





ment along Keelung River began from the late 19th century because of coal mining. With the development of railway and road system, communities spread along the valley and the industrial zones occupied the downstream area in the middle 20th century. For the entire Danshui watershed, forest is the dominant landuse type but its proportion gradually decreases from upstream toward downstream due to the expansion of human-associated landuses. Consequently, population increases from the headwater to the downstream and reaches the maximum in the district of Taipei City.

## 2.2 Water sampling and chemistry

In this study, the stream water samples were collected at 20 sites in 2003. There were 5, 8, and 7 sites along Dahan River (D), Keelung River (K) and Sindian River (S), respectively (Fig. 1). Table 1 shows the fundamental watershed characteristics and landuse compositions for each sampling site. The sites in Table 1 were arranged in accordance with their distances to the estuary. These 20 sampling sites covered wide human-altered levels, providing the opportunity to distinguish the urbanization impacts on water quality through inter-comparisons among sites. Site ids with the prefix of EPA indicate that the water chemistry data at those sites were actually collected by Environment Protection Administration, EPA ([www.epa.gov.tw](http://www.epa.gov.tw)). EPA regularly implements the monthly stream water sampling for most downstream reaches in Taiwan.

Different sampling schemes were applied to cover the entire watershed. Two samples per week were taken at D13, K05, K06, S05, and S07 resulting in ~ 100 samples at each station in a year. Monthly sampling frequency, the same as the EPA, was applied onto the other sites. The water samples taken from the river were immediately filtered through GF/F filters (0.7  $\mu\text{m}$ ). The filtrates were quick-frozen in liquid nitrogen for water chemistry analyses. Nitrate, nitrite and ammonium content were determined by ion chromatography (IC) using a Dionex ICS-1500 instrument with a detection limit of 0.2, 0.2, and 0.4  $\mu\text{M}$ , respectively. The dissolved oxygen (DO) was measured in situ using the HI9828 probe produced by HANNA with the accuracy of 0.1  $\text{mgL}^{-1}$ .

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## 2.3 Rainfall and discharge data

There are over 80 rain gauges maintained by Central Weather Bureau (CWB) in the Danshui watershed (Fig. 1). The precipitation distribution of rainfall was interpolated by the built-in Kriging module in ArcGIS and then retrieved the annual precipitation for individual watershed by overlaying the watershed polygons. As for discharge, the Taiwan Water Resource Agency (WRA) is responsible for monitoring of river discharge of Taiwan Rivers. The river discharge was estimated by substituting the consecutive water levels to the individual rating curve which is calibrated by field measurements every year. Among the 20 sampling sites, 8 of them have discharge gauges. For the other sampling sites, the daily discharges could be derived from an area proportion of the adjacent gauges (Kao et al., 2004; Lee et al., 2013). The annual rainfall and discharge data at each sampling in 2003 are shown in Table 1.

## 2.4 Flux calculation

The flux is defined as the total amount of exported elements from a watershed within a given period. The measured concentrations multiplying the corresponding discharge are the main concept to obtain the elemental mass load. However, compared to the consecutive discharge, the measured concentration is discrete, which implies the requirement of flux estimator to complement the unsampled days. Therefore, the uncertainties, due to sampling frequency, hydrological behaviors, and hydrologic response, in estimations are unavoidable (Lee et al., 2009). In this study, four commonly used methods (i.e., linear interpolation (LI), global mean (GM), flow weighted (FW), and the rating curve (RC) method) were applied to estimate the individual DIN flux of the 20 sites. The four method-derived fluxes at each site were then averaged and normalized by drainage area to represent flux and yield, respectively.

The linear interpolation (LI) method interpolates the unsampled daily DIN concentrations by two adjacent measured nitrate concentrations, as shown in Eq. (1). The main merit of this method is to supplement the discrete DIN concentration to pair with the

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rivers, followed by Sindian and Dahan River. The rainfall seasonality was less evident in Keelung River, also because of the north-eastern monsoon bringing abundant rainfall in dry season.

The discharge (in terms of runoff depth) at the sampling sites ranged from 595 mm to 4259 mm per year. The annual discharge for each watershed generally followed the rainfall ( $\rho = 0.89$ ) after removing data at S05, S07 and S12 where the annual discharges were higher than the rainfall amount. The correlation coefficients between annual discharge and rainfall were 0.97 and 0.82 for the upstream and downstream watersheds, respectively. Generally, the runoff depths in the downstream sites were lower compared to the upstream ones. Note that there are two reservoirs located in between D13-D01 and S05-EPA1910. We will discuss this later in the Discussion section.

