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2 **Agricultural Water balance Study in Sindh (Pakistan)**
3 **using Satellite-derived Actual Evapotranspiration**

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12 **Abstract:** The rising water demand, coupled with mismanagement and misallocation of water, has
13 caused water scarcity in the Sindh Province of Pakistan. The Sindh province almost entirely relies
14 on the Indus River supply to meet its agricultural demand. The rising population will demand more
15 food, but at the same time, agricultural water share will be under pressure due to the increasing
16 demand of other competing users. Many studies have predicted a shortfall of water in the coming
17 years that will cause food security issues. Since agriculture is the largest water user among all
18 sectors, water management in this sector will significantly be affected. A water balance study is
19 presented in this paper to evaluate the current and future water supply and demands and develop
20 sustainable agriculture water budgeting. In this study, actual evapotranspiration (consumptive
21 water) in Sindh's irrigated region was estimated during 2017-2019. The study utilized Landsat
22 satellite data product from the Earth Engine Evapotranspiration Flux (EEflux). Study results
23 identified shortages during the *Rabi* seasons when flows are usually low, and consumptive water
24 use is more than the available quantum of canal flows and rainwater. However, the *Kharif* season
25 presented the opposite trend. Within canal command areas (CCAs), the supplies and demands
26 showed variable trends that can be balanced by adjusting surplus and deficit supplies by
27 recalculating canal allocations. Suggestions for balancing water in these CCAs were also presented
28 in this study.

29 **Keywords:** Agriculture; ET; Earth Engine Evapotranspiration; EE Flux; GIS; Indus River; Satellite
30 Remote Sensing.
31

32 **1. Introduction**

33 In arid and semi-arid regions of the world, water availability is a major challenge for crop
34 production due to inadequate rainfall patterns [1,2]. Irrigated agriculture consumes more than 70%
35 freshwater globally and more than 80% in arid and semi-arid regions [3,4]. According to the United
36 Nations Educational Scientific Cultural Organisation (2012), over the last 50 years, the demand for
37 water in almost every country across the globe has tripled [5]. On the other hand, the exponential
38 increase in population growth and increase in demand for irrigated food production is likely to rise,
39 which has raised concerns about resources' availability and sustainability [6]. This situation demands
40 essential improvements in agricultural water management efficiency. Researchers worldwide have
41 also recognized this as one of the key topics associated with water scarcity and droughts [7]. Despite
42 the critical pressure of agriculture on water resources, information on irrigated water is often
43 unavailable. Thus, monitoring and assessing the agricultural water balance between supply and
44 demand is critical for efficient water resources management.

45 Pakistan, located in the Indus River Basin and has more glaciers than anywhere else globally [6],
46 faces acute water shortage, especially by its low riparians. The food production in Pakistan largely
47 depends on irrigation, which provides more than 90% of the country's wheat, pulses, and nearly all
48 other types of crops [8]. Irrigation of pasture also provides the main feed for milk production and the
49 feed for meat livestock [8]. However, with the growing population, the per capita availability of water
50 is declining. Around a 50% increase in the irrigation water requirement was predicted by 2025 in 2003
51 by Azad et al. (2003) [9,10]. These demands may further escalate dramatically with the induced effects
52 of climate change and high water stress conditions. The current study assesses agricultural
53 consumptive water use in Sindh, the most water-scarce province of Pakistan situated in the Indus
54 River's tail-end. This study is based on secondary data from governmental and non-governmental
55 agencies and remote sensing-derived information.

