

RESEARCH ARTICLE

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Key Points:

- We estimated the monthly evapotranspiration at four large basins in Tibetan Plateau
- We evaluated five global evapotranspiration products with a water balance method
- Seasonal evapotranspiration trends (1983–2006) were detected from corrected data

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Seasonal evapotranspiration changes (1983–2006) of four large basins on the Tibetan Plateau

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Abstract Lack of reliable historical basin-scale evapotranspiration (*ET*) estimates is a bottleneck for water balance analyses and model evaluation on the Tibetan Plateau (TP). This study looks at four large basins on the TP to develop a general approach suitable for large river basins to estimate historical monthly *ET*. Five existing global *ET* products are evaluated against monthly *ET* estimated by the water balance method as a residual from precipitation (*P*), terrestrial water storage change (ΔS), and discharge (*R*). The five *ET* products exhibit similar seasonal variability, despite of the different amounts among them. A bias correction method, based on the probability distribution mapping between the reference *ET* and the five products during 2003–2012, effectively removes nearly all biases and significantly increases the reliability of the products. Then, the surface water balance changes for the four basins are analyzed based on the corrected *ET* products as well as observed *P* and *R* during 1983–2006. A trend analysis shows an upward trend for *ET* in the four basins for all seasons during the past three decades, along with the regional warming, as well as a dominating increasing trend in *P* and negative trend in *R*.

1. Introduction

Evapotranspiration (*ET*) is a critical process that determines terrestrial water budget and exchanges of surface energy. Global and regional climate changes [Intergovernmental Panel on Climate Change Fifth Assessment Report (IPCC AR5), 2013; Liu and Chen, 2000; Su et al., 2013] have changed hydrological cycles and surface energy budgets [e.g., Ohmura and Wild, 2002; Huntington, 2006; Gao et al., 2007; Yang et al., 2011]. More importantly, *ET* is taken as an indicator for climate change, in particular for the accelerated hydrological cycle [Brutsaert and Parlange, 1998; Ohmura and Wild, 2002]. Accurately, quantifying the terrestrial water budget can help to improve our understanding of global and regional water cycle changes and the role of *ET* in the hydrologic cycle. However, obtaining water budget components from ground-based measurements alone remains a challenge. As a result of high variability in time and space, *ET* is perhaps the most difficult and complicated component in the hydrological cycle and is especially difficult to measure [Xu and Singh, 2005].

The Tibetan Plateau (TP), also called the “Asian Water Tower,” is essential to Asian monsoon evolution and concurrent water-energy cycles. Shrinking glaciers at the headwaters of many prominent Asian rivers and changes in precipitation patterns caused by weakening Indian monsoons and strengthening westerlies [Yao et al., 2012] have all influenced the hydrologic cycle in this area [Immerzeel et al., 2010]. Yang et al. [2011] indicated that the surface water balance has changed in recent decades and that *ET* shows an overall increasing trend in the TP. However, their results were derived from a land surface model driven by meteorological observations only and lacked sufficient observations in the TP.

There are a number of methods to estimate *ET*, including micrometeorological measurements [e.g., Rana and Katerji, 2000], climatology water balance [e.g., Gao et al., 2007], remote sensing-based methods [e.g., Vinukollu et al., 2011a, 2011b; Zhang et al., 2010; Ferguson et al., 2010; Mu et al., 2007], and land surface models [e.g., Yang et al., 2011; Zhou and Huang, 2012]. However, these methods are often constrained by sparse measurement stations and a number of uncertainties involving input data and techniques, as well as by the model used [e.g., Wang and Dickinson, 2012]. The traditional water balance method provides another useful tool for estimating *ET* at the regional or basin scale [e.g., Rodell et al., 2004b; Sheffield et al., 2009; Gao et al., 2010]. The newly launched Gravity Recovery and Climate Experiment (GRACE) satellite [Wahr et al., 2004;

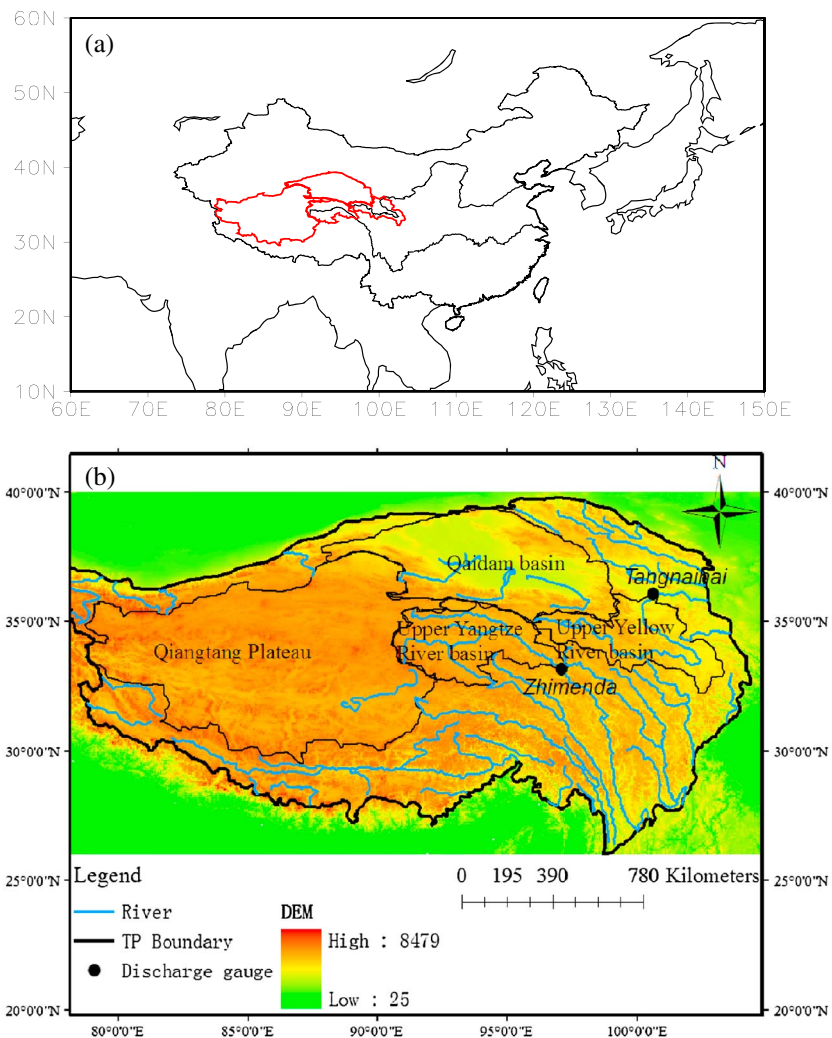


Figure 1. (a) Location of the study region in China. (b) Distributions of two discharge gauge stations with closed circles. The shades illustrate the elevation from Shuttle Radar Topography Mission digital elevation model (DEM) (m).

Tapley *et al.*, 2004] is a perfect fit for water budget studies because it is a horizontally and vertically integrated quantity [Rodell and Famiglietti, 1999]. In the past decades, a number of studies have focused on global and regional quantifications of *ET* by the water balance method [e.g., Ramillien *et al.*, 2006; Swenson and Wahr, 2006a; Sheffield *et al.*, 2009; Rodell *et al.*, 2004b]. Although the uncertainties in the GRACE data are generally much greater owing to its coarse spatial resolution, it still is an effective way to study the water balance at the basin scale. Recently developed filtering technique designed to selectively remove correlated errors in the GRACE spectral coefficients significantly improves the spatial resolution of the GRACE water storage estimates [Swenson *et al.*, 2006]. Lately, scaled gridded data, accompanied with provided leakage and GRACE measurement errors and gain factors, may be finer spatial scales to achieve accurate results [Landerer and Swenson, 2012].

