Observed and modeled diurnal variations
around Lake Malawi

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Abstract

We investigate how the intensity and spatial distribution of precipitation varies around Lake Malawi on a diurnal time scale, which can be valuable information for water resource management in tropical southeastern African nations. Using a state-of-the-art satellite product and regional atmospheric model, the well-defined diurnal cycle is detected around Lake Malawi with harmonic and principle component analyses: the precipitation is intense during midnight to morning over Lake Malawi and the precipitation peaks in the daytime over the surrounding area. This diurnal cycle in the precipitation around the lake is associated with the lake-land breeze circulation. Comparisons between the benchmark simulation and an idealized simulation in which Lake Malawi is removed, reveals that the diurnal variations in the precipitation are substantially amplified by the presence of Lake Malawi. This is most evident over the lake and relatively surrounding coastal regions. Lake Malawi also enhances the lake-land breeze circulation; the nocturnal lakeward land breeze generates the surface convergence effectively and the precipitation intensifies over the lake. Conversely, the daytime landward lake breeze generates the intense divergence over the lake and the precipitation is strongly depressed over the lake. The lake surface helps to create the thermal contrast between the lake and land and consequently the local lake-land breeze system is maintained via sensible heat flux. The lake-land breeze and the background water vapour enriched by Lake Malawi drives dominantly a diurnal variation in the surface moisture flux divergence/convergence over the lake and surrounding area and consequently, contributes to the diurnal cycle of the precipitation.
1. Introduction

A key climatological characteristic over tropical southeastern Africa is the manifestation of dry and wet seasons induced by the meridional march of the Inter-tropical Convergence Zone (ITCZ). This seasonal movement in the ITCZ is associated with the southwesterly Indian summer and northeasterly winter monsoons (e.g., Camberlin 1997; Viste and Sorteberg, 2013; Jury 2016; Diallo et al., 2018; Koseki and Bhatt, 2018) as shown Figs. S1a-l. In summer (May to September), tropical southeast Africa is covered entirely with the moisture flux divergence (Fig. S1m) and consequently, a dry season falls on this region. The northeastward moisture flux provides some of the summer precipitation over northeastern Africa and South Asia (e.g., Segele et al., 2009a; Viste and Sorteberg, 2013; Gleixner et al., 2017; Bohlinger et al., 2017). Conversely, the southwestward Indian winter monsoon generates a large convergence of vertically-integrated moisture flux over the tropical southeast of Africa (November to March, as shown Fig. S1n) bringing a wet season to this region. This monsoon-brought precipitation is quite important for the regional economy and society of the southeastern African nations such as Tanzania, Mozambique, Madagascar, and Malawi where their economies depend highly on rain-fed agriculture.

In addition to such seasonal variation, the variability in hourly rainfall is also dominant over Southeastern Africa. It is controlled largely by a diurnal cycle due to the thermal heat contrast between water surface and land surface in the tropics (e.g., Estoque, 1967; Mak and Walsh, 1976; Kikuchi and Wang, 2008; Teo et al., 2011; Koseki et al., 2013; Jury, 2016). The diurnal cycle is observed ubiquitously around the tropical coastal areas since the coastal land and ocean creates the thermal contrast between daytime and nighttime, inducing the sea and land breeze circulation (e.g.,
Kitoh and Arakawa, 2005; Kikuchi and Wang, 2008; Teo et al., 2011; Diro et al., 2012; Koseki et al., 2013). Steep terrain and land-lake contrast also generate the similar diurnal variations in precipitation. These variations are associated with the diurnal cycle of mountain-valley and lake-land breeze systems (e.g., Keen and Lyons, 1978; Joseph et al., 2008; Stivari et al, 2003; Crosman and Horel, 2010; Koseki et al., 2018). Such information on diurnal variation in precipitation is highly important for efficient water resource management in nations with economies that depend strongly on rain.

Lake Malawi, located at 12.11°S and 34.22°E (Fig. S1), is the third largest great lake in the African Continent and ninth in the world having an area of 29,600 km², a maximum width of 75km, and a maximum length of 560km. Lake Malawi is an important water resource for surrounding tropical southeastern African nations such as Malawi, Mozambique and Tanzania (Kumambala and Ervine, 2010). In particular, a large part of agriculture and energy in Malawi originates from the water resource of Lake Malawi and Shire River flowing from the lake; all of the national hydropower stations are built on the Shire River (a total installation capacity of 280MW, Kumambala and Ervine, 2010) and the largest national sugar plantations are supplied with water from the Shire River. Societies along the Shire River and surrounding Lake Malawi are exposed to high risks of flooding during the rainy season (November to March, Fig. 1) when the lake level is high due to the rainfall over the lake (e.g., Neuland, 1984; Schäfer et al., 2015). Regarding other aspects, Lake Malawi is an important fishing resource in Malawi and there are quite unique ecosystem and biodiversity (e.g., Weyl et al., 2010). On the other hand, Lake Malawi itself plays an important role for the regional climate system. Diallo et al. (2018) performed climate simulations with a state-of-the-art regional climate model and...
suggested that Lake Malawi is a water source for regional precipitation (over the lake and surrounding area) via intense latent heat flux release from the lake surface.

