

WATER SUPPLY RESERVOIR OPERATION IN THE FRAMEWORK OF CLIMATE VARIABILITY AND CHANGE

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CLIMATE VARIABILITY AND CHANGE

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To my beloved family...

mek

siti noor rashidah abdul rahim

muhammad nasrizal, muhammad irfan, muhammad imran

fatini, farzana

brothers, sisters, and in-laws

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ABSTRACT

The optimal planning and operation of a reservoir system is getting more crucial particularly in view of the recent awareness of potential climate change. In particular, the incorporation of hydrologic uncertainties due to climate change into reservoir operation system requires comprehensive and long-term hydrological database which rarely available in most of the conventional reservoir design. The prime objective of the study is to formulate a multiple approach on the long-term reservoir operation optimization under the scarcity of observed hydrological data and with the influence of climate change. A combined research method using IHACRES for hydrological simulation, HadCM3 for emission scenario and Statistical Downscaling Model were developed along with a Mixed Integer Linear Programming (MILP) for reservoir operation optimization. These approaches were applied to a single purpose Sg Layang Reservoir, that is one of the most prominent water supply reservoir located in Johor State, Malaysia. The climatic variables obtained from general circulation model (GCM) were downscaled corresponding to HadCM3 emission scenario and used in climate change impact analysis. The SDSM was used to produce 100 synthetic climate time-series for 90 years of the participating station, representing the climate change projection and baseline period. With respect to the baseline data, an apparent increase in temperature (1.2 degree Celsius between time periods) and rainfall was observed. The deterministic optimization exercise is performed repetitively for a number of case scenarios based on weekly reservoir's inflows derived from the projected climate change in a way to determine the optimal operation rule and policy which are based on total pumping volume and pumping cost. Corresponded to the future inflows, the pumping volume has shown an increase trend particularly during southwest monsoon, transition between seasons and autumn. Judged from the decreasing rate of the streamflows, a 34 to 40% increase in the projected monthly pumping volume is anticipated. An opposite scenario is observed during northeast monsoon season which shows a decreasing trend of 28% to 46%. At various degree of statistical reliability, the optimal operational pumping curves of the reservoir were established. These curves provide some basic information on the monthly pumping requirement from various sources of inflow to sustain the reservoir storage and demand. These operation curves are of very useful guidelines for reservoir operators in making decision to follow an optimal pumping operations schedule onsite. Such research findings were expected to generate a general awareness to the public water authorities on the potential long term effect of climate change to the reliability of reservoir operating system.

ABSTRAK

Kepentingan pengoptimuman operasi dan perancangan pengurusan sistem takungan telah meningkat terutamanya dengan kesedaran terhadap kesan potensi perubahan iklim. Khususnya, gabungan faktor ketidakpastian hidrologi disebabkan oleh perubahan iklim terhadap operasi sistem takungan memerlukan pengkalan data hidrologi yang komprehensif yang jarang terdapat dalam kebanyakan takungan konvensional. Objektif utama kajian ini ialah untuk merumuskan satu pendekatan pelbagai bagi pengoptimuman operasi takungan jangka panjang pada keadaan kekurangan data cerapan hidrologi dibawah pengaruh perubahan iklim. Gabungan kaedah kajian menggunakan IHACRES sebagai model simulasi hidrologi, senario pemancaran dari HadCM3 bagi model penurunan skala statistik (SDSM) telah dibangunkan bersama Program Integer Linear Bercampur (MILP) untuk menghasilkan operasi reservoir yang optimal. Pendekatan kajian ini diaplikasikan keatas takungan bertujuan tunggal Reservoir Sg Layang, iaitu satu takungan bekalan sumber air penting di Negeri Johor, Malaysia. Pemboleh-ubah iklim dari model peredaran umum (GCM) diturunkan skalanya selaras dengan senario HadCM3 bagi kegunaan didalam analisis impak perubahan iklim. SDSM dipilih untuk menghasilkan 100 siri data iklim sintetik bertempoh 90 tahun untuk setiap stesen pilihan yang mewakili ramalan perubahan iklim dan tempoh iklim dasar. Daripada rujukan terhadap data dasar, satu peningkatan jelas dalam suhu bagi semua musim (1.2 darjah Celsius antara sela masa) dan hujan telah ditunjukkan. Proses pengoptimuman dijalankan secara berulang bagi pelbagai kes senario dengan menggunakan siri data kadar alir mingguan yang dijanakan bagi memperolehi polisi operasi reservoir yang optimal berasaskan isipadu dan kos pengepaman. Hasil daripada aliran masuk masa depan yang dijanakan, jumlah isipadu pengepaman menunjukkan corak menaik terutama semasa monsun baratdaya, peralihan antara musim-musim dan musim luruh. Dinilai dari penyusutan kadar aliran sungai, satu unjuran peningkatan jumlah isipadu pengepaman bulanan diantara 34% hingga 40% telah dijangkakan. Sebaliknya pada musim timurlaut anggaran kadar pengepaman bulanan menurun diantara 28% hingga 46%. Dari berbagai tahap keboleharapan statistik, lengkung operasi optimal pengepaman ke takungan diterbitkan. Lengkung operasi ini menyediakan panduan operasi berkenaan keperluan pengepaman bulanan dari berbagai sumber aliran masuk bagi mengekalkan simpanan reservoir dan memenuhi permintaan semasa. Lengkung operasi ini juga boleh dijadikan sebagai garis panduan yang berguna kepada pengendali takungan untuk menentukan penjadualan operasi pengepaman yang optima ditapak. Hasil kajian ini dijangka mampu menjana kesedaran umum kepada pihak berkuasa bekalan air diatas potensi kesan jangka panjang dari perubahan iklim terhadap kebolehpercayaan sistem pengendalian takungan.

