# OPTIMIZING ENERGY PERFORMANCE AND INDOOR ENVIRONMENTAL QUALITY OF BUILDINGS USING ENERGY SIMULATION, GENERIC OPTIMIZATION AND COMPUTATIONAL FLUID DYNAMICS

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# **DEDICATION**

I dedicate this thesis to my beloved late father, Mr. R M Navaratne Bandara (1943-2016), who had been the live wire throughout my life. Without his never ending support and encouragement, I would not have come this far.

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#### **Abstract**

A building is a complex system with multiple interacting physical processes taking place simultaneously. Various aspects influence the performance of buildings and the building envelope is one of the major contributors in this regard. Building orientation, Aspect ratio, Window to wall ratio, Location and types of fenestration, Envelope materials and their characteristics etc. can have a major impact on the energy consumption and life cycle cost of buildings. However, the best combination of the said envelope elements for optimizing the performance of buildings is difficult to determine and is not known. Whole building simulation tools are often used in making building performance predictions. Building energy simulation is generally used on a scenario-by-scenario basis, with the designer generating a solution and subsequently having the computer evaluating it. This is however, a slow and a tedious process and only a few cases are evaluated in a large range of scenarios, possibly leading to sub-optimal envelope designs. By coupling a generic optimization tool with a whole building energy simulation tool, it is possible to optimize the performance of buildings by determining the best combination of envelope elements, subject to predefined constraints. First part of the thesis explains optimization of energy performance and life cycle cost of buildings through this methodology. Secondly, drawbacks of whole building simulation tools that lead to issues in energy performance predictions of buildings are discussed in detail. The issues have been addressed by coupling the whole building simulation tool with a computational fluid dynamics tool on a complementary data exchange platform. It is observed that with this approach more reliable building performance predictions can be made. Final section of the thesis discusses on optimizing indoor environmental quality using computational fluid dynamics with respect to identified mechanical ventilation configurations. Model predictions have been validated using a detailed experimental design where computational model predictions closely agree with the actual measurements.

Keywords: Performance, Envelope, Simulation, Optimization, Computational Fluid Dynamics

## **TABLE OF CONTENTS**

Decl	aration,	copyright statement and the statement of the supervisor	i
Dedi	cation		ii
Ackı	nowledg	gement	iii
Abst	ract		iv
Tabl	e of cor	ntents	V
List	of Figu	res	X
List	of Table	es	xvi
1.	1.1 1.2 1.3 1.4 1.5 1.6	Research Problem Analyzed Performance of Buildings and Optimization Criteria Indoor Environmental Quality Research Objectives	1 1 3 4 6 9 10 11
2.	<b>Mod</b> 2.1 2.2	Performance of Buildings Overview Building Energy Simulation Tools 2.2.1 EnergyPlus 2.2.2 eQUEST 2.2.3 ESP-r 2.2.4 DeST 2.2.5 TRNSYS 2.2.6 Trend of Usage	12 12 14 16 18 19 20 20
	2.3	Building Performance Optimization	21
	2.4	Optimization Methods	23
	2.5	Optimization Algorithms 2.5.1 Adaptive Optimization Algorithms 2.5.2 Non-adaptive Optimization Algorithms 2.5.3 Pareto Optimization Algorithms 2.5.4 Hybrid Optimization Algorithms 2.5.5 Trend of Use	23 23 28 28 29 29
	2.6	Optimization Tools	31

