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Potential impacts of climate and environmental change
 on the stored water of Lake Victoria Basin and
 economic implications

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11 Abstract

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The changing climatic patterns and increasing human population within 12 the Lake Victoria Basin (LVB), together with overexploitation of water for 13 economic activities call for assessment of water management for the entire 14 basin. This study focused on the analysis of a combination of available 15 in-situ climate data, Gravity And Climate Experiment (GRACE), Tropical 16 Rainfall Measuring Mission (TRMM) observations, and high resolution Re-17 gional Climate simulations during recent decade(s) to assess the water storage 18 changes within LVB that may be linked to recent climatic variability/changes 19 and anomalies. We employed trend analysis, principal component analysis 20 (PCA), and temporal/spatial correlations to explore the associations and 21 co-variability among LVB stored water, rainfall variability, and large scale 22 forcings associated with El-Niño/Southern Oscillation (ENSO) and Indian 23 Ocean Dipole (IOD). Potential economic impacts of human and climate-24 induced changes in LVB stored water are also explored. 25

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Overall observed in-situ rainfall from lake-shore stations showed a modest 26 increasing trend during the recent decades. The dominant patterns of rainfall 27 data from the TRMM satellite estimates suggest that the spatial and tem-28 poral distribution of precipitation have not changed much during the period 29 of 1998-2012 over the basin consistent with in-situ observations. However, 30 GRACE-derived water storage changes over LVB indicate an average de-31 cline of 38.2 mm/yr for 2003-2006, likely due to the extension of the Owen 32 Fall/Nalubale dam, and an increase of 4.5 mm/yr over 2007-2013, likely due 33 to two massive rainfalls in 2006-2007 and 2010-2011. The temporal correla-34 tions between rainfall and ENSO/IOD indices during the study period, based 35 on TRMM and model simulations, suggest significant influence of large scale 36 forcing on LVB rainfall, and thus stored water. The contributions of ENSO 37 and IOD on the amplitude of TRMM-rainfall and GRACE-derived water 38 storage changes, for the period of 2003-2013, are estimated to be ~ 2.5 cm 39 and ~ 1.5 cm, respectively. 40

⁴¹ Key words: Lake Victoria Basin, surface and groundwater, climate change,
⁴² ENSO, GRACE, environmental change, economic impacts

43 1. Introduction

Freshwater, the most fundamental natural resource for human beings, is required in abundance for drinking, agriculture and all forms of socioeconomic development. Its stored potential (surface, groundwater, soil moisture, ice, etc) is increasingly facing challenges from climate change as well as anthropogenic activities. That current and future climate change is expected to significantly impact the fresh water systems including rivers, streams and

lakes, in terms of flow and direction, timing, volume, temperature and its 50 inhabitants has been documented in numerous publications (e.g., Bates et 51 al., 2008; Palmer et al., 2008). Changes in the freshwater system, both in 52 terms of quality and quantity, resulting from both natural climate variability 53 (e.g., rainfall patterns) and change, and other anthropogenic influences such 54 as excessive water withdrawals and construction of dams for hydropower gen-55 eration in the upstream will have significant consequences on the ecosystem 56 and the people depending on them (e.g., Palmer et al., 2008). The con-57 ditions are expected to get worse for hugely populated basins such as Lake 58 Victoria Basin (LVB) (see, e.g., Hecky et al., 2010). 59

Lake Victoria, the second largest freshwater body on Earth, is a source 60 of freshwater and livelihood for more than 30 million people living around it 61 (Awange and Ong'ang'a, 2006) and indirectly supports another 340 million 62 people along the Nile Basin (Sutcliffe and Parks, 1999) being the source of 63 the White Nile. Lake Victoria Basin (LVB, Figure 1) constitutes an area 64 of 193,000 km^2 and extends over Burundi (7.2%), Kenya (21.5%), Rwanda 65 (11.4%), Tanzania (44%) and Uganda (15.9%) (Awange and Ong'ang'a, 66 2006). The basin acts as a constant source of water to the lake through 67 its massive catchment area and its ability to influence the regions' seasonal 68 rainfall. In the last decade, however, the stored waters within LVB have come 69 under immense pressure from climate change and anthropogenic factors that 70 resulted in significant fluctuations. However, the lake level remained above 71 average since the early 1960's (Nicholson, 1998, 1999) till the early 2000's. 72 Discharge estimates from the lake for the period 1950-2005 show that the 73 net balance between recharge and discharge remained relatively stable over 74

the estimation period (PPA, 2007). A decreasing trend in the lake's level in
the past decade as shown, e.g., by Kull (2006); Riebeek (2006); Swenson
and Wahr (2009); Awange et al. (2008a), however, is attributed equally
to over-abstraction and natural climate change such as evaporation (PPA
, 2007; Sutcliffe and Petersen , 2007; Awange et al. , 2008b; Swenson and
Wahr , 2009).