Over the past decade, a large number of studies focused on potential evapotranspiration (or pan evaporation) in China [Chen *et al.*, 2005; Xu *et al.*, 2006] and on the TP [e.g., Zhang *et al.*, 2007; Liu *et al.*, 2011]. Several regional studies in the world have demonstrated that potential evapotranspiration or pan evaporation can have a different change compared to the actual evapotranspiration under climate change [Brutsaert and Parlange, 1998; Hobbins *et al.*, 2004; Lawrimore and Peterson, 2000; Golubev *et al.*, 2001]. Gao *et al.* [2007] studied the variations of potential evapotranspiration and actual

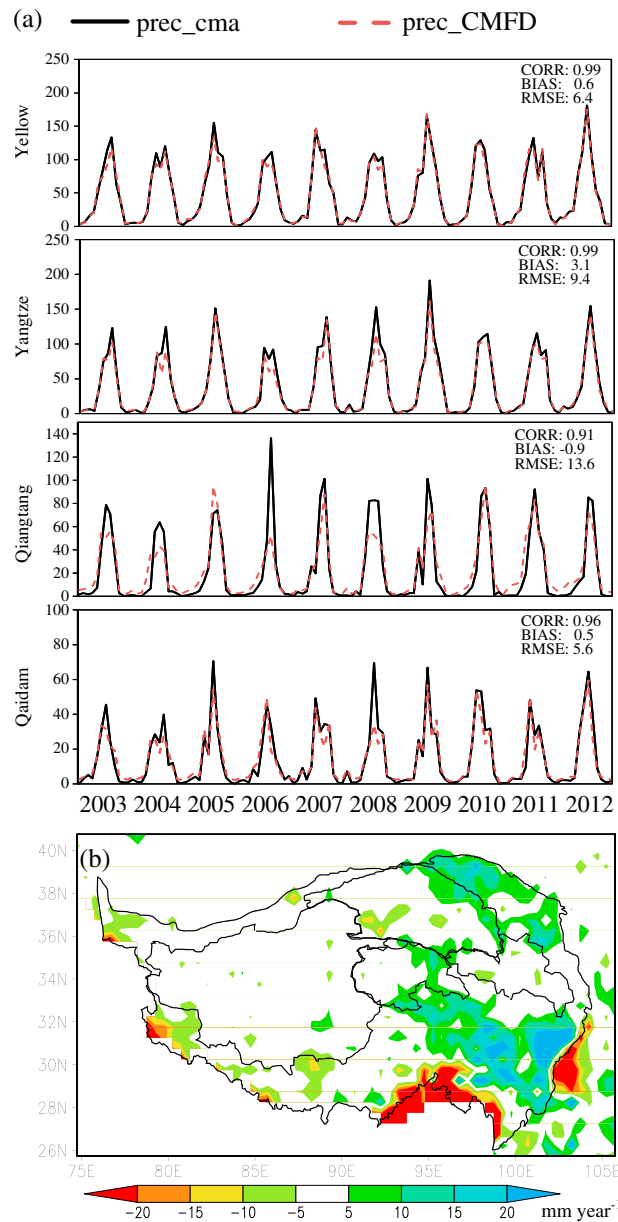


Figure 2. (a) Comparison of the monthly precipitation (mm month^{-1}) from CMA (prec_CMA) and from China Meteorological Forcing Data Set (prec_CMFD), for domain-averaged time series on the four basins and (b) for annual mean difference (prec_CMA minus prec_CMFD) on the whole TP.

evapotranspiration over China during 1960–2002 and obtained similar conclusion. However, the number of stations over the TP in their study was too few to draw a general conclusion for the TP. Besides, the approach may be too simple to get an accurate estimate.

Under the background of global climate change over the last decades, what was the actual change in the evapotranspiration on the TP? To address the question effectively, a hydrological water balance method can be used to reveal the variation of actual *ET* on the TP. Recently, *Xue et al.* [2013] had used the method to estimate annual *ET* and then evaluated existing *ET* products on the TP at the annual scale.

To further understand the seasonal variations of water cycles and their response to climate changes on the TP, monthly or seasonal *ET* products are needed. In this study, we use the basin-scale water balance method in hydrology to estimate monthly *ET* as the reference *ET* for large basins on the TP. Then, we propose a simple method to correct monthly *ET* fields from several global *ET* products with the help of the reference *ET*. Finally, long-term (1983–2006) variations of the basin-scale water balance in four seasons are investigated by means of the corrected *ET* estimates, along with the observed *P* and *R*.

The paper is structured as follows. In section 2, we describe the study region, followed by the data and methodology. Section 3 presents the results of the estimation of *ET* by the water balance

Table 1. Overview of the Five Global *ET* Products

Data Sets	Category	Spatial Resolution	Temporal Extent	References
Zhang_ET	Penman–Monteith method	8 km	1983–2006	Zhang et al. [2010]
MODIS_ET	Penman–Monteith method	1 km	2000–2012	Mu et al. [2007]
GLDAS1_ET	land surface model	1° × 1°	1948–2012	Rodell et al. [2004a]
GLDAS2_ET	land surface model	1° × 1°	1948–2010	Rodell et al. [2004a]
JRA_ET	reanalysis	T106 Gaussian	1979–2012	Onogi et al. [2007]

Table 2. Correlation Coefficients (CORR) Among Monthly Domain-Averaged TWSA (Total Water Storage Anomaly) and ΔS s (Total Water Storage Changes) From CSR, GFZ, and JPL Centers, as Well as the Standard Deviations (SD) (mm month^{-1}) of Monthly Domain-Averaged TWSA and ΔS for the Four Basins on the TP

		TWSA				ΔS			
		Yellow	Yangtze	Qiangtang	Qaidam	Yellow	Yangtze	Qiangtang	Qaidam
CORR	CSR and GFZ	0.91	0.91	0.86	0.89	0.82	0.79	0.75	0.73
	CSR and JPL	0.89	0.85	0.71	0.79	0.86	0.79	0.65	0.69
	GFZ and JPL	0.85	0.79	0.58	0.72	0.77	0.69	0.54	0.51
SD	CSR	42.8	23.2	23.0	9.5	21.9	11.3	11.0	3.9
	GFZ	46.9	25.4	26.0	10.6	24.7	13.5	14.1	5.1
	JPL	40.3	22.8	24.2	9.6	20.2	10.5	12.1	4.1

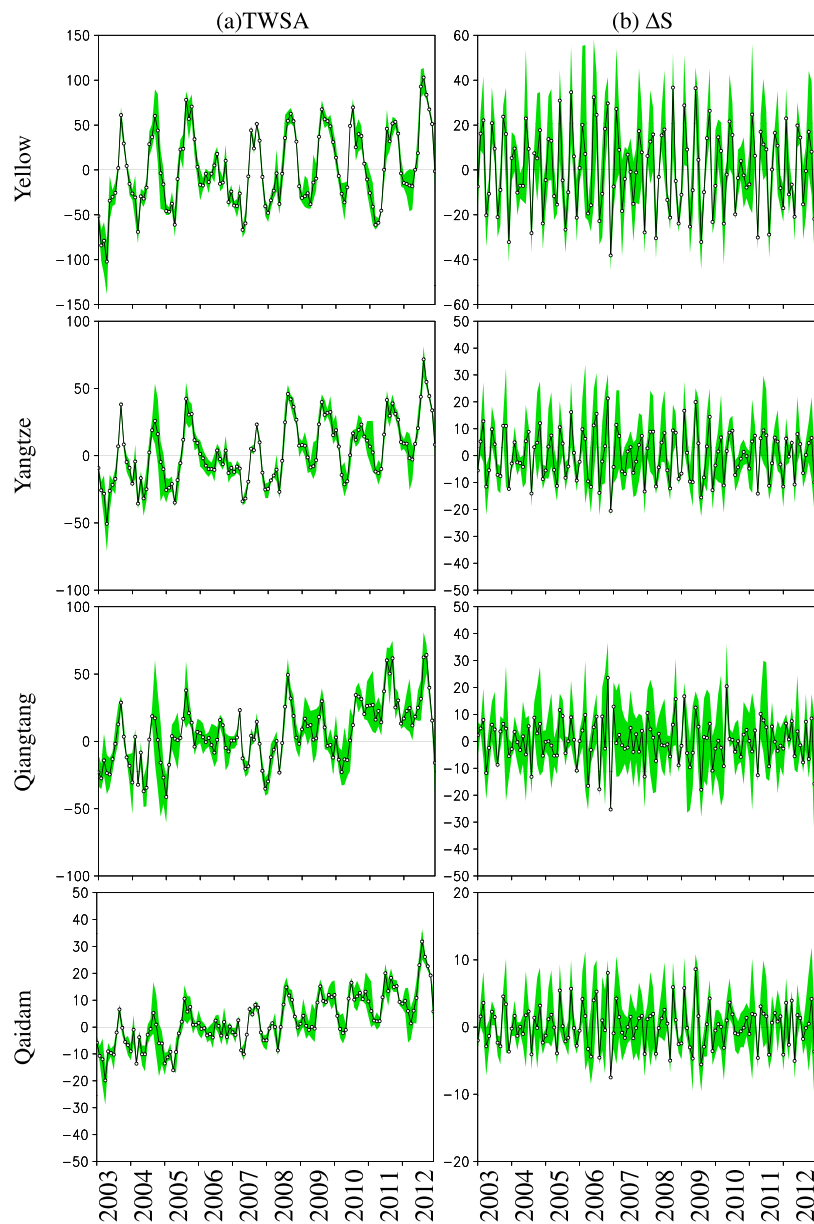


Figure 3. Monthly domain-averaged (a) TWSA (total water storage anomaly) (mm month^{-1}) and (b) ΔS (mm month^{-1}) over the four basins. The shades indicate the range determined by data sets from CSR, GFZ, and JPL centers, while the lines represent the mean of the three.