### 3.2 DIN concentrations and species changes

DIN concentrations and species compositions at the 20 sampling sites are shown in Table 2. In Dahan River, the annual mean concentration changed from 18  $\mu\text{M}$  at D13 (in the upstream) to 385  $\mu\text{M}$  at EPA1907 (downstream). The increase of mean concentration corresponded to the increase of population density, from 16  $\text{pl km}^{-2}$  (people  $\text{km}^{-2}$ ) to 1492  $\text{pl km}^{-2}$ , revealing the impacts of urbanization along the main channel. In terms of seasonal pattern, mean DIN concentration in wet season was lower than in dry season except at D03. DO concentration held relatively steady until EPA1907 where it dropped to 1.09  $\text{mgL}^{-1}$ . With regard to species composition, nitrate is the dominant species in the upstream (high DO) and ammonium gradually dominated the DIN composition in the downstream (low DO), corresponding to DO concentration. Besides, nitrite plays a secondary role in DIN composition which only accounted for < 7% of DIN.

In Keelung River, annual mean DIN concentration was  $\sim 24 \mu\text{M}$  at the upstream sites and elevated to above 103  $\mu\text{M}$  from K02 toward the downstream (Table 2). DIN concentration reached the maximum of 355  $\mu\text{M}$  in EPA1905 and was slightly moderated

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to 305  $\mu\text{M}$  at EPA1906. In the upstream reach where population density was less than 157  $\text{pl km}^{-2}$ , the DIN concentrations in wet season were higher compared to those in the dry season (except at K05), which were contrary to the cases in the downstream. Population density rose to 475  $\text{pl km}^{-2}$  at K02 and then abruptly elevated to 2617  $\text{pl km}^{-2}$  at EPA1906 that is only 46 km downstream of K02. DO concentration began to decrease when river flowed by K03 where DIN concentration and population density were rising. DO concentrations were  $\sim 8 \text{mgL}^{-1}$  in the upstream and were decreasing at a rate of  $\sim 0.11 \text{mgL}^{-1} \text{km}^{-1}$  to 0.98  $\text{mgL}^{-1}$  at EPA1906. DIN compositions also corresponded well to the DO concentration. Nitrate could contribute  $\sim 94\%$  of DIN where DO concentrations were higher than 7.8  $\text{mgL}^{-1}$  (upstream reach). When river flowed by the middle reach of Keelung River (K02 and K01), both nitrate and ammonium were similarly occupied  $\sim 47\%$  of DIN and nitrite contributed the remaining 7%. While in the lower reach where DO concentrations were  $< 2 \text{mgL}^{-1}$  (EPA1905 and EPA1906), ammonium dominantly accounted for  $\sim 85\%$  of DIN concentration. Nitrate only contributed  $\sim 14\%$  of DIN. Nitrite, as an intermediate product of nitrification or denitrification process, was merely  $\sim 2\%$  of the DIN.

In Sindian River, water sampling sites were actually distributed in three main branches of Sindian River. At S12 where population density was 15  $\text{pl km}^{-2}$ , annual mean DIN concentration was 19  $\mu\text{M}$  comparable to the background sites in Dahan and Keelung River. At S07 and S05 that were located in another branch, the population densities were higher at 57  $\text{pl km}^{-2}$  and 35  $\text{pl km}^{-2}$ , respectively. S05 was at a small tributary entering the main branch downstream of S07. Less population density and smaller proportion of agricultural/building landuse at S05 (35  $\mu\text{M}$ ) resulted in lower DIN concentration than that at S07 (57  $\mu\text{M}$ ). EPA1910, EPA1908, S03, and EPA1909 in the main stream were located in the urban district. Population density hence rose to 644  $\text{pl km}^{-2}$  at EPA1908 and abruptly increased to 2060  $\text{pl km}^{-2}$  at EPA1909. In the downstream reach (between EPA1910-EPA1909), the annual mean DIN concentration ranged between 161  $\mu\text{M}$  to 431  $\mu\text{M}$ . Following the general DIN pattern, the DIN concentration increased downstream-ward but dropped at S03 right after the afflux of a small

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tributary (not shown). The observations revealed that the most downstream sites of the three tributaries have the highest DIN concentration of each tributary. Like in Dahan and Keelung River, DIN concentrations in the upstream sites were enhanced in wet season but were diluted in the downstream. Besides, the differences between wet and dry season in DIN concentration seemed increasing toward the downstream. DO concentrations decreased toward the downstream except at S05 (a tributary) and S03 (after the afflux of a small tributary). The DIN compositions were evidently changed with DO concentrations, like all the above-mentioned cases.