	2.6.1 GenOpt 2.6.2 MATLAB 2.6.3 DAKOTA 2.6.4 MOBO	31 32 33 34
2.7	Major studies on Building Performance Optimization	35
2.8	Future trends on Building Performance Optimization	40
2.9	Summary	41
3. Gov	verning Aspects of Building Performance	42
3.1	Overview	42
3.2	Heat Balance in Buildings 3.2.1 Heat Balance for Zonal Air 3.2.2 Heat Balance for Building Envelope Elements	42 43 45
3.3	Mass Balance in Buildings	47
3.4	Problem of Building Performance Optimization	48
3.5	Building Performance Optimization Algorithm	48
3.6	State of Convergence	49
3.7	Summary	50
4. Met	chodology for Performance Optimization	51
4.1	Introduction	51
4.2	Objective Functions 4.2.1 Annual Energy Consumption 4.2.2 Life Cycle Cost	51 52 53
4.3	<ul> <li>Tools for Analysis of Performance of Buildings</li> <li>4.3.1 Whole Building Simulation Tool</li> <li>4.3.2 Geometry Modelling Tool</li> <li>4.3.3 Optimization Tool</li> <li>4.3.4 Optimization Algorithm</li> <li>4.3.5 Output Visualization Tool</li> </ul>	55 55 56 56 57 58
4.4	Optimization Framework	58
4.5	User-defined and associated files 4.5.1 Initialization file 4.5.2 Command file 4.5.3 Configuration file 4.5.4 Simulation input file	60 60 60 60

		<ul><li>4.5.5 Simulation input template file</li><li>4.5.6 Weather file</li></ul>	61 61
		4.5.7 EnergyPlus output file	62
	4.6	$\epsilon$	62
		4.6.1 Single-storey Building	62
		4.6.2 Three-storey Building	64
		4.6.3 L-shape Building	66
	4.7	Summary	69
5.	Opt	imization Results	70
	5.1	Simulation Environment	70
	5.2	Single-storey Building	70
		5.2.1 Annual Energy Consumption	70
		5.2.2 Building Life Cycle Cost	73
	5.3	$\mathcal{E}$	75
		5.3.1 Annual Energy Consumption	75
		5.3.2 Building Life Cycle Cost	78
	5.4	L-shape Building	80
		5.4.1 Annual Energy Consumption	80
		5.4.2 Building Life Cycle Cost	83
	5.5	Weighted Predicted Mean Vote	86
	5.6	Summary	87
6.	Stra	tegies for Making Reliable Predictions	88
	6.1	Issues and Challenges	88
	6.2	ES and CFD Coupling Strategy	90
	6.3	Methodology	94
	6.4	Case Studies of Coupled Simulation	96
		6.4.1 Case Study 1: Single-storey Building	96
		6.4.2 Case Study 2: L-shape Building	101
	6.5	Application of ES-CFD coupling in generic optimization	105
		6.5.1 General Framework	105
		6.5.2 Approach 1	106
		6.5.3 Approach 2	106
		6.5.4 Approach 3	107
		<ul><li>6.5.5 Case Study 1: Single-storey Building</li><li>6.5.6 Case Study 2: Three-storey Building</li></ul>	108 109
		0.5.0 Case Study 2. Three-storey building	107

	6.6	Summary	111
7.	Con	cepts on Indoor Environmental Quality	112
	7.1	Overview	112
	7.2	Thermal Comfort	113
	7.3	Indoor Air Quality	115
	7.4	Ventilation in Buildings 7.4.1 Mixing Ventilation 7.4.2 Displacement Ventilation 7.4.3 Cavity Flow Ventilation 7.4.4 Piston Flow Ventilation	117 118 119 120 120
	7.5	Modelling Indoor Environmental Quality 7.5.1 Simplified/Semi-empirical approach 7.5.2 Zonal approach 7.5.3 Computational Fluid Dynamics approach	121 122 122 126
	7.6	Summary	139
8.	Mod	delling Indoor Environmental Quality	140
	8.1	Overview	140
	8.2	ES-CFD Coupled Approach	142
	8.3	Simulation Results	142
	8.4	Summary	149
9.	Vali	idation of Model Predictions	150
	9.1	Overview	150
	9.2	Experimental Design	152
	9.3	Measuring equipment 9.3.1 Omni-directional Anemometer (Swema 03) 9.3.2 Black globe Temperature Sensor (Swema 05) 9.3.3 Air Humidity Sensor (HygroClip2-S) 9.3.4 Data Logging Software (SwemaMultipoint 3.5.1) 9.3.5 Thermal Imaging Camera (Fluke Ti400) 9.3.6 Indoor Air Quality Monitor (IQM 60) 9.3.7 Other equipment	154 154 155 155 156 157 157
	9.4	Measurement Process	158
	9.5	Modelling Test Facility	160