TABLE OF CONTENTS

CHAPTER	TITLE	PAGE
	DECLARATION	ii
	DEDICATION	iii
	ACKNOWLEDGEMENTS	iv
	ABSTRACT	v
	ABSTRAK	vi
	TABLE OF CONTENTS	vii
	LIST OF TABLES	xiii
	LIST OF FIGURES	xvi
	LIST OF SYMBOLS	xxiii
	LIST OF ABBREVIATIONS	xxiv
	LIST OF APPENDICES	xxvi
1	INTRODUCTION	1
	1.1 Background of Study	1
	1.2 Statement of the Problem	2
	1.3 Objective of the Study	4
	1.4 Research Approach and Scope of Work	5
	1.5 Significance of the Study	6
	1.6 Thesis Outline	8
2	LITERATURE REVIEWS	11
	2.1 Rainfall Runoff Modeling in Reservoir Inflow Simulation and Climate Change Studies	11
	2.1.1 Rainfall Runoff Relationships	12

2.1.2	Classification of Rainfall Runoff Models	13
2.1.2.1	Empirical Models	14
2.1.2.2	Lumped Conceptual Models	16
2.1.2.3	Distributed, Physically-based Models	20
2.2	Climate change and downscaling methods	24
2.2.1	Global Climate Models	24
2.2.2	Emission Scenarios	27
2.2.3	Baseline Climate	29
2.2.4	Downscaling Methods and Tools	30
2.2.4.1	Dynamical Downscaling	32
2.2.4.2	Statistical Downscaling	34
2.2.4.3	Downscaling Models	43
2.2.5	Artificial Neural Networks	46
	Downscaling Methods	
2.3	Reservoir Operation and Optimization	49
2.3.1	Optimization Models in Reservoir Operation	50
2.3.1.1	Linear Programming (LP)	50
2.3.1.2	Nonlinear Programming (NLP)	53
2.3.1.3	Dynamic Programming (DP)	54
2.3.1.4	Evolutionary Computation (EC)	58
2.4	Summary of Literature Review	59
2.4.1	Summary on Rainfall-runoff Modeling and Model Selection	59
2.4.2	Summary on Climate Change and Downscaling Methods	60
2.4.3	Summary on Optimization Models in Reservoir Operation	61

3	STUDY AREA AND DATA AVAILABILITY	63
3.1	Description of Study Area	63
3.2	Data Availability	68
3.2.1	Reservoir Characteristics Data	68
3.2.2	Net Reservoir Inflow Data Analysis	71
3.2.3	Rainfall	73
3.2.4	Temperature	87
3.2.5	Evaporation	88
3.2.6	Streamflow	88
3.2.7	Meteorological Data for Climate Study	89
4	METHODOLOGY	95
4.1	Hydrological Analysis	95
4.1.1	Water Balance Analysis	95
4.1.2	Rainfall- Runoff Modeling	97
4.1.2.1	Rainfall-Runoff Model Selection	98
4.1.2.2	IHACRES Model Description	100
4.1.2.3	Model Calibration from Historical Catchment Data	104
4.1.2.4	Regionalization	106
4.1.2.5	Model Performance Analysis	108
4.2	Climate Change and Downscaling Methods	110
4.2.1	General	112
4.2.2	Historical Trend Analysis and Rainfall Indices	112
4.2.3	Implementation of Downscaling Methods	116
4.2.3.1	General Circulation Model (GCM) and Emission	117