For the entire Danshui watershed, the overall pattern of DIN concentrations and population densities toward the estuary is shown in Fig. 2a and b, respectively. It is apparent that the annual DIN concentrations well followed the population density ( $\rho = 0.89$ ). The DIN species changed as well toward the estuary as Fig. 3 shows. Ammonium gradually replaced nitrate as the dominant species toward the estuary. Nitrite proportion reached its maximum in the middle reach where DO concentration remained in a medium level. Nitrite seemed to appear in the most upstream site where DO concentration tended to decrease. Figure 4 shows the mean DIN concentrations in wet season against those in dry season. For the upstream sites, the DIN concentrations were prone to be higher in wet season than in dry season (except K05). On the contrary, the downstream sites had opposite tendency (except D03).

### 3.3 DIN yields in the Danshui watershed

Four method-derived DIN yields for each sampling site are shown in Table 3. The mean value of the four method-derived DIN yields were used to represent the actual yield to smooth the method-associated uncertainty. In general, the differences among four method-derived DIN yields were relatively small; most of the coefficients of variation (CV) were less than 30 %, except K04 and EPA1907. Therefore, the mean values can be regarded as a good estimator to present and compare the DIN yields among all sites. In Dahan River, DIN yields ranged from 175 at D13 to 2244 kgNkm<sup>-2</sup>yr<sup>-1</sup> at EPA1907, which followed the trend of increasing DIN concentration and population

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density toward the estuary. In Keelung River, DIN yield was  $\sim 605$  kgNkm<sup>-2</sup>yr<sup>-1</sup> for the upstream sites and abruptly elevated to larger than 1989 kgNkm<sup>-2</sup>yr<sup>-1</sup> from K02 toward the downstream. Although the CV of the calculated yields at K04 was 66 %, it did not influence the overall trend of increasing DIN toward the estuary. DIN yield at EPA1906 was  $\sim 6000$  kgNkm<sup>-2</sup>yr<sup>-1</sup> representing the highest DIN yield among all the study watersheds. In Sindian River, S12 represented a background DIN yield at 532 kgNkm<sup>-2</sup>yr<sup>-1</sup>. At S07, although it was located in the upstream reach, it represented a high DIN yield at 3400 kgNkm<sup>-2</sup>yr<sup>-1</sup>. We speculate it was owing to the higher proportion of agricultural landuse (tea farm). With the decrease of agricultural landuse proportion, the DIN yield may decrease as at S05 ( $\sim 1500$  kgNkm<sup>-2</sup>yr<sup>-1</sup>). For the downstream sites, the DIN yields were more than 2500 kgNkm<sup>-2</sup>yr<sup>-1</sup> according to the relatively consistent estimations among four methods. At EPA1909, DIN yield reached 5295 kgNkm<sup>-2</sup>yr<sup>-1</sup>. For the entire Danshui watershed, DIN yields also showed an evident increasing trend toward the estuary (Fig. 5a), which was similar to the patterns of DIN concentration and population density.

## 4 Discussion

### 4.1 Changes of controlling factors for DIN concentration

We demonstrate the correlation coefficients between the observed mean DIN concentrations and the potential controlling factors, including population density, discharge, and landuse compositions in Table 4. For the all dataset, the DIN concentrations are highly and positively correlated to population density ( $\rho = 0.89$ ) and building proportion ( $\rho = 0.85$ ) but negatively correlated to natural forest proportion ( $\rho = -0.75$ ) (owing to the competitive relation among natural and building landuse,  $\rho = -0.80$ ). The results imply that the increasing population density-associated inputs (e.g. domestic and industrial sewage) very likely control the spatial distribution of DIN (Fig. 2). Population density is one of the well-known factors regulating DIN export both on global and

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regional scale (Smith et al., 2005; Boyer et al., 2006). As a result of urbanization, particularly in the developing countries, nitrogen input to the surface water is increasing (Bouwman et al., 2005). On the catchment scale, given the similar climate among the sub-basins as in this study, it might be clearer to specify the contribution of urbanization to DIN export.