Although Diallo et al. (2018) have investigated the role of Lake Malawi for monthly time scales, little is known about the diurnal cycle of rainfall around Lake Malawi and the lake’s influence on the diurnal cycle. Since Lake Malawi, a huge water body (29,600km²), is located in the tropics, the region can be affected by the diurnal cycle of incoming solar radiation (e.g., Crosman and Horel, 2010). This is the main driver of the diurnal variations in precipitation and local breeze systems. Although, it is expected that Lake Malawi can drive local circulation in response to the diurnal solar radiation, the lake’s role in the diurnal cycle of precipitation is less clear and poorly understood. This is partly due to the lack of tools to study this topic but recent developments in the resolution of numerical models now permit such investigations. This study, therefore, attempts to investigate the regional diurnal variation in the regional precipitation in the rainy season (November to March) and quantify the effects of Lake Malawi on the diurnal cycle with state-of-the-art observational products and numerical regional model. Using a relatively coarse resolution of satellite product, a climatological diurnal cycle is overviewed and a case study of November to March in 2014/15 is investigated using a higher resolution satellite product. The numerical simulation is also targeted on assessment for this case investigation.

The rest of this paper is structured as follow: Section 2 gives the details of observational data and numerical model used in this study and statistical methodologies to investigate the diurnal variations. Section 3 provides the results of the statistical analysis on the observation and numerical simulation including an assessment of the modeled diurnal cycle. Moreover, the results of an idealized
numerical experiment will be used to elucidate the physical mechanisms that underlie
Lake Malawi’s role in the diurnal cycle around the lake. Section 4 will discuss the
details of results simulation focusing on the quantification of the influence of Lake
Malawi and finally, we will summarize this study in Section 5.

2. Data, Model, and Methodology

2.1 Observational Data

Both the Tropical Rainfall Measuring Mission (Huffman et al., 2007) version
3B42 (TRMM 3B42) and the Global Precipitation Measurement (GPM, Skofronick-
Jackson et al., 2017) mission data (Level-3) are used in this study. TRMM 3B42 has
superior temporal coverage (1998-2014) which facilitates a climatological overview
of the diurnal cycle over Lake Malawi. However, the spatial resolution of TRMM
3B42 (0.25°) prohibits its use in the analysis of the spatial characteristics of the
diurnal cycle over the lake and its shore. GPM, the successor to TRMM 3B42, has a
superior spatial resolution of 0.1° and it is employed for the more detailed study of the
diurnal variations in precipitation. The original Level-3 data is every 30 minutes and
in this study, the data is averaged to hourly rainfall.

2.2 Weather Research and Forecasting (WRF) Model

The Advanced Research Weather Research and Forecasting (hereafter referred
to WRF, Skamarock et al., 2007) model version 3.9.1 is also used to investigate the
diurnal variations around Lake Malawi. The domains used in all simulations are
shown in Figure 1a. The outer domain covers southeastern Africa, -20.74902°S to -
2.958107°S and 23.3115°E to 44.0885°E with 15km grid spacings (171×117 grids)
and the inner domain is centred on Lake Malawi, -15.87943°S to -8.219772°S and
32.22042°E to 37.06839°E with 3 km grid spacing (155×250 grids), respectively (Fig. 126 2a). Both domains have 56 vertical layers. The outer domain is forced laterally with 6 hourly ERA-Interim (Dee et al., 2011) data which has a grid spacing of 0.75° and at the lower boundary by the daily Optimum Interpolated Sea Surface Temperature (OISST, Reynolds et al., 2007) which has a grid spacing of 0.25°. The inner domain is forced laterally by the outer domain of WRF (the outer domain of WRF does not interact with the inner domain).

The following physical schemes are used in our WRF simulations: the WRF Single-moment (WSM) 6-class scheme for microphysics (Hong and Lim, 2006) and the Yonsei University parameterization for the Planetary Boundary Layer (PBL; Hong et al., 2006). The longwave and shortwave radiative forcing are parameterized by the Rapid Radiative Transfer Model (Mlawer et al., 1997) schemes. Betts-Miller-Janjic (Janjic, 1994) scheme is used only for parameterizing cumulus convection processes in the outer domain; cumulus parameterization is switched off in the convection permitting inner domain. Investigations of the sensitivity of precipitation in this region to the convective scheme for Betts-Miller-Janjic and Kain-Fritsch (Kain, 2004) schemes showed that the Betts-Miller-Janjic scheme simulates the precipitation over land better than the Kain-Fritsch scheme (not shown). Therefore, the Betts-Miller-Janjic scheme is chosen in this study. Over the land and lake grids based on MODIS landuse data, the NOAH land surface model consisting of 4-layers (Chen and Dudhia, 2001a, b) and the 9-layer lake model (Xu et al., 2016) are implemented and air-land/lake interactions are active in the simulations.