	Scenario	
4.2.3.2	Climate Data	118
4.2.3.3	Statistical Downscaling	119
	Model	
4.2.3.4	Artificial Neural Network	122
4.2.4	Model Evaluation and Uncertainties	131
	Analyses	
4.2.4.1	Non-parametric Tests for the Difference of Two Population Means	132
4.2.4.2	Non-parametric Tests for the Equality of Two Population Variance	133
4.2.4.3	Goodness-of-fit test	134
4.2.5	Climate Change Scenarios	135
4.3	Reservoir Operation Systems	136
4.3.1	Model Formulation for Reservoir Operation Optimization	137
4.3.1.1	Objective Function	138
4.3.1.2	Constraint Equations	139
4.3.2	Input Data	142
4.3.2.1	Catchment Surface Inflow Volume	143
4.3.2.2	System Demand	144
4.3.2.3	Electricity Tariff Schedule	144
4.3.2.4	Storage-Area Curve	145
4.4	Summary	147
5	RESULTS AND DISCUSSION	149
5.1	Hydrological Analysis	149
5.1.1	Water Balance Analysis	150
5.1.2	Rainfall- Runoff Modeling	153
5.1.2.1	Hydrological Model	153

	Development from Historical Data	
	5.1.2.2 Regionalization	158
5.1.3	Model Performance Analysis	169
5.1.4	Summary	171
5.2	Climate Change Statistical Downscaling	172
5.2.1	Trend Analysis of Historical Data and Downscaled Rainfall	172
5.2.2	Downscaling Results	178
	5.2.2.1 Statistical Downscaling Climate Model Analysis	178
	5.2.2.2 Fixed Forward Neural Network	188
5.2.3	Model Evaluation and Uncertainties Analysis	202
	5.2.3.1 Error Evaluation in the Estimates of Means	202
	5.2.3.2 Error Evaluation in the Estimate of Variances	207
	5.2.3.3 Distribution of Monthly Mean of Daily Rainfall and Temperature	211
	5.2.3.4 Summary	214
5.2.4	Climate Change Scenario	216
	5.2.4.1 Downscaling the GCM for the Current Climate Period	216
	5.2.4.2 Downscaling the GCM for Future Climate Scenario	217
5.3	Flow Simulation	219
5.3.1	Flow Simulation for Current Climate Conditions	220
5.3.2	Flow Simulation Under Future Climate Conditions	220

5.4	Water Supply Reservoir Optimization and Management	223
5.4.1	Optimization of Current Operations	223
5.4.2	Model Optimization of Alternative Scenarios	224
5.5	Summary	231
6	CONCLUSIONS AND FUTURE WORKS	233
6.1	Conclusions	233
6.1.1	Rainfall-runoff Modeling	234
6.1.2	Climate change Downscaling Analysis	236
6.1.3	Reservoir Operation	239
6.2	Future Work	240
	REFERENCES	243
	Appendices A - E	283 - 335

LIST OF TABLES

TABLE NO.	TITLE	PAGE
2.1	Name, institution, and resolution of coupled atmospheric general circulation models	26
2.2	Large scale predictor variables	35
2.3	Main strengths and weaknesses of statistical and dynamical downscaling	37
3.1	Basic features of Upper Sg Layang Reservoir	69
3.2	Historical average monthly inputs and outputs of Sg Layang Reservoir	72
3.3	Selected observation stations for rainfall statistical indices analyses	74
3.4	Hydrometeorological stations used in modeling	83
3.5	Calibration and validation periods	85
3.6	Rainfall stations weightage	85
3.7	Meteorological station detail	87
3.8	Summary of evaporation data	88
3.9	Streamflow station for regionalization hydrologic model	89
3.10	Large scale predictor variables and their conventional file name selected for NCEP on HadCM3 grid and SDSM	90
4.1	IHACRES model parameters	104
4.2	Evaluation statistics and indices	113
5.1	Monthly average summary of reservoir water balance components	152
5.2	Calibrated model parameter values	155

5.3	Statistical performance criteria for catchments validation in regionalization	165
5.4	Model parameters of different catchments for development of correlation in regionalization Approach	168
5.5	Model calibration and validation performance Criteria	170
5.6	Numerical comparison of precipitation indices	173
5.7	Selected large-scale predictor variables for statistical downscaling model	179
5.8	FFNN rainfall downscaling models with best performing network summary for RF1, RF2, RF3, and RF_{avg}	190
5.9	FFNN temperature downscaling models with best performing network summary for T_{avg} , T_{max} , and T_{min} at MMD48679	191
5.10	FFNNSL rainfall downscaling models with best performing network summary for RF1, RF2, RF3, and RF_{avg}	192
5.11	FFNNSL temperature downscaling models with best performing network summary for T_{avg} , T_{max} , and T_{min} at MMD48679	193
5.12	Wilcoxon rank sum test results (p -value) for the difference of means of observed and downscaled daily rainfall at 95% confidence level	205
5.13	Wilcoxon rank sum test results (p -value) for the difference of means of observed and downscaled daily temperature at 95% confidence level at station MMD48679	206
5.14	Levene's test results (p -value) for the equality of variances of observed and downscaled daily rainfall at 95% confidence level	210
5.15	Levene's test results (p -value) for the equality of variances of observed and downscaled daily	211

	temperature at 95% confidence level at station MMD48679	
5.16	Kolmogorov-Smirnov goodness-of-fit test results (p- value) of monthly mean of daily rainfall of observed and downscaled data	213
5.17	Kolmogorov-Smirnov goodness-of-fit test results (p- value) of monthly mean of daily temperature of observed and downscaled data for station MMD48679	214