If we take a closer examination into the upstream and downstream dataset, their controlling factors are different. For the subset of the upstream data, the DIN concentrations (dominated by nitrate) are significantly and positively correlated to discharge ( $\rho = 0.86$ ) and agricultural landuse proportion ( $\rho = 0.87$ ). Basically, nitrate concentrations increase with the increase of discharge which illustrates a typical diffuse source where nitrate is carried along the flow pathways (Salmon et al., 2001; Kao et al., 2004). Agricultural landuse along with fertilization superimposes the background nitrate which represents the leaching status of the forest (Lee et al., 2013). In the upstream, higher DIN concentration in wet season, compared to that in dry season, again indicates that higher discharge can result in more DIN export to the stream (Fig. 4). However, K05 shows a contrary case owing to higher building landuse proportion (4.6 %, Table 1) than the agricultural one (2.3 %). Therefore, population-associated inputs dominate river DIN at K05. Domestic and industrial sewages are usually characterized as point sources owing to the built-in sewer system. Given that DIN concentration is constant from a point source, more water discharge dilutes the riverine DIN concentration. On the contrary, agriculture-associated inputs, e.g. fertilizer, are non-point sources which are diffused by various flow pathways (e.g. surface, subsurface, and groundwater). More water discharge can purge out more non-point source from the soil (Lee et al., 2013). It could hence be concluded that higher DIN concentration in wet season indicates the dominance of diffuse sources to riverine DIN. On the other hand, point source dominates while DIN concentration in dry season is higher (Fig. 4).

For the downstream dataset, as expected, DIN concentrations are significantly and positively correlated to two population-associated factors, i.e. population density ( $\rho = 0.78$ , Table 4) and building landuse proportion ( $\rho = 0.71$ ). Seasonal DIN concentration

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pattern in the downstream is opposite to that in the upstream. All the downstream sites show higher DIN concentrations in dry season except D03 where agricultural landuse (13.1 %, Table 1) is higher than building one (4.0 %). Diffuse sources overwhelm point sources at D03. The contrary cases at D03 and K05 reveal DIN concentrations are very sensitive to human disturbances, even when the anthropogenic proportion is quite low. Huang et al. (2012) reviewed the relation between agricultural landuse proportion and nitrate concentration (flux as well) and concluded that even small piece of agriculture would result in considerable nitrate export due to over-fertilization and abundant rainfall in Taiwan.

#### 4.2 Transformation among DIN species

Dissolved oxygen of the stream water plays a superior role on influencing the compositions of DIN species due to nitrification and denitrification processes. The correlation coefficients between DO and nitrate/ammonium proportion are 0.87 and  $-0.87$ , respectively (not shown). DIN appears in the form of nitrate at higher dissolved oxygen. On the contrary, ammonium appears at lower dissolved oxygen. Nitrite shows little correlation with dissolved oxygen ( $\rho = -0.28$ ) and is hardly detected due to its low stability in the water.

In the upstream, the riverine nitrate is mainly influenced by leaching from the soil. Warmer temperature in Taiwan may enhance the rates of decomposition of organic matter and nitrification within a watershed. In Taiwan, excess rainfall forces farmers to apply much more ammonium sulfate and urea in hope to help crop growth. Ammonium in the leachate is quickly oxidized to nitrite (which being quickly oxidized as well) and then to nitrate in the upstream reaches. Fertilization raises the background nitrate concentration in the leachate (Lee et al., 2013). In addition, rapid infiltration diminishes denitrification potentials in the upstream mountainous watersheds. The denitrification signals cannot be detected in stream water even in the cultivated watersheds (Peng et al., 2012). Previous study also shows that ammonium and nitrite concentrations in

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the headwater catchments of Taiwan are not detectable (Wen et al., 2008; Lee et al., 2013).

In the downstream, concentrated population and sewage system facilitate the input of pollutant into the river. While the samples were taken in 2003 there was only one waste water treatment plant conducting primary treatment for waste water along the Danshui River (Fig. 1). The dissolved inorganic nitrogen of the effluents from the waste water treatment plant was measured in a previous study in 2001. It was found that nitrite and nitrate concentration were both below  $0.2\ \mu\text{M}$  while ammonium was  $\sim 1718\ \mu\text{M}$  (Wen et al., 2008), supporting ammonium being the dominant DIN species in the downstream. Current research found that particulate organic matter in the estuary mainly consists of phytoplankton feeding ammonium as the major nutrient source (Cheng, 2010). Eutrophication has resulted in hypoxia, the depletion of oxygen in the estuarine water column. A modeling work also suggests that the Danshui estuary is a heterotrophic ecosystem. More organic matter is consumed than produced in the estuary (Lin et al., 2007), leading to the depletion of dissolved oxygen and the release of ammonium (from decomposition of organic matter) in the water. Low dissolved oxygen further impedes the oxidation of ammonium, resulting in the dominance of ammonium in DIN species (Fig. 3).