With the model configurations above, a benchmark experiment is initialized in January 1st of 2014, 00 UTC of ERA-Interim for atmosphere and land surface and integrated until April 1st of 2015 (referred to WRF-CTL, hereafter). This run will be
utilized to gain insights into the diurnal variations around Lake Malawi compared to
the observations. In a second experiment, the grid boxes over Lake Malawi are
converted from water to land grid boxes (Figs. 1b and c). This facilitates an
exploration of the role of Lake Malawi on the local diurnal variations (called WRF-
NOLM in the rest of the paper). Due to this conversion, some land surface properties
are modified in WRF-NOLM: the landuse index of the converted grids is set to be
savanna which is the most dominant landuse category in the inner domain of WRF
experiments. The soil type of the converted grids is also replaced with sandy clay
loam which is the majority soil type for the savanna grids in the inner domain.
Additionally, the surface albedo over Lake Malawi grids set to a value of albedo
averaged over the savanna grids in the inner domain. Finally, the soil moisture and
temperature of the converted grids are initialized by averaged value of savanna grids.
These modifications are done only in the inner domain to avoid any modulations in
larger-scale meteorological and hydrological quantities associated with the absence of
Lake Malawi. All settings of outer domain of WRF-NOLM are exactly same as those
of WRF-CTL.

We analyze the hourly output of the 5 months of November in 2014 to March
in 2015, that is the first 10 months are spin-up, designated for the land surface model
based on Cosgrove et al. (2002) and Chen et al. (2007). In particular, in WRF-NOLM,
the soil moisture and temperature are initialized by averaged value, which is to a large
extent artificial. Therefore, a long spin-up for land surface model is necessary.

2.3 Methodologies to detect the nature of diurnal variation

For quantification of the diurnal cycle, harmonic analysis has been used quite
commonly in the previous studies (e.g., Yang and Slingo, 2001; Diro et al., 2012;
Mooney et al., 2017). The harmonic analysis is highly advantageous to estimate the explained variance (%) of a specific frequency and its phase from a time series. This study follows Mooney et al. (2017) and NDJFM-averaged hourly data is fitted with the function,

\[
a_{24} \cos\left(\frac{2\pi(t - \phi_{24})}{24}\right) + a_{12} \cos\left(\frac{2\pi(t - \phi_{12})}{12}\right) \tag{1},
\]

where \(a_{24} (a_{12})\) and \(\phi_{24} (\phi_{12})\) are the amplitude and phase of diurnal and semi-diurnal cycle, respectively.

The empirical orthogonal function (EOF) analysis is additionally utilized to capture the features of diurnal variation around Lake Malawi following the previous studies (e.g., Kikuchi and Wang, 2008; Teo et al., 2011). The EOF analysis is useful to capture the dominant spatio-temporal patterns. In particular, for the diurnal variation, it has been known that the first mode represents a stationary dipole pattern between coastal land and ocean and on the other hand, a propagation pattern from land to sea is detected by the second mode (the EOF patterns and principle component scores between the first and second modes are out of phase approximately by \(\pi/4\), e.g., Kikuchi and Wang, 2008; Teo et al., 2011). Employing these statistical methodologies, we will explore the details of the observed and modeled diurnal variations around Lake Malawi in Section 3.2 and 3.3. The EOF analysis is adopted into the diurnal deviation components like,

\[
A'(t) = A(t) - \bar{A} \tag{2},
\]

where \(A\) is a variable \(t\) is time (hourly). The overbar and prime denote the daily-mean and daily-deviated components, respectively.

3. Results
3.1 Climatology

Firstly, we take an overview of the climatological diurnal cycle of precipitation around Lake Malawi using TRMM 3B42 which has good temporal coverage but relatively coarse resolution (temporally and spatially). Figure 2 illustrates the 3-hourly precipitation obtained by TRMM-3B42 for NDJFM-mean climatology. Between 00-03 to 06-09 UTC (02-05 to 08-11 LST), the precipitation over Lake Malawi gets enhanced and the precipitation over the surrounding land area becomes weaker. At 09-12 UTC, the precipitation is suppressed over the entire area. Afterwards, from 12-15 LST, precipitation gets activated around Lake Malawi and land precipitation is intense widely at 15-18 UTC while there is negligible rainfall over Lake Malawi. From 18-21 to 21-00 UTC, the land precipitation is gradually reduced and oppositely the precipitation over Lake Malawi commences. That is, around Lake Malawi there is a well-organized diurnal variation in precipitation. Interestingly, the magnitude of land and lake precipitation is almost identical (0.9 mm/h).

3.2 Case study, 2014/15 NDJFM

In this subsection, the more detailed nature of the diurnal variation, which is indicated in the preceding subsection, are investigated with a finer satellite product and numerical simulation for a case study of November to March in 2014/15. Figures 3a-e show monthly-mean rainfall for GPM from November to March. In November, the precipitation is quite modest around Lake Malawi while there is some intense rainfall over the northern Lake Malawi. Rainfall becomes more intense in December particularly over the central Lake Malawi. In January, the precipitation peaks and it is very intense in the entire domain with rainfall over Lake Malawi reaching ~ 22 mm/h.
From February to March, the precipitation decreases while the lake precipitation is still strong, especially, in the central area (around 18 mm/h). WRF-CTL can capture such seasonal march of larger-scale precipitation in Figs. 3f-j. However, the land precipitation tends to be overestimated, in particular, from January to February. This overestimation might be due to the high topography (higher than 2300m) around Lake Malawi (see section 4). WRF-CTL appears to reproduce the intense lake precipitation from December to March.