Lake Victoria Basin is characterized by modified equatorial type of cli-81 mate with substantial rainfall occurring throughout the year, particularly 82 over the lake surface, to semiarid type characterized by intermittent droughts 83 over some near-shore regions (e.g., Anyah et al., 2006). The seasonal rainfall 84 over the basin is further characterized by a bimodal cycle, just like most areas 85 of East Africa, and is controlled mainly by the north-south migration of Inter 86 Tropical Convergence Zone (ITCZ), a quasi-permanent trough that occurs 87 over Lake Victoria (e.g., Asnani, 1993) due to locally induced convection, 88 orographic influence and land-lake thermal contrast, which modulates rain-89 fall pattern over the lake and hinterlands. The large-scale precipitation over 90 the lake is mainly initiated from the easterly/southeasterly (Indian Ocean) 91 monsoon flow that transports maritime moisture into the interior of East 92 Africa. The humid Congo air mass has also been linked to significant rain-93 fall amounts received over the western and northwestern parts of the lake 94 (Asnani, 1993). Large-scale winds over the Lake Basin are mainly easterly 95 trades most of the year. Superimposed on this basic flow regime are the 96 south-easterly (SE) or north-easterly (NE) monsoons that are mostly driven 97 towards, and often converge over, the ITCZ location. The strength of the 98 monsoons also depends on the sub-tropical anticyclones over the Arabian Sea (Arabian high pressure cell) and southwestern Indian Ocean (Macarene high
 pressure cell).

In terms of inter-annual variability, Lake Victoria Basin climate is char-102 acterized by periodic episodes of anomalously wet/dry conditions with some 103 of the memorable events including the 1961/62 and 1997/98 floods that left 104 behind a huge trail of damage to property and infrastructure. The 1961/62105 floods were associated with a strong zonal SST gradient over the equato-106 rial Indian Ocean and mid-troposphere westerly flow from Tropical Atlantic 107 (Anyamba, 1984; Anyah and Semazzi, 2006, 2007). It is noteworthy that 108 1997/98 floods coincided with one of the warmest ENSO episodes (strongest 109 El Niño) of the last century as well as very strong IOD mode. Hence, the 110 inter-annual variability of the Lake Basin is also closely linked to the SST 111 anomalies over the global ocean basins. 112

On the one hand, climate Change influences rainfall and temperature 113 patterns thereby affecting LVB's stored water. This is attributed to the 114 fact that more than 80% of LVB's water source is derived directly from 115 the seasonal precipitation (e.g., Awange and Ong'ang'a, 2006) and almost 116 an equivalent amount of the precipitation is lost to evaporation (Yin and 117 Nicholson, 1998; Sewagudde, 2009). The temperature in the LVB region is 118 projected to increase by $3 - 4^{\circ}$ C by the end of this century without much 119 change in the rainfall regime, leading to a significant downward trend in the 120 Lake's net Basin supply as a result of enhanced evaporation (Sewagudde, 121 2009) as well as increased water temperatures. Impacts of climate change on 122 LVB have been reported, e.g., in (PPA, 2007; Sutcliffe and Petersen, 2007; 123 Swenson and Wahr, 2009; Lejju, 2012). 124

On the other hand, on anthropogenic influence on LVB, Yin and Nichol-125 son (1998) characterized most of the LVB's catchment areas as semi-arid 126 zones, with exception of areas close to the lake, and hence the catchments 127 ability to discharge water into Lake Victoria is expected to decrease as a 128 result of increased abstraction demand for agricultural and industrial activ-129 ities. This, in addition to declining lake water quantity and quality due to 130 increasing population will thus have serious impacts on the regional water 131 requirement, domestic food supplies, and global food trade (e.g., Geheb and 132 Crean, 2003; Awange et al., 2007; Johnson, 2009). 133

Combined, the impacts of both climate change and other anthropogenic 134 factors on LVB's total water storage (TWS) is having a toll on the economic 135 as well as the environment of the region. For instance, there are already 136 signs of declining fish trades (Geheb and Crean, 2003) and access to fresh 137 water in the LVB leading to environmental scarcity (e.g., Mwiturubani, 138 2010; Canter and Ndegwa, 2002). Change of fish community and loss of 139 phytoplankton (e.g., Geheb and Crean, 2003; Hecky et al., 2010) are some 140 impacts of climate change and anthropogenic influences on the lakes water 141 quality, questioning the quality and health of the food. Lake Victoria's out-142 flow is determined by the "agreed curve" drawn between Egypt and Uganda, 143 which also determines the level of hydropower generation. The current and 144 more alarming anthropogenic stress is the increasing demand for power as 145 a result of increasing population in the basin area (Mutenyo, 2009; PPA, 146 2007). The impact of hydropower plants along the Nile river are found to 147 be largest during the drought seasons (or years) and is therefore, expected 148 to put more pressure on the lake with increasing hydropower plants (e.g., 149

