HEC-HMS MODEL PARAMETER TRANSFERABILITY FOR DAILY STREAMFLOW ESTIMATION IN GIN GANGA BASIN

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DECLARATION

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HEC-HMS Model Parameter Transferability for Daily Streamflow Estimation in Gin Ganga Basin

ABSTRACT

Rapid urbanization and population growth with economic advancement causes a conflict between limited freshwater supply and the demand. Accurate streamflow estimation in a watershed is a necessity for sustainable water resources management to overcome this conflict. Sustainable water management requires quantification of streamflow components for flood, drought and irrigation management. Hydrologic modeling is one of the most versatile options to estimate streamflow in watershed. Streamflow quantification by modeling had issues with ungauged watersheds due to lack of sufficient measured data to determine model parameters. The objective of this work is to apply HEC-HMS process-based model to simulate processbased river flow in an ungauged sub-watershed Thawalama at daily time scale, where the main watershed Baddegama is gauged, and check the possibility of parameter transferability from main to sub-watershed and vice versa. Here, spatiotemporal transferability approach was used to assess possibility of parameter transferability in order to estimate daily streamflow in an ungauged sub watershed. Temporal transferability approach also used to assess the comparison of selected transferability option for this work. Gin Ganga basin study area and HEC-HMS model were selected. Eight models developed for both Thawalama and Baddegama watersheds from 2007 to 2017 on a daily time scale. Calibration period was from 2007 to 2012 and validation period was from 2012 to 2017. Model efficiency was evaluated by the Root Mean Square Error (RMSE). Two models at Baddegama and Thawalama were calibrated and validated. For spatiotemporal approach, both model's calibrated parameters were transferred from Baddegama to Thawalama and vice versa for 10 years of period. For temporal approach calibrated parameters of both models were transferred to same watersheds for 10 years of period. Then the model performance evaluated with flow hydrograph, flow duration curve for low, high and intermediate flows to asses calibrated parameter transferability of HEC-HMS from Baddegama to Thawalama sub-watershed and vice versa. Thawalama and Baddegama models were calibrated with RMSE of 4.8 mm/day, 3.0 mm/day and validated with RMSE of 5.0 mm/day, 3.5 mm/day respectively. The spatiotemporal parameter transferability approach to Baddegama main watershed from Thawalama sub-watershed showed RMSE of 6.0 mm/day and vice versa showed RMSE of 5.8 mm/day. The temporal parameter transferability approach to Baddegama main watershed from Thawalama sub-watershed showed RMSE of 3.3 mm/day and vice versa showed RMSE of 4.9 mm/day. Results concluded that spatiotemporal transfer approach showed better achievement in model parameter transferability from main to subwatershed. Temporal transfer approach showed better achievement in model transferability from sub to main watershed. Spatiotemporal transferability approach showed better model performance rating than temporal approach with RSR value of 0.5 for Thawalama subwatershed to Baddegama main watershed and RSR value of 0.6 for vice versa. The HEC-HMS model can be successfully applied to assess the transferability approach within the Gin Ganga basin for sustainable water resource management. Furthermore, need to asses individual parameter influence on transferability approach with compared to watershed physical characteristics.

Key Words

Process-based hydrologic model, HEC-HMS, Sustainable Water Resources Management, Spatial Transferability

TABLE OF CONTENTS

DECLARATION
ACKNOWLEDGMENTi
ABSTRACTii
TABLE OF CONTENTSiv
LIST OF FIGURESix
LIST OF TABLESxiv
LIST OF ABBREVIATIONxv
1 INTRODUCTION
1.1 Sustainable Water Resources Management
1.2 Hydrologic Modeling in Streamflow Estimation
1.3 Spatial and Temporal Resolution in Streamflow Modeling
1.4 Process-Based Hydrologic Modeling
1.5 Challenges in Watershed Modeling
1.6 Problem Identification
1.7 Study Area
1.8 Overall Objective
1.8.1 Specific Objectives
2 LITERATURE REVIEW
2.1 Hydrologic Models
2.2 Types of Hydrologic Models
2.3 Application of Types of Hydrologic Models
2.4 Continuous and Event Model
2.5 Lumped and Distributed Model

	2.6	Temporal Resolution	9
	2.7	Current Status of Process-Based Hydrologic Models	. 10
	2.8	Model Comparison.	. 10
	2.9	Parameter Transferability	. 16
	2.10	Filling Missing Data	. 17
	2.11	Model Calibration and Validation	. 18
	2.12	Objective Function	. 19
	2.13	Model Warm-Up	. 21
	2.14	HEC-HMS Model Structure	. 22
	2.1	4.1 Precipitation Model	. 22
	2.1	4.2 Canopy Model	. 22
	2.1	4.3 Loss Model	. 22
	2.1	4.4 Transform Model	. 23
	2.1	4.5 Baseflow Model	. 23
	2.1	4.6 Routing Model	. 24
	2.15	Data Requirement	. 24
	2.16	Parameters	. 24
	2.17	Parameter Optimization in HEC-HMS Model	. 25
3	M	ETHODOLOGY	. 26
4	DA	ATA COLLECTION AND DATA CHECKING	. 29
	4.1	Study Area	. 29
	4.2	Thiessen Rainfall	. 30
	4.2	2.1 Thawalama Watershed	. 30
	4.2	2.2 Baddegama Watershed	.31
	4.3	Data and Data Checking	. 32