### 4.3 DIN yield estimation equations

The controlling factors regulating spatial DIN yield changes were also examined. The correlation between the calculated DIN yields and watershed characteristics are shown in Table 5. The DIN yield data were also grouped into two subsets. As for the all data set, DIN yields are positively correlated to population-associated factors, i.e. population density ( $\rho = 0.85$ ) and building proportion ( $\rho = 0.88$ ) as the DIN concentration tendency indicates (Table 4). The correlations are more robust while only looking into the downstream subsets. However, the controlling factors for DIN yields actually change from upstream to downstream. In the upstream where diffuse source pollution prevails, discharge ( $\rho = 0.89$ ) and agricultural proportion ( $\rho = 0.86$ ) dominates the DIN export.

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Downstream dataset mask the upstream DIN behaviors while pooling all the dataset as a whole. DIN yields are well correlated to annual DIN concentrations regardless of which subsets.

Previous studies have investigated less populated large river basins, e.g. Mediterranean and Black Sea river basins where pollution densities are less than  $200\ \text{pl km}^{-2}$  with basin areas ranging  $68\text{--}5526 \times 10^3\ \text{km}^2$ . They found that DIN yields are generally best correlated with N fertilizer usage and runoff ratio as a quantitative measure of water production in the river basins (Ludwig et al., 2010). However, in the global spectrum, population density and discharge are the two main controlling factors while addressing the nutrient export from land to ocean (Smith et al., 2003). With the comprehensive investigation from the headwater to the estuary as we did in this study, it is critical to discover the changes of controlling factors from upstream to downstream and to understand how the controlling factors influence DIN export from forest and from the city. It is found that the influence of diffuse source pollution is masked by the point source pollution toward the estuary. Further investigations, e.g. the measurement of nitrogen isotope ( $\delta^{15}\text{N}$ ), are essential to identify the sources of DIN through more direct evidence (Ohte et al., 2010).

Following previous studies (Smith et al., 2003, 2005), we used logarithmic linear regression model to estimate DIN export (Table 6). Inclusion of annual runoff depth and population density in the logarithmic linear regression model, as in the global model, produces the best estimation. Both the coefficients of population and runoff depth are statistically significant, i.e.  $p$  value  $\ll 0.01$ . Population density directly reflects human-associated waste effluent, and runoff depth is a carrier of nutrient (Caraco and Cole, 1999). In this study, there is a reservoir in the mid reach of Sindian and Dahan River resulting in runoff depths much higher in the upstream than downstream (Fig. 5b), a poor correlation coefficient of annual runoff depth and DIN yield for all sites is found (0.04, Table 5); nevertheless, runoff depth actually correlates closely with DIN yield in the upstream or downstream, respectively ( $\rho = 0.89$  for upstream and  $\rho = 0.67$  for



that the unexplained (residual) variance in the relationship between N inputs and N export can be explained by climatic factors (precipitation and discharge). For example, the relatively lower discharge at D13 might explain such a large retention because DIN export will follow the flow pathways (Lee et al., 2013). For S05 and S07, higher discharge and relatively more agricultural activities (compared to building proportion) result in N yield comparable to the atmospheric deposition, noted that the considerable fertilization is not yet taken into account. If the global retention rate of 80 % are applied to our cases, the estimated N input would be  $\sim 7800$  and  $\sim 17000 \text{ kg N km}^{-2} \text{ yr}^{-1}$  for S05 and S07, respectively. In other words, the additional N input of  $\sim 5400$  and  $\sim 14300 \text{ kg N km}^{-2} \text{ yr}^{-1}$  should be mainly from fertilization. Over-fertilization is a common way among local farmers to complement the substantial fertilizer loss due to abundant rainfall (Huang et al., 2012). More investigation relevant to nitrogen budget should be conducted further at S05 and S07 where tea is the major crop.

For the downstream sites in this study, the riverine DIN export at most of the sites are so large that additional N input must be superimposed on the atmospheric deposition and fertilization. Urbanization has been made possible by increasing longdistance import of agricultural goods from rural regions. Human population actually consumes agricultural products from other areas, e.g., headwater catchments. The wastes produced by human that are far from the site of crop production can no longer be easily recycled in the agricultural sector (Howarth et al., 2002; Galloway et al., 2007; Smaling et al., 2008). Nevertheless, urbanization transfers the crop fixed nitrogen in the rural areas to the waste in the sewage system of cities and renders an unprecedented opening of the nitrogen cycle on regional and global scales (Billen et al., 2010). To quantify the impacts of population on DIN export, the equation describing DIN export in the upstream was applied at the downstream sites to remove the impacts from diffuse sources. The contribution of population and diffuse source to the downstream DIN export is significant and shown in Fig. 7b. It reveals that more than 80 % DIN export in the downstream could be attributed to the population. We further estimated the population-induced DIN export after excluding the contribution of diffuse source. The average individual DIN export