Mutenyo, 2009; Hecky et al., 2010). Recent studies on climate variabil-150 ity and change over the LVB and fluctuations of Lake Victoria levels show 151 some worrying scene of drought patterns and receding lake levels, which are 152 both attributed to natural climate change and increasing human influence 153 (e.g., Yin and Nicholson, 1998; Awange et al., 2008a,b, 2013; Swenson 154 and Wahr, 2009; Sewagudde, 2009). Thus, it is very important to monitor 155 the basin's hydrological cycle using the up-to-date technology and methods 156 to inform the policy-makers and politicians, who plays the most important 157 role in managing the regional water resource. All these poses a significant 158 environment and economic challenge to the East African region as a whole, 159 leading to various levels of domestic and interstate conflicts, see e.g., (Canter 160 and Ndegwa, 2002). 161

This contribution examines the changes of total water storage (surface, 162 groundwater and soil moisture) caused by climate variability and extremes 163 over the recent decade (2003-2013) over LVB and the potential economic 164 impacts. To achieve this, we employ freely available global high resolution 165 satellite data sets of Tropical Rainfall Measuring Mission (TRMM) rainfall 166 estimates and Gravity Recovery and Climate Experiment (GRACE) time-167 variable gravity fields (Tapley et al., 2004a,b; Rummel et al., 2002) coupled 168 with outputs from various regional climate models (RCMs) in addition to 169 analysis of observed in-situ rainfall data over specific stations within the 170 lake's perimeter to study trends of climate over the basin. 171

The rest of the study is organised as follows. Section 2 presents a brief overview of the various data sets used and discusses the methods employed to investigate the impacts of climate variability and extremes on stored water potential of LVB. The results are presented and discussed in Section 3 while
Section 4 concludes the report.

FIGURE 1

177 2. Data sets and Methodology

This section gives a brief overview of the various datasets employed in this study. These include observed in-situ data, Gravity Recovery And Climate Experiment (GRACE) and Tropical Rainfall Measuring Mission (TRMM). The next subsection gives brief highlights on each dataset used.

182 2.1. Rainfall data (1960-2012)

Monthly observed in-situ precipitation data for stations along Lake Victo-183 ria Basin (see, Figure 1) were employed in this analysis. There are a number 184 of other meteorological stations within the Lake Victoria basin, but only 185 those representatives of their climatological zones with homogeneous anoma-186 lies were used. The annual rainfall total was computed through accumulation 187 of the monthly observed data. These data sets were first subjected to qual-188 ity control and homogeneity tests, see e.g., (Peterson et al., 1998; Omondi 189 et al., 2012), before being analyzed. The slopes of linear trends from the 190 annual rainfall total for the common period 1921 to 2012 were computed 191 using least-squares regression analysis while statistical significance assessed 192 using Student's t-test (Awange et al., 2008b). Linear regression model was 193 applied to the accumulated annual rainfall total for various stations used for 194 the study. 195

196 2.2. Tropical Rainfall Measuring Mission (TRMM)

The rainfall measurements employed in this work are a product derived 197 largely from observations made by the Tropical Rainfall Measuring Mission 198 or TRMM (Kummerow et al., 2000). TRMM products have been employed 199 in a number of studies of African precipitation where they have been found to 200 be adequate when compared with ground truth observations (e.g., Nicholson 201 et al., 2003; Owor et al., 2009). The product employed in this work is re-202 ferred to as the TRMM and Other Precipitation Data Set (denoted as 3B43), 203 and covers the period 1998 to 2013. 3B43 provides monthly rainfall (average 204 hourly rate) between latitudes $50^{\circ}N/50^{\circ}S$ over a $0.25^{\circ} \times 0.25^{\circ}$ grid. It is 205 derived not only from TRMM instruments, but also a number of other satel-206 lites and ground-based rain-gauge data. Over time, the products produced 207 from the TRMM observations are updated as the processing techniques and 208 methods for integrating the different data sets are improved upon. In this 209 work we use the latest version, number 7, which has been found to be a signif-210 icant improvement over the previous version 6 owing to such changes as the 211 use of additional satellites and a superior means of incorporating rain gauge 212 information from the Global Precipitation Climatological Centre (Huffmann 213 and Bolvin, 2012; Fleming and Awange, 2013). 214

215 2.3. Gravity Recovery And Climate Experiment (GRACE)

The Gravity Recovery And Climate Experiment (GRACE) is a United States (National Aeronautics and Space Administration, NASA) and German (Deutsche Zentrum für Luft- und Raumfahrt, DLR) space mission which has been providing products that describe the temporal variation of the Earth's gravity field arising from mass movements within the Earth's system. Level 2 time-variable gravity field products of GRACE have been frequently used to
study the Earth's water storage variations (see, e.g., Awange et al., 2008a).
This study uses the latest release five (RL05) monthly GRACE solutions,
provided by the German Research Centre for Geosciences (GFZ) (Dahle et
al., (2012)), covering 2003 to 2013.