LIST OF FIGURES

FIGURE NO.	TITLE	PAGE
2.1	Conceptual structure of a coupled atmosphere-ocean general circulation model	27
2.2	A schematic illustrating the basic principles of downscaling from GCM output	31
3.1	Schematic representation of Sg Layang Water Treatment Plant	65
3.2	Location map of study area	66
3.3	River network and cathment boundary of Sg Layang, Johor Bahru, Johor	67
3.4	Landuse types within the Upper and Lower Layang catchment areas	67
3.5	Various levels of Upper Sg Layang Reservoir	69
3.6	Sg Layang Reservoir capacity curve and area - elevation curve	70
3.7	Existing rule curve of Sg Layang Reservoir	71
3.8	Location of rainfall station for statistical indices analysis	74
3.9	Summary of rainfall data availability	75
3.10	Location of selected catchments for rainfall-runoff model calibration	77
3.11	Geographic representation of the Sungai Kesang catchment	78
3.12	Geographic representation of the Sungai Linggi catchment	78
3.13	Geographic representation of the Sungai Lui	79

	catchment	
3.14	Sungai Sayong catchment	79
3.15	Geographic representation of the Sungai Selangor catchment	80
3.16	Geographic representation of the Sungai Sembrong catchment	81
3.17	Geographic representation of the Sungai Tasoh catchment	82
3.18	Geographic representation of the Sungai Tebrau catchment	83
3.19	GCM Grid box with respect to study area and selected observation stations for statistical downscaling model and RegHCM Grid Station	92
3.20	Enlarged scale of GCM Grid showing the study area	93
4.1	Schematic of climate change impact study for reservoir operation	95
4.2	Schematic representation of IHACRES Model Structure	102
4.3	The FFNN architecture of a single hidden layer with three input units, three hidden units, and one output unit	123
4.4	Schematic of a single hidden layer feedforward neural network with skip layers connections	124
4.5	(a) Population and population growth rate of Johor Bahru, and (b) Future demand projection	144
4.6	(a) Current electricity tariff schedules and (b) estimated future electric rate schedule	145
4.7	Reservoir surface area – storage relationship and piecewise linear approximation	146
5.1	Inflows to the Sg Layang Reservoir ($RF = \text{Rainfall}$, $q_{1t} = \text{pumped volume from Sg Johor}$, and $q_{2t} = \text{total pumped volume from Lower Layang}$)	151
5.2	Outflows from the Sg Layang Reservoir ($TP_t =$	151

	Demand volume to treatment plant, E_t = Daily evaporation)	
5.3	Change in storage derived from reservoir volume – elevation curve	151
5.4	Total surface inflows to Sg Layang reservoir	152
5.5	hydro-meteorological data inputs (2004 2006) for model calibration (Top : Rainfall, Middle: Temperature, Bottom: Streamflow)	155
5.6	Observed and simulated daily flow in model calibration (Jan 2004 to Jan 2007)	156
5.7	Hydro-meteorological data inputs for model verification (Jan 2007 to Dec 2008) (Top : Rainfall, Middle: Temperature, Bottom: Streamflow)	157
5.8	Observed and simulated daily flow in model verification (Jan 2007 to Dec 2008)	157
5.9	Residual flow for model validation (2004 to 2008)	158
5.10	Results of simulation for Sg Kesang Catchment	159
5.11	Residual flow for model calibration period (1978 to 1986) – Sg Kesang catchment	160
5.12	Results of simulation for Sg Linggi Catchment	160
5.13	Residual flow for model calibration period (1986 to 1986) – Sg Linggi catchment	160
5.14	Results of simulation for Sg Lui Catchment	161
5.15	Residual flow for model calibration period (1977 to 1983) – Sg Lui catchment	161
5.16	Results of simulation for Sg Sayong Catchment	161
5.17	Residual flow for model calibration period (1989 to 1991) – Sg Sayong catchment	162
5.18	Results of simulation for Sg Selangor Catchment	162
5.19	Residual flow for model calibration period (1982 to 1987) – Sg Selangor catchment	162
5.20	Results of simulation for Sg Sembrong Catchment	163
5.21	Residual flow for model calibration period (1983 to	163

