EFFECT OF WATERSHED SUBDIVISION AND ANTECEDENT MOISTURE CONDITION ON HEC-HMS MODEL PERFORMANCE IN THE MAHA OYA BASIN, SRI LANKA

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February 2017

DECLARATION

Dr. R. L. H. L. Rajapakse

I declare that this is my own work and this thesis does not incorporate without acknowledgement any material previously submitted for a Degree or Diploma in any other University or institute of higher learning and to the best of my knowledge and belief it does not contain any material previously published or written by another person except where the acknowledgement is made in the text.

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Date

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ABSTRACT

Effect of Watershed Subdivision and Antecedent Moisture Condition on HEC-HMS Model Performance in the Maha Oya Basin, Sri Lanka

Rainfall-Runoff models such as Hydrologic Modeling System (HEC-HMS) are used for predicting the hydrologic response of watersheds. Due to the effect of discretization, the model accuracy increases with number and watershed sub-divisions and the inferred level of soil saturation in the model. Therefore, an important issue that must be addressed by all users of these models is the determining of an appropriate level of watershed subdivision and Antecedent Moisture Condition (AMC) for runoff simulation.

The present research study was conducted in an attempt to find appropriate answers for the above two modelling issues. As a case study, the Badalgama watershed is selected as study area in the Maha Oya Basin in Sri Lanka. Spatial extent of Badalgama watershed is 1272 km^2 with an upstream river length of 96 km. Four rainfall stations and one river gauge station are selected in Badalgama watershed. Daily rainfall and streamflow data were used for calibration period from $2005 \sim 2008$ and for validation period from $2010 \sim 2013$.

River basin was divided into 3, 6, 9, and 16 number of subdivisions based on critical threshold area method using ArcGIS 10.5. Nash–Sutcliffe (NASH) and Mean Ratio of Absolute Error (MRAE) objective functions were selected as the evaluation criteria of the model. HEC-HMS modeling was carried out for different subdivisions and varying AMC conditions.

The result shows that with MRAE objective function, the accuracy of the model increased by 4.5% up to six subdivisions and with NASH, the accuracy increased by 4.2% with respect to the same lumped model. The accuracy of the model found to decrease for the model with six subdivisions to sixteen sub-divisions. The accuracy of the model with Antecedent Moisture Condition with AMC-III was found to increase by 12.04% as compared to AMC-II.

With the above findings, it is concluded that subdivision of watershed for modeling results in no more than modest improvements in prediction of low flow and medium flow simulation. As the result shows in the AMC analysis AMC-III produced improved accuracy of 12.04% in calibration period and 6.60% for validation period as compared to AMC-II. The event-wise estimation of AMC led to further increase in model accuracy.

In this research, the recession method was considered for the base flow simulation which led to a mass balance error exceeding 20%. Therefore, it is recommended apply linear reservoir method as base flow simulation method to further improve the modelling accuracy by conserving the water balance.

Keywords: Antecedent Moisture Condition, Hydrological modeling, Sensitivity analysis, Watershed subdivision

TABLE OF CONTENTS

DE	CLAR	ATI	ON	i
ACI	KNOV	VLE	DGEMENTS	ii
ABS	STRA	CT		. iii
LIS	TOF	APP	PENDIX	viii
LIS	T OF	FIG	URES	. ix
LIS	T OF	TAE	BLES	xiii
1.0	INT	ROL	DUCTION	1
	1.1	Bac	ckground of the study	1
	1.2	Hy	drological modeling in Sri Lanka	3
	1.3	Wh	ny hydrological models are needed?	4
	1.4	Cha	allenges of water situation in Sri Lanka	4
	1.4	4.1	Impact of climate change	4
	1.4	4.2	Water demand for agriculture sector	4
	1.4	4.3	Water demand for water supply sector	5
	1.5	Pro	blem statement	5
	1.6	Ob	jectives	5
	1.0	6.1	Overall objective	5
	1.0	6.2	Specific objectives	6
	1.7	Lin	nitations and scope of the research	6
2.0	LIT	ERA	ATURE REVEIW	7
	2.1	Ge	neral detail of hydrological model	7
	2.2	Tyl	pes of hydrological modeling	7
	2.2	2.1	Stochastic models	7
	2	2.2	Process-based models	8
	2.2	2.3	Lumped hydrologic models	8
	2.2	2.4	Semi-distributed hydrologic models	8
	2.2	2.5	Distributed hydrologic models	8
	2.3	Cla	assification of hydrological modeling	9
	2.4	HE	C-HMS Background	9
	2.4	4.1	Continues and event base simulation	10

