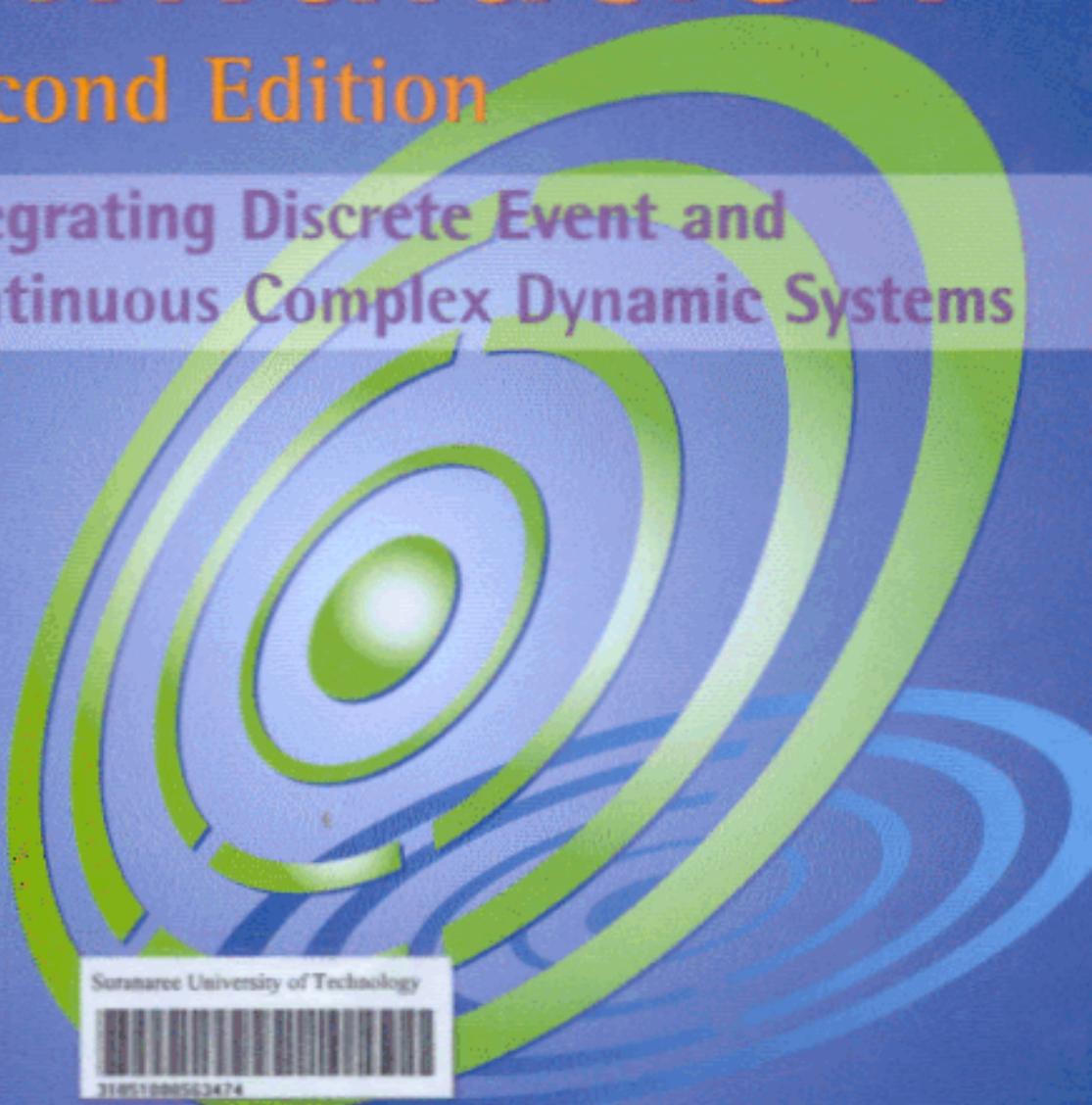


# Theory of Modeling and Simulation

Second Edition

Integrating Discrete Event and  
Continuous Complex Dynamic Systems



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# Contents

Preface to First Edition .....	xvii
Preface to Second Edition .....	xix
Acknowledgments .....	xxi
<b>Part I: Basics .....</b>	<b>1</b>
<b>Chapter 1 Introduction to Systems Modeling Concepts .....</b>	<b>3</b>
1.1 Systems Specification Formalisms .....	3
1.1.1 Relation to Object Orientation .....	5
1.1.2 Evolution of Systems Formalisms .....	6
1.1.3 Combining Continuous and Discrete Formalisms .....	7
1.1.4 Quantized Systems .....	8
1.1.5 Extensions of DEVS .....	9
1.2 Levels of System Knowledge .....	11
1.3 Introduction to the Hierarchy of Systems Specifications .....	13
1.4 The Specification Levels Informally Presented .....	14
1.4.1 Observation Frame .....	14
1.4.2 I/O Behavior and I/O Function .....	16
1.4.3 State Transition System Specification .....	17
1.4.4 Coupled Component System Specification .....	18
1.5 System Specification Morphisms: Basic Concepts .....	18
1.6 Summary .....	21
1.7 Sources .....	22
Definitions, Acronyms, Abbreviations .....	23
<b>Chapter 2 Framework for Modeling and Simulation .....</b>	<b>25</b>
2.1 The Entities of the Framework .....	25
2.1.1 Source System .....	25
2.1.2 Experimental Frame .....	27
2.1.3 Model .....	29
2.1.4 Simulator .....	30
2.2 Primary Relations Among Entities .....	30
2.2.1 Modeling Relation: Validity .....	30
2.2.2 Simulation Relation: Simulator Correctness .....	32
2.3 Other Important Relationships .....	32
2.3.1 Modeling As Valid Simplification .....	32
2.3.2 Experimental Frame: Model Relationships .....	33
2.4 Time .....	34
2.5 Summary .....	35
2.6 Sources .....	36

<b>Chapter 3 Modeling Formalisms and Their Simulators . . . . .</b>	<b>37</b>
