally authenticated the theoretical simulation and calculation. The contribution here will guide rational optimization and selection of pseudocapacitive electrodes for advanced supercapacitors.

# Conflicts of interest

There are no conflicts to declare.

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