	1985) – Sg Sembrong catchment	
5.22	Results of simulation for Sg Tasoh Catchment	163
5.23	Residual flow for model calibration period (1980 to 1984) – Sg Tasoh catchment	164
5.24	Results of simulation for Sg Tebrau Catchment	164
5.25	Residual flow for model calibration period (1981 to 1982) – Sg Tebrau catchment	164
5.26	Correlation of mass balance term (c) and catchment area	165
5.27	Correlation of drying rate at reference temperature (t_w) and catchment area	165
5.28	Correlation of temperature dependence of drying rate (f) and catchment area	166
5.29	Correlation of recession rate ($\alpha(s)$) and catchment area	166
5.30	Correlation of peak response ($\beta(s)$) and catchment area	166
5.31	Correlation of time constant ($\tau(s)$) and catchment area	167
5.32	Comparison on average monthly total flow of modeling approaches	170
5.33	Comparison of model errors of modeling approaches	171
5.34	Trends of statistical indices (black solid line) for RF1-1539136 (Left), RF2-1539134 (Middle), and RF3-1538117 (Right), the red line with rectangular represents the observed records and black line with circle represents the mean annual time-series generated from SDSM	177
5.35	Calibration (left) and validation (right) results of SDSM regression downscaling of mean daily rainfall at RF1, RF2, RF3, and RF_{avg}	182
5.36	Model errors (absolute values) of calibration (left) and validation (right) results of SDSM regression Downscaling of daily rainfall at RF1, RF2, RF3, and RF_{avg}	183
5.37	Variances of calibration (left) and validation (right)	184

	results of SDSM regression downscaling of daily rainfall at RF1, RF2, RF3, and RF _{avg}	
5.38	Calibration (left) and validation (right) results of SDSM regression downscaling of mean daily temperature for T _{avg} , T _{max} , and T _{min} at MMD48679	185
5.39	Model errors (absolute values) of calibration (left) and validation (right) results of SDSM regression downscaling of mean daily temperature for T _{avg} , T _{max} , and T _{min} at MMD48679	186
5.40	Variances of calibration (left) and validation (right) results of SDSM regression downscaling of mean daily temperature for T _{avg} , T _{max} , and T _{min} at MMD48679	187
5.41	Training (left) and testing (right) results of ANN (with and without skip-layer) downscaling of mean daily rainfall at RF1, RF2, RF3, and RF _{avg}	196
5.42	Model errors (absolute values) of training (left) and testing (right) results of ANN (with and without skip-layer) downscaling of daily rainfall at RF1, RF2, RF3, and RF _{avg}	197
5.43	Variances of training (left) and testing (right) results of ANN (with and without skip-layer) downscaling of daily rainfall at RF1, RF2, RF3, and RF _{avg}	198
5.44	Training (left) and testing (right) results of ANN (with and without skip-layer) downscaling of mean daily temperature for T _{avg} , T _{max} , and T _{min} at MMD48679	199
5.45	Model errors (absolute values) of training (left) and testing (right) results of ANN (with and without skip-layer) downscaling of mean daily temperature for T _{avg} , T _{max} , and T _{min} at MMD48679	200
5.46	Variances of training (left) and testing (right) results of ANN (with and without skip-layer) downscaling of mean daily temperature for T _{avg} , T _{max} , and T _{min} at	201

	MMD48679	
5.47	Model errors in downscaled daily rainfall (1961 – 2001) and temperature (1975 – 2001) with NCEP variables.	204
5.48	Variances in downscaled daily rainfall (1961 – 2001) and temperature (1975 – 2001) with NCEP variables as compared to the observed	209
5.49	Mean daily rainfall at RF2 and temperature T_{avg} corresponding to a current period downscaled with SDSM	217
5.50	Mean daily rainfall at RF2 and temperature T_{avg} corresponding to a climate change scenario downscaled with SDSM	218
5.51	Change in monthly average temperature between the current period and future for HadCM3A2a	218
5.52	Average simulated meteorological inputs on current climate conditions	219
5.53	Average simulated daily inflows on current climate conditions	220
5.54	Downscaled climate data for future periods, top is for time slice of 2020s, middle is for time slice of 2050s, and bottom is for time slice of 2080s	221
5.55	Simulated inflows under future scenarios, top is for time slice of 2020s, middle is for time slice of 2050s, and bottom is for time slice of 2080s	222
5.56	Pumping cost comparison at current condition from 2004 to 2008	224
5.57	Simulation results for Scenario 1	226
5.58	Minimum, average and maximum pumping volume	226
5.59	Average monthly pumping and generated inflow	226
5.60	Comparison of pumping volume of actual operation and simulated operation using flow from current climate condition and climate change	227

5.61	Pumping operation curve with 90% reliability level	227
5.62	Simulation results for Scenario 2	228
5.63	Minimum, average and maximum pumping volume for Scenario 2	229
5.64	Pumping operation curve with various reliability levels	229
5.65	Simulation results for Scenario 3	230
5.66	Pumping operation curve with various reliability levels	231