3.1 Introduction .....	37
3.2 Discrete Time Models and Their Simulators .....	37
3.2.1 Discrete Time Simulation .....	39
3.2.2 Cellular Automata .....	40
3.2.3 Cellular Automaton Simulation Algorithms .....	43
3.2.4 Discrete Event Approach to Cellular Automaton Simulation .....	44
3.2.5 Switching Automata/Sequential Machines .....	45
3.2.6 Linear Discrete Time Networks and Their State Behavior .....	47
3.3 Differential Equation Models and Their Simulators .....	49
3.3.1 Continuous System Simulation .....	50
3.3.2 Feedback in Continuous Systems .....	55
3.3.3 Elementary Linear Systems .....	56
3.3.4 Nonlinear Oscillators: Limit Cycles and Chaotic Behaviors .....	61
3.3.5 Continuous System Simulation Languages and Systems .....	64
3.4 Discrete Event Models and Their Simulators .....	66
3.4.1 Introduction .....	66
3.4.2 Discrete Event Cellular Automata .....	67
3.4.3 Discrete Event World Views .....	70
3.5 Summary .....	72
3.6 Sources .....	73
<b>Chapter 4 Introduction to Discrete Event System Specifications (DEVS) . . . . .</b>	<b>75</b>
4.1 Introduction .....	75
4.2 Classic DEVS System Specification .....	75
4.2.1 DEVS Examples .....	77
4.2.2 Classic DEVS With Ports .....	84
4.2.3 Classic DEVS Coupled Models .....	85
4.3 Parallel DEVS System Specification .....	89
4.3.1 Processor With Buffer .....	90
4.3.2 Parallel DEVS Coupled Models .....	91
4.4 Hierarchical Models .....	93
4.5 Object-Oriented Implementations of DEVS: An Introduction .....	93
4.5.1 Structural Inheritance .....	94
4.6 Summary .....	96
4.7 Sources .....	96
<b>Chapter 5 Hierarchy of System Specifications . . . . .</b>	<b>99</b>
5.1 Time Base .....	99
5.2 Segments and Trajectories .....	100
5.2.1 Piecewise Continuous Segments .....	102
5.2.2 Piecewise Constant Segments .....	103
5.2.3 Event Segments .....	103
5.2.4 Sequences .....	104