	2.5 An	tecedent moisture condition
	2.5.1	Importance of soil moisture on runoff
	2.5.2	CN variability with antecedent moisture condition
	2.5.3	Major weaknesses in AMC
	2.6 Sca	ale effect in modeling
	2.6.1	Issue of scale in hydrologic modeling
	2.7 Ob	jective function
	2.7.1	Nash-Sutcliffe efficiency
	2.7.2	Coefficient of determination (R ²)
	2.7.3	Mean absolute error (MAE)
	2.7.4	Mean squared error (MSE)
	2.7.5	Ratio of Absolute Error to Mean
	2.7.6	Mean Ratio of Absolute Error (MRAE)
	2.8 Ch	aracteristics of objective functions
	2.9 Ide	entification of hydrological model
	2.9.1	Calibration of hydrological model
	2.9.2	Manual calibration
	2.9.3	Automatic calibration
	2.9.4	Verification of hydrological model
	2.10 Ser	nsitivity analysis
3.0	MATER	IALS AND METHODOLOGIES22
	3.1 Ge	neral
	3.2 Stu	dy area
	3.3 Da	ta and data source
	3.4 Da	ta checking
	3.4.1	Details of missing data
	3.4.2	Thiessen rainfall
	3.4.3	Visual data checking
	3.5 Fil	ling in of missing data
	3.5.1	Annual water balance
	3.5.2	Variation of annual runoff coefficients
	3.5.3	Variation of annual rainfall and streamflow

	3.5.4	Comparison of annual rainfall.	36
	3.5.5	Double mass curve	37
	3.6 Res	search methodology	38
	3.6.1	Development of the basin model	41
	3.6.2	Development of the precipitation loss model	41
	3.6.3	Development of transform model	41
	3.6.4	Development of baseflow model	42
	3.6.5	Development of precipitation model	43
	3.6.6	Control specification	43
	3.6.7	Model calibration	43
	3.7 De	velopment of model considering antecedent moisture condition	44
	3.7.1	Calculation of model parameters	44
	3.7.2	Development of HEC-HMS model for AMC	47
4.0	RESULT	S AND DISCUSSION	48
	4.1 Ge	neral detail	48
	4.2 Cal	libration for Badalgama lumped model	48
	4.2.1	Statistical goodness of fit measures for initial parameters	48
	4.3 Par	ameters sensitivity analysis	52
	4.4 Op	timization of parameters	53
	4.5 Lui	mped model result for optimum parameters in calibration period	59
	4.5.1	Annual water balance	59
	4.5.2	Flow duration curve in calibration period	60
	4.5.3	Outflow hydrograph	63
	4.6 Lui	mped model result for optimum parameters in validation period	65
	4.6.1	Annual water balance	65
	4.6.2	Flow duration curve for validation period	66
	4.6.3	Outflow hydrograph	67
	4.7 Dis	stributed model	70
	4.7.1	Three subdivision model result in calibration period	70
	4.7.2	of three subdivisions model result in validation period	76
	4.7.3	Six subdivisions model result in calibration period	80
	4.7.4	Six subdivisions model result in validation period	. 86