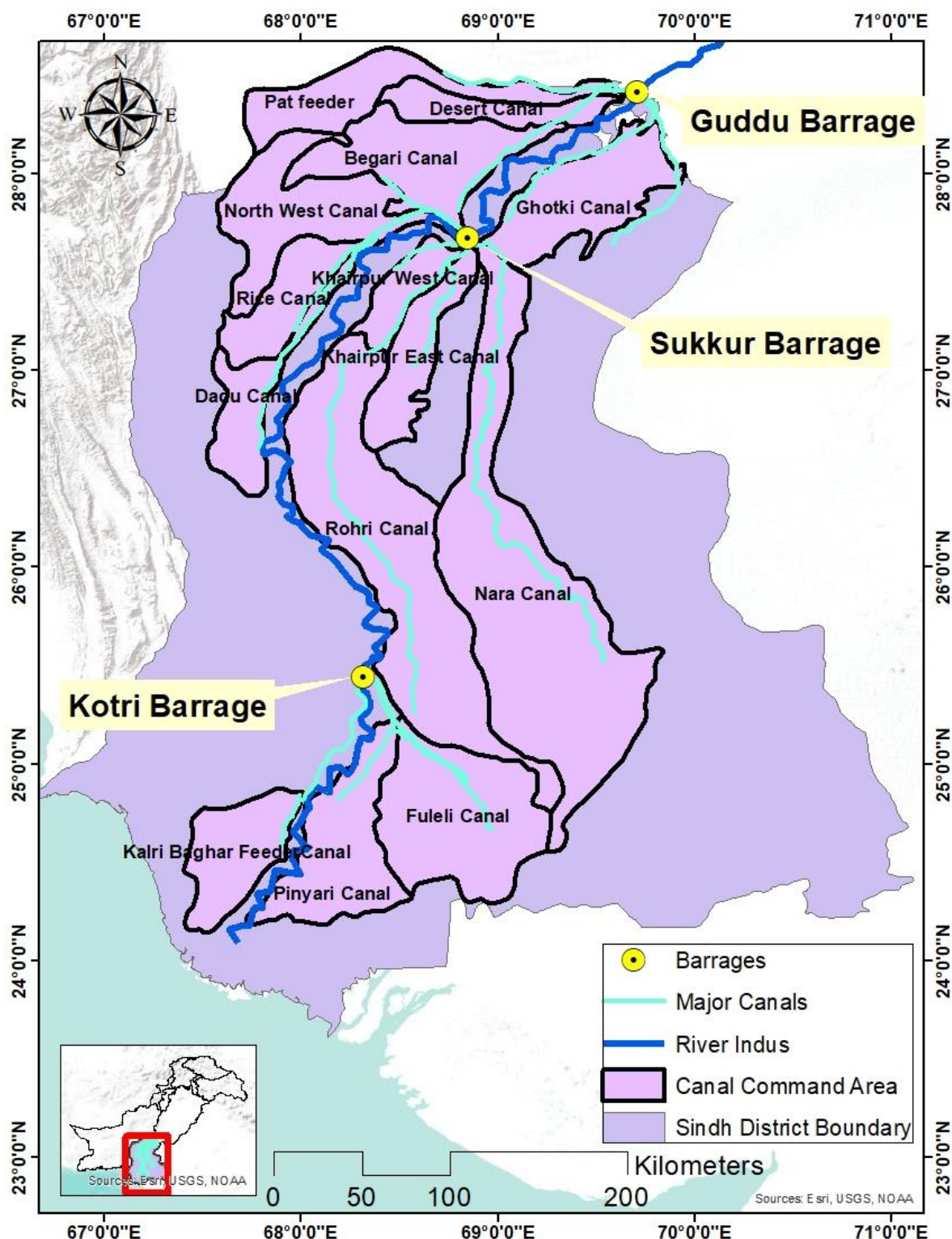
56 The consumptive water use can be estimated using various models and methods [11,12]. These
57 models need input data regarding atmospheric and terrestrial information. Pakistan also lacks an
58 efficient and comprehensive monitoring system to record relevant data in time and space. However,
59 remote sensing (RS) application to estimate consumptive water use or water demand in larger areas
60 prone to high demand variations has gained much popularity in the recent era of freely available
61 satellite data due to its extended temporal and spatial scope [13,14,15,16,17].

62 Remote sensing uses various energy balance models for calculating actual evapotranspiration
63 (ETa) [18,19,20,21,22,23]. In this study, satellite data were used to estimate ETa (consumptive water
64 use) to evaluate the current and future water supply and demands and develop sustainable
65 agriculture water budgeting. In this paper, two *Rabi* (winter) of 2017-2018 and 2018-2019 and one
66 *Kharif* (summer) seasons of 2018 were studied. Average ETa was estimated in the entire irrigated land
67 of the Sindh province comprising 14 culturable command areas (CCA) using Earth Engine
68 Evapotranspiration Flux (EEFlux) data. The purpose of that study was to propose sustainable water
69 budgeting for the Sindh province to manage its water resources in the agricultural sector.