		9.5.1 Creation of Geometrical Model	160
		9.5.2 Creation of Computational Model	160
	9.6	Comparison of model predictions against measurements	162
		9.6.1 Overview	162
		9.6.2 Indoor Air Velocity	163
		9.6.3 Indoor Air Temperature	164
		9.6.4 Thermal Comfort	165
		9.6.5 CO <sub>2</sub> concentration	166
	9.7	Summary	167
10.	Con	clusion	168
	10.1	Performance-based Modelling and Optimization	168
	10.2	Challenges in making reliable predictions	172
	10.3	Indoor Environmental Quality	174
	10.4	Validation of Predictions	175
	10.5	Concluding Remarks	176
	10.6	Directions for Future Work	177
	10.7	Summary	177
List o	f Refe	rences	178
Anne	ndix A	: User code to calculate PMV in buildings	191

# LIST OF FIGURES

		Page
Figure 1.1	Global building sector energy consumption and intensity by sub-sector, 1990-2014	1
Figure 1.2	Direct and indirect emissions (from electricity and heat production) in the building sub-sectors, 1970 - 2010	2
Figure 1.3	Relationship between IEQ and health effects	8
Figure 2.1	Inputs for Energy Modelling	12
Figure 2.2	Workflow related to Energy Modelling	13
Figure 2.3	EnergyPlus workflow chart	17
Figure 2.4	EnergyPlus modules	17
Figure 2.5	Wizards in eQUEST	18
Figure 2.6	Utilization proportions of major building energy simulation tools	21
Figure 2.7	Exploration and pattern search in the Hooke-Jeeves algorithm	24
Figure 2.8	Simplex in 3-D in the Nelder and Mead algorithm	25
Figure 2.9	Steepest descent method	27
Figure 2.10	Pareto front of optimal solutions	28
Figure 2.11	Usage frequency of algorithms in building performance Studies	30
Figure 2.12	Interface between GenOpt and simulation programme	32
Figure 2.13	Trend of the number of optimization studies on building performance	40
Figure 3.1	Heat and mass transfer processes in a typical building	42
Figure 3.2	Heat balance for a particular building envelope element	45
Figure 4.1	Graphical user interface of EnergyPlus	55
Figure 4.2	Graphical user interface of Legacy OpenStudio Plug-in for SketchUp	56
Figure 4.3	Graphical user interface of GenOpt	57

Figure 4.4	Graphical user interface of xEsoView	58
Figure 4.5	Building performance optimization framework	59
Figure 4.6	Simulation model of the single-storey building	62
Figure 4.7	Simulation model of the three-storey building	64
Figure 4.8	Simulation model of the L-shape building	66
Figure 5.1	Solution for optimal annual energy consumption reaching convergence: Single-storey building	70
Figure 5.2	Solution for optimal energy consumption for heating, cooling and lighting reaching convergence: Single-storey building	71
Figure 5.3	Solution for optimal azimuth angle and WWR reaching convergence: Single-storey building	71
Figure 5.4	Solution for optimal life cycle cost reaching convergence: Single-storey building	73
Figure 5.5	Optimal investment and operating costs reaching convergence: Single-storey building	73
Figure 5.6	Solution for optimal azimuth angle and WWR reaching convergence: Single-storey building	74
Figure 5.7	Solution for optimal annual energy consumption reaching convergence: Three-storey building	76
Figure 5.8	Solution for optimal energy consumption for heating, cooling and lighting reaching convergence: Three-storey building	76
Figure 5.9	Solution for optimal azimuth angle and WWR reaching convergence	76
Figure 5.10	Solution for optimal life cycle cost reaching convergence: Three-storey building	78
Figure 5.11	Optimal investment and operating costs reaching convergence: Three-storey building	78
Figure 5.12	Solution for optimal azimuth angle and WWR reaching convergence: Three-storey building	79
Figure 5.13	Optimal annual primary energy consumption reaching convergence: L-shape building	81
Figure 5.14	Solution for optimal energy consumption for heating, cooling and lighting reaching convergence: L-shape building	81