3.3 Harmonic analysis

Figure 4 shows the key characteristics of the diurnal cycle of precipitation obtained by harmonics analysis (see Section 2.3) for NDJFM-mean hourly data of GPM and WRF-CTL. Over Lake Malawi, the daily variations are dominated by the diurnal cycle as shown in Fig. 4a (about 70-80% of explained variance) observed by GPM. Other dominant diurnal cycles are seen along the coast of Lake Malawi and to the northeast of Lake Malawi, around 10°S and 35-36°E with a similar explained variance. In WRF-CTL the dominant diurnal variation are captured well over Lake Malawi with 60-70 % of explained variance in Fig. 4e. Although the strength of diurnal signal over the coastal region tends to be underestimated to some extent, the terrestrial diurnal cycle is well represented in WRF-CTL in terms of the explained variance.

The observed largest amplitudes of the diurnal cycle ($a_{24}$ in Eq. 1) are observed over Lake Malawi (up to 0.5 mm/h) and its coastal region in Fig. 4b. Over land, the amplitude is relatively large to the northeast of the Lake (0.2-0.3 mm) where the diurnal cycle dominates the sub-daily variations (Fig. 4a). This distribution of amplitude is fairly well simulated by WRF-CTL in Fig. 4f. However, over Lake
Malawi, the amplitude is lower than observed while the amplitude over land to the Northeast is too large (0.5 mm). This is consistent with the overestimated monthly-mean precipitation in Fig. 3. The observed phase of the diurnal cycle ($\phi_{24}$ in Eq. 1) shows a clear contrast over the lake and land in Fig. 4c; the maximum peak of the precipitation is at 02-03 UTC over the lake and surrounding coastal area and at 13-14 UTC over the land north of the lake where terrestrial precipitation is relatively large (Figs. 4a and b). This result is consistent with the climatological overview in the previous subsection. The WRF-simulated timing of the simulated diurnal cycle in Fig. 4g agrees reasonably with that of the observation. Over the lake, the peak time is slightly late especially in the south (at 03-05 UTC) compared to the observation and the land precipitation is maximized at 13-14 UTC to the north of the lake. However, over the eastern coastal region, the timing of the rainfall fails to be simulated.

In Figs. 4d and h, the explained variance of semi-diurnal cycle is given for GPM and WRF-CTL. Neither products show a clear semi-diurnal cycle around Lake Malawi although there are some spots with relatively high variance of 40-50 %. The harmonic analysis suggests that the sub-daily variations in rainfall are mainly associated with the diurnal cycle over and around the lake while semi-diurnal cycle is almost negligible.

Figures 4i-l give the properties of diurnal cycle of the hourly rainfall calculated by the harmonic analysis (Eq.1) for WRF-NOLM. Comparing with WRF-CTL (Fig. 4e), the explained variance of diurnal cycle is almost identical around Lake Malawi, in particular, to the northeast of the lake. Over the lake, the variance of the diurnal cycle is reduced remarkably in the southern part of the lake, which drops down to 20-30% in Fig. 5i (50-60% in WRF-CTL, shown in Fig. 4e). To the north of the lake, the diurnal cycle persists despite the absence of the lake. However, the
amplitude of the diurnal cycle shrinks over the entire of the lake in Fig. 4j. Most notably, the reduction is largest in the central part and the northern part of the lake (down from 0.5 mm/h to 0.1-0.2 mm/h) even though the variance of the diurnal cycle is still comparable to the WRF-CTL case. Over land, the diurnal amplitude is unchanged without Lake Malawi, in particular, to the northeast of the lake. The phase of the diurnal cycle is also modified over the lake. Its peak is slightly earlier (around 02-03 UTC) than WRF-CTL (comparison between Fig. 4g and 4k). In the southern shore of the lake (where the diurnal cycle almost disappears), the phase is noisy with respect to WRF-CTL. The component of the semi-diurnal cycle is almost identical with that in WRF-CTL and the semi-diurnal cycle is not of importance in the sub-diurnal variations (Fig. 4l).

3.4 EOF analysis

The dominant spatio-temporal pattern of variation is provided through the EOF analysis in Fig. 5. The EOF first mode of GPM shows a clear contrast between the land and lake (Fig. 5a). The amplitude is larger over the lake than over the land suggesting that the lake rainfall is more intense than the land rainfall. The coastal land rainfall synchronizes with the lake rainfall in both eastern and western shores. This mode explains 53.69 % of the total variance and its principal component (PC) score (Fig. 5h) shows an obvious diurnal cycle. The peak of land rainfall is at 12-13 to 16-17 UTC and that of the lake rainfall is at 23-00 to 02-03. This seesaw pattern of daytime land rainfall and nighttime lake rainfall is quite similar to the pattern described by sea-land contrast in the tropics (e.g., Teo et al., 2011; Bhatt et al., 2016). On the other hand, the EOF second mode has 15.77% of the total variance and its spatial pattern and PC score do not indicate a propagation mode from land to lake (not
shown). The PC score seems a semi-diurnal cycle and the spatial pattern is quite spotty (seem not related to Lake Malawi). Its amplitude is much smaller than that of the first mode.