70 2. Materials and Methods

71 2.1 Study Area

72 Sindh is the third-largest (area wise) and second-most populous province of Pakistan. It is located
73 in the lower part of the Indus Basin. The province area is about 140,900 km², which is 17.7% of the
74 total area of Pakistan. The agricultural activities of Sindh province largely depend on canal irrigation.
75 In the Sindh province, there are three barrages—Guddu, Sukkur, and Kotri— and 14 canals and their
76 command areas (Figure 1). The Indus River flows vary throughout the year. There are 29 districts in
77 the province [24]. Sindh's reported population in the 2017 census was about 48 million (25 million in
78 urban and 23 million in rural areas)—around 23% of its total population [24].



79

80 Figure 1: Sindh Canal Command Area

81 2.2 Study Data

82 For this study, open-source Landsat satellite data products for study seasons were downloaded
 83 from the Google Earth Engine Evapotranspiration Flux (EEFlux) website. EEFlux ET estimations are
 84 based on the METRIC (Mapping Evapo-Transpiration at high Resolution with Internalized
 85 Calibration) algorithm. Moreover, weather and climatic data were also acquired from the Pakistan
 86 Meteorological Department (PMD) for the entire Sindh province during 2014-2018. The analysis was

87 based on inflow and outflow data from secondary sources such as statistical reports, Sindh Irrigation
 88 and Drainage Authority (SIDA), Sindh Irrigation Department (SID), and Water Sector Improvement
 89 Project (WSIP).

90 2.2 Methodology

91 2.2.1 Agricultural Water Assessment

92 Agriculture water use in terms of actual ET or consumptive water was estimated using ETrF from
 93 METRIC-EEFlux. The following sections describe the processing steps.

94 2.2.1.1 Reference ET Fraction (ETrF)

95 ETrF is the ratio of the actual ET (ET_a) of each pixel to the reference ET (ET_r) (Eq (1)). ET_r values
 96 for the study area were obtained from previous studies [25, 26]. ETrF is similar to crop-coefficient
 97 (K_c) and used to extrapolate ET_a for extended periods [27-28].

$$ETrF = \frac{ET_a}{ET_r} \quad (1)$$

98 Where ET_a is actual ET in mm, and ET_r is the reference ET in mm.

99 2.2.1.2 Consumptive Water Use (WU)

100 Consumptive water use (WU) is the total amount of water consumed by agricultural lands. WU
 101 was estimated by aggregating the total amount of water transpired through the agricultural lands in
 102 the form of ET_a during the entire growing season. Eq (2) was used to calculate the consumptive water
 103 use in million acre-ft (MAF) for each of the 14 CCAs separately.