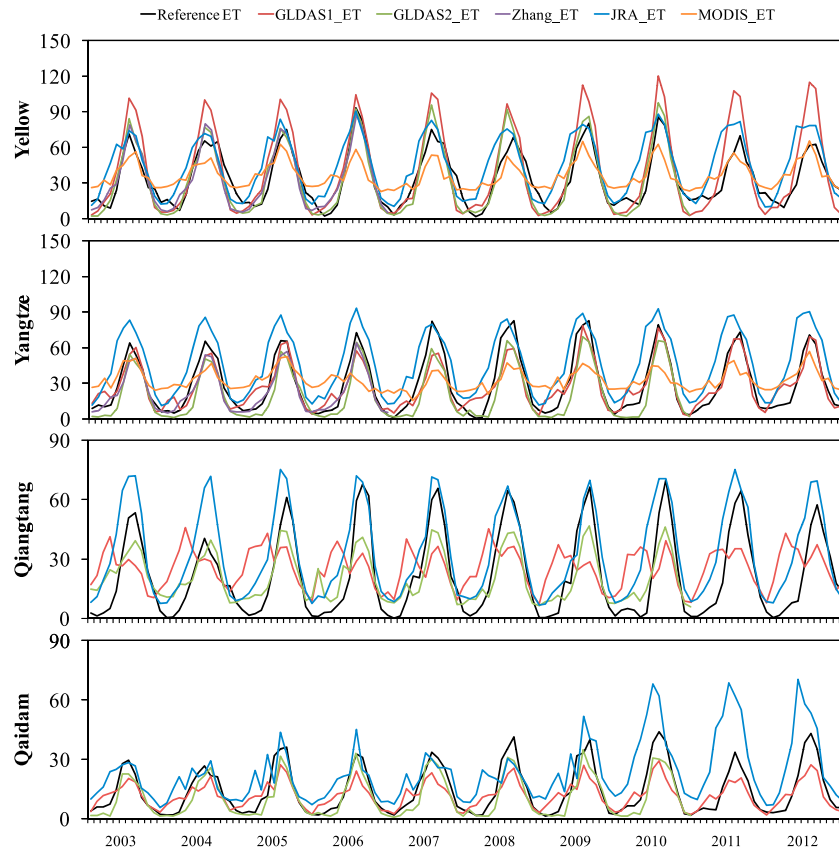


Figure 4. Comparison of the domain-averaged values between the five global *ET* products (mm month^{-1}) and the reference *ET* (mm month^{-1}) estimated by the water balance method for the four basins from January 2003 to December 2012. The statistical values for comparison are shown in Table 3.

method and analysis of the long-term water balance for the four basins. Section 4 contains the conclusions and discussions.

2. Study Regions, Data Sets, and Method

2.1. Study Regions

Two types of basins on the TP, with and without surface runoff flowing out of the basin, are involved in this work. The first type includes the upper Yellow and Yangtze River basins (see Figure 1), determined by the stream systems extracted from the digital elevation model (DEM), with outlets at Zhimenda for the upper Yangtze River and Tangnaihai for the upper Yellow River. The upper Yellow River and Yangtze River

Table 3. Bias (mm), RMSE (mm), and Correlation Coefficient of the Five Monthly *ET* Products in Comparison With the Reference *ET* (mm) Estimated From the Water Balance for the Four Basins on the TP^a

Data Sets	Yellow				Yangtze				Qiangtang				Qaidam			
	Mean	BIAS	RMSE	CORR	Mean	BIAS	RMSE	CORR	Mean	BIAS	RMSE	CORR	Mean	BIAS	RMSE	CORR
Reference <i>ET</i>	34.0				29.4				22.3				14.3			
GLDAS1_ET	40.0	6.0	14.7	0.96	28.0	-1.4	9.5	0.92	25.8	3.6	21.4	0.28	12.0	-2.2	7.3	0.88
GLDAS2_ET	32.9	-1.2	7.1	0.97	20.3	-8.9	11.8	0.95	20.5	-1.5	11.8	0.92	10.7	-3.5	5.6	0.93
JRA_ET	44.5	10.5	16.4	0.87	46.7	17.2	20.4	0.91	33.1	10.8	14.4	0.91	23.3	9.0	14.1	0.70
Zhang_ET	32.8	-0.8	5.5	0.95	23.2	-3.7	7.1	0.96								
MODIS_ET	36.5	2.5	17.1	0.86	32.4	3.0	18.2	0.76								

^aSmaller BIAS and RMSE and larger correlation coefficients are in boldface.

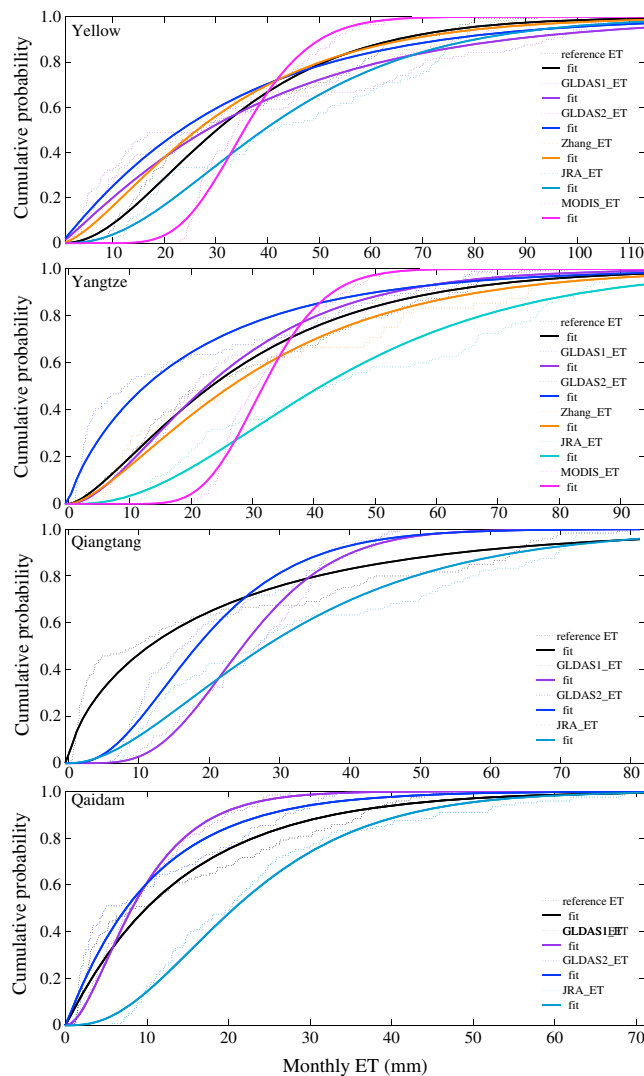


Figure 5. Distribution of the monthly domain-averaged ET values from the reference ET (mm month^{-1}) and ET products (mm month^{-1}) for the period of 2003–2012. The dashed lines and the solid lines represent the values and their gamma distribution fitting, respectively.

basins have total areas of 121,972 and 137,704 km^2 , respectively. The main soil types are alpine cold desert, alpine meadow, alpine steppe, mountain meadow, gray cinnamonic, chestnut, swamp, and aeolian [Bing *et al.*, 2012]. The second type includes the Qiangtang Plateau and the Qaidam Basin, with total areas of 700,000 and 257,768 km^2 , respectively. They are the highest inland basins with many rivers and lakes in China. Water in the two inland basins evaporates after flowing into the lakes. The climate of the four basins is classified as semiarid and subhumid plateau continental, with distinct wet and dry seasons. The study region is strongly influenced by the summer Indian monsoon and East Asian monsoon during summer [Yao *et al.*, 2012]. The geographical distribution of the basins and hydrological stations are shown in Figure 1.