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is  $\sim 2.2 \text{ kg N person}^{-1} \text{ yr}^{-1}$ , though the individual DIN export varies among sub-basins ( $1.0\text{--}3.4 \text{ kg N person}^{-1} \text{ yr}^{-1}$ ). The determination of variability among sub-basins would be helpful for local environmental management. For the entire Danshui watershed, the annual total DIN export divided by the total population derives  $\sim 2.4 \text{ kg N person}^{-1} \text{ yr}^{-1}$  which is comparable to the global mean value of  $2.99 \text{ kg N person}^{-1} \text{ yr}^{-1}$  (compiled 79 of 88 rivers around world, mainly from dataset used in Liu et al., 2010 and He et al., 2011; 9 outliers were excluded). The extremely concentrated population of Taipei City results in the high DIN yield in Danshuei River.

#### 4.5 Implication for global DIN estimation

From the point of view of global DIN export, the export from Oceania rivers is a significant source (Seitzinger et al., 2005, 2010). Our study reveals that the Danshui River occupies  $1.8 \times 10^{-3} \%$  of the land surface area of the Earth but discharges  $\sim 60 \times 10^{-3} \%$  ( $\sim 14000 \text{ t N yr}^{-1}$ ) of the annual global DIN export to the ocean ( $24.8 \text{ Tg N}$ , Seitzinger et al., 2005), implying a disproportionate DIN production from small mountainous rivers and emphasizing their importance on global biogeochemistry cycles. Smith et al. (2005) compiled 496 rivers with different drainage areas around the world and suggested that runoff coefficient and population density are dominant factors for DIN export estimation; nonetheless, this model underestimated the DIN export in the Danshui River considerably (Table 6). Although agricultural landuse does not have a primary effect on DIN yield in the global spectrum (Fig. 6c), it has been found that more DIN can be flushed out with increasing extent of agricultural activities in a watershed (Huang et al., 2012; Lee et al., 2013). Hence, more investigations on areas where diffuse source dominates with low population density are suggested. This might be important in the global DIN export estimations for regions having such condition, e.g. Australia, South Africa and South America where fertilization is considered the most significant source of DIN export to the ocean (Dumont et al., 2005; Seitzinger et al., 2005).

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Besides statistical models, Seitzinger et al. (2005) developed a conceptual model, NEWS (Nutrient Export from Watersheds), to estimate nutrient export from 5761 watersheds. Their DIN yield estimation for the Oceania, as a function of land use, nutrient inputs, hydrology, and other factors, is  $\sim 720 \text{ kg N km}^{-2} \text{ yr}^{-1}$ . However, their estimation is far lower than our yield of  $\sim 5200 \text{ kg N km}^{-2} \text{ yr}^{-1}$  from the Danshui River. Although the global DIN load to the ocean can probably be adequately estimated from large systems, our observational estimation in Danshui River can facilitate the dataset in Oceania rivers. Moreover, an accurate estimation of riverine DIN export may be a key for understanding the primary production surrounding the Oceania where the ocean is oligotrophic and limited by bio-available nutrients, particularly nitrogenous nutrients. This challenging issue is getting important because the scenario analysis shows that the riverine N flux in the Oceania will increase to over 10% by 2030 as the consequence of urbanization, sanitation, development of sewerage systems, and lagging wastewater treatment (Bouwman et al., 2005). It may imply that the DIN export from the Oceania in the near future may be more than the current estimation. This study supplemented the global databases and will benefit the completeness of global models, considering the fact that the results and inferences of the previous studies are mainly extrapolation from large rivers with limited data from the Oceania rivers (Meybeck, 1982; Caraco and Cole, 1999; Smith et al., 2003). The significant hydrologic and demographic heterogeneity of the small basins can result in varied geographic distribution of nutrient loading (Smith et al., 2005). High-resolution regional and local analysis is necessary for environmental assessment and management. We hence highlight the importance of DIN export survey for the Oceania rivers here in this study.

## 5 Conclusion

Global nitrogen cycle is a hot issue due to its significance in biogeochemical cycles. DIN, occupying more than one-third of nitrogen export from land to ocean, deserves more detailed investigations. Previous studies mainly focused on large river systems

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for the fact that data from Oceania rivers are not easily accessible, even though the Oceania has been identified as a hotspot of global DIN export. The Danshui River exports close-to-top DIN yields among the world rivers at given the abundant rainfall, dense population, and the sensitive responses of DIN yields to the increase of runoff depth and population density. The Danshui River demonstrates the feature of small mountainous rivers in terms of the high efficiency in DIN transport. Given the unit runoff depth and population density, Danshui River can discharge, respectively,  $\sim 1.2x$  and  $\sim 1.4x$  DIN yield estimated by the global model (Smith et al., 2005). The complement of regional data will make the global estimations more robust. Moreover, it is found that different DIN transport mechanisms from watersheds would alter the regression model, and an accurate DIN export estimation should include more than one model which is adjusted in accordance with suitability to different conditions.