For computing monthly total water storage (TWS) fields over the LVB basin, the following items are considered:

1. GRACE level-02 products contain correlated errors among higher order 228 spherical harmonics, known as the north-south striping pattern in spa-229 tial domain (Kusche, 2007). In order to remove stripes, we applied the 230 de-correlation filter of DDK3 (Kusche et al., 2009) to the GFZ-RL05 231 solutions. The filtered solutions can also be downloaded from http:// 232 icgem.gfz-potsdam.de/ICGEM/TimeSeries.html. Evaluation of the 233 DDK filter for computing correct water storage variations is addressed 234 e.g., in Werth et al. (2009). 235

Residual gravity field solutions with respect to the temporal average of
 2003 to 2013 were computed.

- 3. The residual coefficients were then convolved with a basin function, while considering the basin boundary of Figure 1. For computing the basin function, we assumed a uniform mass distribution with the value of one inside the LVB basin and no mass outside the basin (S1 = 1, is a uniform mass in the basin). Then, we transformed the uniform mass into spherical harmonics. The obtained coefficients are filtered with the same DDK3 filter as was applied for GRACE products.
- 4. In order to account for leakages (see e.g., Fenoglio-Marc et al. (2006,

2012)), the total surface mass of the basin was calculated from the basin
function coefficients (S2, synthesized uniform mass in the LVB basin).
The ratio of S1/S2 reflects the effect of the truncation of the spherical
harmonics as well as signal attenuation due to filtering GRACE products over LVB. More discussion of the leakage problem can be found,
e.g., in Klees et al. (2007).

5. The derived ratio is multiplied by coefficients in item 2 and the results were transformed into $0.5^{\circ} \times 0.5^{\circ}$ TWS maps within LVB, following Wahr et al. (1998).

255 2.4. CRU Data

The University of East Anglia Climate Research Unit (CRU) gridded ob-256 servational data comprises of 1200 monthly observed climate from 1901 to 257 2000. CRU data are derived from gauge observations over land areas only 258 and are interpolated on a regular grid of $0.50^{\circ} \times 0.50^{\circ}$ (Mitchell et al., 2003). 259 The data sets contain five climatic variables including precipitation, surface 260 temperature, diurnal temperature range (DTR), cloud cover and vapor pres-261 sure. In the present study, we only utilize monthly mean surface temperature 262 and precipitation to complement the available station-based observations. 263

264 2.5. Regional Climate Simulations

In this study we present results of simulated rainfall climatology during the recent decades from four state-of-the-art high resolution Regional Climate Models [a random sample from the Coordinated Regional Downscaling Experiment (CORDEX)] a group of models being used in CORDEX (http://wcrp-cordex.ipsl.jussieu.fr/). CORDEX Africa Project

(http://start.org/cordex-africa/about/) used different RCMs to sim-270 ulate rainfall over the whole Africa domain. The four RCMs data from the 271 CORDEX archive used in constructing simulated climatology over the LVB 272 were WRF, MPI, CRCM5, and PRECIS. The data is from 1989 to 2008 (20 273 years). The spatial resolution for RCMs-CORDEX is 50 km and for our 274 study, data was extracted for the LVB domain stretching from $31^{\circ}E$ to $36^{\circ}E$, 275 and 4°S to 2°N. Details on these RCMs are explained in Nikulin et al. 276 (2012).277

Given the importance of rainfall in the water balance of the LVB, in the 278 present study we only concentrate in comparing the model vs observations 279 (TRMM 3B43-V7 and CRU). We also evaluate how the model simulates the 280 impact of large-scale forcings on the seasonal and interannual variability of 281 LVB rainfall (i.e., influence of IOD and ENSO during the years 2005 and 282 2006, respectively). In order to understand the IOD and ENSO influence, 283 we also computed spatial correlations between Nino3.4 and IOD indices for 284 both model and observed (TRMM) data. Knowing the temporal pattern 285 of ENSO and IOD from the indices, their contributions were co-estimated 286 considering linear trends as well as the annual and semi-annual components 287 in the TRMM-derived rainfall and GRACE-derived TWS changes from 2003 288 to 2013. 289

