



# Speciation and dynamics of dissolved inorganic nitrogen export in the Danshui River, Taiwan

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**Abstract.** Human-induced excess nitrogen outflowing from land through rivers to oceans has resulted in serious impacts on terrestrial and coastal ecosystems. Oceania, which occupies < 2.5 % of the global land surface, delivers 12 % of the freshwater and dissolved materials to the ocean on a global scale. However, there are few empirical data sets on riverine dissolved inorganic nitrogen (DIN) fluxes in the region, and their dynamics are poorly understood. In this study, a river monitoring network covering different types of land uses and population densities was implemented to investigate the mechanism of DIN export. The results show that DIN concentration/yield varied from  $\sim 20 \mu\text{M} / \sim 300 \text{ kg-N km}^{-2} \text{ yr}^{-1}$  to  $\sim 378 \mu\text{M} / \sim 10\,000 \text{ kg-N km}^{-2} \text{ yr}^{-1}$  from the relatively pristine headwaters to the populous estuary. Agriculture and population density control DIN export in less densely populated regions and urban areas, respectively, and runoff controls DIN at the watershed scale. Compared to documented estimates from global models, the observed DIN export from the Danshui River is 2.3 times larger, which results from the region-specific response of DIN yield to dense population and abundant runoff. The dominating DIN species change gradually from  $\text{NO}_3^-$  in the headwaters ( $\sim 97\%$ ) to  $\text{NH}_4^+$  in the estuary ( $\sim 60\%$ ) following the urbanization gradient. The prominent existence of  $\text{NH}_4^+$  is probably the result of the anaerobic water body and short residence time, unlike in large river basins. Given the analogous watershed characteristics of the Danshui River to the rivers in Oceania, our study could serve as a first example to examine riverine DIN fluxes in Oceania.

## 1 Introduction

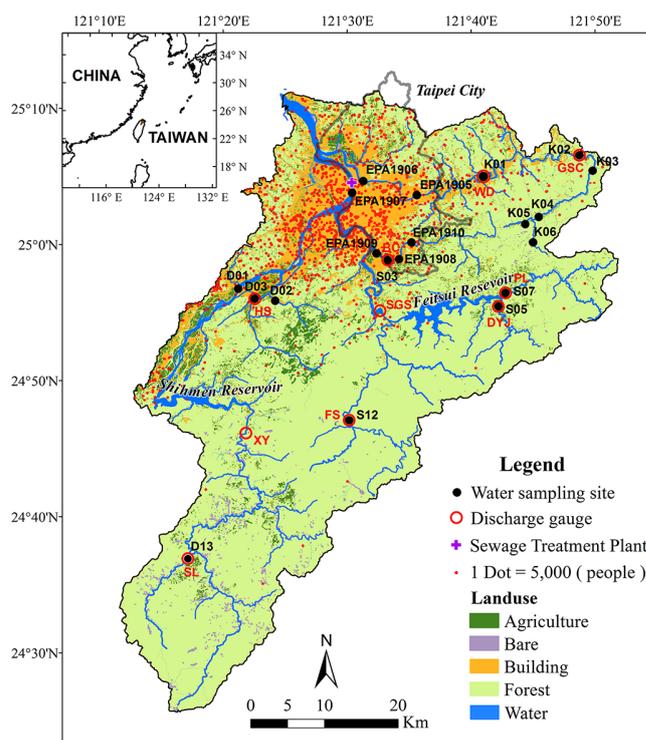
Nitrogen, a vital element in living organisms, plays a critical role in controlling primary production in the biosphere. Along with fossil fuel combustion to meet the food demand of mankind, human activities have greatly increased the amount of actively cycling nitrogen during the past decades (Galloway and Cowling, 2002; Galloway et al., 2004; Boyer et al., 2006; Seitzinger et al., 2010). Added anthropogenic reactive nitrogen enters drainage basins through atmospheric deposition, the direct application of nitrogenous fertilizer, land use changes and sewage (Dumont et al., 2005). Consequently, excess nitrogen discharged from land to oceans has resulted in seasonal coastal hypoxia, harmful algal blooms, and decreased fishery production in ecosystems (Howarth et al., 1996; Rabalais, 1996; Jickells, 1998; Boesch, 2002; Turner et al., 2003; Galloway et al., 2004; Duan et al., 2007; Conley et al., 2009; Billen and Garnier, 2007; Diaz and Rosenberg, 2008). However, most current knowledge about dissolved inorganic nitrogen ( $\text{DIN} = \text{NH}_4^+ + \text{NO}_3^- + \text{NO}_2^-$ ) export has derived from larger river systems in developed countries of Europe and North America; much less attention has been paid to developing countries in Oceania in the tropical western Pacific Ocean. Oceania is surrounded by stratified oligotrophic water with limited bio-available nutrients, particularly nitrogenous nutrients (Jiao et al., 2007; Martha and Kristen, 2012).

Oceania, composed of numerous high-standing islands with mountainous watersheds, experiences active tectonics and extremely high soil erosion rates (Milliman and Syvitski,

1992; Kao and Milliman, 2008). Annually,  $\sim 27$  tropical cyclones (typhoons) pass through this region, bringing torrential rainfall which triggers flushing floods (Webster et al., 2005; Tu and Chou, 2013). Collectively, Oceania discharges 6.8 Gt of sediment annually to the ocean ( $\sim 40\%$  of the global total), even though these islands account for less than 2.5 % of the global land area (Milliman and Farnsworth, 2013). In addition, Oceania rivers deliver  $\sim 12\%$  of global fresh water and dissolved solids to the ocean (Seitzinger et al., 2005; Milliman and Farnsworth, 2013), underscoring the potential importance of DIN discharge. The DIN export from Oceania was predicted to increase by more than 10 % by 2030 compared to the 1995 level due to urbanization, sanitation, the development of sewer systems, and lagging wastewater treatment (Seitzinger et al., 2002; Bouwman et al., 2005). Although global models have demonstrated Oceania to be a hot spot of global DIN export, no intensive network of DIN monitoring exists or has ever been implemented or documented for Oceania rivers. A previous study that monitored the DIN in headwater catchments of Taiwan determined that global models are likely to underestimate nitrogen yields for rivers in Oceania (Lee et al., 2013). To better project future DIN discharge from global land surfaces, data from subtropical small watersheds are required.

Countries in Oceania including the Philippines, Indonesia and Papua New Guinea are all in a stage of fast development. Taiwan has geographic and climatic features similar to the islands of Oceania, i.e., high precipitation, steep slopes, small basin areas, and frequent flood events (Milliman et al., 1999; Milliman and Farnsworth, 2013). Moreover, the rugged terrain of these islands offers limited space to accommodate towns and agricultural lands; thus, cities are all located at downstream flood plains and tillage is often inevitably located on steep slopes (Huang et al., 2012b). With these hydrological and geomorphological similarities, Taiwanese rivers have long been considered analogous to the rivers of Oceania (Kao and Liu, 2000, 2002; Kao et al., 2005; Lee et al., 2013). Because of their short water residence times in the watershed, high flow velocities and soil erosion rates, we also expect the controlling factors for DIN export, speciation and dynamics over the river continuum to differ from those of large rivers.

Taiwan, a small island, holds 23 million people on an island of  $\sim 36\,000\text{ km}^2$  (i.e.  $\sim 638\text{ cap km}^{-2}$ , one of the most densely populated countries in the world). Wastewater disposal from the capital city Taipei in the downstream of the Danshui River along with agricultural activities in the upstream have had a significant biogeochemical influence on the river continuum (Wen et al., 2008). In this paper, we investigated the DIN speciation and fluxes in the Danshui River network, where different types of human alteration increase from upstream to downstream. The observed DIN exports were correlated to runoff, land use and population and further compared with global data sets. The objectives of this study are: (1) to explore the factors governing DIN export and spe-



**Figure 1.** The map of land use and population density distribution in the Danshui River watershed. The land use and population data are sourced from the Ministry of Interior. Locations of water sampling sites (black dots), runoff gauges (red circle), and sewage treatment plants (cross symbol) are marked. The grey curve represents the boundary of Taipei City.

ciation; and (2) to construct a practical equation for DIN discharge in mountainous watersheds. The results may provide a scientific background for stream restoration and nutrient mitigation in Oceania rivers.