	4.7	7.5	Nine subdivision model result in calibration period	91
	4.7	7.6	Nine subdivisions model result in validation period	97
	4.7	7.7	Sixteen subdivisions model result in calibration period	. 102
	4.7	7.8	Sixteen subdivisions model result in validation period	. 108
	4.8	Cor	mparison of model calibration results	. 113
	4.8	3.1	Flow comparisons	. 113
	4.9	Cor	mparison of model in validation period	. 117
	4.9	9.1	Flow comparisons	. 117
	4.10	Cor	mparison of annual mass balance errors	. 120
	4.1	10.1	Comparison of annual mass balance errors in calibration	. 120
	4.1	10.2	Comparison of annual mass balance errors in validation	. 121
	4.1	10.3	Statistical performance in calibration and validation period	. 122
	4.1	10.4	Comparisons of model parameters for Badalgama watershed	. 128
	4.11	Res	sult for the model of Antecedent Moisture Condition	. 128
	4.1	11.1	Result for calibration period	. 128
	4.1	11.2	Result for validation period	. 129
	4.12	Dis	cussions	. 130
	4.1	12.1	Data and data period	. 130
	4.1	12.2	Existence of data error	. 131
	4.1	12.3	Selection of model parameters and objective function	. 131
	4.1	12.4	Model development and sensitivity analysis	. 131
	4.1	12.5	Subdivisions of the watershed	. 131
	4.1	12.6	Evaluation criteria of model in calibration period	. 132
	4.1	12.7	Evaluation criteria of model in validation period	. 133
	4.1	12.8	Matching flow duration curve	. 133
	4.1	12.9	Comparison of flow residuals	. 134
	4.1	12.10	Data and data period for Antecedent Moisture Conditions	. 136
	4.1	12.11	Evaluation criteria for AMC calculations	. 136
	4.1	12.12	Evaluation of AMC model	. 136
5.0	CON	CLU	USION AND RECOMMENDATIONS	. 137
	5.1	Cor	nclusion	. 137
	5.2	Rec	commendations	. 138

LIST OF REFERENCES 13		
LIST OF APPENDIX		
Appendix A: Visual checking of data without filling missing data in calibration period		
Appendix B: Single mass curve without filling missing data in calibration validation period		
Appendix C: Parameters of lumped and subdivision model and thiessen w	eight 166	
Appendix D: Statically T-test for lumped and six subdivisions	176	
Appendix E: Watershed subdivisions approach	180	
Appendix F: Evaluation criteria for AMC calculations	183	

LIST OF FIGURES

Figure 2-1: Variation of SCS CN with AMC	. 12
Figure 3-1: Study area of Badalgama watershed	. 22
Figure 3-2: Land use classification for Badalgama watershed	. 24
Figure 3-3: Thiessen polygons for Badalgama Watershed	. 26
Figure 3- 4: Streamflow response to rainfall without filling missing data in 2005	. 28
Figure 3-5: Streamflow response to rainfall without filling missing data in 2011	. 29
Figure 3-6: Streamflow response to rainfall after filling missing data in 2005	. 30
Figure 3-7: Streamflow response to rainfall after filling missing data for 2011	. 31
Figure 3-8: Single mass curve without filling missing data	. 32
Figure 3-9: Single mass curves after filling in the missing data	. 33
Figure 3-10: Annual water balance for Badalgama watershed	. 34
Figure 3-11: Variation of annual runoff coefficient of Badalgama watershed	. 35
Figure 3-12: Variation of annual rainfall and streamflow for Badalgama watershed	136
Figure 3-13: Comparison of annual rainfall	. 37
Figure 3-14: Double mass curves for each rainfall gauging station	. 38
Figure 3-15: Methodology flow chart	. 40
Figure 3-16: Time of concentration	. 42
Figure 3-17: Soil classification	. 45
Figure 4-1: Flow duration curve for initial parameters	. 49
Figure 4-2: Flow duration curve of initial parameters in calibration period	. 50
Figure 4-3: Hydrograph result of initial parameters in calibration period	. 51
Figure 4-4: Parameters sensitivity analysis	. 52
Figure 4-5: Global optimization for soil percolation and soil storage	. 58
Figure 4-6: Global optimization for soil storage and ratio to peak parameter	. 59
Figure 4-7: Annual water balance of lumped model in calibration period	. 60
Figure 4-8: Flow duration curve in calibration period Badalgama watershed	. 61
Figure 4-9: Flow duration curve for each year in calibration period	. 62
Figure 4-10: Hydrograph for calibration period	63