WRF-CTL represents well the sharp contrasting spatial pattern between the land and lake in Fig. 5b as an EOF first mode (the explained variance of 41.51%). However, as shown in Figs. 3 and 4, the amplitude of the land precipitation is overestimated and coastal terrestrial rainfall synchronizing with the lake rainfall does not spread widely compared to the observation although there is some coastal land precipitation occurring simultaneously with the lake precipitation. While the PC score of first mode is roughly consistent with that of observation (Figs. 5h and i), the phase is somewhat shifted: the peak of the nighttime rainfall is around 03-04 to 06-07 UTC (later than the observation) and that of daytime is around 12-13 to 13-14 UTC, which is slightly earlier than the observation. In particular, the earlier simulated peak in the daytime precipitation is a common issue in regional climate modeling (e.g., Nikulin et al. 2012; Pohl et al., 2014; Mooney et al., 2016, 2017; Koseki et al., 2018). Similar to the GPM observations, WRF-CTL does not show any clear propagation mode by the second mode and the large variation is limited in some small areas (its variance is 18.36 %) although the PC score of the second mode is lagged by approximately \( \pi/4 \) (not shown).

The modeled surface zonal wind shows an interesting distribution by the EOF first mode in Fig. 5c: the lake shore is encompassed by the narrow bands of the negative and positive daily anomalies of surface zonal wind (77.88% of the total variance) and those bands spread over Lake Malawi. Combining with its PC score (Fig. 5i), during 09-10 to 12-13 UTC, the outgoing flow from the Lake is maximized and during 21-22 to 02-03 UTC, the incoming flow into the Lake is dominant. This
diurnal-varying circulation appears to be a well-characterized lake-land breeze (e.g., Keen and Lyons, 1978; Crosman and Horel, 2010). The PC score of the surface zonal wind leads by about 3 hours that of the precipitation. In particular, the offshore land breeze may initiate the nocturnal and morning precipitation over the lake (the detailed discussion will be given in Section 4). The surface meridional wind also shows a remarkable pattern by the EOF first mode (61.46% of the total variance) in Fig. 5d: with a macroscopic view, there is a dipole mode of positive in the south and negative in the south of Lake Malawi. Combining it with the PC score (Fig. 5i), there is an outgoing/incoming flow of meridional surface wind during daytime and nighttime as the zonal wind. The EOF 1st mode of meridional wind varies approximately in consistent with the zonal wind as shown in Fig. 5i.

The EOF 1st mode also shows substantial changes in the diurnal cycle in WRF-NOLM as shown in Figs. 5e-g: the dipole pattern between the lake and surrounding terrestrial area almost disappears in the EOF 1st mode and the dominant variability is only over the land in Fig. 5e. The variance is still 35.60% and the amplitude over the land is almost identical with that of WRF-CTL in Fig. 5b. While the harmonic analysis estimates the diurnal cycle independently at each grid cell, the EOF analysis calculates the most explainable variability in all the selected grids and therefore, the amplitude at one grid would be affected by that at other grids. That is, in Fig. 5e, the variability at the lake grids are much smaller than those at land grids, which is consistent with the reduced amplitude of diurnal variation over the lake in Fig. 4j. The PC score still indicates that the EOF 1st mode is a diurnal cycle in Fig. 5j with some modification in its peak time. Whereas the EOF 1st mode of surface zonal wind still have the two narrow bands along the lake shore in WRF-NOLM (74.53% of the total variance), their spreads over the lake are largely diminished over both sides
of the lake shore with respect to that in WRF-CTL (Figs. 5c and 5f). The PC score is almost identical between WRF-CTL and WRF-NOLM in Figs. 5i and 5j. Similarly, the surface meridional wind also reduces its variability over the lake shown in Fig. 5g although there is still some clue for the dipole pattern between northern and southern part of Lake Malawi as shown in WRF-CTL (Fig. 5d). Its PC score slightly shifts earlier than that in WRF-CTL (Figs. 5i and 5j).