	4.3.1	Annual water balance at Thawalama	. 32
	4.3.2	Variation of annual runoff coefficients and evaporation of Thawalama	33
	4.3.3	Variation of annual rainfall and streamflow of Thawalama	. 34
	4.3.4	Annual water balance at Baddegama	. 34
	4.3.5	Variation of annual runoff coefficients and evaporation of Baddegama	35
	4.3.6	Variation of annual rainfall and streamflow of Baddegama	. 35
	4.4 D	ouble Mass Curve	. 36
	4.5 V	isual Data Checking	. 37
	4.5.1	Thawalama Watershed	. 37
	4.5.2	Baddegama Watershed	.41
	4.6 M	Ionthly and Annual Rainfall	. 45
	4.6.1	Monthly comparison of streamflow and Thiessen rainfall	. 46
	4.6.2	Monthly evaporation	. 46
	4.7 Fi	illing Missing Data	. 48
5	ANA	LYSIS AND RESULTS	. 49
	5.1 Se	election of Two Watersheds	. 49
	5.2 M	Iodel Selection	. 49
	5.3 H	EC-HMS Model Development	. 49
	5.3.1	Review of modeling practices in HEC-HMS	. 49
	5.3.2	Development of the basin model	. 50
	5.3.3	Control specification	. 55
	5.3.4	Model simulation.	. 56
	5.3.5	Model warmup	. 56
	5.4 M	Iodel Calibration	. 56
	5.4.1	Automatic parameter optimization	.56

	5.5	Streamflow Separation	57
	5.6	Calibration Results	59
	5.6.	1 Statistical goodness of fit measures	59
	5.6.	2 Parameters of Thawalama and Baddegama Watersheds Parameters	59
	5.6.	Matching observed and calculated hydrograph and FDC	59
	5.6.	4 Annual water balance	65
	5.6.	5 Monthly and seasonal performance	66
	5.7	Model Verification	71
	5.7.	1 Statistical goodness of fit measures	71
	5.7.	2 Matching observed and calculated hydrograph and FDC	71
	5.7.	3 Annual water balance	77
	5.7.	4 Monthly and seasonal performance	78
	5.8	Parameter Transferability	83
	5.8.	1 Parameter transferability from Baddegama to Thawalama watershed	83
	5.8.	2 Parameter transferability from Thawalama to Baddegama watershed	90
6	DIS	CUSSION	97
	6.1	Model Component Selection	97
	6.1.	1 Loss model	97
	6.1.	2 Baseflow model	97
	6.1.	3 Transform model	97
	6.1.	4 Canopy model	98
	6.2	Data and Data Period	98
	6.2.	1 Selection of data period	98
	6.2.	2 Existence of Data Error	99
	63	The Selection and Determination of Initial Parameter Values	99

6.3.1 Canopy Model
6.3.2 Loss Model
6.3.3 Transform model
6.3.4 Baseflow model
6.4 Objective Function Selection
6.5 Flow Threshold Selection
6.6 Evaluation Criteria of Model Performance
6.6.1 Model performance in calibration of Thawalama and Baddegama 102
6.6.2 Model performance in verification of Thawalama and Baddegama 104
6.7 Reliability of Model Results
6.7.1 Uncertainty in meteorological data
6.7.2 Uncertainty in catchment parameters
6.8 Comparison of Parameter Transferability
6.8.1 Baddegama to Thawalama
6.8.2 Thawalama to Baddegama
7 CONCLUSIONS
8 RECOMMENDATION
REFERENCES
APPENDIX A: STREAMFLOW RESPONSE WITH RAINFALL 123
APPENDIX B: DOUBLE MASS CURVES AFTER DATA FILLING 142
APPENDIX C: COMPARISON OF RAINFALL CALCULATIONS 146
APPENDIX D: REVIEW OF OPTIMIZATION CRITERIA
APPENDIX E: CANOPY STORAGE. WARM UP AND FLOW COMPONENT 157