290 3. Results and Discussions

291 Rainfall variability analysis

The trend analysis results for precipitation over the basin are shown in Figure 2. Stations located within the Lake Victoria Basin generally showed

modest increase in rainfall trends (e.g., see, Figures 2 a, b, c and d). The 294 increase in trends shown by these stations are, however, not significant at 95%295 confidence level when Student t-test is applied. We further employed PCA 296 analysis of TRMM data to isolate the dominant spatial and temporal patterns 297 of rainfall variability over the LVB during the recent years. We preferred 298 using the TRMM rainfall estimates here given the more complete spatial 299 coverage, albeit over a relatively short period. To extract the period with 300 relatively more rainfall, we summed up the rainfall values of each monthly 301 grids and showed them with respect to their corresponding month in Figure 3. 302 Impacts of the EL-Niño Southern Oscillation phenomenon can be seen e.g., 303 in 2006-2007 and 2011-2012. 304

Applying PCA on rainfall data of LVB, we found four dominant EOFs 305 and PCs that are shown in Figure 4. EOF1 and PC1 (representing 63% of 306 total variance of the rainfall) show a superposition of the annual and seasonal 307 variabilities. The amplitude of the signal in some years such as that of 2007 308 is amplified as a result of El-Niño. EOF2 and PC2 representing 13% of total 309 rainfall are also related to the annual variation with the same dipole structure 310 of the annual TWS changes in Figure 7. We found a lag of one-month 311 between PC2 of TRMM and PC2 of TWS changes. PC3 shows a summation 312 of inter-annual changes and a linear trend over the basin. Considering the 313 structure of EOF3, which is negative over the north west and positive over 314 the southeast, we estimate respectively a rainfall rate of -2.0 and 2.8 mm/yr 315 over them, for the period of 2003 to 2013. The derived trends, however, were 316 not statistically significant. We do not interpret the fourth mode of PCA on 317 rainfall changes (EOF4 and PC4) here, since the temporal pattern is quite 318

noisy and they represent only 3% of variance in rainfall.

FIGURE	2
FIGURE	3
FIGURE	4

320 Simulated climatology of LVB (1989-2008)

The observed bimodal rainfall pattern over the LVB (31.5°E - 34°E; 2.5°S 321 - 1°N) is well reproduced by three of the four CORDEX Regional Climate 322 Models (RCMs) as shown in Figure 5. However, the MPI RCM captures 323 the bimodal rainfall regime but underestimates the peaks during MAM and 324 OND seasons. This level of RCMs differences (uncertainties) in reproduc-325 ing the LVB spatial and temporal mean patterns of precipitation presents 326 a challenge in using numerical (theoretical) modeling techniques to under-327 stand climate-hydrology connections as well as water level/storage variabil-328 ity over LVB. The RCMs inability to reproduce variability of some peculiar 329 rainfall features of the LVB climate has been linked to incomplete represen-330 tation/parameterization of localized convective and boundary layer processes 331 that exert significant influence on the spatio-temporal distribution of LVB 332 rainfall (Song et al., 2006; Sun et al., 1999; Anyah et al., 2006; Anyah 333 and Semazzi, 2009). 334

FIGURE 5

In Figure 6, the Canadian Regional Climate Model version 5 (CRCM5), compared to TRMM estimates, overestimates over-lake seasonal rainfall amounts

for both MAM and OND seasons. On the other hand, the PRECIS model 337 as well as the other two models (not shown) consistently simulate drier con-338 ditions over the LVB; in some places underestimating the rainfall totals by 339 nearly 100% of the observed (TRMM) seasonal total, especially during the 340 March-May (MAM). However, the CRCM5 captures the OND seasonal mean 341 rainfall pattern quite well compared to TRMM, and also consistent with the 342 dominant EOF loadings of TRMM in Figure 4. The PRECIS model also re-343 produces the observed spatial distribution of rainfall during OND although 344 the simulated center of rainfall maximum is over the northeastern quadrant 345 of the Lake as opposed to southwestern and western quadrants as in TRMM 346 estimates and CRCM5 simulation. 347

FIGURE 6

348 GRACE total water storage over LVB

We then employed PCA analysis on TWS to examine whether the ob-349 served and simulated patterns of climate variability discussed in the previous 350 section are consistent with the water storage variability derived from GRACE 351 data. As a result, its first two dominant EOFs and PCs are shown in Figure 7, 352 where EOF1 and PC1 represents 82% of total variance in TWS changes and 353 EOF2 and PC2 represents 14%. EOF1 shows a strong anomaly all over the 354 basin, while its corresponding PC1 shows the dominant trend of the basin. 355 Using a linear regression, we found an average mass decline of 38.2 and in-356 crease of 4.5 mm/yr over the LVB, respectively for the periods of 2003 to 357 2007 and 2007 to 2013. EOF2 shows a spatial north-south dipole structure, 358 which as PC2 indicates, corresponds to the annual changes of TWS over the 359

basin. The TWS decline of 2003 to 2007 is attributed to the extension of
the Owen Falls (Nalubale) dam as stated e.g., in (Awange et al. , 2008a;
Swenson and Wahr , 2009). The positive rate of 2007 to 2013 is likely due
to the positive impact of El Niño in the years 2007 and 2013. This result is
supported by rainfall analysis of Section 3.