5.3	I/O Observation Frame .....	104
5.4	I/O Relation Observation .....	105
5.5	I/O Function Observation .....	107
5.6	I/O System .....	108
5.6.1	Going from System Structure to Behavior .....	110
5.6.2	Time-Invariant Systems .....	112
5.6.3	Special Cases: Input-Free and Memoryless Systems .....	115
5.7	Iterative Specification of Systems .....	116
5.7.1	Generator Segments .....	117
5.7.2	Generator State Transition Systems .....	120
5.8	Multivariable Sets and Structured Systems .....	123
5.9	Multicomponent System Specification .....	125
5.10	Network of System Specifications (Coupled Systems) .....	127
5.10.1	Coupled System Specification .....	128
5.10.2	Coupled System Specification at the Structured System Level .....	129
5.11	Summary .....	131
5.12	Sources .....	133

## **Part II Modeling Formalisms and Simulation Algorithms ..... 135**

### **Chapter 6 Basic Formalisms: DEVS, DTSS, DESS ..... 137**

6.1	Basic System Specification Formalisms .....	137
6.2	Discrete Event System Specifications (DEVS) .....	138
6.2.1	Classic DEVS .....	138
6.2.2	Structure Specified by DEVS .....	139
6.2.3	Legitimacy: When is the Structure Specified by a DEVS Really a System? .....	141
6.3	Parallel DEVS .....	142
6.3.1	System Specified by Parallel DEVS .....	144
6.4	Discrete Time System Specification (DTSS) .....	144
6.5	Differential Equation System Specification (DESS) .....	146
6.6	Summary .....	147

### **Chapter 7 Basic Formalisms: Coupled Multicomponent Systems ..... 149**

7.1	Discrete Event Specified Network Formalism .....	149
7.1.1	Classic DEVS Coupled Models .....	150
7.1.2	Parallel DEVS Coupled Models .....	152
7.2	Multicomponent Discrete Event System Formalism .....	155
7.2.1	Event Scheduling Models .....	159
7.2.2	Combined Event Scheduling, Activity Scanning Simulation Strategy .....	159
7.2.3	Process Interaction Models .....	161
7.2.4	Translating Nonmodular Multicomponent DEVS Models into Modular Form .....	161
7.2.5	State Updating in Distributed Simulation .....	162

7.3	Discrete Time Specified Network Formalism .....	163
7.4	Multicomponent Discrete Time System Formalism .....	166
7.5	Differential Equation Specified Network Formalism .....	168
7.6	Multicomponent Differential Equations Specified System Formalism .....	169
7.7	Summary .....	171
7.8	Sources .....	172
	Appendix .....	173

## **Chapter 8 Simulators for Basic Formalisms . . . . . 175**

8.1	Simulators for DEVS .....	176
8.1.1	Simulator for Basic DEVS .....	177
8.1.2	Simulators for Modular DEVS Networks .....	180
8.1.3	The Root-Coordinator .....	184
8.2	DEVS Bus .....	184
8.2.1	Simulator for Event Scheduling Multicomponent DEVS .....	185
8.2.2	Simulator for Activity Scanning and Process Interaction Multicomponent DEVS .....	187
8.3	Simulators for DTSS .....	189
8.3.1	Simulator for Atomic DTSS .....	190
8.3.2	Simulator for Instantaneous Functions .....	192
8.3.3	Simulator for Nonmodular Multicomponent DTSS .....	192
8.3.4	Simulators for Coupled DTSS .....	193
8.3.5	The Root-Coordinator .....	196
8.4	Simulators for DESS .....	197
8.4.1	Causal Simulator for DESS .....	197
8.4.2	Noncausal Simulator for DESS .....	198
8.5	Summary .....	201
8.6	Sources .....	201