## 2 Materials and methods

### 2.1 Danshui watershed

The Danshui River, the third largest river in Taiwan, originates from Mt Pin-Tian (3529 m a.s.l.) and has a drainage area of  $2,726\text{ km}^2$  (Fig. 1). It drains through the capital city, Taipei, at the downstream flood plain. Taipei has 5.7 million people living in an area of  $376\text{ km}^2$  (i.e.  $15\,200\text{ cap km}^{-2}$ ). The annual precipitation is approximately  $2500\text{--}4000\text{ mm yr}^{-1}$ , and the annual mean temperature is approximately  $22\text{ }^\circ\text{C}$ . Three major tributaries, the Dahan (D), Singdian (S) and Keelung (K) Rivers, merge to the east of Taipei City (Huang et al., 2012a). Among the three major tributaries, the Dahan River, which drains from south to north, is the longest with a stream length of 135 km. The Shihmen reservoir in the middle of the Dahan River is one of the most important hydrological constructions for

**Table 1.** Watershed characteristics, land use compositions, discharge and rainfall for each sampling site. Sites are arranged in sequence according to their distances to the estuary. Upstream sites (distance to the estuary > 70 km) are in bold. The distance is measured from the shoreline. The tidal excursion distance is ~ 10–20 km upriver, depending on tidal range and weather conditions. Bare land use usually includes landslide and outcrop.

Site ID	Tributary	Watershed characteristics			Land use Composition					Runoff			
		Distance	Area	Population	Building	Agricultural	Forest	Water	Bare	Gauge	Annual	Dry	Wet
		(km)	(km <sup>2</sup> )	(cap km <sup>-2</sup> )	(%)	(%)	(%)	(%)	(%)		(mm)	(mm)	(mm)
<b>D13</b>	<b>D</b>	<b>125</b>	<b>119</b>	<b>16</b>	<b>0.2</b>	<b>1.4</b>	<b>96.7</b>	<b>0.7</b>	<b>1.0</b>	<b>SL</b>	<b>1174</b>	<b>320</b>	<b>849</b>
D01	D	40	857	158	3.6	4.8	87.7	2.9	1.0	XY	1391	381	1005
D03	D	39	126	489	4.0	13.1	81.9	0.9	0.1	HS	1410	517	893
D02	D	37	54	488	5.0	23.1	70.8	0.7	0.5	HS	1539	673	854
EPA1907	D	16	2101	1492	8.9	5.6	82.3	2.7	0.5	XY, SGS	2420	820	1594
<b>K06</b>	<b>K</b>	<b>93</b>	<b>7</b>	<b>81</b>	<b>1.5</b>	<b>1.3</b>	<b>96.4</b>	<b>0.6</b>	<b>0.2</b>	<b>GSC</b>	<b>3255</b>	<b>1851</b>	<b>1408</b>
<b>K05</b>	<b>K</b>	<b>90</b>	<b>9</b>	<b>81</b>	<b>4.6</b>	<b>2.3</b>	<b>91.9</b>	<b>1.0</b>	<b>0.2</b>	<b>GSC</b>	<b>3150</b>	<b>1791</b>	<b>1362</b>
<b>K04</b>	<b>K</b>	<b>87</b>	<b>37</b>	<b>81</b>	<b>3.1</b>	<b>2.2</b>	<b>93.4</b>	<b>1.1</b>	<b>0.2</b>	<b>GSC</b>	<b>3345</b>	<b>1902</b>	<b>1447</b>
<b>K03</b>	<b>K</b>	<b>74</b>	<b>85</b>	<b>157</b>	<b>3.2</b>	<b>1.7</b>	<b>93.6</b>	<b>1.4</b>	<b>0.1</b>	<b>GSC</b>	<b>3308</b>	<b>1881</b>	<b>1431</b>
K02	K	62	124	476	6.9	1.9	89.5	1.7	0.1	GSC	3285	1868	1421
K01	K	47	203	1054	11.4	2.6	84.0	1.9	0.0	WD	3551	1722	1828
EPA1905	K	32	328	1930	15.4	3.5	79.2	1.9	0.0	WD	3551	1722	1828
EPA1906	K	16	361	2618	19.9	3.2	74.6	2.1	0.0	WD	3551	1722	1828
<b>S12</b>	<b>S</b>	<b>72</b>	<b>163</b>	<b>15</b>	<b>0.3</b>	<b>0.1</b>	<b>98.4</b>	<b>0.5</b>	<b>0.6</b>	<b>FS</b>	<b>3209</b>	<b>1171</b>	<b>2030</b>
<b>S07</b>	<b>S</b>	<b>72</b>	<b>111</b>	<b>54</b>	<b>2.0</b>	<b>4.8</b>	<b>91.8</b>	<b>1.3</b>	<b>0.1</b>	<b>PL</b>	<b>2754</b>	<b>1273</b>	<b>1947</b>
<b>S05</b>	<b>S</b>	<b>71</b>	<b>79</b>	<b>38</b>	<b>0.8</b>	<b>2.1</b>	<b>96.0</b>	<b>0.9</b>	<b>0.1</b>	<b>DYJ</b>	<b>1890</b>	<b>823</b>	<b>1413</b>
EPA1910	S	40	91	645	8.6	7.5	82.8	1.1	0.0	BC	2294	710	1577
EPA1908	S	36	106	1737	13.0	7.7	78.1	1.1	0.0	BC	2289	708	1573
S03	S	34	111	1969	13.9	8.5	76.5	1.2	0.0	BC	2184	676	1501
EPA1909	S	31	115	2061	16.0	8.2	74.5	1.2	0.0	BC	2120	656	1457
Danshui River		2697	2187	14.1	5.4	77.2	2.8	0.4		2360	869	1486	

irrigation, hydroelectric power, water supply and flood prevention in Taiwan. It serves a 365 km<sup>2</sup> irrigation area and 1.8 million people. The Feitsui reservoir is another reservoir that is located in the middle reach of the Singdian River; it was designed to provide the drinking water supply for Taipei city, and the upstream of this reservoir is thus legally preserved. For the entire Danshui watershed, forest is the dominant land use, although its proportion gradually decreases from ~ 97 % in the upstream to ~ 75 % in the downstream due to the expansion of human-associated land uses (Table 1). Correspondingly, population density increases from ~ 10 cap km<sup>-2</sup> at the headwaters to ~ 2000 cap km<sup>-2</sup> in the downstream and reaches a maximum in the district of Taipei City.

## 2.2 Discharge, land use and population data

In Taiwan, the Water Resource Agency (WRA) is responsible for monitoring river discharge. River discharge is estimated by substituting consecutive water levels into the individual rating curve, which is calibrated by field measurements every year. There are 10 flow gauges in the Danshui watershed. For the sampling sites without flow gauges, the daily discharges can be derived from the area proportion of the adjacent gauges (Kao et al., 2004; Lee et al., 2013). In the years 2002–2005, the runoff for the Danshui River was 1569 mm (2002), 1150 mm (2003), 3010 mm (2004), and

3223 mm (2005), exhibiting a significant fluctuation (~ 50–130 %) compared to the long-term mean of ~ 2500 mm. Land use data were retrieved from aerial photos taken during 1996–1998 by the National Land Surveying and Mapping Centre. The Taiwanese government carried out a census approximately every 10 years. The Ministry of the Interior (<http://www.ris.gov.tw/>) provides the township-based population data. We applied the data from the year 2000 to the watershed-based density for further analyses.

## 2.3 Water sampling and chemistry

Stream water samples were collected from the three major tributaries at 14 sites in the middle and upper reaches from 2002–2004 (Fig. 1). The fundamental watershed characteristics (flow distance, watershed area and population density), land use compositions and runoff depth for each sampling site are shown in Table 1. Data from six more sites in the downstream maintained by EPA (Environment Protection Administration) from 2002–2005 were taken to complete the full basin scale DIN variability. Eight of the 20 stations were equipped with flow gauges for flux calculations. Note that the discharges at the other 12 sites were estimated using the adjacent flow gauges. The sampling sites were classified into upstream and downstream subsets at distance of 70 km from the river mouth (a proximate boundary of rural and city area where that marks the onset of significant human-alteration in

**Table 2.** Observed dissolved oxygen (DO), DIN concentrations, compositions of DIN species and their corresponding sample numbers and sampling periods. Upstream sites are in bold.