2.2. Data Sets

2.2.1. Precipitation and Runoff Data

Precipitation (P) from the National Meteorological Information Center of the China Meteorological Administration (CMA) and observed discharge (R) for Tangnaihai and Zhimenda are used to estimate the ET by the water balance method. The precipitation data are spatially interpolated by the Thin Plate Spline method from 2400 ground stations to generate gridded monthly data sets with a horizontal resolution

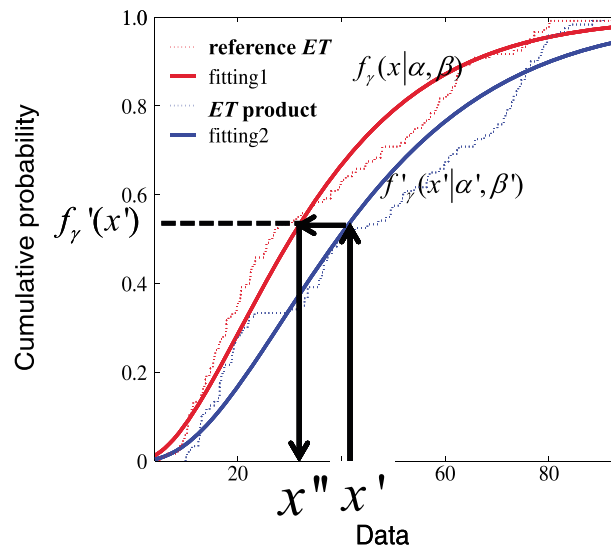


Figure 6. Schematic diagram of the first step in the bias correction method. The red lines represent the values and their fittings from the reference *ET* estimated by the water balance method, while the blue lines from the *ET* product. The corresponding functions for the reference *ET* and the *ET* product are also expressed in the figure. Parameters x' and x'' are the *ET* values before and after the bias correction at the first step.

of $0.5^\circ \times 0.5^\circ$ across China ($18\text{--}54^\circ\text{N}$, $72\text{--}136^\circ\text{E}$). The data are available from January 1961 to present and can be downloaded from the China Meteorological Data Sharing Service System (<http://cdc.cma.gov.cn/home.do>).

Due to sparse distribution of precipitation stations on the TP, the representativeness of this precipitation data is explored through comparing with another precipitation data from China Meteorological Forcing Data Set (CMFD) [He and Yang, 2011]. This precipitation from CMFD with higher temporal resolution (3-hourly) and spatial resolution (0.1°) was produced through merging CMA station data, Tropical Rainfall Measuring Mission satellite precipitation data (3B42), and the Global Land Data Assimilation System (GLDAS) precipitation data. It was found that domain-averaged P values from CMA were comparable to those from CMFD forcing data (shown in Figure 2a). The

mean annual differences between CMA and CMFD data for the four basins range from -5.0 mm to 5.0 mm (shown in Figure 2b), which is considered small. Therefore, the P values from CMA, generated completely by station data, are considered of reasonable quality for the following analysis.

2.2.2. Global ET Products

Five *ET* products were evaluated (details of the five *ET* products are presented in Table 1). Zhang_ET from Zhang *et al.* [2010] and MODIS_ET from Moderate Resolution Imaging Spectroradiometer (MODIS) [Mu *et al.*, 2007] are produced by the Penman–Monteith method. Note that these two products do not cover the whole TP. *ET* from the Global Land Data Assimilation System with Noah Land Surface Version 1 (hereafter GLDAS1_ET) [Rodell *et al.*, 2004a] and Noah Land Surface Version 2 (hereafter GLDAS2_ET) [Rodell *et al.*, 2004a] are also evaluated. GLDAS1_ET is produced by constantly updated meteorological data, while GLDAS2_ET is forced by the Princeton meteorological forcing data set [Sheffield *et al.*, 2006] for the period of 1948–2010, which is more suitable for analyzing the long-term trends. The last *ET* product is from the Japanese 25 year Reanalysis (JRA) (hereafter JRA_ET) [Onogi *et al.*, 2007]. JRA is a high-quality, homogeneous data set in space and time for land surface hydrological cycles, proved by previous study [e.g., Takahashi *et al.*, 2006; Nakaegwa, 2008; Tosiyuki, 2008].

2.2.3. GRACE Data

The terrestrial water storage changes (ΔS s) are derived from the Gravity Recovery and Climate Experiment (GRACE) land data [Tapley *et al.*, 2004]. The descriptions of present status and solving of GRACE gravity field solutions are presented in previous study [Tapley *et al.*, 2004; Rodell and Famiglietti, 1999; Swenson and Wahr, 2002, 2006a, 2006b; Wahr *et al.*, 2004]. Although the spatial resolution of GRACE data is around a few hundred kilometers, a reasonable agreement between GRACE estimated and in situ observation has been found [Yeh *et al.*, 2006], and the usefulness of the data in hydrological applications has already been demonstrated for basin scale [Rodell and Famiglietti, 2002; Longuevergne *et al.*, 2010; Landerer and Swenson, 2012; Xue *et al.*, 2013; Long *et al.*, 2014].

Here RL05 gridded data (available on the GRACE Tellus website) are extracted to examine the domain-averaged changes of terrestrial water storage for the basins on the TP, which are processed at the Center for Space Research (CSR), University of Texas; the Jet Propulsion Laboratory (JPL); and the GeoForschungsZentrum (GFZ). A destriping filter and a glacial isostatic adjustment correction have been

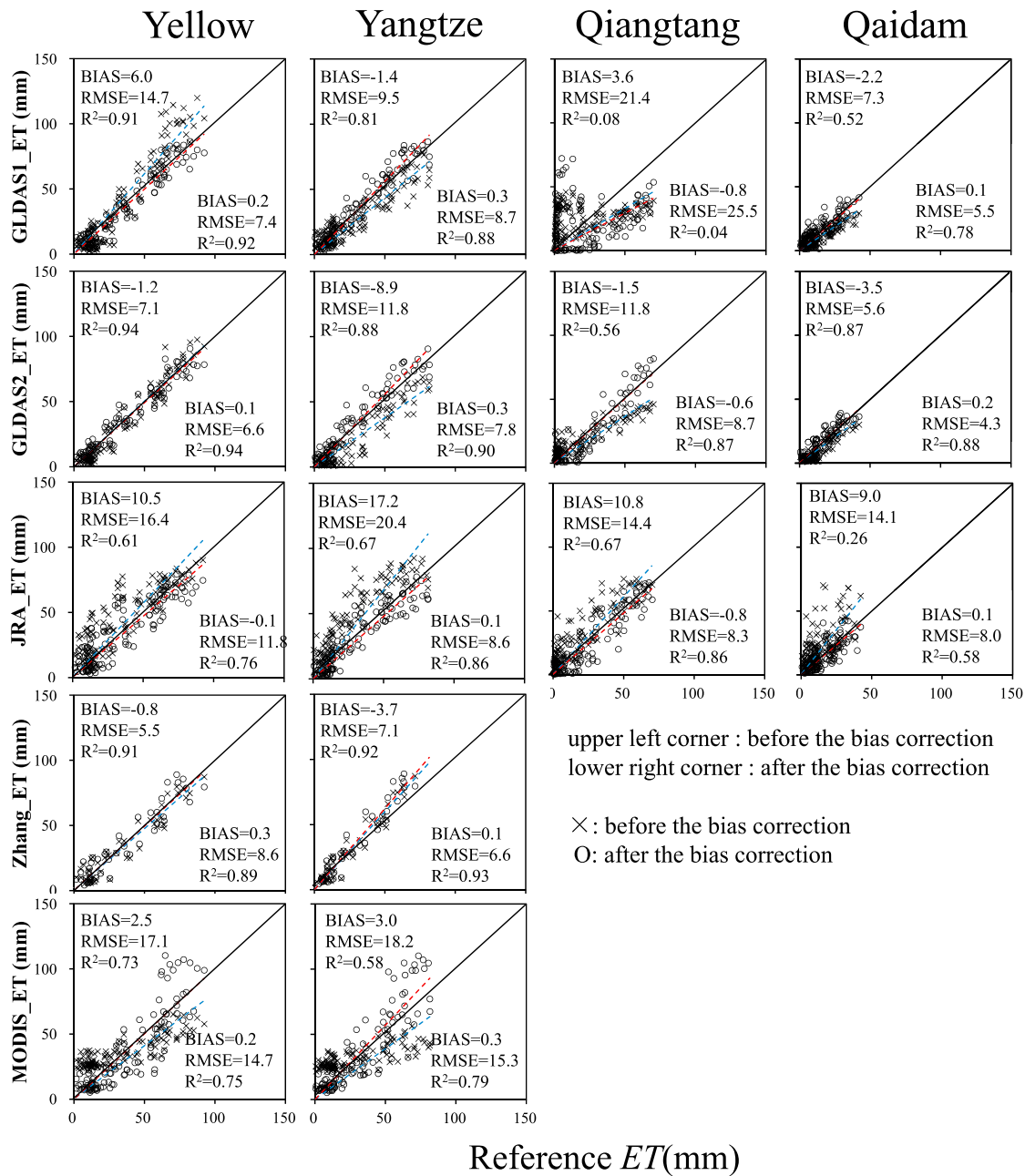


Figure 7. Comparison of the monthly ET products with the reference ET before and after the bias correction for the four basins on the TP.

applied to the data to minimize the error [Landerer and Swenson, 2012; Swenson and Wahr, 2006b]. However, each center follows different data processing methods, which might cause some differences in the solutions [Klees et al., 2007].