## **Chapter 9 Multiformalism Modeling and Simulation . . . . . 203**

9.1	Brief Introduction to Specialized Formalisms .....	203
9.1.1	DESS Subformalisms: Systems Dynamics and Bond Graphs .....	203
9.1.2	DEVS Subformalisms: Petri Nets and Statecharts .....	204
9.2	Multiformalism Modeling .....	206
9.3	DEV&DESS: Combined Discrete Event and Differential Equation Specified Systems .....	208
9.3.1	A Simple Example: DEV&DESS Model of a Barrel Filler .....	210
9.3.2	System Specified by a DEV&DESS .....	213
9.4	Multimodeling with DEV&DESS .....	214
9.4.1	Example: Pot System with Command Inputs and Threshold Value Outputs .....	216
9.5	Coupled DEV&DESS: Network of Multiformalism Models .....	217
9.5.1	Basic Formalisms are Subsumed by DEV&DESS .....	217
9.5.2	Coupled DEV&DESS Formalism .....	219

9.6	Simulator for DEVS&DESS .....	222
9.6.1	The DEV&DESS-Simulator and Coordinator .....	223
9.6.2	Integrating Different Modeling Formalisms .....	226
9.7	Sources .....	227
	Appendix A: The System Specified By a DEV&DESS .....	229
	Appendix B: The System Specified By a Multiformalism System-Closure Under Coupling of Networks of DEV&DESS .....	231

## **Chapter 10 DEVS-Based Extended Formalisms . . . . . 233**

10.1	Stochastic Systems: Conventional Approach to Uncertainty .....	233
10.2	DSDEVS (Dynamic Structure DEVS) .....	235
10.2.1	DSDEVS Closure Under Coupling .....	237
10.2.2	Example: Adaptive Processing Architectures .....	237
10.3	Symbolic DEVS .....	240
10.3.1	<i>Symbolic DEVS Coupled Models</i> .....	241
10.3.2	Example: Performance Evaluation of Basic Architectures .....	241
10.4	Fuzzy DEVS .....	244
10.4.1	Basic Fuzzy DEVS Formalism .....	247
10.4.2	Embedding Fuzzy DEVS in DEVS .....	250
10.4.3	Example: Fuzzy DEVS Model for Boiler System .....	251
10.5	Real-Time DEVS (RT-DEVS) .....	252
10.5.1	Formal Specification of Real-Time DEVS Models .....	252
10.5.2	<i>Execution of RT-DEVS Models</i> .....	253
10.5.3	Example of RT-DEVS: Elevator Control .....	254
10.5.4	Real-Time Simulation and RT-DEVS .....	257
10.6	Summary .....	259
10.7	Sources .....	259

## **Chapter 11 Parallel and Distributed Discrete Event Simulation . . . . . 261**

11.1	Problem Characterization of Parallel Discrete Event Simulation .....	262
11.2	Conservative Parallel Discrete Event Simulation .....	264
11.2.1	Conservative Parallel DEVS Simulator .....	268
11.3	Optimistic Parallel Discrete Event Simulation .....	273
11.3.1	Time-Warp DEVS Simulator .....	275
11.3.2	Riskfree Optimistic DEVS Simulator .....	281
11.4	Parallel DEVS Simulator .....	284
11.5	Summary .....	287
11.6	Sources .....	287

## **Part III System Morphisms: Abstraction, Representation, Approximation ..... 293**

### **Chapter 12 Hierarchy of System Morphisms ..... 295**

12.1	The I/O Frame Morphism .....	297
12.2	The I/O Relation Observation Morphism .....	297

12.3	The I/O Function Morphism . . . . .	298
12.3.1	IOFO System Morphism Implies IORO System Morphism . . . . .	300
12.4	The I/O System Morphism . . . . .	301
12.4.1	I/O System Morphism Implies IOFO and IORO Morphism . . . . .	302
12.4.2	The Lattice of Partitions and the Reduced Version of a System . . . . .	305
12.5	System Morphism for Iteratively Specified Systems . . . . .	308
12.5.1	Iterative Specification Morphism Implies I/O System Morphism . . . . .	309
12.5.2	Specialization of Morphisms for Iteratively Specified Systems . . . . .	310
12.6	The Structured System Morphism . . . . .	311
12.7	Multicomponent System Morphism . . . . .	314
12.8	The Network of Systems Morphism . . . . .	317
12.9	Homomorphism and Cascade Decompositions . . . . .	320
12.10	Characterization of Realizable I/O Relations and Functions . . . . .	324
12.10.1	Canonical Realization . . . . .	326
12.11	Summary . . . . .	327
12.12	Sources . . . . .	327