Site ID	Sample number	Sampling period	DIN concentration ( $\mu\text{M}$ )						DIN species (%)			DO ( $\mu\text{M}$ )
			Annual		Dry season		Wet season		NO <sub>3</sub>	NO <sub>2</sub>	NH <sub>4</sub>	
			mean	std	mean	std	mean	std				
<b>D13</b>	<b>198</b>	<b>24 Feb 2002–15 Apr 2004</b>	<b>21.1</b>	<b>9.5</b>	<b>17.6</b>	<b>6.7</b>	<b>24.5</b>	<b>10.6</b>	<b>94</b>	<b>1</b>	<b>6</b>	<b>187</b>
D01	21	24 Feb 2002–31 Mar 2004	68.9	44.8	76.0	54.3	63.1	34.1	75	5	21	168
D03	21	24 Feb 2002–31 Mar 2004	162.4	75.9	160.0	73.8	164.3	77.6	38	5	56	117
D02	21	24 Feb 2002–31 Mar 2004	120.3	73.1	133.5	94.2	108.3	42.9	71	4	25	187
EPA1907	45	15 Jan 2002–13 Dec 2005	377.8	239.2	433.8	251.0	324.3	214.2	38	1	61	34
<b>K06</b>	<b>203</b>	<b>29 Mar 2002–30 Apr 2004</b>	<b>22.1</b>	<b>6.2</b>	<b>21.1</b>	<b>5.6</b>	<b>23.3</b>	<b>6.6</b>	<b>96</b>	<b>0</b>	<b>3</b>	<b>249</b>
<b>K05</b>	<b>203</b>	<b>29 Mar 2002–30 Apr 2004</b>	<b>23.2</b>	<b>11.1</b>	<b>24.0</b>	<b>10.4</b>	<b>22.2</b>	<b>11.8</b>	<b>88</b>	<b>2</b>	<b>10</b>	<b>274</b>
<b>K04</b>	<b>8</b>	<b>28 Feb 2002–10 Feb 2004</b>	<b>20.1</b>	<b>13.8</b>	<b>16.0</b>	<b>8.2</b>	<b>26.2</b>	<b>17.8</b>	<b>90</b>	<b>2</b>	<b>8</b>	<b>246</b>
<b>K03</b>	<b>8</b>	<b>28 Feb 2002–10 Feb 2004</b>	<b>29.8</b>	<b>11.5</b>	<b>28.7</b>	<b>6.6</b>	<b>31.5</b>	<b>16.1</b>	<b>92</b>	<b>3</b>	<b>7</b>	<b>243</b>
K02	8	28 Feb 2002–10 Feb 2004	96.3	20.0	89.1	14.3	103.4	22.3	64	9	37	201
K01	21	28 Feb 2002–31 Mar 2004	223.8	113.3	188.3	113.1	256.0	103.4	44	7	49	160
EPA1905	45	14 Jan 2002–12 Dec 2005	283.8	173.8	273.7	185.3	293.5	161.6	30	4	67	65
EPA1906	45	14 Jan 2002–12 Dec 2005	272.2	143.9	262.5	155.6	281.4	131.1	28	2	70	30
<b>S12</b>	<b>8</b>	<b>27 Feb 2002–12 Feb 2004</b>	<b>19.7</b>	<b>6.0</b>	<b>17.2</b>	<b>6.3</b>	<b>23.3</b>	<b>3.0</b>	<b>77</b>	<b>2</b>	<b>22</b>	<b>255</b>
<b>S07</b>	<b>389</b>	<b>28 Feb 2002–29 Dec 2005</b>	<b>54.1</b>	<b>17.3</b>	<b>50.2</b>	<b>13.9</b>	<b>57.8</b>	<b>19.3</b>	<b>90</b>	<b>1</b>	<b>9</b>	<b>210</b>
<b>S05</b>	<b>389</b>	<b>28 Feb 2002–29 Dec 2005</b>	<b>34.8</b>	<b>11.8</b>	<b>32.9</b>	<b>9.0</b>	<b>36.6</b>	<b>13.7</b>	<b>97</b>	<b>0</b>	<b>3</b>	<b>228</b>
EPA1910	45	16 Jan 2002–12/13 Dec 2005	168.6	111.6	158.7	74.6	178.1	137.3	52	5	42	107
EPA1908	45	16 Jan 2002–13 Dec 2005	199.4	94.0	205.2	82.3	193.9	103.7	46	5	49	115
S03	52	5 Jan 2002–31 Mar 2004	236.2	118.7	273.6	138.4	200.3	81.0	39	8	58	120
EPA1909	45	16 Jan 2002–13 Dec 2005	342.1	213.4	358.8	211.4	326.1	214.1	43	5	52	89

terms of population density and land use composition). Such spatially intensive monitoring in the river network provides a great opportunity to distinguish the effects of urbanization on DIN flux and speciation. Water samples were collected at different frequencies covering both the dry (November–March) and wet (April–October) seasons. The number of samples taken at each site is shown in Table 2.

Water samples were immediately filtered through GF/F filters ( $0.7\mu\text{m}$ ) after collection. 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 detection limits of 0.2, 0.2, and  $0.4\mu\text{M}$ , respectively. The reported DIN denotes the summation of nitrate, nitrite and ammonium concentrations. Dissolved oxygen (DO) was measured in situ using an HI9828 probe produced by Hanna Instruments with an accuracy of  $3\mu\text{M}$ .

## 2.4 Flux calculation

In this study, four commonly used methods – linear interpolation (LI), global mean (GM), flow weighted (FW) and the rating curve (RC) method – were applied to estimate the individual DIN fluxes of the 20 sites. Each of the four methods, which have been widely discussed in previous studies, have specific advantages, although no single method is universally suitable for all watersheds (Ferguson, 1987; Preston et al., 1988; Moatar and Meybeck, 2005; Birgand et al.,

2010). To prevent subjective or arbitrary choices, the four method-derived fluxes at each site were then averaged and normalized by drainage area to represent flux and yield, respectively. Please refer to the Supplementary Information for details.

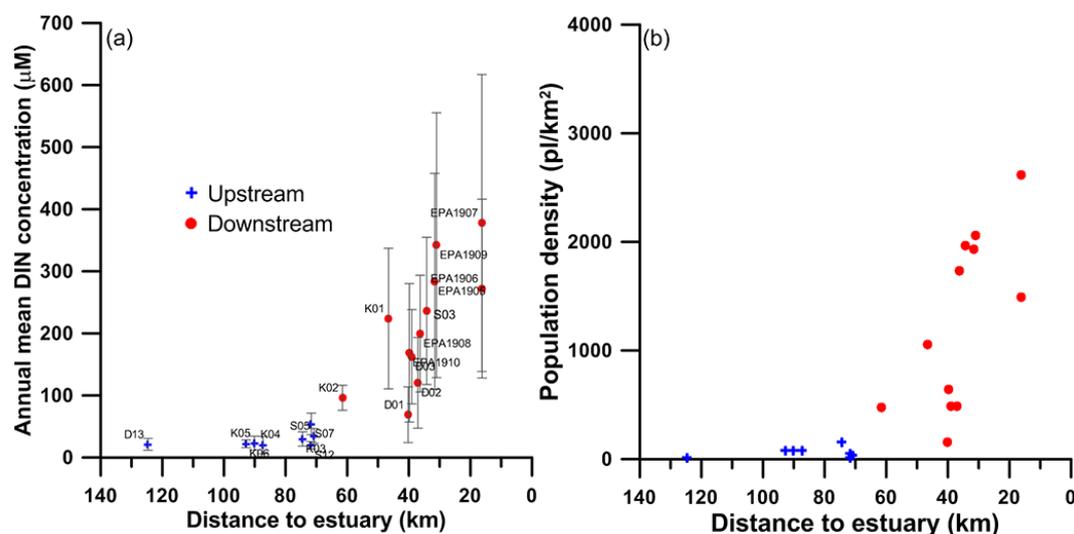
## 3 Results

### 3.1 Spatial distribution of DIN

The DIN speciations and concentrations for the 20 sampling sites are listed in Table 2. In the Dahan tributary, the annual mean concentration ranges from  $21\mu\text{M}$  in the upstream (D13) to  $378\mu\text{M}$  in the downstream (EPA1907), showing a downstream increasing trend. With only two exceptions (D13 in the upstream and D03 in the downstream), the mean DIN concentrations in the wet season are lower than those in the dry season.

In the Keelung tributary, the annual mean DIN concentration is  $\sim 24\mu\text{M}$  at the upstream sites and increases to above  $96\mu\text{M}$  from K02 toward the downstream. The DIN concentration reaches a maximum of  $284\mu\text{M}$  in EPA1905 and is slightly moderated to  $272\mu\text{M}$  at EPA1906 within the tidal excursion distance. In this tributary, most of the DIN concentrations in wet season are higher than those in the dry season (except at K05).

Unlike the previous two tributaries, the water sampling sites in the Sindian tributary are actually distributed in three



**Figure 2.** Longitudinal distributions of (a) measured DIN concentration and (b) population density along the Danshui River. Bars in (a) represent the standard deviation of measurements. The blue crosses and red circles indicate the upstream and downstream sites, respectively.

**Table 3.** The correlation matrix among population density, runoff and land use composition. The Pearson correlation coefficients are shown. The observed DIN concentrations are grouped into two subsets: upstream and downstream data.