LIST OF FIGURES

Figure 1-1:Study area6
Figure 3-1:Methodology flowchart
Figure 4-1:Thiessen polygon-Thawalama watershed
Figure 4-2:Thiessen polygon-Baddegama watershed
Figure 4-3: Variation of annual evaporation and runoff coefficient at Thawalama 33
Figure 4-4:Variation of annual rainfall and streamflow at Thawalama34
Figure 4-5: Variation of annual evaporation and runoff coefficient at Baddegama 35
Figure 4-6: Variation of annual rainfall and streamflow at Baddegama
Figure 4-7:Double mass cures for each RF, SF and EVP stations
Figure 4-8:Thawalama SF vs RF at each Station 2015/16 – semi log plot
Figure 4-9:Thawalama SF vs Thiessen RF during calibration period
Figure 4-10:Thawalama SF vs Thiessen RF-during validation period
Figure 4-11:Baddegama SF vs RF at each station 2015/16 – semi log plot
Figure 4-12:Baddegama SF vs Thiessen RF- during calibration period
Figure 4-13:Baddegama SF vs Thiessen RF- during validation period
Figure 4-14:Variation of monthly average rainfall
Figure 4-15:Comparison of monthly evaporation with streamflow
Figure 4-16:Comparison of monthly thiessen rainfall and streamflow in Thawalama and Baddegama watersheds
Figure 5-1:Landuse map for Baddegama and Thawalama watersheds
Figure 5-2:HEC-HMS model schematic diagram
Figure 5-3:Streamflow separation in Thawalama watershed
Figure 5-4:Streamflow separation in Baddegama watershed
Figure 5-5:Performance of Thawalama model calibration-normal plot

Figure 5-6:Performance of Thawalama model calibration-log plot	61
Figure 5-7:Performance of Baddegama model calibration-normal plot	62
Figure 5-8:Performance of Baddegama model calibration-log plot	63
Figure 5-9:FDC of Thawalama model-both sorted	64
Figure 5-10:FDC of Thawalama model-sort only observed	64
Figure 5-11:FDC at Baddegama model-both sorted	65
Figure 5-12:FDC at Baddegama model-sort only observed	65
Figure 5-13:Annual water balance error at Thawalama	66
Figure 5-14:Annual water balance error at Baddegama	66
Figure 5-15:Thawalama monthly average simulated and observed SF	67
Figure 5-16:Thawalama seasonal behavior of observed and simulated SF	68
Figure 5-17:Baddegama monthly average simulated and observed SF	69
Figure 5-18:Baddegama seasonal behavior of observed and simulated SF	70
Figure 5-19:Performance of Thawalama model validation-normal plot	72
Figure 5-20:Performance of Thawalama model validation-log plot	73
Figure 5-21:Performance of Baddegama model validation-normal plot	74
Figure 5-22:Performance of Baddegama model validation-log plot	75
Figure 5-23:FDC of Thawalama model-validation-both sorted	76
Figure 5-24:FDC of Thawalama model-validation-sort only observed	76
Figure 5-25:FDC of Baddegama model-validation-both sorted	77
Figure 5-26:FDC of Baddegama model-validation-sort only observed	77
Figure 5-27:Thawalama annual water balance error	78
Figure 5-28:Baddegama annual water balance error	78
Figure 5-29:Thawalama monthly average observed vs simulated SF	79
Figure 5-30:Thawalama seasonal behavior of observed and simulated SF	80

Figure 5-31:Baddegama monthly average observed vs simulated SF 81
Figure 5-32:Thawalama seasonal behavior of observed and simulated SF 82
Figure 5-33:SF vs RF at Thawalama from Baddegama transferred parameter [normal plot]-I
Figure 5-34:SF vs RF at Thawalama from Baddegama transferred parameter [normal plot]-II
Figure 5-35:SF vs RF at Thawalama from Baddegama transferred parameter [log plot]- I
Figure 5-36:SF vs RF at Thawalama from Baddegama transferred parameter [log plot]- II
Figure 5-37:FDC at Thawalama after parameter transferability-both sorted
Figure 5-38:Thawalama after parameter transferability-sort only observed SF 88
Figure 5-39:Annual water balance at Thawalama after transferability
Figure 5-40:SF vs RF at Baddegama from Thawalama transferred parameters [normal plot]-I
Figure 5-41:SF vs RF at Baddegama from Thawalama transferred parameters [normal plot]-II
Figure 5-42:SF vs RF at Baddegama from Thawalama transferred parameters [log plot]-I
Figure 5-43:SF vs RF at Baddegama from Thawalama transferred parameters [log plot]-II
Figure 5-44:FDC at Baddegama after parameter transferability-both sorted95
Figure 5-45:FDC at Baddegama after parameter transferability-Sort only observed 95
Figure 5-46:Annual water balance at Baddegama after parameter transferability 96
Figure A 1:SF vs RF at each station at Thawalama watershed-(2007/08) 124
Figure A 2:SF vs RF at each station at Thawalama watershed-(2008/09) 125