## **Chapter 13 Abstraction: Constructing Model Families . . . . . 329**

13.1	Scope/Resolution/Interaction Product . . . . .	329
13.1.1	Complexity . . . . .	330
13.1.2	Size/Resolution Trade-Off: Simplification Methods . . . . .	332
13.1.3	How Objectives and Experimental Frame Determine Abstraction Possibilities . . . . .	334
13.2	Integrated Families of Models . . . . .	335
13.2.1	Integrated Model Family Example: Space Travel . . . . .	335
13.2.2	Space Travel Base Model . . . . .	336
13.3	Aggregation: Homogeneity/Coupling Indifference Principles . . . . .	339
13.3.1	Coupling Conditions Imposed by Anonymity . . . . .	342
13.3.2	Constructing Lumped Models Based on Identity-Erasing Aggregation . . . . .	344
13.3.3	All-To-One Coupling . . . . .	348
13.3.4	Example of Aggregation Model Construction: Space Travel . . . . .	349
13.3.5	Constructing Aggregations Through State and Block Refinement . . . . .	351
13.3.6	Time Scale Relations . . . . .	353
13.3.7	Universality/Applicability of Identity-Erasing Aggregations . . . . .	353
13.4	Abstractions for Event-Based Control . . . . .	354
13.4.1	Boundary-Based DEVS . . . . .	354
13.4.2	DEVS Abstraction: Space Travel Example . . . . .	357
13.5	Parameter Morphisms . . . . .	358
13.5.1	Linear Systems Parameter Morphisms . . . . .	359

13.5.2	Example Lumpable: Linear DTSS and Parameter Morphisms .....	360
13.5.3	Constraints on Parameter and State Spaces: Disaggregation .....	362
13.5.4	Using Parameter Morphisms in an Integrated Model Family .....	362
13.6	Summary .....	364
13.7	Sources .....	364

## **Chapter 14 Verification, Validation, Approximate Morphisms: Living with Error . . . . . 367**

14.1	Verification .....	367
14.2	Validation at the Behavioral Level .....	368
14.2.1	Quantitative Comparison .....	371
14.2.2	Qualitative Comparison .....	372
14.3	Performance/Validity (e.g., Speed/Accuracy) Trade-off .....	373
14.4	Approximate Morphisms and Error Behavior .....	377
14.4.1	Approximate Morphisms and the Specification Hierarchy .....	377
14.4.2	Approximate Homomorphisms and Error Propagation .....	378
14.4.3	Example: Approximate Linear System Homomorphisms .....	382
14.5	Approximate Morphisms at the Coupled System Level .....	384
14.5.1	Error-Driven Aggregation Refinement .....	384
14.6	Validation at Structural Levels .....	387
14.6.1	Calibration, Parameter Identification, Sensitivity .....	388
14.6.2	Local/Global, Cross-Model Validation .....	388
14.7	Sources .....	389

## **Chapter 15 DEVS and DEVS-like Systems: Universality and Uniqueness . . . . . 391**

15.1	Relation Between Classical and Parallel DEVS: Is There One or Two? .....	391
15.2	Universality and Uniqueness of DEVS .....	393
15.2.1	Systems with DEVS Interfaces .....	393
15.2.2	Behavior of DEVS-like Systems .....	395
15.2.3	Universality of DEVS .....	396
15.2.4	Example: DEVS Realization of DEVS-like System .....	397
15.2.5	Uniqueness of DEVS .....	398
15.3	DEVS Representation of DTSS .....	399
15.3.1	Input-Free Moore .....	400
15.3.2	Multiported FNSS .....	400
15.3.3	Moore DTSS with Input .....	401
15.3.4	Mealy DTSS .....	401
15.3.5	DEVS Strong Simulation of DTSS Coupled Models .....	401
15.4	Efficient DEVS Simulation of DTSS Networks .....	403
15.5	Summary .....	405
15.6	Sources .....	405
	Appendix: Isomorphically Representing DEVS-like Systems by DEVS .....	406