Figure 4-11: Hydrograph of lumped model in calibration period6	54
Figure 4-12: Annual water balance for validation period of lumped model6	55
Figure 4-13: Flow duration curve of lumped model in validation period6	56
Figure 4-14: Hydrograph of lumped model in validation period6	57
Figure 4-15: Flow duration curve at each year of lumped model in validation period ϵ	
Figure 4-16: Hydrograph of lumped model in validation period6	59
Figure 4-17: Three subdivisions of Badalgama watershed	70
Figure 4-18: Annual water balance for three subdivisions in calibration period7	72
Figure 4-19: Flow duration curve for three subdivisions model in calibration period	
Figure 4-20: Hydrograph for three subdivisions model in calibration period	73
Figure 4-21: Flow duration curve for three sub divisions model in calibration period	
Figure 4-22: Hydrograph for three subdivisions model in calibration period	75
Figure 4-23: Annual water balance for three subdivisions model in validation period	
Figure 4-24: Flow duration curve for three sub divisions model in validation period	
Figure 4-25: Hydrograph for three subdivisions model in validation period	77
Figure 4-26: Flow duration curve for three subdivisions model in validation period 7	78
Figure 4-27: Hydrograph for three subdivisions model in validation period7	79
Figure 4-28: Six sub division of Badalgama watershed	30
Figure 4-29: Schematic diagram for six sub divisions model in HEC-HMS	31
Figure 4-30: Annual water balance for six subdivisions model in calibration period 8	32
Figure 4-31: Flow duration curve for six sub divisions model in calibration period 8	32
Figure 4-32: Hydrograph for six sub divisions model in calibration period	33
Figure 4-33: Flow duration curve for six subdivisions model in calibration period 8	34
Figure 4-34: Hydrograph for six subdivisions model in calibration period	35
Figure 4-35: Annual water balance for six subdivisions model in validation period 8	36
Figure 4-36: Flow duration curve for six subdivisions model in validation period 8	37
Figure 4-37: Hydrograph for the model of six subdivisions in validation period	38

Figure 4-38: Flow duration curve for six subdivisions model in validation period 89
Figure 4-39: Hydrograph for six subdivisions model in validation period90
Figure 4-40: Delineation of nine subdivisions for Badalgama watershed
Figure 4-41: Schematic diagram of nine subdivisions in HEC HMS
Figure 4-42: Annual water balance for nine subdivisions model in calibration period
Figure 4-43: Flow duration curve for nine sub divisions model in calibration period93
Figure 4-44: Hydrograph for nine sub divisions model in calibration period 94
Figure 4-45: Flow duration curve for nine sub divisions model in calibration period
Figure 4-46: Hydrograph for nine sub divisions model in calibration period 96
Figure 4-47: Annual water balance for nine sub divisions model in validation period
Figure 4-48: Flow duration curve for nine sub divisions model in validation period 98
Figure 4-49: Hydrograph for the model of nine subdivisions in validation period 99
Figure 4-50: Flow duration curve for nine sub divisions model in validation period100
Figure 4-51: Hydrograph for nine sub divisions model in validation period 101
Figure 4-52: Sixteen subdivisions in Badalgama watershed
Figure 4-53: HEC-HMS schematic diagram of sixteen subdivisions model in Badalgama watershed
Figure 4-54: Annual water balance for sixteen sub divisions model in calibration period
Figure 4-55: Flow duration curve for sixteen sub divisions model in calibration period
Figure 4-56: Hydrograph of sixteen sub divisions model in calibration period 105
Figure 4-57: Flow duration curve for sixteen sub divisions model in calibration period
Figure 4-58: Hydrograph for sixteen sub divisions model in calibration period 107
Figure 4-59: Annual water balance for sixteen sub divisions model in validation period

Figure 4-60:	Flow duration curve for sixteen sub divisions model in validation period
Figure 4-61:	Hydrograph for the model of sixteen sub divisions in validation period
Figure 4-62:	Flow duration curve for sixteen sub division model in validation period
Figure 4-63:	Hydrograph for sixteen sub divisions model in validation period 112
Figure 4-64:	Performance comparison for high flow in calibration period
Figure 4-65:	Performance comparison for medium flow in calibration period 115
Figure 4-66:	Performance for low flow in calibration period
Figure 4-67:	Performance comparison for high flow in validation period
Figure 4-68:	Performance comparison for medium flow in validation period 119
Figure 4-69:	Performance comparison for low flow in validation period
Figure 4-70:	Comparison of annual mass balance error (%) in for calibration period
Figure 4-71:	Comparison of annual mass balance error (%) in validation period 122
Figure 4-72:	Performance comparisons of statically in calibration period 124
Figure 4-73:	Overall comparison of statically performance in calibration period 125
Figure 4-74:	Statically performance comparison in validation
Figure 4-75:	Overall comparisons of statically performance in Validation 127
Figure 4-76:	Performance for the model of different AMC condition in calibration period
Figure 4-77:	Performance for the model for different AMC condition in validation period
Figure 4-78:	Variation of streamflow residuals of lumped model in calibration period
Figure 4-79:	Variation of streamflow residuals of six subdivisions model in calibration period.