LIST OF SYMBOLS

$\alpha^{(s)}$	-	Recession rate in linear module
$\beta^{(s)}$	-	Peak response in linear module
$\tau^{(s)}$	-	Slow flow time constant in linear module
ε_i	-	Modeling error
α_i	-	Weight from predictor-i (input) directly to output of skip layer connection
β_j	-	Connection weight from the j -th hidden node to the output node of ANN architecture
ω_{ji}	-	Bias weight in hidden layer of ANN architecture
β_o	-	Bias weight in output layer of ANN architecture
A_a	-	Area per unit active storage volume above dead storage
A_o	-	Reservoir surface area corresponding to the dead storage volume at 10m reservoir level
c	-	Mass balance parameter in non-linear module
e_t	-	Rate of evaporation
f	-	Temperature modulation parameter in non-linear module
h_j	-	Hidden node output of sigmoid function
Q_{in}	-	Total daily inflow
Q_t	-	Net surface inflow to reservoir during period t
t_w	-	Reference drying rate parameter in non-linear module
u_k	-	Effective rainfall
x_k	-	Streamflow
ΔS	-	Difference of reservoir storages
τ_k	-	Drying rate
ϕ_k	-	Soil moisture index

LIST OF ABBREVIATIONS

ANN	Artificial Neural Network
AOGCM	Atmosphere-Ocean General Circulation Model
DID	Malaysia Drainage and Irrigation Department
DP	Dynamic Programming
EC	Evolutionary Computation
EDA	Exploratory Data Analyses
FFNNSL	Feedforward Neural Network with skip layer connections
FFNN	Feedforward Neural Network without skip layer connections
GCM	General Circulation Model (Global Climate Model)
HadCM3	Hadley Center Coupled Model, version 3
INC	Malaysia's Initial National Communication
IPCC	Intergovernmental Panel on Climate Change
LAM	Limited-Area Model
LARS-WG	Long Ashton Research station Weather Generator
LP	Linear Programming
MILP	Mixed Integer Linear Programming
MMD	Malaysia Meteorological Department
NC2	Second National Communication
NCEP	National Center for Environmental Prediction
NLP	Non-Linear Programming
RCM	Regional Climate Model
RegHCM-PM	Regional Hydrologic-atmospheric Climate Model of Peninsular Malaysia
RF1	Rainfall Station at Station No 1539136
RF2	Rainfall Station at Station No. 1539134
RF3	Rainfall Station at Station No. 1538117

RF_{avg}	Average Rainfall
SDSM	Statistical Down-Scaling Model
SRES	Special Report on Emissions Scenario
T_{avg}	Average Temperature
TLFN	Time Lagged Feedforward Neural Network
T_{max}	Maximum Temperature
T_{min}	Minimum Temperature
UNFCCC	United Nations Framework Convention on Climate Change

LIST OF APPENDICES

APPENDIX	TITLE	PAGE
A	FFNNSL and FFNN in S-Plus	283
B	Trends for Statistical Indices	289
C	Simulation Results	298
D	FFNN and FFNNSL rainfall and temperature models	302
E	Programs Description and Flowchart	316

CHAPTER 1

INTRODUCTION

1.1 Background of Study

Urbanization processes is a continuing phenomenon not only in developing countries but also in developed countries. There has been increasing interest and concern on the use of our natural resources specifically water, that has been accorded as the highest priority in the global development agenda. Forests, plantations, grasslands and others are being continually converted into residential areas, commercial and industrial complexes, shopping centers and other facilities. One of the consequences of urbanization with which engineers, planners and decision makers should deal with is the increase demand of water supply for domestic and industrial usage that requires a greater emphasis in managing the water resources and water supply in an integrated manner.

The demand for a proper and appropriate water resources development and water supply services has increased steadily as a result of the rapid socio-economic development and environmental consciousness. As the population expands, rapid urbanization, industrial expansion and climate change, besides contributing to rising water pollution, the strains places on the earth's natural resources also increase.

There is a strong agreement among the scientific community that the climate change is taking place with evidence from the increase in earth's surface temperature due to greenhouse gas emissions. The Intergovernmental Panel on Climate Change (IPCC) for instance has reported that the average global temperature increases of

about 0.2°C per decade is anticipated over the next twenty years from the previous assessment of 0.6°C to 0.74°C (IPCC 2007). Changes in global climate would have significant impact on regional and local hydrological regimes in terms of key climatic variables, which in turn will affect the future water supply sources in the region. The Malaysia's Initial National Communication (INC) to the United Nations Framework Convention on Climate Change (UNFCCC) describes the quantitative impact of climate change to surface runoff. For instance, with 10% less rainfall and a 1°C increase in temperature the runoff would reduce between 13% to 35% and 14% to 43% during the wet and dry months, respectively. Similarly, when temperature rises by 3°C, the reduction in runoff ranges between 13% to 48% and 17% to 53% during the wet and dry periods, respectively (MOSTE, 2000). In the Second National Communication (NC2) report (NRE, 2010), emphasis is given to the water resources sector as a result of climate change projections that states the disruption of water supply is expected to occur in urban areas during extreme drought events.