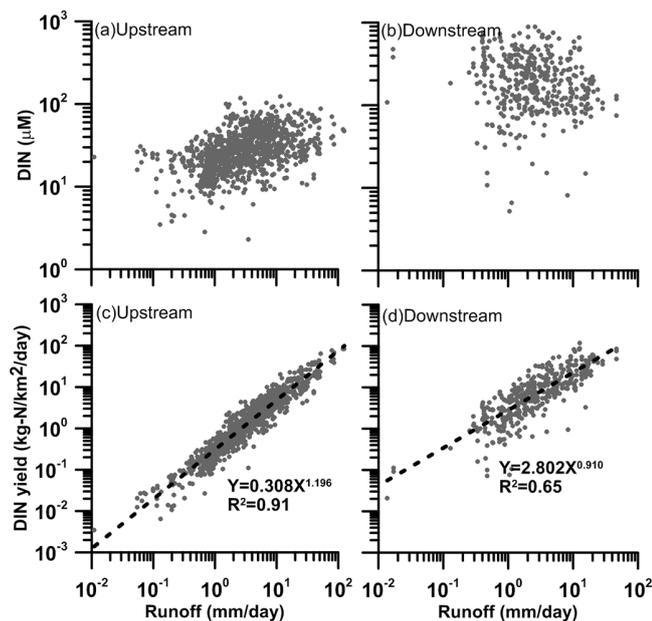
	Pop (cap km <sup>-2</sup> )	Q (mm)	Building (%)	Agri. (%)	Forest (%)	Water (%)	Bare (%)
Pop (cap km <sup>-2</sup> )	1	-0.30	0.97*	-0.11	-0.70*	0.19	-0.38
Q (mm)		1	-0.29	-0.41	0.49	-0.26	-0.35
Building (%)			1	0.16	-0.80*	0.42	-0.51
Agricultural (%)				1	-0.71*	-0.16	-0.03
Natural (%)					1	-0.28	0.33
Water (%)						1	0.10
Bare Land (%)							1
Whole data	0.84*	-0.08	0.80*	0.26	-0.74*	0.48	-0.31
Upstream	0.01	0.24	-0.01	0.78*	-0.43	0.48	-0.42
Downstream	0.68*	-0.18	0.59*	-0.21	-0.34	0.18	-0.26

\* indicates a significant correlation.

main branches. At S12, the annual mean DIN concentration is 19.7  $\mu\text{M}$ , which is comparable to the background sites of the Dahan and Keelung Rivers. Although S07 and S05 are closely located in another branch, S07 is located in a town and has a DIN concentration of 54.1  $\mu\text{M}$ , which is higher than that of S05 (34.8  $\mu\text{M}$ ). EPA1910, EPA1908, S03 and EPA1909 are located in yet another branch in the urban district and have annual mean DIN concentrations ranging from 169  $\mu\text{M}$  to 342  $\mu\text{M}$ . In terms of the tributaries, the trend in annual mean DIN concentration increases moving downstream. Downstream from EPA1910, the annual mean DIN concentrations in the dry season were higher than those in the wet season.

### 3.2 DIN concentrations and watershed characteristics

The overall longitudinal patterns of DIN concentration and population density are shown in Fig. 2a and b, respectively. Both the DIN concentration and population density show an upward trend and surge simultaneously as the boundary between upstream and downstream is crossed. The annual DIN concentrations are clearly strongly correlated with population density, with a Pearson correlation coefficients ( $\rho$ ) of 0.84. Table 3 shows the Pearson correlation coefficients between the observed mean DIN concentrations and the potential controlling factors including population density, runoff and land use composition. For the entire data set, the DIN concentrations are correlated to building proportion ( $\rho = 0.80$ ), which is associated with population density and negatively correlated to forest proportion ( $\rho = -0.74$ ); owing to the competition between forest and building land



**Figure 3.** Sampled DIN concentrations and yields plotted against runoff at all upstream (a, c) and downstream sites (b, d). The dashed lines in (c, d) are power regression equations of the samples.

uses,  $\rho = -0.80$ ). A closer examination of the upstream and downstream data sets reveals that their controlling factors are different. For the downstream subset, as in the whole data set, DIN concentrations are positively correlated to two population-associated factors: population density ( $\rho = 0.68$ ) and building land use proportion ( $\rho = 0.59$ ). For the upstream subset, however, agricultural land use proportion controls the DIN concentrations with  $\rho = 0.78$ .

### 3.3 DIN concentrations/yields and runoff

Figure 3 shows scatter plots of the DIN concentrations and yields against runoff for the upstream and downstream sites, revealing different influences of runoff on upstream/downstream DIN transport. In the upstream (Fig. 3a), the DIN concentration corresponds to the runoff patterns, indicating a positive concentration–runoff (C–Q) relationship. A change in runoff of four orders of magnitude accompanies a two-orders of magnitude change in DIN concentration; this results in a strong relationship between DIN yield and runoff with  $R^2 = 0.91$  (Fig. 3c). In the downstream, the C–Q plot is relatively scattered (Fig. 3b), yet shows a slightly negative relationship. Nevertheless, runoff still controls the DIN transport, as shown in Fig. 3d.

Figure 4 further shows the scatter plots of DIN concentrations and yields against runoff for selected upstream and downstream sites in the three tributaries. The C–Q relationships in the upstream (blue crosses in Fig. 4a–c) and downstream (red circles) sites follow the overall patterns shown in Fig. 3a and b. The strong positive correlations between

the observed DIN yields and runoff (Fig. 4d–f) again illustrate that hydrology exerts a strong control on DIN export, particularly for the upstream sites. These relationships can be well depicted by a power function with high coefficients of determination ( $R^2 > 0.85$ ) for the upstream sites. For the downstream sites, the relationships are not as strong; however,  $R^2 > 0.5$ , indicating that runoff is still the dominant influence on DIN export. The cumulative DIN yields for the selected sites are presented in Fig. 4g–i. The daily yields are calculated based on the power function (shown in Fig. 4d–f) calculated by substituting the 2002–2005 daily runoff values into the formula. Note that the cumulative DIN yields of the upstream sites display a stepwise increasing pattern (Fig. 4g–i) due to typhoon-triggered flooding. Such high runoff events contribute a great deal to the annual DIN export. The cumulative DIN yields of the downstream sites (Fig. 4j–l) reveal a constant rate, although the rate is  $\sim 2x$  greater after mid-2004. The effect of high runoff events can also be observed for the downstream sites (Fig. 4j–k) underlying the smooth cumulative curves, which might be obscured by different controlling factors.

### 3.4 Spatial distribution of DIN yields

The mean DIN yields of the 20 sites during 2002–2005 are shown in Table 4. The differences among DIN yields derived from the four methods are small; with the exception of D01 and K02, the coefficients of variation (CV) are less than 30 %, demonstrating that method-associated manipulation is limited in our study. In the Dahan tributary, DIN yields range from 322 kg-N km<sup>-2</sup> yr<sup>-1</sup> at D13 to 10 094 kg-N km<sup>-2</sup> yr<sup>-1</sup> at EPA1907. In the Keelung tributary, DIN yields are  $\sim 1100$  kg-N km<sup>-2</sup> yr<sup>-1</sup> for the upstream sites and abruptly elevate to  $> 4291$  kg-N km<sup>-2</sup> yr<sup>-1</sup> from K02 toward the downstream, showing an increasing trend toward the estuary (except EPA1906). In the Sindian River, S12 represents a background DIN yield at 734 kg-N km<sup>-2</sup> yr<sup>-1</sup>. At S07, a small town in the upstream, a high DIN yield of 2522 kg-N km<sup>-2</sup> yr<sup>-1</sup> is observed. For the downstream sites, the DIN yields are  $> 4000$  kg-N km<sup>-2</sup> yr<sup>-1</sup> and reach a maximum of 6510 kg-N km<sup>-2</sup> yr<sup>-1</sup> at EPA1909.

Figure 5 shows the relationships between the annual DIN yields from 2002–2005 at each site and runoff, population density and agricultural proportion. The relationships are individually examined in terms of the Pearson correlation coefficients ( $\rho$ ) for the upstream and downstream subsets and the whole data set. Fitted lines are drawn only if  $\rho$  values are greater than 0.70. Runoff undoubtedly has a strong influence on DIN yields for the three data sets (Fig. 5a). Population density only exerts control over the whole data set (Fig. 5b). The DIN yields in the upstream are better correlated to the agricultural proportion (Fig. 5c). Although agricultural proportions are higher in the downstream, the population density, which masks the effects of agriculture, overwhelmingly controls the DIN yields.

**Table 4.** The DIN yields at each sampling site. Four calculation methods are applied in this study. Upstream sites are coloured in italic.