Figure A 3:SF vs RF at each station at Thawalama watershed-(2009/10)	126
Figure A 4:SF vs RF at each station at Thawalama watershed-(2010/11)	127
Figure A 5:SF vs RF at each station at Thawalama watershed-(2011/12)	128
Figure A 6:SF vs RF at each station at Thawalama watershed-(2012/13)	129
Figure A 7:SF vs Rf at each station at Thawalama watershed-(2013/14)	130
Figure A 8:SF vs RF at each station at Thawalama watershed-(2014/15)	131
Figure A 9:SF vs RF at each station at Thawalama watershed-(2016/17)	132
Figure A 10:SF vs RF at each station at Baddegama watershed-(2007/08)	133
Figure A 11:SF vs RF at each station at Baddegama watershed-(2008/09)	134
Figure A 12:SF vs RF at each station at Baddegama watershed-(2009/10)	135
Figure A 13:SF vs RF at each station at Baddegama watershed-(2010/11)	136
Figure A 14:SF vs RF at each station at Baddegama watershed-(2011/12)	137
Figure A 15:SF vs RF at each station at Baddegama watershed-(2012/13)	138
Figure A 16:SF vs RF at each station at Baddegama watershed-(2013/14)	139
Figure A 17:SF vs RF at each station at Baddegama watershed-(2014/15)	140
Figure A 18:SF vs RF at each station at Baddegama watershed-(2016/17)	141
Figure B 1:Double mass curves for rainfall stations	144
Figure B 2:Double mass curves for streamflow and evaporation stations	145
Figure C 1:Comparison of model and manual calculation of rainfall	147
Figure D 1:Flow hydrograph matching for each objective function-I	150
Figure D 2:Flow hydrograph matching for each objective function-II	151
Figure D 3:Flow hydrograph matching indicator for each objective function	151
Figure D 4:FDC matching for each objective function-I	152
Figure D 5:FDC matching for each objective function-II	153
Figure D 6:FDC matching for each objective function-III	154

Figure D 7:FDC matching for high, medium and low flows for each objective function
Figure D 8:Monthly simulated vs observed SF for each objective function-I 155
Figure D 9:Monthly simulated vs observed SF for each objective function-II 156
Figure E 1:Soil moisture level during warm-up period at Thawalama
Figure E 2:Soil moisture level during warm-up period at Baddegama
Figure E 3:Flow component during warm-up at Thawalama
Figure E 4:Flow component during warm-up at Baddegama

LIST OF TABLES

Table 2-1:Model selection-initial shortlisting evaluation	12
Table 2-2:Model selection-detailed shortlisting evaluation	13
Table 2-3:Judgments for model classification	14
Table 4-1:Locations of gauging stations	29
Table 4-2:Data source and resolution	29
Table 4-3:Distribution of gauging stations at Thawalama and Baddegama	30
Table 4-4:Thiessen weights for Thawalama watershed	30
Table 4-5:Thiessen weights for Baddegama watershed	31
Table 4-6:Annual water walance of Thawalama watershed	32
Table 4-7:Annual water balance of Baddegama watershed	34
Table 4-8:Comparison of monthly average rainfall	45
Table 4-9:Thiessen weights for data filling scenarios	48
Table 5-1:Weighted CN calculation for Thawalama watershed	52
Table 5-2:Weighted CN calculation for Baddegama watershed	53
Table 5-3:Selected initial parameters and values for watersheds	54
Table 5-4:Comparison of model calibration results	59
Table 5-5:Optimized parameters of Thawalama and Baddegama	59
Table 5-6:Thawalama monthly average mass balance error	67
Table 5-7:Thawalama seasonal error at each water year	68
Table 5-8:Baddegama monthly average mass balance error	69
Table 5-9:Baddegama seasonal error at each water year	70
Table 5-10:Comparison of model validation results	71
Table 5-11:Thawalama monthly mass balance error	79

Table 5-12:Thawalama seasonal error at each water year
Table 5-13:Baddegama monthly mass balance error
Table 5-14:Baddegama seasonal error at each water year
Table 5-15:Model performance after calibrated parameter transferring from Baddegama to Thawalama watershed
Table 5-16:Model performance after calibrated parameter transferring from Thawalama to Baddegama watershed
Table B 1:Variation of cumulative values
Table B 2:Variation of cumulative average values
Table D 1:Variation of error values corresponding to different minimum objective
function values

LIST OF ABBREVIATION

Abbreviation Description

FDC Flow Duration Curve

MRAE Mean Ratio of Absolute Error

MAR Mean Annual Rainfall

NEM North East Monsoon

NWSDB National Water Supply and Drainage Board

RAEM Ratio of Absolute Error to Mean Relative Error

RF Rainfall

RMSE Root Mean Square Error

SF Streamflow

SMA Soil Moisture Accounting

SWRM Sustainable Water Resources Management