FIGURE 7

³⁶⁵ Influence of ENSO and IOD on inter-annual variability of LVB rainfall

Some previous studies over equatorial eastern Africa (including LVB) have 366 shown that local forcings modulate regional climate by either amplifying 367 or suppressing the anomalies triggered by perturbations in the large-scale 368 circulations that are propagated through global teleconnections such as El-369 Niño/Southern Oscillation and east-west sea surface temperature (SST) gra-370 dient over equatorial Indian Ocean [i.e IOD mode: Saji et al. (1999); Indeje 371 et al. (2000); Schreck and Semazzi (2004); Omondi et al. (2013), among 372 others]. ENSO and IOD have thus been indicated as significant triggers of 373 some of the past extreme LVB rainfall anomalies (floods and droughts). 374

In the present study, we show in Figure 8 the observed and simulated rain-375 fall anomalies during 2005 and 2006, associated with fairly strong La Niña 376 and El Niño/IOD conditions respectively. Generally, the apparent ENSO 377 influence on the spatial variability of LVB rainfall is manifest, with more 378 widespread below normal rainfall amounts during the OND season (2005) 379 and the opposite during 2006 season (based on 1989-2008 average). Over-380 lake rainfall is more depressed during La Niña (2005), but there is a modest 381 increase during El Niño years (2006 and 2010), although TRMM estimates 382

show significant increases over the western and northern quadrants of the Lake. This feature is clearly reproduced by all the four CORDEX models, compared to TRMM estimates. Given the recent improvements in ENSO prediction, with lead times over 6 months, the apparent link between LVB rainfall and ENSO can have very practical application for LVB water resources availability and governance.

FIGURE 8

In Figure 9, we show the spatial correlations between ENSO (Nino3.4 389 index) and LVB TRMM on the one hand, and simulated monthly rainfall 390 totals on the other hand during the OND season. In October (Figure 9,top), 391 statistically significant correlation between Nino3.4 and TRMM (3B43-V7) 392 during 1998-2008 is observed over the western parts of the Lake as well as 393 the northeastern shores (Winam Gulf and surrounding areas). In contrast, 394 significant r-values between nino3.4 and simulated rainfall tend to be more 395 widespread, especially over the northern sector of the Lake. Similar correla-396 tion patterns are derived from TRMM during November (Figure 9. middle), 397 but nino3.4 index correlation with the simulated rainfall show very weak 398 correlations $(r \sim 0)$, especially over the lake surface. The spatial correla-399 tion pattern in December (Figure 9, bottom) for both TRMM and model are 400 somehow similar to the pattern in October (Figure 9, top). 401

FIGURE 9

FIGURE 10

A conspicuous similarity in the monthly spatial correlation patterns between IOD and rainfall (Figure 10), and those shown in Figure 9 is unmistakable. This apparently implies that co-occurrence of IOD and ENSO events exert significant influence on LVB rainfall, and hence significantly influence climate-sensitive socio-economic activities (see, Section 3 over the lake and its hinterland).

In order to estimate the impact of ENSO and IOD on the variability of 408 rainfall and thus stored water, we assumed the normalized temporal pat-409 terns of the nino3.4 and IOD indices as known. Then, we co-estimated 410 their contributions, beside a linear trend as well as the annual and semi-411 annual components, in the variability of TRMM-rainfall and GRACE-TWS, 412 over 2003-2013. Thus, we assumed that the dominant temporal behavior of 413 the rainfall and TWS changes is represented by $[a, b.t, c.sin(2\pi t), d.cos(2\pi t),$ 414 $e.sin(4\pi t), f.cos(4\pi t), g.\bar{E}(t-\phi_{ENSO}), h.\bar{I}(t-\phi_{IOD})]$, where t is time in year 415 (2003-2013), \overline{E} and \overline{I} respectively contain the normalized ENSO and IOD 416 indices and ϕ_{ENSO} and ϕ_{IOD} are the phase lags in year between the indices 417 and the rainfall/TWS time series. The contributions of the components 418 a, b, c, d, e, f, g are co-estimated using a least squares procedure. We found 419 the correlation between nino3.4 and IOD indices and rainfall time series to 420 be maximum when the lag is zero. Therefore, the normalized ENSO E and 421 IOD E indices without considering any time lags, i.e. $\phi_{ENSO} = \phi_{IOD} = 0$ 422 are considered for the rainfall. The estimated coefficients for q and h are 423 summarized in Figure 11. The magnitude of ENSO and IOD over 2003-424 2013 reached 25 mm whereas the magnitude of the annual $(\sqrt{c^2 + d^2})$ and 425 semi-annual components $(\sqrt{e^2+f^2})$ were 70 and 50 mm, respectively. The 426