Site ID	DIN yield (kg-N km <sup>-2</sup> yr <sup>-1</sup> ), globally					
	LI	GM	FW	RC	Mean	CV (%)*
<i>D13</i>	<i>319</i>	<i>285</i>	<i>326</i>	<i>357</i>	<i>322</i>	<i>9.1</i>
D01	973	1089	1129	1968	1290	35.4
D03	1743	1998	1973	1525	1810	12.3
D02	1700	1897	1914	1642	1788	7.7
EPA1907	10 748	11 602	10 027	8000	10 094	15.2
<i>K06</i>	<i>899</i>	<i>811</i>	<i>965</i>	<i>876</i>	<i>888</i>	<i>7.1</i>
<i>K05</i>	<i>900</i>	<i>805</i>	<i>996</i>	<i>969</i>	<i>918</i>	<i>9.3</i>
<i>K04</i>	<i>810</i>	<i>1407</i>	<i>1496</i>	<i>993</i>	<i>1177</i>	<i>27.9</i>
<i>K03</i>	<i>1106</i>	<i>1870</i>	<i>1955</i>	<i>1232</i>	<i>1541</i>	<i>28.2</i>
K02	3158	5653	5537	2817	4291	35.3
K01	9234	8721	9040	7022	8504	11.9
EPA1905	13 516	12 583	9665	6815	10 645	28.5
EPA1906	11 689	11 329	9882	6785	9921	22.5
<i>S12</i>	<i>727</i>	<i>709</i>	<i>715</i>	<i>784</i>	<i>734</i>	<i>4.7</i>
<i>S07</i>	<i>2577</i>	<i>2452</i>	<i>2526</i>	<i>2535</i>	<i>2522</i>	<i>2.1</i>
<i>S05</i>	<i>1185</i>	<i>1025</i>	<i>1125</i>	<i>1191</i>	<i>1132</i>	<i>6.8</i>
EPA1910	5919	5600	4543	3266	4832	24.8
EPA1908	4597	5082	4802	3216	4424	18.8
S03	4269	4415	4499	3124	4077	15.8
EPA1909	5949	7341	7990	4759	6510	22.2

\* CV denotes coefficient of variation.

### 3.5 Spatial distribution of DIN composition and dissolved oxygen

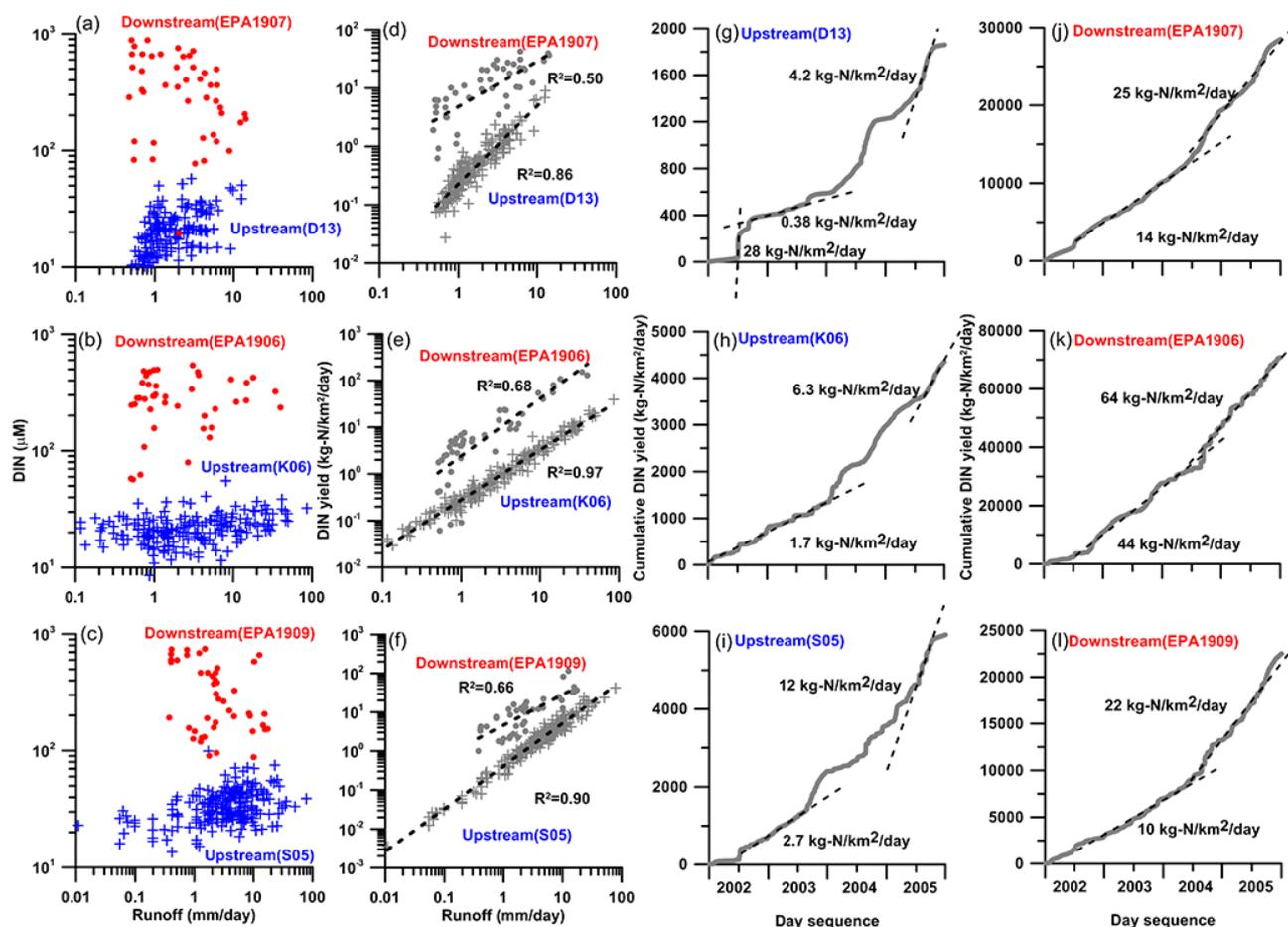
Figure 6 shows the overall longitudinal distributions of DO (Fig. 6a), DIN composition (Fig. 6b–d) and DIN concentration (Fig. 6e–h) along the Danshui River. The DIN compositions evidently change from upstream to downstream, while the DIN concentration increases downstream-ward. In the Dahan tributary, nitrate dominates in the upstream, and ammonium emerges in the downstream (Table 2). Nitrite, only accounting for < 5 % of DIN, plays a minor role in DIN composition. DO concentration remains relatively steady until EPA1907, where it drops to 34  $\mu\text{M}$ . In the Keelung tributary, nitrate contributes  $\sim 94$  % of DIN in the upstream reach. In the middle reach of the Keelung River (K02 and K01), the ammonium in the DIN composition increases by an order of magnitude. In the lowest reach (EPA1905 and 1906), ammonium surges to  $\sim 68$  % of DIN concentration. Nitrate and nitrite contribute  $\sim 29$  % and  $\sim 3$  %, respectively. DO concentration begins to decrease when the river flows by K03. The DO concentration is  $\sim 270$   $\mu\text{M}$  in the upstream; DO then decreases at a rate of  $\sim 3.1$   $\mu\text{M km}^{-1}$  to 30  $\mu\text{M}$  at EPA1906. Like the Dahan and Keelung rivers, the nitrate proportion of the DIN in the Sindian River is less in the downstream than in the upstream, with ammonium becoming the leading species. The DO concentrations also reveal a decreasing trend toward the estuary, with minor variations.

Generally, DO concentrations are  $> 200$   $\mu\text{M}$  in the upstream and  $< 120$   $\mu\text{M}$  in the downstream. The  $\rho$  values between DO and nitrate/ammonium proportion are 0.89/–0.90, respectively (not shown). DIN appears in the form of nitrate in higher DO conditions; in contrast, ammonium appears in lower DO conditions. The relative proportion of nitrite reaches its maximum in the middle reach, where DO concentration remains at a moderate level. Nitrite, which is hardly detected due to its low stability in water, shows little correlation with dissolved oxygen ( $\rho = -0.27$ ).

## 4 Discussion

### 4.1 Controlling factors on DIN export

Because upstream catchments are critical to understand source inputs to downstream river systems, our data set demonstrates the spatial transport behaviour of DIN and the urbanization effect. As mentioned earlier, nitrate concentrations at the upstream sites (population density  $< 150$  cap km<sup>-2</sup>) generally increase with increasing runoff (Fig. 3a, 4a–c), which is characteristic of a typical diffuse source where nitrate is carried along the flow pathways (Salmon et al., 2001; Kao et al., 2004). Fertilization from agricultural land uses superimposes the background nitrate from the forest (Table 3), and runoff controls the overall DIN export (Fig. 3c). Our upstream cases show that the agricultural

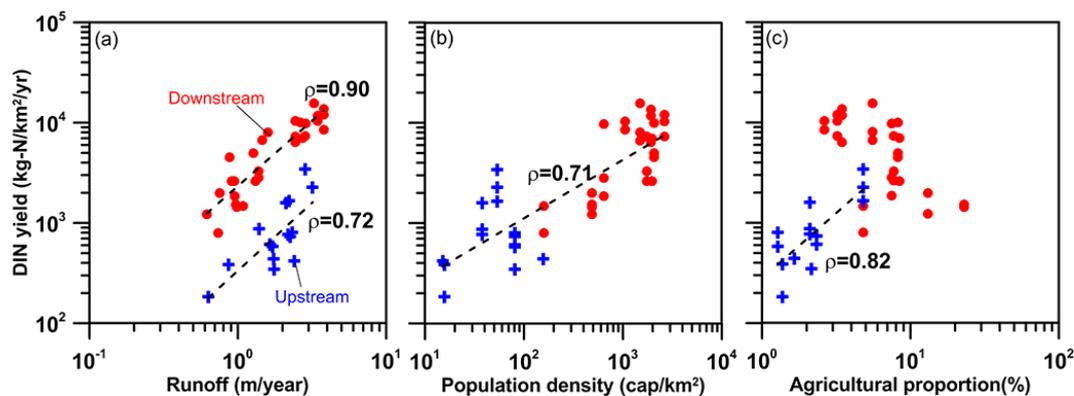


**Figure 4.** Scatter plots of DIN concentration (a, b, c) against runoff, daily DIN yield (d, e, f) against runoff, and cumulative yields (g through l) of selected upstream and downstream sites. Dashed lines in (d, e, f) are regression relations, while those in (g, h, i, j, k, l) are the mean yields of the window periods.

land use and runoff control the DIN concentration and yield (Fig. 5), which is consistent with previous studies on some less populated Mediterranean and Black Sea river basins ( $< 200 \text{ cap km}^{-2}$ ) with basin areas ranging from  $68\text{--}5526 \times 10^3 \text{ km}^2$ . These previous studies also found that DIN yields are generally best correlated with N fertilizer application and runoff (Ludwig et al., 2010).