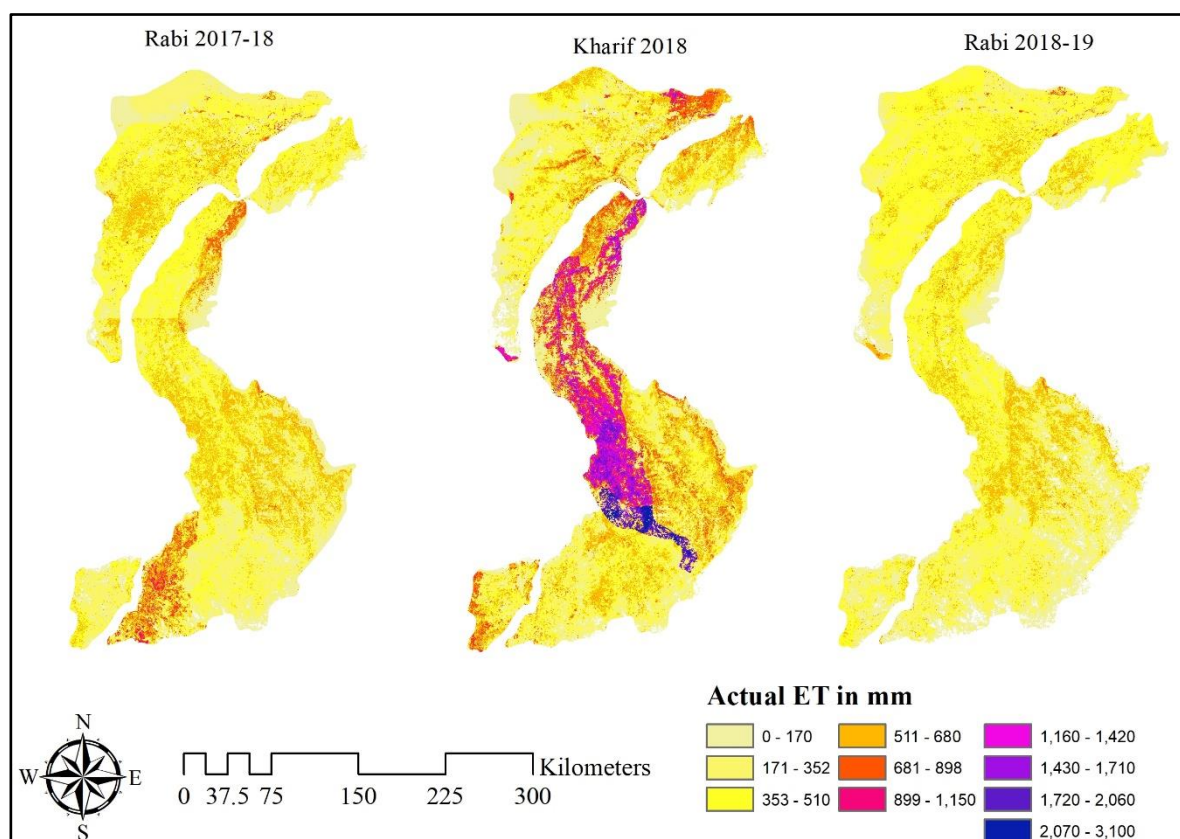
$$WU = \sum_i^n ET_i \times a_i \quad (2)$$

104 ET_a is the actual ET in ft, *n* is the total pixel count, and *a* is the area of a pixel of Landsat image
 105 in acres.

106 3. Results and Discussions

107 a. Actual Evapotranspiration (ET_a) for Sindh

108 During three growing seasons, the actual ET values, *Rabi* 2017-18, *Kharif* 2018, and *Rabi* 2018-19,
 109 are shown in Figure 2. The highest values of ET were observed during *Kharif* 2018, more specifically
 110 in the *Rohri* CCA.



111
112 Figure 2: Seasonal Actual ET

113 *b. Canal Water Supply and Consumptive Water Use (WU)*

114 Tables 1, 2, and 3 give WU details calculated from actual ET in each CCA, authorized canal
115 supply, and precipitation volumes, respectively, for *Rabi 2017-18*, *Kharif 2018*, and *Rabi 2018-19*. The
116 information provided in these tables helps calculate surplus or deficit waters at the CCA level. The
117 surplus and deficit water-flows for each CCA were calculated (canal diversions + rainfall -
118 consumptive water). It was observed that surplus flows are mostly available in the *Kharif* season,
119 while deficit or negative flows were observed during both *Rabi* seasons. The highest surplus flow of
120 2.0 MAF was observed in the *Fuleli* canal off-shooting from the Kotri Barrage during the *Kharif 2018*
121 season. In this analysis, it was observed that the *Rohri* canal CCA remained in deficit due to high
122 consumptive demands in all seasons. It is also interesting to note that the *Rohri* canal is a highly
123 productive CCA in Sindh [28]. The highest deficit value of all seasons was -1.28 MAF in the *Rohri*
124 CCA during *Rabi 2018-19*.

125 The estimated water balance information helps manage the flows by adjusting the canals' flows
126 by reducing the surplus amounts and reallocating them into the water deficit areas. Regulating the
127 water flows according to the consumptive water need of a CCA can ensure an optimal water balance
128 in the province.