In order to explore the uncertainties of ΔS from RL05 products in estimating ET at the basin scale on the Tibetan Plateau, the terrestrial water storage anomaly (TWSA) and ΔS from the three processing centers (CSR, GFZ, and JPL) for the study regions are compared. Statistical values for the comparison are listed in Table 2. It was found that TWSA from the three centers showed an overall agreement, demonstrated by high temporal correlation coefficients and similar standard deviation of the monthly variation, providing some confidence to derive monthly ΔS for the water balance calculation. Figure 3 also shows the ranges of TWSA and ΔS , determined by GRACE data from the three centers and their means for

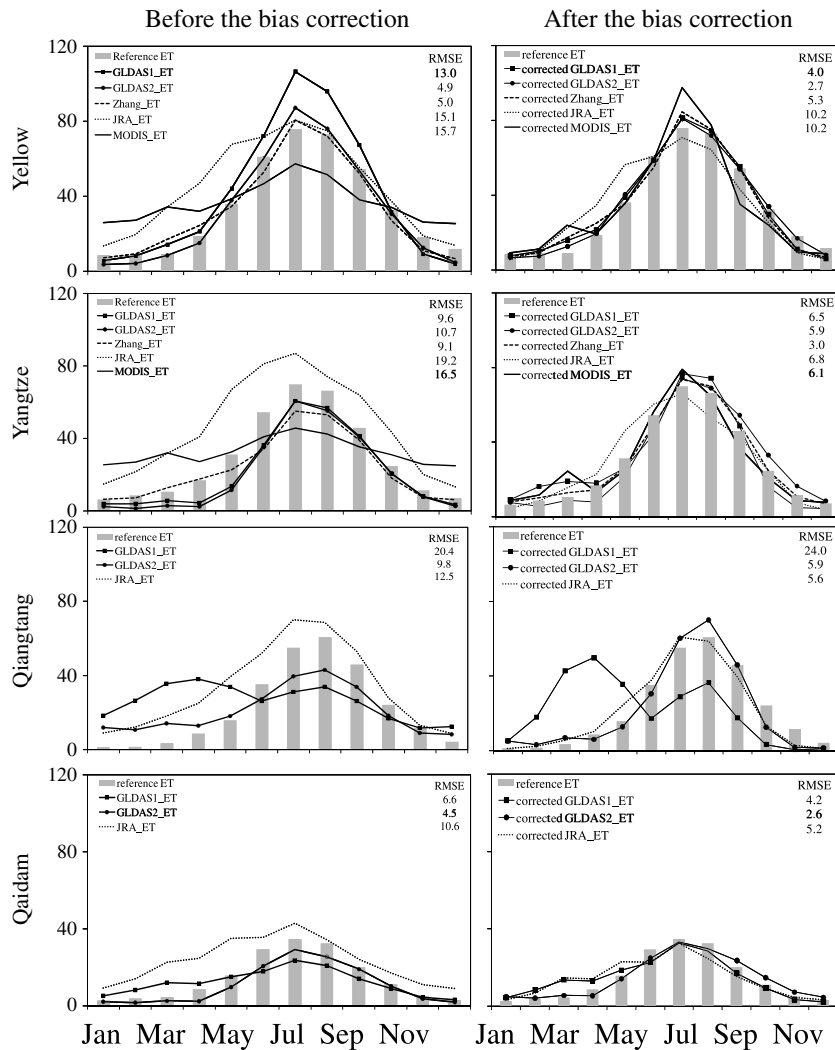


Figure 8. Seasonal cycle of the reference ET (mm month^{-1}) and the ET products (mm month^{-1}) before and after the bias correction in the four basins averaged for the period of 2003–2012. The RMSE values (mm month^{-1}) are shown in the upper right corner of the figures.

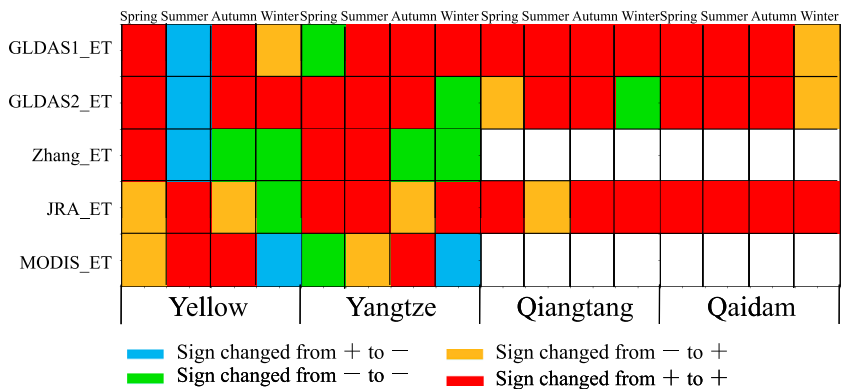


Figure 9. Changes in the sign of the correlation coefficient between the mean monthly reference ET from 2003 to 2012 and those from the five ET products before and after the bias correction for the four basins. The plus and minus signs indicate the positive and negative correlation coefficients, respectively.

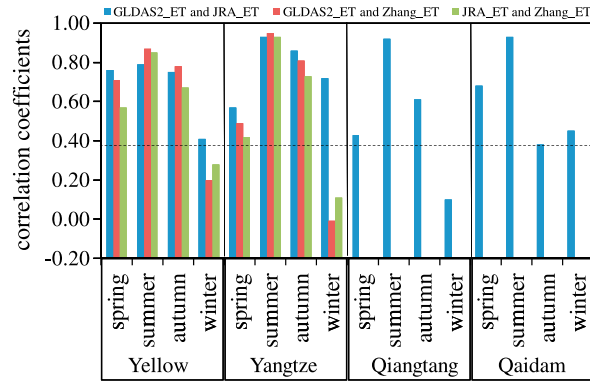


Figure 10. Correlation coefficients among seasonal mean-corrected ET products in the four basins during the period of 1983–2006. The dashed line represents the 95% significant level.

the four basins from January 2003 to December 2012. There are larger variations for TWSA and ΔS , especially for the upper Yellow River basin. Similar to the study by Tang et al. [2013], the GRACE products from the three processing centers are averaged to extract ΔS from January 2003 to December 2012 in our study to minimize the impact from individual errors of the three TWSA estimates.

2.3. Method

The traditional water balance method, shown in equation (1), is used to estimate ET (hereafter, reference ET) for the four basins [e.g., Hobbins et al., 2004; Rodell et al., 2004b; Xue et al., 2013].

$$ET = P - R - \Delta S \tag{1}$$

where P is the total precipitation (mm), R is the river discharge (mm), and ΔS is the change in terrestrial water storage (mm; including surface, subsurface, and groundwater changes).

Normally, P and R are obtained from in situ observation, and ΔS is assumed negligible over a long period (usually annual or longer time scale) [e.g., Hobbins et al., 2004; Xue et al., 2013]. But at the monthly scale, ΔS is not negligible and should be considered. For the inland basins (Qiangtang Plateau and Qaidam Basin), the discharge is zero, and the traditional water balance equation can be simplified to equation (2).

$$ET = P - \Delta S \tag{2}$$

Bias (BIAS), root-mean-square error (RMSE), and correlation coefficient (CORR) are used as evaluation criteria for the ET products against the reference ET, and they are defined as

$$BIAS = \sum_{i=1}^N (A_i - B_i) / N \tag{3}$$

$$RMSE = \sqrt{\sum_{i=1}^N (A_i - B_i)^2 / N} \tag{4}$$

$$CORR = \frac{\sum_{i=1}^N (A_i - \bar{A})(B_i - \bar{B})}{\sqrt{\sum_{i=1}^N (A_i - \bar{A})^2} \sqrt{\sum_{i=1}^N (B_i - \bar{B})^2}} \tag{5}$$

where N represents the number of months of the study period and A_i and B_i are from the monthly ET products and the reference ET, respectively.