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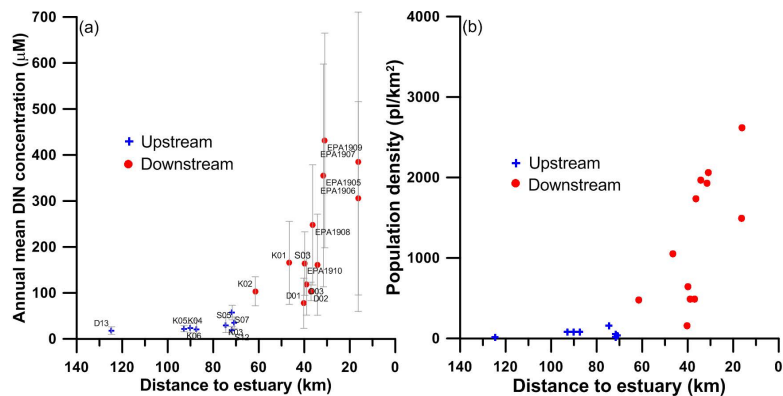






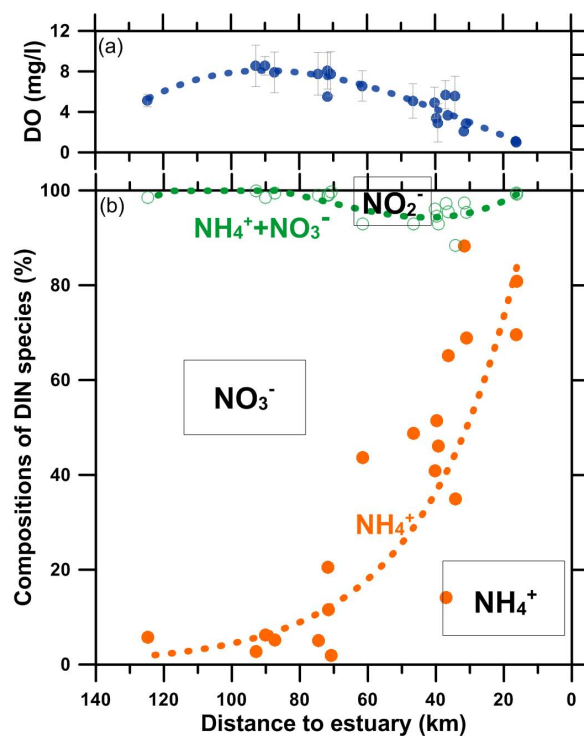






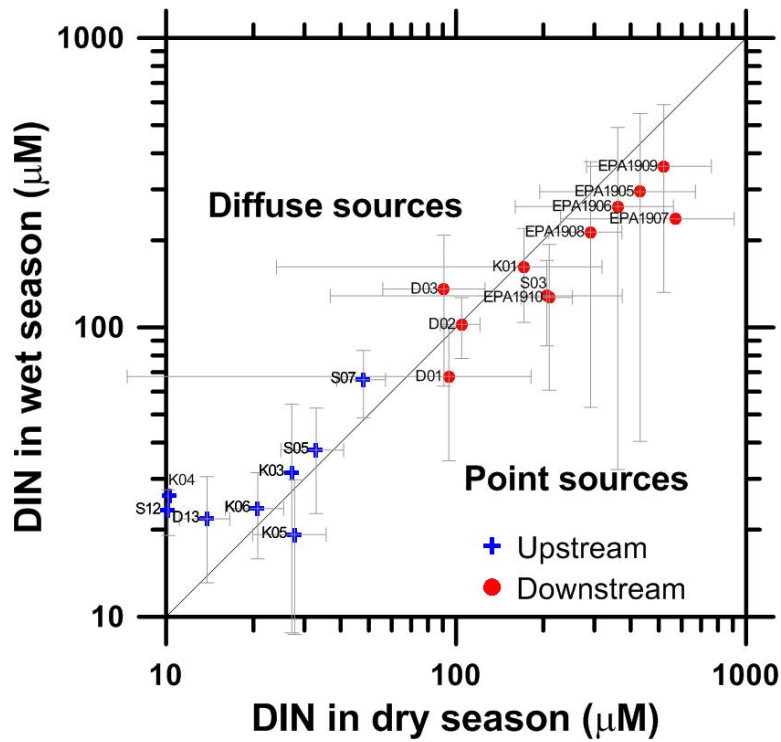
**Fig. 2.** (a) Annual mean DIN concentration and (b) population density along Danshui River. Error bars in (a) represent standard deviation among samples. The blue cross and red circle indicate the upstream and downstream sites, respectively.