Figure 5.15	Solution for optimal azimuth angle and WWR reaching convergence: L-shape building	81
Figure 5.16	Solution for the optimal life cycle cost reaching convergence: L-shape building	84
Figure 5.17	Optimal investment cost and operating cost reaching convergence: L-shape building	84
Figure 5.18	Solution for optimal azimuth angle and WWR reaching convergence: L-shape building	84
Figure 6.1	Staged coupling strategy	93
Figure 6.2	Workflow of the coupled ES-CFD simulation	95
Figure 6.3	CFD model of the single-storey building	96
Figure 6.4	Daily variation of internal envelope temperature – Scenario 1	98
Figure 6.5	Daily variation of internal envelope temperature – Scenario 2	98
Figure 6.6	Variation of north wall mean convective heat transfer coefficient – Scenario 1	99
Figure 6.7	Variation of south wall mean convective heat transfer coefficient – Scenario 1	99
Figure 6.8	Variation of north wall mean convective heat transfer coefficient – Scenario 2	100
Figure 6.9	Variation of south wall mean convective heat transfer coefficient – Scenario 2	100
Figure 6.10	CFD model of L-shape building	101
Figure 6.11	Daily variation of internal envelope temperature – Scenario 1	102
Figure 6.12	Daily variation of internal envelope temperature – Scenario 2	102
Figure 6.13	Variation of north wall convective heat transfer coefficient – Scenario 1	103
Figure 6.14	Variation of south wall convective heat transfer coefficient – Scenario 2	103
Figure 6.15	General nature of building performance studies in literature	105

Figure 6.16	Proposed framework for optimizing building performance - Approach 1	106
Figure 6.17	Proposed framework for optimizing building performance - Approach 2	107
Figure 6.18	Proposed framework for optimizing building performance - Approach 3	107
Figure 6.19	ES model of single-storey building with its optimal envelope design	108
Figure 6.20	CFD model of single-storey building with its optimal envelope design	109
Figure 6.21	ES model of three-storey building with its optimal envelope design	110
Figure 6.22	CFD model of three-storey building with its optimal envelope design	110
Figure 7.1	Factors affecting IEQ	112
Figure 7.2	PPD as a function of PMV	115
Figure 7.3	Mixing ventilation	119
Figure 7.4	Displacement ventilation	119
Figure 7.5	Cavity flow ventilation	120
Figure 7.6	Piston flow ventilation	120
Figure 7.7	Overview of the typical building air flow modelling approaches	121
Figure 7.8	Influences on air flow distribution in buildings	123
Figure 7.9	Air flow network model in EnergyPlus	125
Figure 7.10	Schematic representation of a typical turbulent motion	129
Figure 8.1	CFD model of the building	140
Figure 8.2	CFD model showing occupants	141
Figure 8.3	Workflow of ES-CFD coupled approach	142
Figure 8.4	Air flow field for cavity flow ventilation	143
Figure 8.5	Air flow field for displacement flow ventilation	143
Figure 8.6	Air flow field for mixing flow ventilation – Case 1	143

Figure 8.7	Air flow field for mixing flow ventilation – Case 2	144
Figure 8.8	Air flow field for mixing flow ventilation – Case 3	144
Figure 8.9	Air flow field for mixing flow ventilation – Case 4	144
Figure 8.10	Air flow field for mixing flow ventilation – Case 5	145
Figure 8.11	PMV thermal comfort profiles in mixing flow ventilation - Case 1	146
Figure 8.12	$CO_2$ profiles (in ppm) in mixing flow ventilation - Case 1	146
Figure 8.13	Pathlines of occupant emissions: Mixing flow – Case 1	147
Figure 8.14	Predicted PMV at ankle level	147
Figure 8.15	Predicted PMV at waist level	148
Figure 8.16	Predicted PMV at neck level	148
Figure 9.1	Test facility	150
Figure 9.2	Basic features of test facility	150
Figure 9.3	Details of north wall	151
Figure 9.4	Details of east wall	151
Figure 9.5	Plan view of the experimental design layout	153
Figure 9.6	Omni-directional Anemometer (Swema-03)	154
Figure 9.7	Black globe temperature sensor (Swema-05)	155
Figure 9.8	Air humidity sensor (HygroClip2-S)	156
Figure 9.9	GUI of SwemaMultipoint 3.5.1 software	156
Figure 9.10	Thermal imaging camera (Fluke Ti400)	157
Figure 9.11	Indoor air quality monitor (IQM 60)	157
Figure 9.12	Other measuring equipment	158
Figure 9.13	Measuring equipment setup	159
Figure 9.14	Acquisition of thermal data	159
Figure 9.15	Acquisition of CO <sub>2</sub> data	159
Figure 9.16	Geometrical model of the test facility	160
Figure 9.17	Computational model of test facility	160