As a result of the different horizontal resolutions among P , ΔS , and the five ET products, all data are consistently resampled to a $0.5^\circ \times 0.5^\circ$ grid for comparison in this study. To detect temporal trends for all time series data, a linear regression (least squares method) is used for the annual and seasonal basin-averaged values. The seasons considered are spring (March–May), summer (June–August), autumn (September–November), and winter (December–February).

3. Results

3.1. Evaluation of ET Products

In our study, we use the gridded P values provided by CMA, in situ observed R , and the estimated ΔS from GRACE to estimate ET by the water balance method. Figure 4 shows the monthly variations of the reference

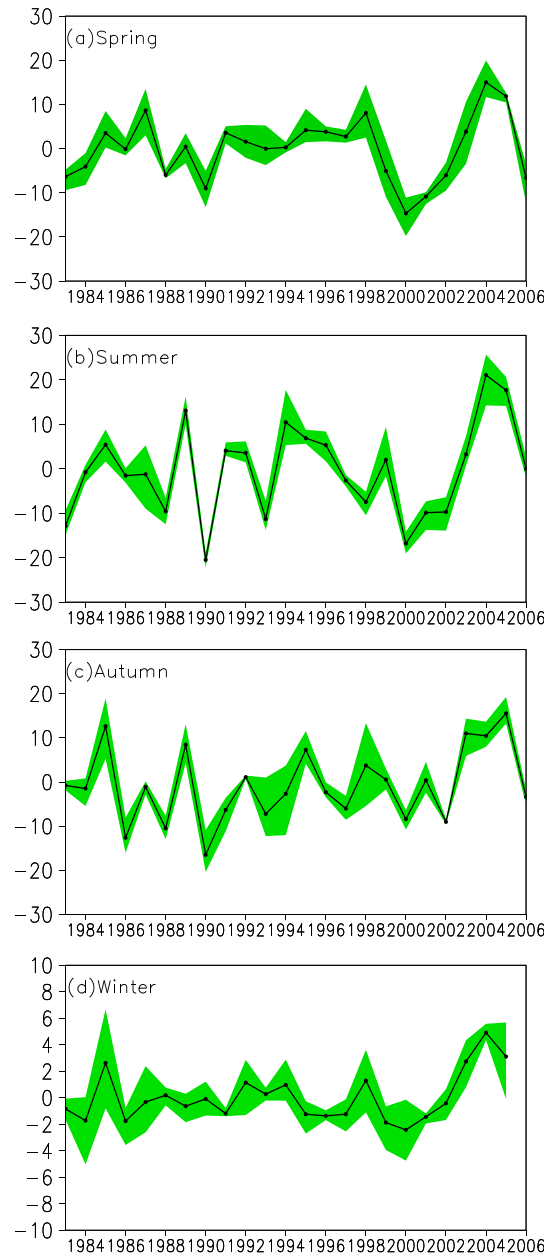


Figure 11. Annual variation of the mean seasonal ET anomaly (mm) (relative to the period of 1983–2006) from the corrected GLDAS2_ET, Zhang_ET, and JRA_ET for the upper Yellow River basin: (a) spring, (b) summer, (c) autumn, and (d) winter. The shades indicate the range determined by the three ET products. The linear trends of the mean ET, precipitation, runoff, and air temperature are given in Table 4.

ET for the two river basins (by equation (1)) and the two inland basins (by equation (2)). The reference ET shows a clear seasonal cycle with maxima in summer and minima in winter. The maxima for the upper Yellow River basin are generally larger than those for the upper Yangtze River basin. In the Qiangtang Plateau, the maxima are consistently larger than those for the Qaidam Basin. The variability of ET is dominant by the seasonal cycles of precipitation and runoff on the two river basins as well as precipitation on the two inland basins.

The monthly time series from the five ET products are also shown in Figure 4 and are compared with the reference ET for the four basins (Table 3). The five ET products exhibit substantial differences. For the upper Yellow River basin, all the ET products reproduce the seasonal cycles well, although the BIAS and RMSE are very different, with a range of -0.8 – 10.5 mm for BIAS and 5.5 – 17.1 mm for RMSE. Overall, GLDAS2_ET and Zhang_ET perform well with smaller BIAS/RMSE ($-1.2/7.1$ mm for GLDAS2_ET and $-0.8/5.5$ mm for Zhang_ET) and higher correlation coefficients (0.97 for GLDAS2_ET and 0.95 for Zhang_ET), while MODIS_ET is of relatively poor quality with the largest RMSE and the smallest correlation coefficient among the five ET products. GLDAS1_ET and JRA_ET's performance is moderate.

For the upper Yangtze River basin, Zhang_ET is the best at reproducing monthly variations, with relatively small BIAS and RMSE. Both GLDAS1_ET and GLDAS2_ET underestimate ET, but they reproduce the monthly variation fairly well with relatively high correlation coefficients (0.92 for GLDAS1_ET and 0.95 for GLDAS2_ET). Similar to the upper Yellow River basin, MODIS_ET and JRA_ET overestimate ET to a large extent. JRA_ET has a high correlation coefficient with the reference ET, demonstrating that the product reproduces monthly variations better than MODIS_ET. A previous study [Xue *et al.*, 2013] had discussed possible reasons for differences among several ET products for the upper Yellow and Yangtze River basins, which suggested that the underestimation of GLDAS2_ET

was mainly caused by its negative bias for precipitation, whereas the overestimation of JRA_ET was due to the overestimation of downward shortwave radiation. Due to high downward shortwave radiation flux inputs from the Global Modeling and Assimilation Office, MODIS_ET greatly overestimated ET in both basins.

The comparisons of Zhang_ET and MODIS_ET with the reference ET cannot be done for the Qiangtang Plateau and Qaidam Basin because of the lack of estimates for the two basins. On the Qiangtang Plateau, GLDAS2_ET and JRA_ET fairly realistically reproduce the monthly variations of ET with correlation

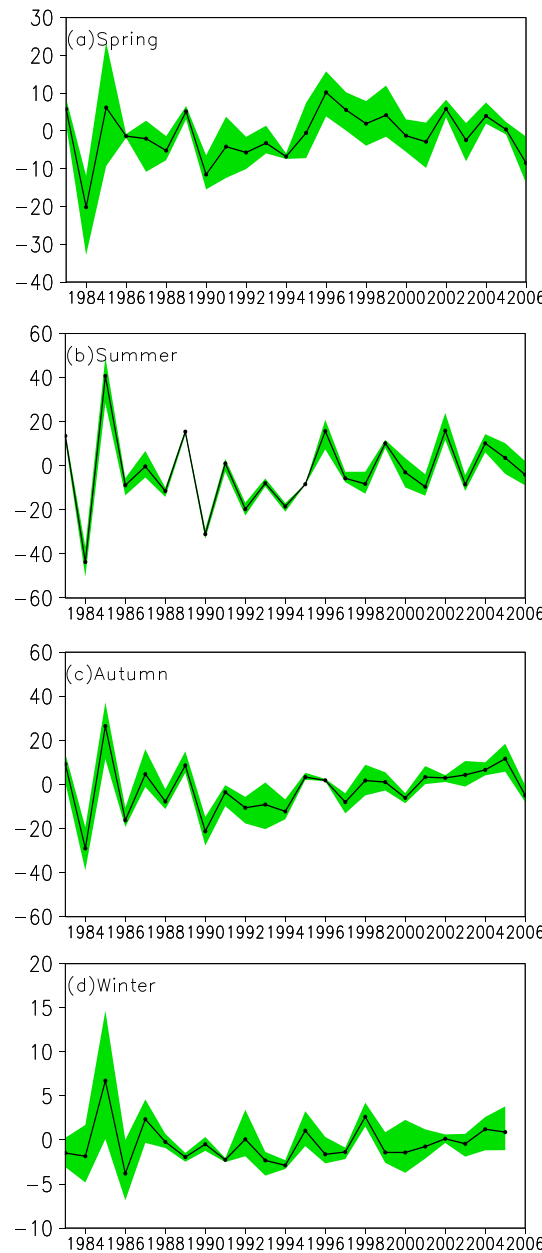


Figure 12. The same as Figure 11 but for the upper Yangtze River basin.