same procedure was repeated for TWS time series while considering a lag of 427 one month for both ENSO and IOD ($\phi_{ENSO} = \phi_{IOD} = 1/12$). This selection 428 is due to the fact that a delay of around one to two months exists between 429 rainfall changes and TWS changes as was discussed under rainfall variability 430 analysis. The corresponding coefficients are summarized in Figure 12. The 431 magnitude of their contribution reached 15 mm, over the period of 2003 to 432 2013. This is relatively less than what we observed in TRMM-rainfall in 433 Figure 11. Considering the simple water balance equation, wherew TWS is 434 equal to precipitation minus evaporation minus runoff, when a phenomenon 435 like ENSO happens, the amplitude of precipitation increases. One should, 436 however, also consider that consequently, the amplitude of evaporation and 437 runoff will increase and to some extent cancel out a part of the extra input 438 water. 439

FIGURE 11

FIGURE 12

Economic implications of observed and simulated co-variability of LVB climate and total water storage

This section provides an overview assessment of the economic impact of climate change linked to changes in stored water potential of Lake Victoria Basin as discussed in Section 3. It is important to point out that impact of climatic change on economic activities is systemic, thus quite complex and cannot be reduced to only monetary metrics for a single time period. Invariably, the economic impact of climatic change can be categorized as first-order

impact, and second order impact. The first order impact can be noticed right 448 after a major extreme climatic event occurs, such as drought or floods (e.g., 449 the El Niño rains of 2007, Figure 3). The second-order impacts are linked to 450 climatic variations in the LVB that happens over protracted length of time 451 or erratic happenings such as unpredictable rainy and dry seasons, which 452 do not correspond to, or altogether disrupt planned-economic activities. In 453 addition, lingering economic effects often happen in an incremental patter 454 over protracted periods of time. 455

Equally important, is the need to understand the complex link between 456 economic and social variables, which when subjected to climatic change, then 457 engenders negative outcomes, both in the short and long term. At the center 458 of economic impact assessment overview is also the heavy dependence of 459 majority of the LVB population on certain economic activities, and therefore 460 negative impact on such activities due to climatic change must be perceived 461 within this reality. For instance, 80% of the LVB population is engaged 462 in small-scale agricultural production and livestock farming, while fishing 463 directly or indirectly support the livelihood of about 3 million people (East 464 African Community Secretariat, 2004; Ntiba et al., 2001; LVBC, 2011). 465 The population of LVB depends on wood biomass for 90% of their energy 466 requirement (LVBC, 2007). 467

It is difficult to arrive at precise monetary figures when making assessment of economic impact of climatic change in the LVB. This is because costs extend well beyond non-economic sectors in the eco-system, but have indirect negative bearing on economic activities in the LVB. Compounding the difficulty of measuring precise economic impact is the sheer lack of accu-

rate statistical data of the gross domestic product (GDP) of the LVB. Lake 473 Victoria Basin Commission (LVBC) officials give conflicting GDP figures of 474 \$ 30 billion, and 40 billion for 2011 and 2012, respectively in various pre-475 sentations (see, Mngube, 2011; Kanangire, 2012). Knowing the accurate 476 GDP can be helpful in estimating the economic impact of changes in stored 477 water potential of Lake Victoria due to climate change. We can then know 478 percentage decrease or increase in GDP that may have resulted from such 479 variability. Hence the overview assessment of economic impact given here is 480 restricted to giving the correlating economic impact to distinctive climatic 481 events drought, floods and erratic seasonal rainfall patterns within spatial 482 dimension. 483

The major economic sectors that are subjected to first-order impact of 484 climatic change are: water resources, ecosystems and fishery, agriculture, en-485 ergy, transportation, infrastructure and communications, and public health 486 and labor productivity. The second-order economic impact of climatic change 487 are such as lingering food shortages, energy poverty, malnutrition and im-488 paired learning ability, and gradual loss of ecosystems that previously sup-489 ported economic and social life of inhabitants. The 1997/98 El Niño floods 490 (see, Figure 2) caused damage to buildings, roads, communications systems, 491 crops, and in addition to costs of treating diseases (Mogaka et al., 2005). 492 This type of damage has immediate and lingering future costs. Taking the 493 costs of replacement of infrastructure, we can assess immediate costs for all 494 damaged structures, in addition to lost value due to impaired infrastructure, 495 cost of treating diseases, and lost productivity due to diseases and inability 496 to move and communicate freely. 497