With such climatic variation trend, it would be a great challenge for water resources managers to develop a comprehensive understanding of the expected impacts on climatic variability and change and its consequences to the water supply system. Subsequently, an optimal reservoir operation and management systems shall be planned in order to improve the management strategies for reliable water supply particularly during the long dry spells. The factors of future land used pattern and the predicted climatic conditions could be considered to accommodate the ever growing demand of freshwater supply as well as to avoid water shortages that may disrupt overall economic activities.

1.2 Statement of the Problem

As the total quantity of available water is finite with increasing demand at geometrical rates, Malaysia, a tropical country relatively rich in water resources, is not exempted from facing numerous water related problems, such as water shortages,

water pollution, and floods. It is reported that 98% of the total national water resources originates from surface water which easily be affected by long dry spells. A few incidents in the past where drought caused serious water rationing and hardship to 1.8 million residents of Kuala Lumpur and other townships in Klang Valley in 1998. In similar case, Malacca state also experienced water rationing in most part of the state when the level at Durian Tunggal Dam recedes to a critical level, i.e. the main water supply reservoir of the state, reached 50% of its capacity in 1991.

Recent local studies also suggest that due to climate change there is a likelihood of a uniform annual increase in temperature and caused the regional precipitation patterns vary considerably (Zakaria and Shaaban, 2007; Shaaban *et al.*, 2011) for most of the watersheds of the country. Regarding the annual rainfall, the east coast region is expected to experience 10% increase while the west coast and southern areas may drop by 5% (Zakaria and Shaaban, 2007). Similarly, the projected increase of annual surface temperature in between 1.0°C to 1.5°C for a future period of 25 years (Salmah and Liew, 2008; Tangang *et al.*, 2007) over all regions may have directly influenced the potential evapotranspiration and subsequently the quantity of the runoff component. Consequently, the availability of water resources in the region would be affected whereby in the past, many operational decisions depend explicitly on the assumptions about future climatic conditions. A few studies have been carried out to incorporate the variation of climate change factor in reservoir planning and operation (Eum and Simonovic, 2010; Karamouz *et al.*, 2012). Therefore there is a need to develop an integrated approach to consider these factors on climate change impact on streamflow and derive adaptive policies for possible optimal reservoir operation.

Considering the continual growth of urbanization and industrialization and the effect of climate change, an optimal operation of a water supply reservoir demands an immediate attention to ensure a long term availability and sustainability of water supply, including the conservation of water in future.

The reliability of a water supply reservoirs system depends on the appropriate rule for optimal operation. It is presumably a function of multiple and complex factors which basically governed by hydrologic uncertainties due to both supply-demand and climatic variability and change. Such generic understanding become the impetus of the present study with primary aim is to provide detail understanding through a case study of Sg Layang Reservoir.

1.3 Objectives of the Study

The principal objective of this study is to derive more realistic and reliable operational rules for a water supply reservoir system with multi-source dependent in a way to reduce the gap between theoretical assumptions and practical implementations. The specific objectives of this study that lead to a logical progression through the thesis have been identified and are summarized as follows:

1. To generate a long-term streamflow data of the study area for climate change scenario using conceptual model
2. To generate rainfall and temperature at catchment scale for climate change scenario using statistical downscaling model by employing climate variables of Global Circulation Model (GCM).
3. To evaluate the probable reservoir inflows in a way to investigate the possible changes in water availability under the framework of future climate variability and variation in pumping operation of multi-source reservoir system.
4. To develop a reservoir optimization model based on mixed integer linear programming algorithm to produce an optimal reservoir operation rules.

1.4 Research Approach and Scope of Work

The scope of the study is focused on the development of optimization model to derive a general monthly reservoir operating policy using historical data and to account the impacts of climate change and the uncertainties of inputs arise from the random nature of the inflows to the system in addition to other various sources.