First, the gamma distribution (F_γ) is fitted to the monthly reference ET over the period of 2003–2012, which creates two parameters ($\alpha_{reference}, \beta_{reference}$). Then, the same gamma distribution is applied to the monthly ET values of each product during 2003 and 2012 to get the corresponding CDFs. With the mean distribution mapping of the reference ET ($\alpha_{reference}, \beta_{reference}$), the inverse function (F_γ^{-1}) is used to get the corrected values by means of the CDFs. This procedure can be expressed mathematically in terms of the gamma CDF (F_γ) and its inverse (F_γ^{-1}) as

$$ET_{corrected} = F_\gamma^{-1} \left(F_\gamma \left(ET_{product} | \alpha_{product}, \beta_{product} \right) | \alpha_{reference}, \beta_{reference} \right) \quad (7)$$

The second step of the bias correction method is to eliminate annual bias using the ratio of annual reference ET to annual values from the ET products obtained in the first step using equation (8).

coefficients higher than 0.91, but there are larger BIAS and RMSE values for JRA_ET. By comparison, GLDAS1_ET displays relatively poor performance in reproducing the monthly ET variability. For the Qaidam Basin, GLDAS1_ET and GLDAS2_ET show similar performance, and JRA_ET follows them.

3.2. Probability Distribution Fitting

From the above analyses, all the ET products have poor performance in reproducing the maxima in summer and to some extent also the minima in winter. The gamma distribution has been proven to be effective presentation of precipitation [e.g., Piani et al., 2010; Liao et al., 2004] and evapotranspiration [e.g., Bouraoui et al., 1999]. To examine the distribution of ET values from the five products, the gamma distribution [Thom, 1958], with shape parameter α and scale parameter β (by equation (6)), is assumed to be suitable for ET over the four basins with parameters determined on a monthly scale.

$$f_\gamma(x|\alpha, \beta) = x^{\alpha-1} \frac{1}{\beta^\alpha \Gamma(\alpha)} e^{-\frac{x}{\beta}}; x \geq 0; \alpha, \beta > 0 \quad (6)$$

In this study, the cumulative distribution functions (CDFs) are constructed for the reference ET and the five ET products over the four basins for all months within the period of 2003–2012 (Figure 5). Except for MODIS_ET, all ET products display similar CDF compared with that of the reference ET . The differences between the five ET products and the reference ET are mainly caused by the biases in the ET estimates.

3.3. Bias Correction of ET Products

To improve the accuracy of ET products at the monthly scale, a bias correction is performed to all the ET products. The bias correction includes two steps. The first step is to use the gamma distribution of the reference ET during 2003 and 2012 to correct the distribution of the ET products. A schematic diagram to demonstrate the correction procedure is shown in Figure 6.

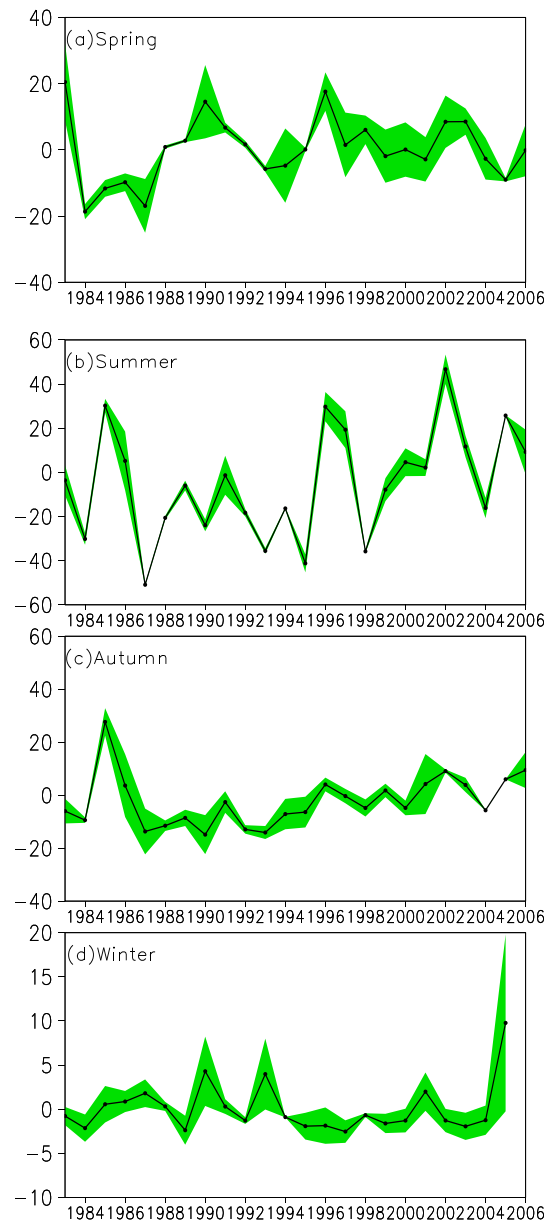


Figure 13. Annual variation of the mean seasonal ET anomaly (mm) (relative to the period of 1983–2006) from the corrected GLDAS2_ET and JRA_ET for the Qiangtang Plateau: (a) spring, (b) summer, (c) autumn, and (d) winter. The shades indicate the range determined by the two ET products. The linear trends of the mean ET, precipitation, and air temperature are given in Table 4.

found that the bias correction also helped in improving the ability of nearly all the ET products to capture the interannual variability of seasonal means. Thus, we will use the bias-corrected ET values to detect the long-term variability.

3.4. Water Balance Analysis

Among the five ET products, Zhang_ET, GLDAS2_ET, and JRA_ET use a continuous forcing data set as input for the periods of 1983–2006, 1948–2010, and 1979–2012, respectively. While MODIS_ET data are only available for a shorter period (2000–2012), GLDAS1_ET uses a constantly changing forcing data set as input, which is

$$ET_{final}(m) = \frac{(P_{annual} - R_{annual})}{ET_{corrected}(a)} \times ET_{corrected}(m) \quad (8)$$

where $ET_{corrected}(m)$ and $ET_{corrected}(a)$ represent the monthly and annual total ET from the ET products, respectively; P_{annual} and R_{annual} are the observed annual total P and R for the river basins; and the difference between P_{annual} and R_{annual} is the annual reference ET. For the Qiangtang Plateau and Qaidam Basin, R_{annual} is zero, and P_{annual} is equal to the annual reference ET. $ET_{final}(m)$ is the final corrected ET values for each ET product. The bias correction ensures that the corrected monthly ET products follow the gamma distribution of the reference ET and agree with interannual variation of the reference ET.

To evaluate the performance of the bias correction, comparisons between the reference ET and the five ET products before and after the bias correction for the four basins are carried out. The corresponding fittings and the statistical values are shown in Figure 7. After the bias correction, all the corrected ET products, except the GLDAS1_ET on the Qiangtang Plateau, show improved error statistics with reduced RMSE and higher correlation coefficients. Moreover, all the biases have been practically removed due to the correction, showing the effectiveness of the bias correction.

The comparisons of seasonal cycles among the ET products before and after the bias correction and the reference ET are shown in Figure 8. The root-mean-square error (RMSE) is used to evaluate the performance. It was obvious that the correction effectively removed the bias and reduced RMSE for all products except GLDAS1_ET for the Qiangtang Plateau. As a result, the seasonal cycles after the correction are much more realistic as compared with the reference.