As for runoff, tropical cyclones are the main contributor to annual runoff in the entire West Pacific. In the neighbourhood watersheds of this study, four typhoons bringing  $\sim 30\text{--}50\%$  of the annual runoff could trigger  $\sim 20\text{--}70\%$  of the annual DIN export, dependent on the cultivation level within the watersheds (Lee et al., 2013). Our stepwise cumulative DIN yields for the upstream sites reveal the influence of typhoons on DIN export (Fig. 4g–l). For example, D13 shows an abrupt  $\sim 28 \text{ kg-N km}^{-2} \text{ day}^{-1}$  jump in cumulative DIN yield in mid-2002; this rate is  $\sim 0.38 \text{ kg-N km}^{-2} \text{ day}^{-1}$  during the dry year ( $\sim 1400 \text{ mm}$  in 2002 and 2003). Subsequently, the rate increases during the next wet year ( $\sim 3100 \text{ mm}$  in 2004 and 2005) and remains at  $\sim 4.2 \text{ kg-N km}^{-2} \text{ day}^{-1}$

for most of the time in 2005. Two important relationships are addressed: (1) the abrupt jump and high DIN cumulative rate correspond well with typhoon events and runoff amount; and (2) the persistent high DIN yield in the wet year reveals sufficient nitrogen supply and/or storage to afford inexhaustible purging. Widespread anthropogenic N deposition (ANN) is one major source in N supply in Oceania (Kao et al., 2004). Atmospheric deposition (mainly from China,  $\sim 2100$  to  $\sim 3400 \text{ kg-N km}^{-2}/\text{year}$  or  $\sim 5.8$  to  $\sim 9.3 \text{ kg-N km}^{-2} \text{ day}^{-1}$ ) may explain the high DIN background in this region (Chen et al., 1998; Lin et al., 2000; Fang et al., 2008). Moreover, the DIN output only accounts for approximately half of the ANN input, which may indicate that N storage in the watershed is accumulating. The estimate of the total N pool in soil at S12 (Owen et al., 2010) is  $690\,900 \text{ kg-N km}^{-2}$ , approximately  $950\times$  the export from the watershed (Table 4). This again supports our speculation of sufficient nitrogen supply/storage. In addition to the ANN, farmers usually over-use fertilizer to maintain crop



**Figure 5.** Annual DIN yields plotted against (a) runoff, (b) population density and (c) agricultural proportion at our sampling sites. Red circles and blue crosses represent downstream and upstream sites, respectively. The relationships are individually examined in terms of Pearson correlation coefficients ( $\rho$ ) for the upstream and downstream subsets and the data set as a whole. Fitted lines are drawn only if  $\rho$  values are greater than 0.70.

**Table 5.** Yield equations as a function of annual runoff and population density. Smith et al. (2005) generated different yield equations for different basin size groups.

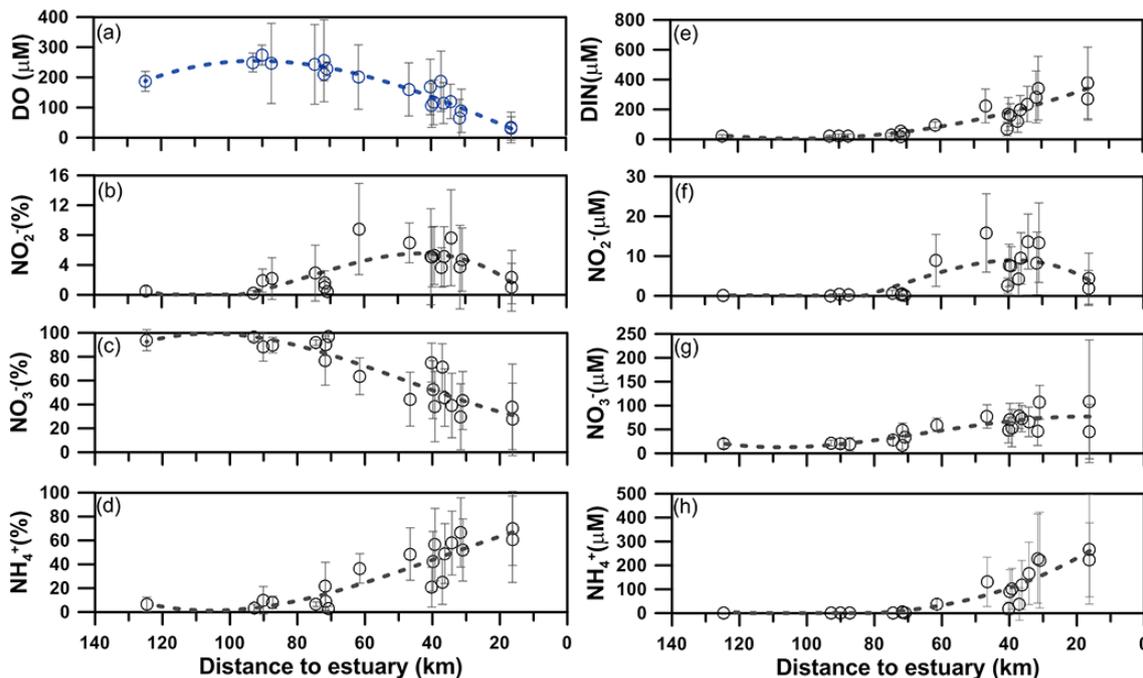
Table 5. Data source	Basin size (km <sup>2</sup> )	Intercept <sup>a</sup>	Runoff coeff.	Population coeff.	No. data	R <sup>2</sup>	Est. Danshui DIN export (tonne N yr <sup>-1</sup> )/yield (kg-N km <sup>-2</sup> yr <sup>-1</sup> ) <sup>b</sup>
This study (whole data)	6–2101	3.64 ± 0.23	0.91 ± 0.28	0.53 ± 0.09	44	0.85	23 435/8689
Smith et al. (2003)	10 <sup>1</sup> –10 <sup>7</sup>	3.99	0.75	0.35	165	0.59	9156/3395
Smith et al. (2005)	< 10 <sup>2</sup>	4.32 ± 0.14	0.82 ± 0.23	0.20 ± 0.07	62	0.19	NA
	10 <sup>2</sup> –10 <sup>3</sup>	4.09 ± 0.09	0.61 ± 0.10	0.38 ± 0.06	157	0.33	NA
	10 <sup>3</sup> –10 <sup>4</sup>	3.97 ± 0.06	0.64 ± 0.08	0.38 ± 0.05	155	0.39	10 205/3783

<sup>a</sup> Yield equation:  $\log(\text{DIN}_y) = \text{Intercept} + \text{Runoff coefficient} \times \log(Q/1000) + \text{Population coefficient} \times \log(\text{Pop})$ ,  $\text{DIN}_y$  is DIN yield in (mol km<sup>-2</sup> yr<sup>-1</sup>),  $Q$  is annual runoff in (mm),  $\text{Pop}$  is population density in (cap km<sup>-2</sup>); all the coefficients in the table are statistically significant, i.e.  $p$ -value < 0.01. <sup>b</sup> Estimations were done at the given runoff of 2.5 m and population density of 2697 cap km<sup>-2</sup>.

production and compensate for fertilizer removed by heavy typhoon rainfall in the summer when crops are growing.