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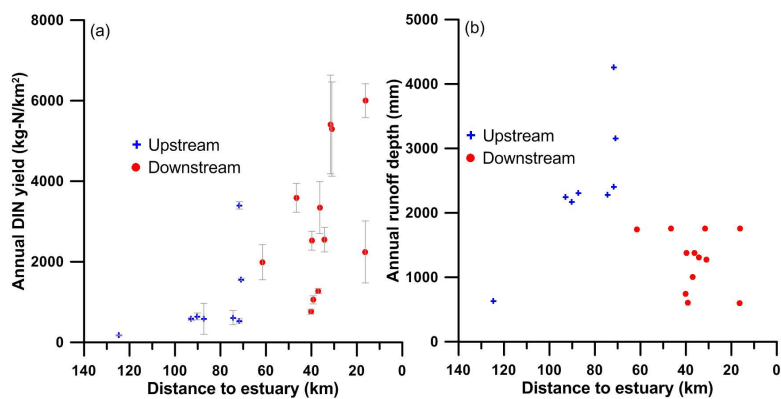
**Fig. 3.** (a) Annual mean dissolved oxygen and (b) relative proportions of three DIN species along Danshui River. Orange curve stands for  $\text{NH}_4^+$  proportion in total DIN. Green curve stands for the summed proportion of  $\text{NH}_4^+$  and  $\text{NO}_3^-$ . Hence, the range in between green curve and orange curve represents the  $\text{NO}_3^-$  proportion. Similarly, the area above the green curve is the  $\text{NO}_2^-$  proportion in total DIN along Danshui River.

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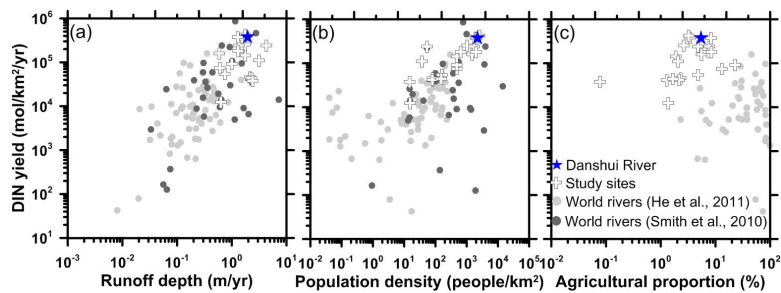
**Fig. 4.** The mean DIN concentration in wet season (May–October in 2003) against mean DIN concentration in dry season (other months in 2003). Horizontal and vertical error bars represent standard deviations among samples taken in dry season and wet season, respectively. Please read the text for the determination of DIN sources, i.e. diffuse and point source.

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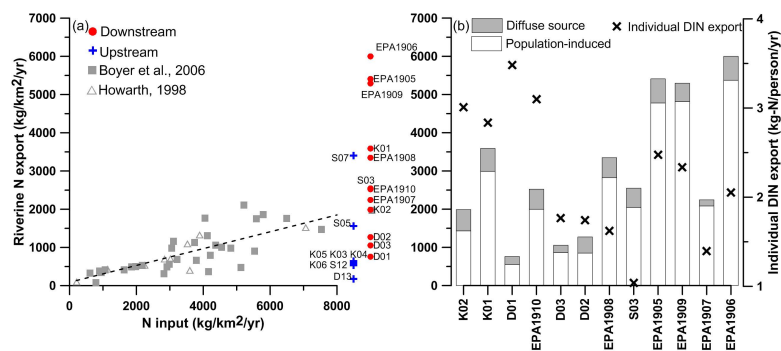
**Fig. 5.** (a) Calculated annual DIN yield and (b) annual runoff depth along Danshui River. Error bars in (a) are the standard deviations among four flux calculation methods.

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**Fig. 6.** Scatter plots of DIN yields against (a) runoff depth, (b) population density, and (c) agricultural proportion. Not only Danshui River data but also some world river data are shown for comparison. Blue star represents the DIN yield for Danshui River based on the equation established in this study. Please see more detail in the text.

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**Fig. 7.** (a) Scatter plot of riverine N export against N input published in Boyer et al. (2006) and Howarth (1998), the riverine DIN exports in this study were plotted aside for comparison; (b) the percentage of diffuse source and population-induced N in the riverine export and the individual DIN export for only the downstream sites. The cross symbols in (b) stands for the estimated individual DIN export.

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