Figure 9.18	Model predictions against measurements: Air velocity	163
Figure 9.19	Model predictions against measurements: Air temperature	164
Figure 9.20	Model predictions against measurements: PMV	165
Figure 9.21	Model predictions against measurements: PPD	165
Figure 9.22	Predicted PMV profile in the centre plane: $k$ - $\omega$ SST and DO model	166
Figure 9.23	Model predictions against measurements: CO <sub>2</sub> concentration	166

## LIST OF TABLES

		Page
Table 2.1	Evolution of building energy simulation tools	14
Table 2.2	Comparison of features of the building energy simulation software	16
Table 2.3	Comparison of the main features of optimization tools	34
Table 4.1	Thermal and electrical loads: Single-storey building	63
Table 4.2	Construction details: Single-storey building envelope	63
Table 4.3	Details of building envelope variables: Single-storey building	63
Table 4.4	Details of building envelope variables: Three-storey building	64
Table 4.5	Thermal and electrical loads: Three-storey building	65
Table 4.6	Construction details: Three-storey building envelope	65
Table 4.7	Details of building envelope variables: L-shape building	66
Table 4.8	Thermal and electrical loads: L-shape building	67
Table 4.9	Construction details: L-shape building envelope	67
Table 4.10	Economic data for building life cycle cost analysis	68
Table 4.11	Settings of the GPSPSOCCHJ algorithm	68
Table 5.1	Comparison among base case and optimal envelope elements: Single-storey building	72
Table 5.2	Comparison of annual primary energy consumption: Single-storey building	72
Table 5.3	Comparison among base case and optimal values of envelope elements: Single-storey building	74
Table 5.4	Building life cycle cost for optimal case: Single-storey building	75
Table 5.5	Comparison of values of envelope elements: Three-storey building	77
Table 5.6	Comparison of annual energy consumption: Three-storey building	77

Table 5.7	Comparison of values of envelope elements: Three-storey building	79
Table 5.8	Building life cycle cost for optimal case: Three-storey building	80
Table 5.9	Comparison among base case and optimal values of envelope elements: L-shape building	82
Table 5.10	Comparison of annual energy consumption: L-shape building	83
Table 5.11	Comparison among base case and optimal values of envelope elements: L-shape building	85
Table 5.12	Building life cycle cost for optimal case: L-shape building	86
Table 6.1	Simple natural convection model	88
Table 6.2	Ceiling diffuser model	89
Table 6.3	CFD modelling parameters: Single-storey building	97
Table 6.4	Comparison of building energy consumption	101
Table 6.5	CFD modelling parameters for L-shape building	101
Table 6.6	Comparison of building energy consumption	104
Table 6.7	Comparison of predicted building energy consumption: Single-storey building	109
Table 6.8	Comparison of predicted building energy consumption: Three-storey building	110
Table 7.1	ASHRAE thermal sensation scale	113
Table 7.2	Main categories of indoor air pollutants	116
Table 7.3	Comparison of indoor air quality standards	117
Table 7.4	Comparison of turbulence models	135
Table 8.1	Thermal and Electrical loads	140
Table 8.2	Boundary conditions and models for CFD simulations	141
Table 8.3	Comparison of mean values of indoor environmental quality parameters	145
Table 8.4	Predicted mean Thermal Comfort	147
Table 9.1	Placement of measuring equipment	158

Table 9.2	Models for CFD simulations	161
Table 9.3	Boundary conditions	161