In the urbanized area downstream, built-in sewer systems are common, and sewage is usually categorized as a point source. Given that the DIN concentration/flux is relatively constant from a point source, higher runoff, on the contrary, dilutes the riverine DIN concentration (Figs. 3b, 4a–c), unlike the behaviour observed in the upstream. Constant DIN yield rate is conventionally regarded as point source behaviour (Fig. 4j–l). However, the rate changes from dry to wet year among the downstream sites, implying that the influence of non-point sources cannot be ruled out. In our study, the DIN point sources likely originate primarily from two sources: waste water treatment plants (WWTP) and rain water pumping stations (RWPS). The DIN flux from WWTP is presumed constant at  $\sim 1718 \mu\text{M}$  ( $\sim 100\%$  ammonium), with a treatment capacity of  $5 \times 10^5 \text{ m}^3 \text{ day}^{-1}$  (Wen et al., 2008). The water coming from upstream during high flow carries relatively lower DIN concentrations, which may dilute the DIN concentration in the downstream. Nevertheless,

the WWTP can only account for < 1% of daily runoff (the average discharge of the Danshui River is  $\sim 200 \text{ m}^3 \text{ s}^{-1}$ ). In addition, the DIN in the effluents contributes < 1% of the riverine export, indicating that WWTP is not responsible for the downstream DIN. Further investigations, e.g. the measurement of nitrogen isotopes ( $\delta^{15}\text{N}$ ), could be implemented to identify the sources of DIN (Ohte et al., 2010). On the other hand, RWPS was designed to pump out the urban runoff collected by the drainage system within the protecting embankment. The outflow from RWPS depends on the magnitude of rainfall events and is limited to the maximum total capacity of the pumps. Meanwhile, the DIN concentration from RWPS may vary dissimilarly according to the surface runoff pathways, e.g. streets, playgrounds and parks. The urban runoff from roofs with different materials and streets with different traffic intensities, for example, show wide ranges of ammonium and nitrate concentrations from  $\sim 5$ – $344 \mu\text{M}$  and  $\sim 2$ – $258 \mu\text{M}$ , respectively (Gobel et al., 2007). The service rate of public sanitary sewage in Taipei City is < 75%. RWPS pumps not only handled urban



**Figure 6.** Longitudinal distributions of (a) dissolved oxygen, relative proportions of three DIN species, i.e. (b) nitrite, (c) nitrate and (d) ammonium, and concentrations of (e) DIN, (f) nitrite, (g) nitrate, and (h) ammonium along the Danshui River. Circles represent the mean of observations and bars are standard deviations. Dashed lines are polynomial fitting lines interpolating the trend along the river.

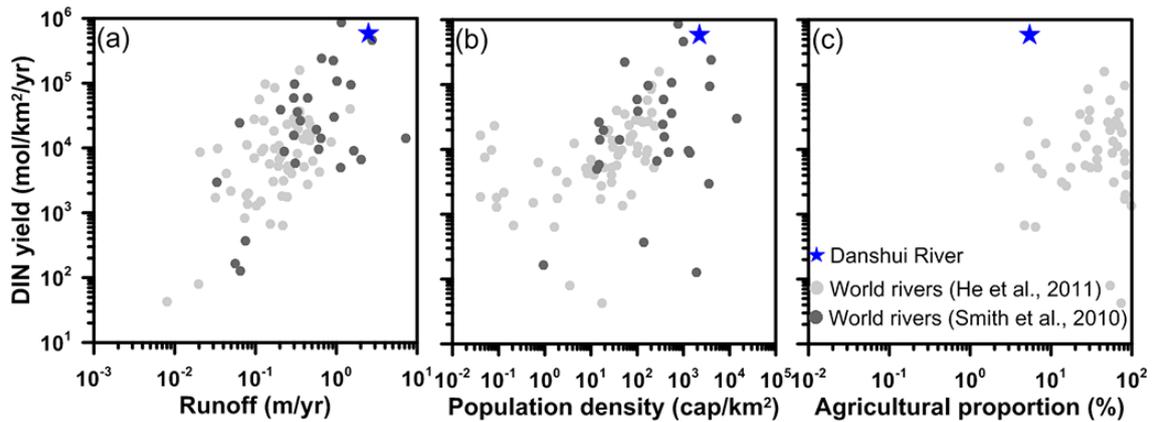
runoff but also untreated sewage. We therefore suggest that urban runoff is also an important source of DIN to the Danshui River. The estimation of the contribution of RWPS is beyond our scope and requires further investigation. Nevertheless, the constant export at downstream sites implies that the drainage system somehow integrates and modulates different DIN sources from its service area, smoothing the typhoon-triggered DIN peaks in Fig. 4j–l. Meanwhile, the rates of DIN yield have simultaneously increased  $\sim 2\times$  since mid-2004, the onset of the wet years. This indicates that the DIN supply is sufficient to support such a  $\sim 2\times$  export because dense population guarantees abundant supply (Fig. 5b). The DIN in the downstream is a combination of point and diffuse sources, indicating that both of these are important for the downstream DIN. Although the controlling factors responsible for upstream and downstream DIN export are different, our observations suggest that the watersheds are transport dominated rather than supply limited. In addition, our observed DIN export and preliminary understanding of controlling factors can help advance nitrogen modelling work, e.g. NANI, SPROW, and NEWS.

#### 4.2 Implications of DIN yields in the Danshui River

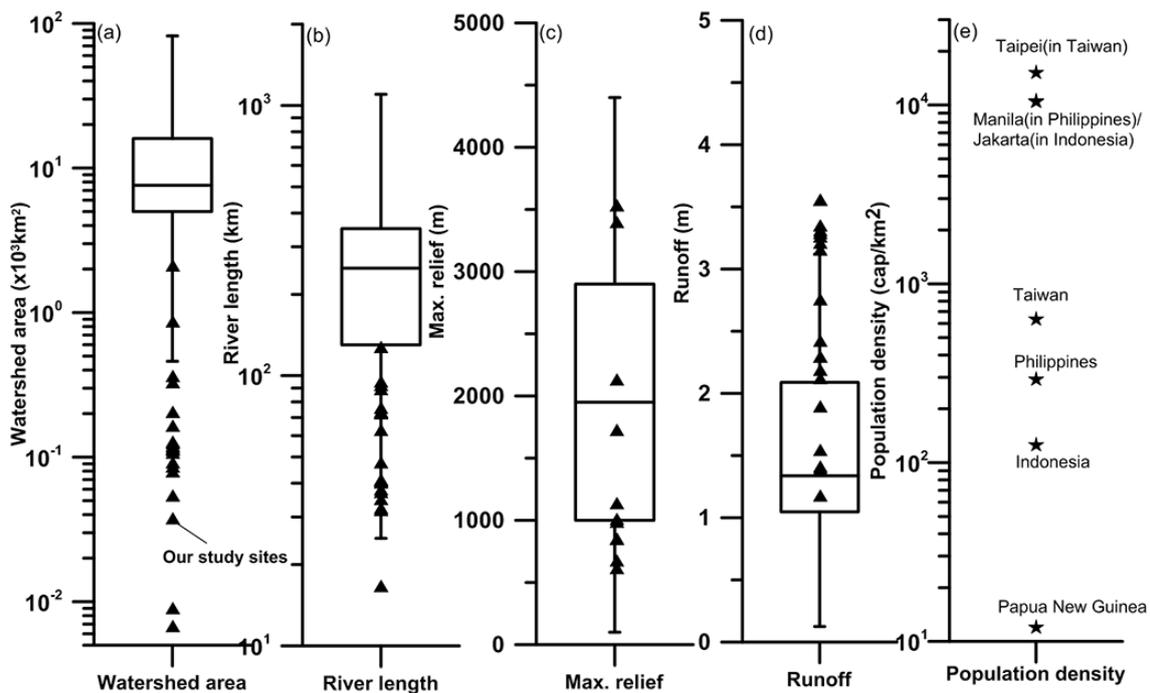
We further use a logarithmic linear regression model to estimate the DIN export of our 20 sites in 2002–2005. As in the global model (Smith et al., 2003, 2005), the application of annual runoff and population density in

this model produces the best estimates. Table 5 shows the equations derived from this study and those from the literature. The intercepts and coefficients of the equations shown in Table 5 are all statistically significant, i.e.  $p$ -value  $< 0.01$ . Using our entire data set to determine the model coefficients, we obtain the following equation:  $\log(\text{DIN yield}) = 3.64 + 0.91 \times \log(\text{runoff}) + 0.53 \times \log(\text{population density})$ . The coefficient for the  $\log(\text{runoff})$ ,  $0.91 \pm 0.28$  (95% confidence interval), is  $\sim 20$ – $50\%$  larger than those in the previous work of Smith. In addition, the coefficient for  $\log(\text{population density})$ ,  $0.53 \pm 0.09$ , is  $> 40\%$  larger. The large differences in the coefficients reveal the regional characteristics.