129 Table 1: Authorized Canal Flows and Water Consumption during *Rabi* 2017-2018

Source	Canal	CCA (MHa)	Authorized Canal Volume (MAF)	Precipitation (MAF)	Consumptive Use (MAF)
Guddu Barrage	Beghari Sindh Canal	0.424	0.14	0.03	1.17
	Desert & Pat Feeder	0.501	1.09	0.03	0.50
	Ghotki Feeder Canal	0.392	1.00	0.02	1.06
Total		1.317	2.23	0.08	2.73
Sukkur Barrage	North West Canal	0.452	0.73	0.04	1.51
	Rice Canal	0.222	0.19	0.02	0.83
	Dadu Canal	0.235	0.65	0.02	0.60
	Nara Canal	1.002	2.30	0.02	2.97
	Khairpur East Feeder	0.240	0.37	0.01	0.52
	Rohri Canal	1.092	2.38	0.03	3.47
	Khairpur West Feeder	0.136	0.29	0.01	0.56
Total		3.379	6.91	0.15	10.46
Kotri Barrage	KB Feeder	0.284	0.85	0.00	0.65
	Pinyari Canal	0.437	0.21	0.01	0.92
	Fuleli Canal	0.620	0.61	0.04	1.15
Total		1.341	1.67	0.05	2.72
Overall	Grand Total	6.037	10.81	0.28	15.91

130 Table 2: Authorized Canal Flows and Water Consumption during *Kharif* 2018

Source	Canal	CCA (MHa)	Authorized Canal Volume (MAF)	Precipitation (MAF)	Consumptive Use (MAF)
Guddu Barrage	Beghari Sindh Canal	0.424	2.57	0.03	1.20
	Desert & Pat Feeder	0.501	2.69	0.04	1.64
	Ghotki Feeder Canal	0.392	2.27	0.04	1.21
Total		1.317	7.53	0.11	4.05
Sukkur Barrage	North West Canal	0.452	1.51	0.06	1.21
	Rice Canal	0.222	2.62	0.03	1.50
	Dadu Canal	0.235	0.93	0.01	0.36
	Nara Canal	1.002	3.88	0.46	3.26
	Khairpur East Feeder	0.240	0.54	0.03	0.54
	Rohri Canal	1.092	3.67	0.21	3.56
	Khairpur West Feeder	0.136	0.41	0.02	0.64
Total		3.379	13.6	0.82	11.1
Kotri Barrage	KB Feeder	0.284	1.81	0.06	1.02
	Pinyari Canal	0.437	2.36	0.12	1.12
	Fuleli Canal	0.620	4.16	0.29	1.87
Total		1.341	8.30	0.47	4.00
Overall	Grand Total	6.037	29.43	1.4	19.15

131 Table 3: Authorized Canal Flows and Water Consumption during *Rabi* 2018-2019*

Source	Canal	CCA (MHa)	Authorized Canal Volume (MAF)	Consumptive Use (MAF)
Guddu Barrage	Beghari Sindh Canal	0.424	0.09	0.30
	Desert & Pat Feeder	0.501	0.96	1.44
	Ghotki Feeder Canal	0.392	0.95	1.15
Total		1.317	2.00	2.89
Sukkur Barrage	North West Canal	0.452	1.02	1.44
	Rice Canal	0.222	0.28	0.85
	Dadu Canal	0.235	0.64	0.48
	Nara Canal	1.002	2.34	2.37
	Khairpur East Feeder	0.240	0.31	0.64
	Rohri Canal	1.092	2.17	3.45
	Khairpur West Feeder	0.136	0.24	0.44
Total		3.379	7.00	9.67
Kotri Barrage	KB Feeder	0.284	1.58	0.62
	Pinyari Canal	0.437	0.36	0.21
	Fuleli Canal	0.620	0.87	1.30
Total		1.341	2.80	2.13
Overall	Grand Total	6.037	11.8	14.69

* No precipitation was recorded during *Rabi* 2018-2019

132 c. Agricultural Water Balance

133 A water balance chart is shown in Figure 3, where the balance bars (in red color) present the
 134 reductions (negative values) or additions (positive values) in the canal flows during the entire study
 135 period. The *Rohri* canal remained in deficit during all study seasons and called for the highest water
 136 need (i.e., 2.49 MAF in addition to the authorized flows). KB Feeder canal had maximum surplus
 137 water during all three growing seasons (i.e., 1.87 MAF minus municipal demand of Karachi).
 138 Effective water management and planning at the canal level can be achieved by appropriating the
 139 balanced flows to meet the consumptive water demands of all 14 CCA. The inflows and outflows of
 140 the *Beghari* CCA were balanced well with 0.07 MAF surplus water than the authorized flows.