LIST OF TABLES

Table 2-1: Variation of SCS CN with AMC	13
Table 3-1: Location of gauging stations in Badalgama watershed	23
Table 3-2: Data sources and resolutions	23
Table 3-3: Land use classification for Badalgama watershed	24
Table 3-4: Details of missing data	25
Table 3-5: Thiessen weight of rain gauging stations for Badalgama watershed	26
Table 3-6: Slope factor estimated for rainfall stations in 2005	33
Table 3-7: Annual water balance in Badalgama watershed	34
Table 3-8: Variation of annual runoff coefficient of Badalgama watershed	35
Table 3-9: Comparison of annual rainfall	37
Table 3-10: Parameters for loss model	41
Table 3-11: Time of concentration and lag time calculation	42
Table 3-12: Thiessen weight of rainfall stations	43
Table 3-13: CN value for land use classes	45
Table 3-14: Curve number for Badalgama watershed	46
Table 3-15: Limitation of AMC value SCS	46
Table 3-16: Calculations of Antecedent moisture conditions value	47
Table 3-17: Summary of AMC lumped model	47
Table 4-1: Calibration result for initial parameters 49	
Table 4-2: Manual calibrated parameters values	53
Table 4-3: Initial parameters values	54
Table 4-4: Result by changing overall flow parameters	55
Table 4-5: Result by changing loss parameters	55
Table 4-6: Result by changing base flow parameters	55
Table 4-7: Result by changing surface flow parameters	56
Table 4-8: Optimized parameters value	57
Table 4-9: Global optimization for soil storage and ratio to peak parameters	58
Table 4-10: Global optimization for soil storage and ratio to peak parameter	59

Table 4-11: Annual water balance of lumped model in calibration period
Table 4-12: Model performance for calibration for different flow condition 61
Table 4-13: Model performance for lumped model in calibration period
Table 4-14: Annual water balance of lumped model in validation period 65
Table 4-15: Performance for lumped model for validation period
Table 4-16: Rainfall gauge weight for three subdivisions
Table 4-17: Annual water balance for three subdivisions in calibration period 71
Table 4-18: Three sub divisions result in calibration period
Table 4-19: Annual water balance for three subdivisions model in validation period
Table 4-20: Thiessen weight for six sub divisions
Table 4-21: Annual water balance for six subdivisions model in calibration period. 81
Table 4-22: Flow duration curve result for different flow condition
Table 4-23: Model performance for six sub divisions model in calibration period 83
Table 4-24: Annual water balance for six subdivisions model in validation period 86
Table 4-25: Performance for the model of six subdivisions in validation period 87
Table 4-26: Annual water balance for nine subdivisions model in calibration period
Table 4-27: Performance of nine sub divisions model at different flow condition in
calibration period
Table 4-28: Annual water balance for nine sub divisions model in validation period97
Table 4-29: Performance of nine sub divisions model in validation period 98
Table 4-30: Annual water balance for sixteen sub divisions model in calibration period
Table 4-31: Performance of sixteen sub divisions model in calibration period 104
Table 4-32: Annual water balance for sixteen sub divisions model in validation period
Table 4-33: Performance of sixteen sub divisions model at different flow condition in validation period
Table 4-34: Performance comparison for high flow in calibration period
Table 4-35: Performance comparison for medium flow in calibration period 114

Table 4-36: Performance comparison for low flow in calibration period	15
Table 4-37: Performance comparison for high flow in validation period	17
Table 4-38: Performance comparison for medium flow in validation period 1	18
Table 4-39: Performance comparison for low flow in validation period	19
Table 4-40: Comparison of annual mass balance error (%) in calibration period 1	21
Table 4-41: Comparison of annual mass balance error (%) in validation period 1	22
Table 4-42: Statistical performance comparison in calibration period	23
Table 4-43: Overall comparison of statically performance in validation period 1	25
Table 4-44:Summary of AMC for six subdivisions and lumped model 1	28
Table 4-45: Performance of the model for different AMC condition in calibration period	
Table 4-46: Models performance for calibration period	32
Table 4-47: Models performance in validation period	33
Table 4-48: Performance for different flow region in calibration period of six subdivisions model	34