Figure 7 shows the relationships between DIN yields and runoff (Fig. 7a), population density (Fig. 7b) and agricultural proportion (Fig. 7c) of the Danshui River and other global rivers for comparison. Based on our equation in Table 5, at the long-term average runoff of 2.5 m and the current population density of  $2697 \text{ cap km}^{-2}$  for the Danshui River, DIN yield is estimated to be  $\sim 6 \times 10^5 \text{ mol-N km}^{-2} \text{ yr}^{-1}$ . This value is almost the highest on the global spectrum. High runoff and population density lead to the high DIN yield. Interestingly, the DIN production rate is much higher than the global model predicts based on the Danshui River runoff and population density. In terms of DIN flux, the Danshui River exports  $\sim 23\,000 \text{ ton-N yr}^{-1}$ , which is  $\sim 2.6\times$  higher than that estimated by Smith et al. (2003) (Table 5). Considering the regional differences and watershed scale, Smith



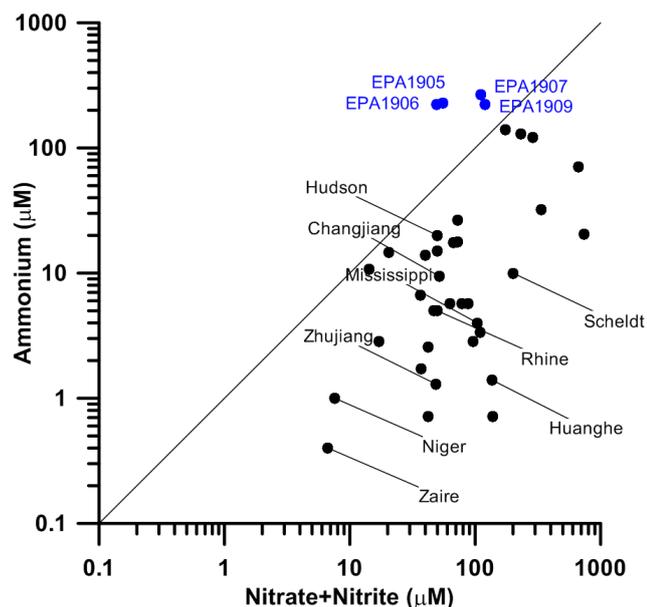
**Figure 7.** Scatter plots of DIN yields against (a) runoff, (b) population density, and (c) agricultural proportion. The export of the Danshui River (the star symbol) is plotted with global river data (grey circles). World river data are retrieved from He et al. (2011) and Smith et al. (2010).



**Figure 8.** The spectra of characterized parameters, (a) watershed area, (b) river length, (c) maximum relief and (d) runoff, for Oceania rivers, and (e) population density in some Oceania countries and their cities (stars). The triangles represent our 20 sub-watersheds.

et al. (2005) updated their database and constructed watershed area-dependent equations to re-calculate global DIN export by compiling 496 rivers around the world. Nonetheless, our observation is still  $\sim 2.3\times$  higher than their updated DIN yield (Table 5). NEWS (Nutrient Export from Watersheds), another global model developed by Seitzinger et al. (2005), estimated an average DIN yield for Oceania of  $\sim 720\text{ kg-N km}^{-2}\text{ yr}^{-1}$ , which is close to that obtained from relatively pristine upstream catchments in Taiwan (Kao et al., 2004; Lee et al., 2013 and this study); however, it is

far lower than that predicted from the overall Danshui River ( $8689\text{ kg-N km}^{-2}\text{ yr}^{-1}$ ). Mayorga et al. (2010) further reduced the estimation to  $\sim 250\text{ kg-N km}^{-2}\text{ yr}^{-1}$ , demonstrating the need for regional observations. These cases highlight the fact that current global models very likely underestimate DIN export from the Oceania rivers. Here, we summarize some basic basin characteristics (watershed area, river length, maximum relief and population density) from 92 selected rivers that together drain  $\sim 45\%$  of Oceania (Fig. 8) (Milliman and Farnsworth, 2013). The Danshui



**Figure 9.** Ammonium concentration plotted against nitrate + nitrite concentration. The blue circles are the sites in/near the Danshui estuary, and the black circles are from documented large rivers. The 1 : 1 line is shown.

River shows the representativeness of rivers in high-standing Oceania islands, as all basins share similar environmental backgrounds. The watershed area of the Danshui River occupies  $1.8 \times 10^{-3}$  % of the Earth's land surface area, but discharges  $\sim 90 \times 10^{-3}$  % ( $\sim 23\,000$  ton-N yr $^{-1}$ ) of the annual global DIN export to the ocean (24.8 Tg N, Seitzinger et al., 2005). This disproportionate DIN yield from small mountainous rivers underscores their importance in global nitrogen cycles and ecological footprints (Billen et al., 2010).

### 4.3 Transformation among DIN species

In this study, DIN speciation changes from the headwaters to the estuary (Fig. 6). Riverine nitrate is mainly influenced by soil leaching in the upstream. Year-round high temperature results in high rates of organic matter decomposition and nitrification. Moreover, excess rainfall induces farmers to apply much more ammonium sulfate and urea to facilitate crop growth. Ammonium in the leachate is quickly oxidized to nitrite and nitrate (Lee et al., 2013). In addition, based on the isotopic compositions of  $\delta^{15}\text{N}$  and  $\delta^{18}\text{O}$  in nitrate, a previous study indicated that the denitrification process is insignificant in upstream mountainous watersheds and even in cultivated watersheds due to rapid infiltration (Peng et al., 2012). Previous studies also demonstrated that ammonium and nitrite concentrations in the headwater catchments of Taiwan are almost undetectable (Wen et al., 2008; Lee et al., 2013). Nitrate seems to flow into rivers as it is present in the soil water.

In the downstream, concentrated population and drainage systems facilitate the input of pollutants into the river. Recent

research found that particulate organic matter in the downstream estuary consists primarily of phytoplankton consuming ammonium as the major nutrient source (Cheng, 2010; Liu et al., 2013). Eutrophication has resulted in hypoxia, the depletion of oxygen in the estuarine water column. By applying a mass-balanced trophic model, Ecopath with Ecosim, Lin et al. (2007) suggested that the estuary is a heterotrophic ecosystem. More organic matter is consumed than is produced in the estuary, leading to the depletion of dissolved oxygen and the release of ammonium (from the decomposition of organic matter) into the water. Low dissolved oxygen further impedes the oxidation of ammonium, resulting in ammonium being the dominant DIN species (Fig. 6).

We further collected DIN speciation data from some global rivers (Meybeck, 1982; Wollast, 1983; Bianchi et al., 1994; Duan et al., 2000; Goolsby and Battaglin, 2001; Zee et al., 2007) and plotted ammonium concentration against nitrate + nitrite concentration in Fig. 9. It is interesting to note that the Danshui River exports most of the DIN in the form of ammonium, unlike the large rivers that export nitrate as the predominant species. This export is a complex process involving the speciation and dynamics of nitrogen species associated with nitrification rate, denitrification rate, DO, organic matter decomposition, aeration in the air–water interface, and some physical parameters such as stream temperature and turbulence. (Hsiao et al., 2013; Bailey and Ahmadi, 2014). We speculate that the dominance of ammonium in the estuary of the Danshui River might be attributed to high flow velocity and short residence time. Many other in-stream processes affect DIN speciation during transportation along the stream; ammonium/nitrate assimilation and nitrate removal (denitrification/anammox) are involved. Oceania is surrounded by stratified oligotrophic water with limited bioavailable nutrients (Jiao et al., 2007; Martha and Kristen, 2012), again emphasizing the importance of DIN export from Oceania rivers in ecological footprints (Billen et al., 2010) and global nitrogen cycles.

## 5 Conclusions

Human activities enhance nitrogen export from land to ocean, altering global biogeochemical cycles. Oceania has been identified as a hotspot of global DIN export, although much less attention has been paid to the rivers of Oceania, where development is now rapid. This is a pioneer investigation on DIN speciation and distribution on basin-scale networks in the Oceania region with wide ranges of human alteration. The Danshui River holds the highest DIN yields among world rivers and could be a model for the rivers of Oceania. The positive correlation between runoff and DIN yield/flux reveals that hydrology exerts strong control over DIN export, i.e. DIN in our study area is transport-dominated. The low yields in the upstream indicate that the forested watershed retains most of the DIN from atmospheric

deposition ( $> 2100 \text{ kg-N km}^{-2} \text{ yr}^{-1}$ ), even though typhoons in the summer growing season flush more DIN out of the system. DIN export from low population density areas with agricultural activities should not be ignored given the common behaviour of over-fertilization. The much higher estimated regional DIN production rate compared to most global models highlights the disproportionate DIN yield from Oceania rivers. Unlike global large rivers where the DIN is dominated by nitrate, ammonium is the prevailing DIN species in the Danshui River. This perhaps results from the anaerobic conditions and short river water residence time that impede the removal of ammonium. Further investigation of in-stream processes is required to fully understand the rivers of Oceania. Our observational data supplement the global river database and serve as a scientific background for better understanding nutrient export from small mountainous watersheds and for promoting stream restoration and nutrient mitigation in Oceania rivers.

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