141 This analysis can also help identify crop selection in a particular CCA against the available water
 142 quantity. Elevated water-intensive intensities may need to be controlled in a CCA if its demand is
 143 extensively higher than the available supply. A better and water-efficient cropping pattern for
 144 farmers may help meet the sustainable development goal of conserving water.

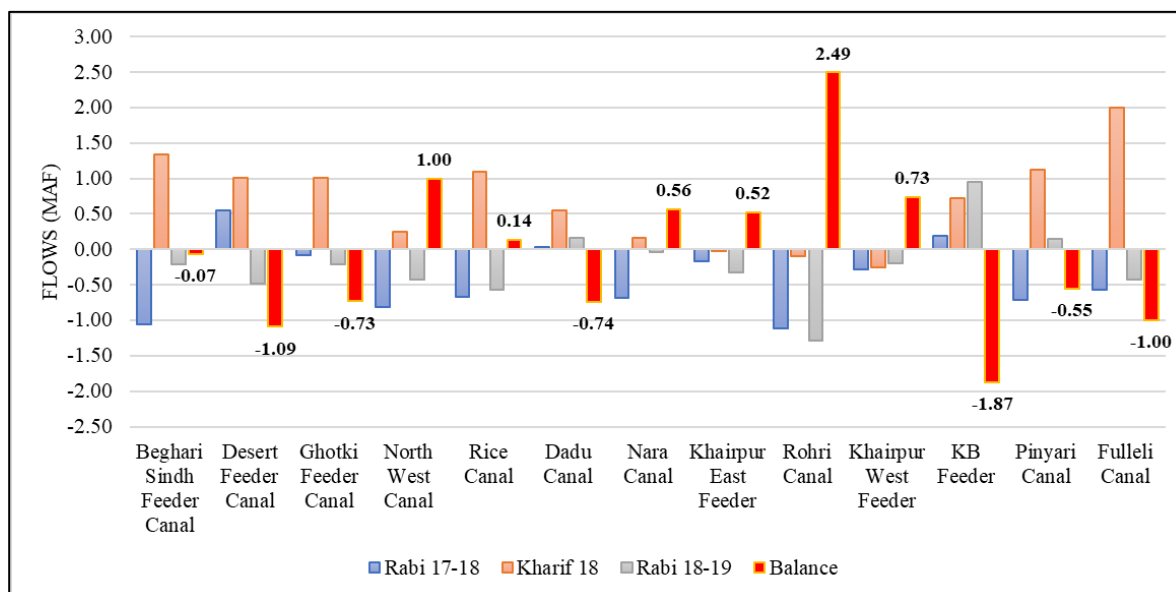


Figure 3: Agricultural Water Balance for Sindh Canals during Rabi 2017-18 to Rabi 2018-19

4. Conclusions

This paper utilizes remote sensing estimates of evapotranspiration to study Sindh's agricultural water requirement. The approach presented in this study was to evaluate the agricultural water resources of Sindh using remote sensing and secondary data that will help in efficiently managing the irrigation activities. Literature-based water demand estimates indicate 93-95% utilization in the agriculture sector [29]; however, our analysis for the recent year (2018-2019) estimates lower utilization (around 80% of the total water available at the CCA level, including canal diversions and precipitation).

This study can help decide the Sindh water sector's policy reforms for sustainable and equitable water distribution among all 14 canal command areas. However, detailed analysis and data of groundwater sources and their consumption are needed to improve the surplus and deficit flows' accuracy to refine the study results further. This study's key findings, including satellite-based consumptive water use of Sindh canals' command areas, provide mathematically sound data essential for developing knowledge-based policies and recommendations for efficiently managing the available water resources.

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Author Contributions: Arjumand Zaidi was the principal investigator of this study and overall supervised the research and wrote the paper; Nabeel Ali Khan did all remote sensing related processing; Bakhshal Khan Lashari conceived the study and reviewed the study report; Farooq Ahmed Laghari delineated the CCAs and provided auxiliary data, Vengus Panhwar helped in data processing and paper writing.

Conflicts of Interest: The authors declare no conflict of interest.

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