3.5 Nighttime and daytime precipitation

As witnessed by the harmonic and EOF analyses above (Figs. 4-5), Lake Malawi plays a crucial role in the generation and/or amplification of the diurnal cycle. At certain times in a day, its role can be clarified more (Fig. 6). During 00-03 UTC, the nocturnal precipitation concentrates over Lake Malawi in WRF-CTL (Fig. 6a) and the lake-anchored precipitation is extensively reduced in WRF-NOLM (Fig. 6b). Its influence is remarkable over the entire lake, in particular, over the northern and central parts of the lake (Fig. 6c). This indicates the importance of Lake Malawi for rainfall over the lake (as concluded by Diallo et al., 2018). Conversely, the surrounding area of the lake experiences a modest reduction in precipitation in the presence of the lake during midnight to early morning. During daytime when the precipitation peak is closely tied to the maximum in local solar heating (11-14 UTC), precipitation is more dominant over the surrounding area of the lake in WRF-CTL (Fig. 6d). While precipitation over the lake is quite small, there is some increment in the precipitation over the lake in WRF-NOLM, especially in the southern shore (Fig. 6e). Opposite to the nocturnal time, daytime precipitation is amplified over the southern part of the lake although its response is relatively weaker than that in the nighttime (Figs. 6c and f).
Figure 7 presents the surface horizontal wind and its divergence anomalies from daily-mean at nighttime and daytime, estimated by Eq. (2). In WRF-CTL, the incoming flow from the shore toward the lake is detected and the strong convergence forms over the lake shown in Fig. 7a. These lakeward flows are land breeze circulations and penetrate deeply into the lake as shown by the EOF analysis (Figs. 5c and d). The intense nocturnal rainfall (as in Fig. 6a) can be attributed to this strong convergence over the lake. In WRF-NOLM, the land breezes are extensively weakened and, as a result, the convergence over the lake shrinks considerably (Fig. 7b). The difference shows clearly that the intensification in the land breeze and convergence is due to Lake Malawi (Fig. 7c). While the daily-residual component of the surface wind can be seen not only around the lake but also everywhere in the region (Figs. 7a and b), the influence of the lake on the breezes seems to be limited around and over the lake (more detailed discussion will be given in the next section). During daytime, on the other hand, the outgoing flows, thus, lake breezes are organized well from the lake outward and this flow is highly divergent over the lake in WRF-CTL (Fig. 7d). Still, the outgoing circulation can be seen in WRF-NOLM (Fig. 7e), but its magnitude is largely diminished and the flow-forming divergence is also reduced. The difference during daytime is almost a mirror image of that during nighttime and it shows that Lake Malawi plays an important role in the diurnal variations of local wind circulations.

4. Discussion

The previous section has revealed that Lake Malawi plays a vital role to form the diurnal variations in land-lake breeze systems and correspondingly, the precipitation. However, the diurnal cycle of outgoing and incoming flows do not
completely disappear in WRF-NOLM, and there is still a signature of the diurnal cycle detected even in the absence of the lake. In this section, we explore the thermodynamical aspects associated with Lake Malawi, which can be a main driver of the land-lake breeze and possibility of other driver of the local breeze circulations.

4.1 Surface heat flux

Figure 8 shows the differences (WRF-CTL minus WRF-NOLM) in surface heat fluxes and surface temperature at nighttime and daytime over Lake Malawi. In agreement with Diallo et al. (2018), our simulations also show that the latent heat flux is enhanced due to Lake Malawi and it can be a source of precipitation (Figs. 8a and d). Interestingly, the latent heat flux difference is much larger during nighttime, when the atmospheric boundary layer can be more enriched with the water vapour and consequently, precipitation is generated effectively by the strong low-level convergence over the lake (Fig. 7c). Conversely, the sensible heat flux is more during the nighttime and substantially less during the daytime in the presence of the lake (Figs. 8b and e). This is due to a large difference in heat capacity between water surface and land surface (in WRF-NOLM, the soil category in Lake Malawi grids is converted to sandy clay loam). Correspondingly, the surface atmospheric temperature is higher during nighttime and lower during daytime in the presence of the lake than in the absence of the lake in Figs. 8c and f. The higher temperature over the lake during nighttime tends to create more convergent field with respect to the surrounding land surface and consequently, the land breeze circulation is more enhanced shown in Fig. 7c. On the other hand, during daytime, the lower surface temperature due to the lake can be more divergent and the lake breeze circulation gets more vigorous shown in Fig. 7f. The differences in the sensible heat flux and surface atmospheric
temperature are much larger during daytime than nighttime. This is because the diurnal variation in the land surface temperature is more amplified than that in the lake surface temperature; this is a result of the lower heat capacity land compared to water so the land surface warms and cools more than water with the same quantities of heat.

4.2 Topography impact

While Lake Malawi is an active driver of the diurnal variations in the local land-lake breeze circulations, the local breeze circulation residually remains without Lake Malawi as shown in Fig. 7. Tyson (1968a and b) and Koseki et al. (2018) showed that the complex terrains also induce a diurnal cycle in the mountain-valley breeze circulation whose mechanism is similar to that for sea-land and lake-land breezes. As shown in Fig. 9a, Lake Malawi is encompassed by the high-elevated topographies that are up to 2600m in the northeast. In contrary, the altitude is below 600 m over all of Lake Malawi. This difference in the elevation forms the large gradients in the surface as shown in Figs. 9b and c. In particular, the two narrow bands of steep zonal gradient run along the eastern and western shore sides. These gradients can drive the down-hill mountain (incoming toward the lake) and uphill valley (outgoing from the lake shore) breeze circulations during nighttime and daytime as shown in Fig. 5b, 7c and 7f. In addition to the lake shore, there are some steep gradients to the northeast (9°S and 34.5°E) and the southwest (14.5°S and 33.5-34.5°E). Around these high mountains, there are well-organized mountain and valley breeze circulation during nighttime and daytime as in Figs. 7a, b, d and e. The daytime precipitation is enhanced around these regions, that is, the valley breeze can activate the cumulus convection and precipitation due to the topography-lifting effect.
The overestimated precipitation in the WRF simulations might be caused by an over sensitive response in convection to this valley breeze circulation.