Likewise, the drought spawned by La Niña between October 1998 to 498 2000 led to massive crop and livestock loss, decreased hydro-electric power 499 station outputs, water shortage and contamination-related diseases (Mogaka 500 et al., 2005). Awange et al. (2007) found a link between highly variable 501 climate pattern in the LVB to the frequency and severity of droughts and 502 food insecurity in the region or parts of it. A commissioned research by 503 United States Agency for International Development (USAID) conducted by 504 International Resource Groups (Hecht et al., 2011), gives some conservative 505 estimates of cost of climate change for LVB at about \$6.5 billion for the year 506 2005, in period in which LVB level dropped (see, Figure 7 and also Awange et 507 al. (2008a)). This study gives the GDP of the LVB at around \$31.4 billion, 508 thus the cost of climate change impact stands at almost 21% of the region's 509 GDP for the single year. Even more surprising result of this study is the 510 huge cost of public healthcare, which claims 4.4% of LVB GDP. Huge costs in 511 healthcare are related to the elevated incident of malaria, diarrheal diseases 512 and malnutrition, all of which have direct link either to drought or floods 513 (Wandiga, 2006). The economic impact overview assessment here depicts 514 great exposure of the LVB's economic activities to adverse impact of climate 515 change. However there is need for accurate data from which reliable monetary 516 cost of the impact of climate change can be measured and therefore allowing 517 for cost-effective adaptation mechanisms to be planned and implemented. 518

519 4. Conclusions

In this study, decadal water storage changes over the basin derived from monthly GRACE, TRMM and RCM products are analyzed. The PCA results from both GRACE and TRMM together with in-situ data analyzed showed a general increase in rainfall and water volume over Lake Victoria Basin.

Overall our study confirm that there has been a modest increase in rainfall 524 and stored water over the basin during the last decade. This is captured by 525 in-situ-observed data obtained from lake-shore stations, TRMM and GRACE 526 satellite remote sensing. TRMM data suggest that rainfall conditions have 527 not changed much during the study period (1998-2013) over the basin while 528 GRACE-TWS indicates average mass decline of 38.2 mm/yr for the period 529 2003 to 2007 and increase of 4.5 mm/yr for 2007 to 2013 over the basin. 530 This decline has been attributed to expansion of the Owen Falls/Nalubale 531 Dam, at Jinja Uganda in earlier investigations by Awange et al., (2008) and 532 Swenson and Wahr (2009). 533

Futhermore, the four high-resolution regional climate model simulations analysed clearly reproduced the broad spatial and temporal patterns of precipitation over the LVB, as well as El Nino and La Nina linked anomalous wet and dry conditions during the recent decades. However, only two (CRCM5 and PRECIS) of the four RCMs capture the observed spatial distribution of rainfall over the LVB, and this is likely to compromise their ability to depict the correct (GRACE) water stored over the LVB.

The economic impact assessment of LVB depicts great exposure of the LVB's economic activities to adverse impact of climate change, specifically its impact on stored water. Acknowledgments E. Forootan is grateful for the financial supports by the German Research Foundation (DFG) under the project BAYES-G. The authors are grateful to the GFZ and NASA for providing the data for this study. This work is a TIGeR publication (no. XXX).

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Figure 1: Lake Victoria Basin and in-situ rainfall stations (red) used in the study (Source: Kayombo and Jorgensen (2006))



Figure 2: Rainfall trends for some stations in the Lake Victoria Basin



Figure 3: An overview of the cumulative rainfall, derived from each month of TRMM data over LVB, for the period of 2003 to 2013.



Figure 4: PCA decomposition of rainfall changes derived from TRMM, over LVB. EOFs are rainfall anomaly maps and PCs are their corresponding unit-less temporal patterns.



Figure 5: Mean annual cycle of precipitation (mm) over Lake Victoria Basin (31.5E-34E, -2.5S-0.5N).



Figure 6: Spatial pattern of seasonal mean rainfall (mm) over LVB. Left panels (March-May season); Right panels (October-December season).



Figure 7: PCA decomposition of TWS changes over LVB. EOFs are counted as anomaly maps that show the spatial distribution of TWS changes within the basin. Corresponding PCs are temporal variations which are scaled with their standard deviations to be unit-less.



Figure 8: Left: Spatial pattern of 2005 (La Nina), and Right: 2006 (El Nino) seasonal rainfall anomalies(mm) from long term mean over LVB.



Figure 9: Spatial correlation between ENSO (nino3.4 index) and monthly rainfall over LVB (r=0.44 significant at 0.05 confidence level). Top (October), Middle (November) and bottom (December)



Figure 10: Spatial correlation between IOD (index) and monthly rainfall over LVB (r=0.44 significant at 0.05 confidence level). Top (October), Middle (November) and bottom (December)



variability of LVB. Figure 11: Contribution of ENSO (left) and IOD (right) on the TRMM-derived rainfall



variability of LVB. Figure 12: Contribution of ENSO (left) and IOD (right) on the GRACE-derived TWS