In order to evaluate the ability of the ET products before and after the bias correction in capturing the interannual variability, Figure 9 shows the variation of correlation coefficient of seasonal mean reference ET with the five ET products over the four basins for the period of 2003–2012. It was

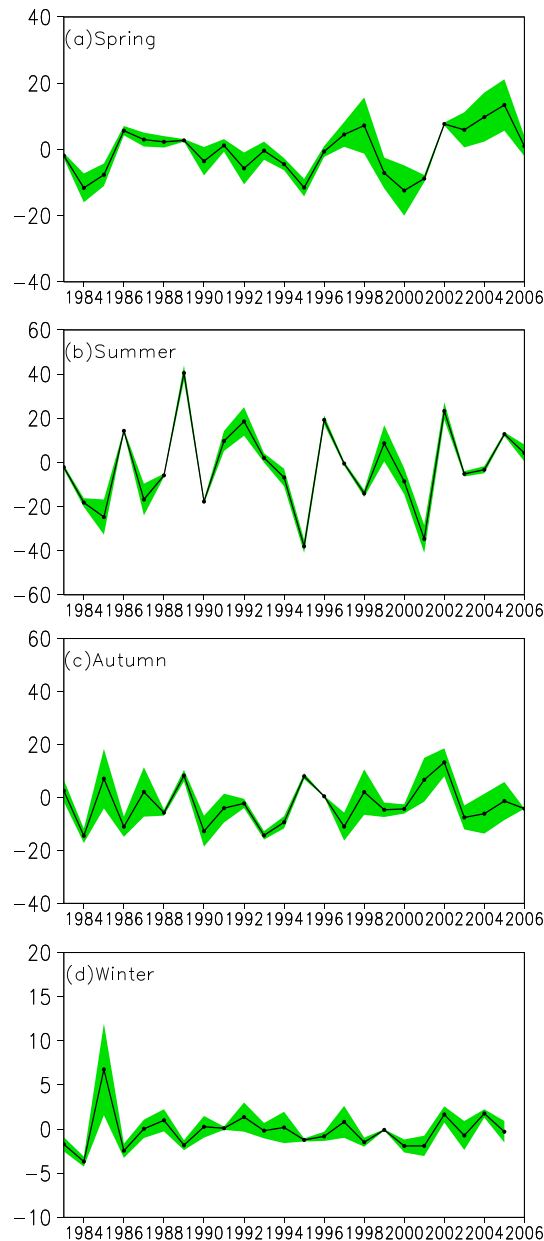


Figure 14. The same as Figure 13 but for the Qaidam Basin.

Changes in R for the basin are sensitive to P , with a correlation coefficient of 0.80 between annual P and R , which confirms the dominant role of P over this region [Zhou and Huang, 2012; Zhang et al., 2011]. For this region, R tended to decrease in summer and autumn as a result of evapotranspiration losses exceeding precipitation supply [Liu et al., 2012], while the decreasing of R in spring and winter is possibly dominated by the variation of ΔS . Additionally, the influence of human activities on the water budget over this region is negligible. However, the degenerating frozen soil, which caused more water infiltration, may be another reason for the decrease in R for this region [Zhou and Huang, 2006].

For the upper Yangtze River basin, the annual average ET and R make up 75% and 25% of the total P , respectively, which is different from the upper Yellow River basin due to different geographic settings. Except for R in spring-summer, seasonal mean P , R , and ET all have increased, but only the changes in P in

unsuited for detecting the long-term trend. Here three data sets (GLDAS2_ET, JRA_ET, and Zhang_ET) are selected to further detect seasonal trends of ET over the four basins for the common period (1983–2006). It should be noted that Zhang_ET does not have data for Qiangtang Plateau and Qaidam Basin, and only two data (GLDAS2_ET and JRA_ET) have full coverage.

To further demonstrate the consistency of the bias-corrected ET values, correlations among the three corrected ET products (Zhang_ET, GLDAS2_ET, and JRA_ET) in the same period of 1983–2006 are shown in Figure 10. The three corrected ET products indeed reproduce similar interannual variability, and the correlation coefficient between GLDAS2_ET and JRA_ET is the highest among all the correlation coefficients of the three products. The highest correlation coefficients are found in summer and autumn, followed by spring and then winter. This comparison implies that the corrected ET products provide more confidence for understanding the trends of ET and the impact of climate change on water balance, especially in warm seasons.

Water balance analyses for the four basins were carried out for the common period of 1983–2006 based on the observed P , R , and the mean ET data averaged over the corrected Zhang_ET, GLDAS2_ET, and JRA_ET data. Figures 11–14 show the range and mean of the three ET s, while Table 4 provides the estimated linear trends of the seasonal mean P , R , ET , and T_{air} .

For the upper Yellow River basin, the annual average ET and R make up 69% and 31% of the total available water (P), respectively. Although P in spring, autumn, and winter has an increasing trend, a strong decreasing trend in summer caused an annual decreasing P trend of -0.8 mm/decade. Four season mean R has a negative trend, which is more prominent in spring, summer,

Table 4. Linear Trends of Annual and Seasonal Mean Precipitation (P : mm decade⁻¹), Runoff (R : mm decade⁻¹), Bias-Corrected Evapotranspiration (ET : mm decade⁻¹) and Air Temperature (T_{air} : °C decade⁻¹) for the Four Basins Under the Period of 1983–2006^a

	Yellow				Yangtze				Qiangtang				Qaidam			
	Spring	Summer	Autumn	Winter	Spring	Summer	Autumn	Winter	Spring	Summer	Autumn	Winter	Spring	Summer	Autumn	Winter
P	1.7	-9.0	2.4	<u>4.2</u>	<u>8.0</u>	12.8	3.0	<u>2.3</u>	<u>11.1</u>	<u>15.0</u>	2.7	<u>3.3</u>	4.1	<u>13.9</u>	<u>6.0</u>	<u>2.0</u>
R	<u>-4.3</u>	<u>-17.4</u>	-6.5	<u>-1.4</u>	-0.5	-0.9	2.9	0.0	/	/	/	/	/	/	/	/
ET	<u>0.7</u>	<u>3.4</u>	3.4	<u>0.7</u>	0.2	2.4	3.4	0.0	2.3	11.9	3.9	0.5	3.1	2.4	1.1	0.2
T_{air}	<u>0.4</u>	<u>0.6</u>	<u>0.5</u>	<u>0.7</u>	0.4	<u>0.7</u>	<u>0.7</u>	<u>1.0</u>	<u>0.5</u>	<u>0.5</u>	<u>0.6</u>	<u>0.9</u>	<u>0.7</u>	<u>0.9</u>	<u>0.7</u>	<u>0.8</u>

^aUnderlined trends indicate that they are statistically significant at the 95% significant level.

spring and winter are significant at the 95% significant level. The annual mean P correlates well with the annual mean R and the annual mean ET , with correlation coefficients of 0.76 and 0.91, respectively, which means that the changes in P to a large extent determine the changes in R and ET . Moreover, some previous study found that glacier melting due to warming is another reason for the increasing R over this region during the 21st century [e.g., Bai and Rong, 2012].

Recent studies about increasing temperature trends at higher elevations on the Qinghai-Tibetan Plateau [Liu and Chen, 2000; Qin et al., 2009; Wang et al., 2011] also happen on the Qiangtang Plateau, with a value of 0.9°C decade⁻¹ in winter season. The maxima trends of P and ET appear in summer for the Qiangtang Plateau during the period of 1983–2006. For the Qaidam Basin, there are maxima trends of P in summer, while the maxima trends of ET appear in spring. Located in the semiarid and subhumid region, the Qaidam Basin has 60% of the annual precipitation in the summer. Therefore, the concentrated summer precipitation may have produced the infiltration access runoff, which leads to less contribution to ET . This means that the maxima trends of P in summer do not necessarily lead to maxima of ET in summer in this basin.

4. Summary and Conclusions

Evapotranspiration data from five global sources were evaluated for four large basins of the Tibetan Plateau against the ET estimated by the water balance method (reference ET) at monthly scale. During the comparison period (2003–2012), the five ET products display varying, sometimes substantial, differences compared with the reference ET , despite similar seasonal variations.

A bias correction method, based on the probability distribution mapping, was applied to the five ET products at monthly scales. Compared with the reference ET , the correction not only effectively removed the biases but also substantially reduced RMSEs and improved temporal variations, especially the seasonal cycle. Therefore, the corrected ET products are considered reasonable and of high quality, which adds confidence for the further trend analysis.

Surface water balance changes in the four basins for the period of 1983–2006 are then analyzed using the corrected ET from GLDAS2_ET, JRA_ET, and Zhang_ET as well as observed P and R . In the upper Yellow River basin, there is a general increasing trend for ET in all seasons, especially for summer and autumn, along with the warming trend in the basin. For the upper Yangtze River basin, P and ET also show increasing trends in all the seasons, while R decreased in spring and summer and increased in autumn and winter. Moreover, P and ET for the Qiangtang Plateau and Qaidam Basin increased in all seasons. It is interesting to note that while there are dominating positive trends for P , dominating negative trends for R , and all positive trends for T_{air} on the seasonal basis for all the four basins, ET shows a positive seasonal trend for all the seasons and basins.

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