<b>Chapter 16 DEVS Representation of Systems .....</b>	<b>411</b>
16.1 DEVS Bus Revisited .....	411
16.1.1 Approaches to DEVS Representation of Continuous Systems .....	412
16.2 DEVS Representation Using Conventional Approach .....	414
16.2.1 DTSS Simulation of a DESS Integrator.....	415
16.2.2 Simulation of Coupled Systems by DTSS .....	416
16.2.3 Discretized Simulation of Coupled DESS with Arbitrarily Small Error .....	418
16.2.4 DEVS Representation of DESS via DTSS Simulation .....	419
16.3 Quantization: An Alternative Approach for DEVS Representation .....	419
16.3.1 Quantized Systems .....	421
16.3.2 Exactly Quantizable Systems .....	422
16.3.3 Quantized Integrator: Approximation of DESS .....	424
16.3.4 Coupled Systems with Quantized Components .....	425
16.3.5 Quantized Simulation of Coupled Systems with Arbitrarily Small Error .....	427
16.3.6 Quantized Simulation of Coupled DESS with Arbitrarily Small Error .....	429
16.3.7 DEVS Representation of Quantized Systems .....	430
16.3.8 DEVS Representation of Quantized Integrator .....	431
16.3.9 DEVS Simulation of Coupled Quantized Systems .....	432
16.3.10 Quantization-Based DEVS Simulation of DESS .....	433
16.4 Simulation Study of Quantization .....	434
16.4.1 Some Indicative Simulation Results .....	434
16.4.2 Comparing Quantized DEVS with Pure DTSS Simulation of DESS .....	437
16.4.3 Insight from Second-Order Linear Oscillator .....	439
16.5 Conjectures for Further Research .....	441
16.6 Summary .....	443
16.7 Sources .....	444
16.8 Problems .....	445
Appendix 1 Closed Loop DTSS Simulation .....	447
Appendix 2 Uniformly Segmentable Input Sets .....	449
Appendix 3 Exact Simulation by DEVS .....	451
Appendix 4 Closed Loop Quantized Simulation .....	452

## **Part IV System Design and Modeling and Simulation Environments.....455**

<b>Chapter 17 DEVS-Based Design Methodology .....</b>	<b>457</b>
17.1 Methodology Overview .....	457
17.2 DEVS Definition Language .....	459
17.2.1 Atomic DEVS Definition .....	460
17.2.2 The Coupled DEVS Definition .....	462
17.2.3 Example: Generator-Buffer-Processor Model .....	463

17.3	Execution of DEVS Definition .....	466
17.4	Logical Analysis: Model Verification .....	468
17.4.1	Assertional Specification of Temporal Logic .....	468
17.4.2	TL Specification Language .....	473
17.5	Model Verification by Language Acceptance Checking .....	475
17.6	Performance Evaluation .....	477
17.7	Implementation: DEVS Model Execution .....	477
17.8	Summary .....	479
17.9	Sources .....	479
<b>Chapter 18</b>	<b>System Entity Structure/Model Base Framework .....</b>	<b>481</b>
18.1	Model Base Management by System Entity Structure .....	481
18.2	System Entity Structure .....	482
18.3	System Entity Structure/Model Base (SES/MB) Framework .....	485
18.4	Example: Design of a Transaction Processing System .....	486
18.4.1	System Entity Structure .....	487
18.4.2	Model Base .....	487
18.4.3	Pruning and Model Synthesis .....	487
18.4.4	Performance Evaluation .....	488
18.5	Automatic Pruning of an SES .....	490
18.6	Summary .....	491
18.7	Sources .....	492
<b>Chapter 19</b>	<b>Collaboration and the Future .....</b>	<b>495</b>
19.1	An Architecture for M&S .....	495
19.2	How Does Collaboration Support M&S? .....	497
19.2.1	Model Construction .....	497
19.2.2	Model Composition .....	497
19.2.3	Supporting M&S with Collaboration Environments .....	497
19.3	Summary .....	499
19.4	Sources .....	499
<b>Index .....</b>		<b>501</b>