The specific aims that lead to the model development and analysis of the proposed work can be summarized as follows:

- ◆ To assess the actual performance of the current reservoir operating policy.
- ◆ To evaluate the historical trends in precipitation as the basis of selecting the local representative station
- ◆ To develop a rainfall-runoff model and model selection to simulate historical and future streamflows under current and future climate scenarios.
- ◆ To evaluate the performance of downscaling models for their ability to convert large-scale GCM outputs into finer resolution daily time series of local precipitation and temperature at local meteorological stations.
- ◆ To simulate the daily inflows to Sg Layang Reservoir for both current climatic conditions and future climate scenarios using daily rainfall and temperature time series generated from the calibrated downscaling model and the corresponding GCM predictors and analyze the inflow variation due to climate change.
- ◆ To develop a deterministic optimization model formulated based on mixed integer linear programming algorithm in order to produce an optimal reservoir operation policy of the Sg Layang Reservoir system with the overall objective is to minimize the operational pumping costs from different sources considering the peak and off-peak power prices.
- ◆ To derive an optimal reservoir operation policy based on the above optimization model that takes an account of population increase and climate change.
- ◆ To compare the operational results obtained from the simulation models with the

actual operational curve produced from historical operation of the reservoir for the evaluation of the usefulness of optimal operation policies based on performance criteria.

- ◆ To analyze the operating policy to take into account of the system maximum capacity and future increase in water demands.
- ◆ To develop reservoir pumping operating curve involving different confidence intervals and change in future demands which are more appropriate for practical applications.

1.5 Significance of the Study

Optimal operation of reservoir has been an active area of water research over the years. Various techniques have been developed and adopted for reservoir operation by incorporating the aspect of uncertainties due to stochastic nature of inflows and demands.

For a reservoir that depends not only upon catchment runoff but other sources of hydrologic inflow, the available and effective volume is subjected to numerous constraints including reservoir inflow conditions, increasing water demands, pumping, and reservoir storage. These constraints vary and may change considerably during the project life which calls for a modified operational policy.

Most of reservoirs found in Malaysia are single purpose reservoirs managed by separate authorities mainly either for the purposes of hydropower generation, water supply, flood control or irrigation. They are operated based on the skill and experience of the reservoir managers that generally provides operation strategies in the form of general operating curve for reservoir releases and pumping according to the current reservoir level, hydrological conditions and water demands. Such operating practices, however, were found not adapted well to changing in hydrologic and climatic conditions. In addition, due to the lack of information on inflows into

the reservoir various hydrologic variables, a more systematic and acceptable approach is crucial to establish for optimization of the operation.

One of the most prominent water supply reservoirs found in the southern region of the country is Sg Layang Reservoir. The general annual water supply-demand analysis of the Sg Layang reservoir system characteristics has shown that in general, the current supply exceeds the demand, which could be due to an excessive pumping during the unsuitable period. If we were based on the current supply trend the future demand could be increased by 40%. As such, the current practice must be enhanced by considering the followings:

- ♦ optimizing pumping operation with respect to the demand
- ♦ developing a specific reservoir operation technique by incorporating the factor of uncertainties due to stochastic nature of inflows and demands
- ♦ developing an optimal operation rule of the reservoir in response to both nonclimatic and climatic changes

Considering the need of future reservoir system expansion, analysis based on annual averages with the upper bound supply level, the current demand can probably be extended by 1.56 times of the present system characteristics. However, monthly variations due to pumping restrictions, river depth, lower reservoir uncertainties, and inflow from watershed, the pumping cost could reduce significantly. Therefore, there is an opportunity to investigate and optimize the water supply reservoir operation in the framework of climate variability and change to establish a more reliable reservoir operating policies for utilizing water of desired quantity over the operational period.

1.6 Thesis Outline

The thesis is organized in six chapters (including the introduction as Chapter 1) as follows;

Chapter 2 presents a summary of the available literatures which are relevant to the development of the optimal operation of reservoir system in the framework of climate variability and change. It briefly introduces a review of rainfall-runoff models, downscaling methods and model selection for assessing climate change impacts on reservoir systems, and mathematical programming related to the optimization of reservoir systems. Emphasized is given to climate change and downscaling methods, describing advantages and limitation of each method and highlighting several comparative studies and models applications that are related to the current study.

Chapter 3 provides a description of study area and availability of data. A comprehensive data collection includes the historical hydrometeorological data for the hydrological and climate downscaling models calibration and analysis, and climate scenario predictor variables consisting of re-analysis data and large-scale atmospheric variables used for statistical downscaling model input.

Chapter 4 describes the methodology used to select the hydrological modeling approach to simulate inflows to the study reservoir, evaluate the downscaling models, develop future climate change scenarios, and derive an optimal operation policy for the reservoir.

Chapter 5 provides the results of a comprehensive assessment of uncertainty for the selection of the best downscaling model to generate the possible future scenarios of local meteorological variables of precipitation and rainfall at representative local station. The results of climate downscaling become the inputs to the calibrated hydrologic model to generate daily streamflow for the investigation on

how changes in water availability under future climate scenarios will effect the optimal operation of pumping of multi-source reservoir system.

Chapter 6 concludes the major findings of the work described in the thesis and recommendations for future study.

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