4.3 Moisture flux convergence

The preceding subsections have elucidated that Lake Malawi radically drives the diurnal cycle in surface winds and heat fluxes. This indicates that the moisture flux, \( \mathbf{U} q \), (here, \( \mathbf{U} \) is horizontal wind vector and \( q \) is specific humidity at surface) due to the lake-land breeze circulations varies in a diurnal cycle and its convergence is highly related to precipitation. Here, we quantify the surface moisture flux and its diurnal variation. Note that 10m and 2m data are used for horizontal wind and specific humidity in this study. The moisture flux can be subdivided into four components like,

\[
\mathbf{U}_q(t) = \left( \overline{\mathbf{U}} + \mathbf{U}'(t) \right) \cdot \left( \overline{q} + q'(t) \right) = \overline{\mathbf{U}} \overline{q} + \overline{\mathbf{U}} q'(t) + \mathbf{U}'(t) \overline{q} + \mathbf{U}'(t) q'(t)
\]

, where the overbar and prime denote daily-mean and daily-deviation as Eq. 2. \( \mathbf{U} \) is surface wind vector and \( q \) is surface specific humidity. The horizontal divergence of moisture flux is calculated as

\[
\nabla \cdot \mathbf{U}_q(t) = \frac{\nabla \cdot \overline{\mathbf{U}} \overline{q}}{A} + \frac{\nabla \cdot \overline{\mathbf{U}} q'(t)}{B} + \frac{\nabla \cdot \mathbf{U}'(t) \overline{q}}{C} + \frac{\nabla \cdot \mathbf{U}'(t) q'(t)}{D} \quad (3)
\]

The term \( A \) is the moisture flux divergence/convergence due to daily-mean wind and humidity, which does not have diurnal variation, but its relevance is more to the moisture flux associated with the Indian winter monsoon over this region. The term \( B \) reflects the influence associated with the diurnal variation in the heat flux and the background wind. On the other hand, the term \( C \) indicates the contribution due to the lake-land breeze and the daily-mean humidity to the moisture flux.
divergence/convergence. The final term is attributed to the diurnal variations in local breeze and humidity. Since the term $A$ does not contain any temporal change, the three terms of $B$, $C$, and $D$ are averaged over Lake Malawi and surrounding area as shown in Fig. 10a.

During nighttime, the moisture flux is converged over Lake Malawi and diverged over the surrounding area mainly by the lake-land breeze circulation and background humidity in WRF-CTL (Figs. 10b and c). The intense moisture flux convergence is responsible for the nocturnal precipitation as shown in Fig. 8c. Conversely, other terms in Eq.3 are not a vital generator of the moisture flux divergence/convergence. In WRF-NOLM, the diurnal varying breeze and background humidity still contributes to the moisture flux convergence/divergence, but its magnitude is much smaller than that in WRF-CTL in Figs. 10b and c. Consequently, the precipitation over the lake area is reduced without Lake Malawi. As shown in Fig. 6c, the precipitation surrounding the lake is somewhat enhanced in WRF-NOLM during nighttime (although the response of the rainfall is noisy and weak relatively, the consistency with the response of the moisture flux is reasonable). During daytime, the lake-land breeze and background humidity are still the main driver of the moisture flux divergence/convergence over the lake and surrounding area in Figs. 10d and e. Without the lake, the divergence over the lake and convergence over the lake shore are weakened. This is consistent with the enhanced and weakened precipitation over the lake and surrounding area in Fig. 6f in WRF-NOLM. The term $C$ is mainly contributed by the zonal component, $\partial (u q) / \partial x$, which is about 70 to 80 % of the total divergence/convergence (not shown).

In both cases of nighttime and daytime, the other terms of $B$ and $D$ in Eq.3 do not contribute to the diurnal changes in moisture flux divergence/convergence. That
is, the land-lake breeze and the enriched background water vapor due to Lake Malawi mainly drive the diurnal variations in surface moisture flux and consequently, the precipitation around Lake Malawi.

5. Concluding Remarks

In this study, we have investigated the diurnal variation in summer (November to March) around Lake Malawi using the state-of-the-art satellite products and regional climate model. In a climatological view, TRMM-3B42 shows a clear diurnal cycle of precipitation around Lake Malawi: the precipitation over the lake is more enhanced during midnight to early morning while the surrounding land area experiences a daytime peak with identical amplitudes between the two phases.

The spatially and temporally finer resolution satellite data of GPM and a convection permitting WRF simulation gives more microscopic views of the diurnal varying precipitation in the area. A harmonic analysis reveals that the diurnal cycle in precipitation is largely dominant over Lake Malawi and to the northeast of the lake and their peak times are almost completely out of phase as suggested by TRMM-3B42. The WRF simulation can capture the diurnal variation in precipitation and reproduce realistic amplitudes of the lake rainfall whilst the land rainfall is overestimated. Analysis of the semi-diurnal cycle shows that semi-diurnal component is a negligibly small contributor to the diurnal variations. The dominant diurnal variation can also be detected by the EOF analysis as a first principal component (the variance is almost half of the total variance). However, the second modes are not propagation pattern like Kikuchi and Wang (2008) and Teo et al. (2011). The surface winds also have the dominant first mode of EOF as diurnal cycle. In particular, the lake-land breeze system is well generated along the lake shore.
Without Lake Malawi, those diurnal variations in precipitation and lake-land breeze are diminished substantially around Lake Malawi: a large part of the diurnal variation in precipitation disappears over the lake region. The lake-land breeze loses its magnitude over the lake. During nighttime, the land breeze does not penetrate deeply into the lake surface and convergence is not formed effectively. On the other hand, during daytime, the outgoing lake breeze also shrinks and the divergence over the lake is weakened intensively. As a result, the daytime rainfall over the surrounding area becomes relatively moderate in the absence of the lake. Basically, Lake Malawi creates a thermal contrast between the lake and land surface and this contrast can drive the lake-land breeze circulation (e.g., Steyn 2003; Kruit et al., 2004; Crosman and Horel, 2010). As Diallo et al. (2018) suggested, Lake Malawi is a source of water vapour and the precipitation is more enhanced. The combination of lake-land breeze and enriched background water vapour is a main contributor to the diurnal variation in the surface moisture flux and consequently that in the precipitation.

Besides Lake Malawi, the steep gradient associated with high topographies encompassing Lake Malawi also induces a diurnal cycle in the local circulation of the mountain-valley breezes. Due to this breeze system, the diurnal cycle of the terrestrial rainfall survives with identical amplitude in the presence and absence of Lake Malawi. That is, the diurnal variation around Lake Malawi forms a combination of the two independent systems of lake-land and mountain-valley breezes.

Based on the analysis of satellite observations and numerical simulations, we conclude that Lake Malawi plays a central role in the remarkable diurnal variations in precipitation and local circulation in summer. Such information could be useful for other fields such as agriculture and hydropower energy to have more efficient water
resources management. For example, Kumambala and Ervine (2010) reviewed the water resources related to Lake Malawi and Shire River and its sensitivity of future climate change using water balance models (e.g., Kebede et al., 2006). The diurnal variations in precipitation can influence the variables of water balance model like rainfall, lake level and outflow from the lake directly. Therefore, our new findings in this study are informative to the community of water balance models for more accurate estimation of water resources of Lake Malawi.

This study is mainly a case study in only a certain year. Therefore, further analyses on the climate variability in large-scale monsoon circulation, its impacts on and interaction with the diurnal cycle in precipitation, and the terrestrial hydrological processes related to such meteorological variabilities will be desirably demonstrated to mitigate extreme natural disasters of flooding and drought in this region.

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Figures
Figure 1.
(a) Domains for WRF simulations. (b) and (c) landuse index for the inner domain of WRF-CTL and WRF-NOLM, respectively.
Figure 2. Climatological 3-hourly precipitation of TRMM-3B42 in NDJFM (1998-2012). The white color is precipitation less than 0.15mm/h.
Figure 3.
Monthly-mean precipitation of (top) GPM and (bottom) WRF-CTL from November to March in 2014/15. The white color is precipitation less than 0.5 mm/day.
Figure 4. Characteristics of daily-scale temporal variation in precipitation estimated by harmonic analysis for (1st row) explained variance of diurnal cycle, (2nd row) amplitude of diurnal cycle, (3rd row) phase of diurnal cycle, and (4th row) explained variance of semi-diurnal cycle for (left) GPM, (middle) WRF-CTL, and (right) WRF-NOLM, respectively.
Figure 5. (a) and (b) the first modes of EOF analysis for precipitation of GPM and WRF-CTL for NDJFM-mean, respectively. (c) and (d) the first modes of EOF analysis for zonal and meridional surface winds of WRF-CTL for NDJFM-mean. (e)-(g) the first modes for WRF-NOLM. (h) the time series of PC1 score for (a). (i) and (j) the times series of PC1 scores for WRF-CTL and WRF-NOLM.
Figure 6.
Nighttime mean of precipitation of WRF-CTL and WRF-NOLM in (a) and (b), respectively and its difference (WRF-CTL minus WRF-NOLM) in (c). (d)-(f) same as (a)-(c), but for daytime mean.
Figure 7.
Same as Fig.6, but for surface horizontal winds (arrows) and its divergence (color). Note that the surface winds and its divergence are anomalies from daily-mean values.
Figure 8.
Same as Fig.6, but for (left) latent heat flux, (middle) sensible heat flux and (right) surface atmospheric temperature.
Figure 9.
(a) Topographic altitude in WRF inner domain and its zonal and meridional gradients in
(b) and (c).
Figure 10.
(a) Grids of the lake (black) and surrounding area (gray) for area-averaging. The area-averaged three components of moisture flux divergence for (b) over the lake, nighttime (00-01 to 02-03 UTC), (c) surrounding the lake, nighttime, (d) over the lake, daytime (11-12 to 13-14 UTC), and (e) surrounding the lake, daytime for WRF-CTL (black) and WRF-NOLM (gray), respectively.