Process Systems Engineering

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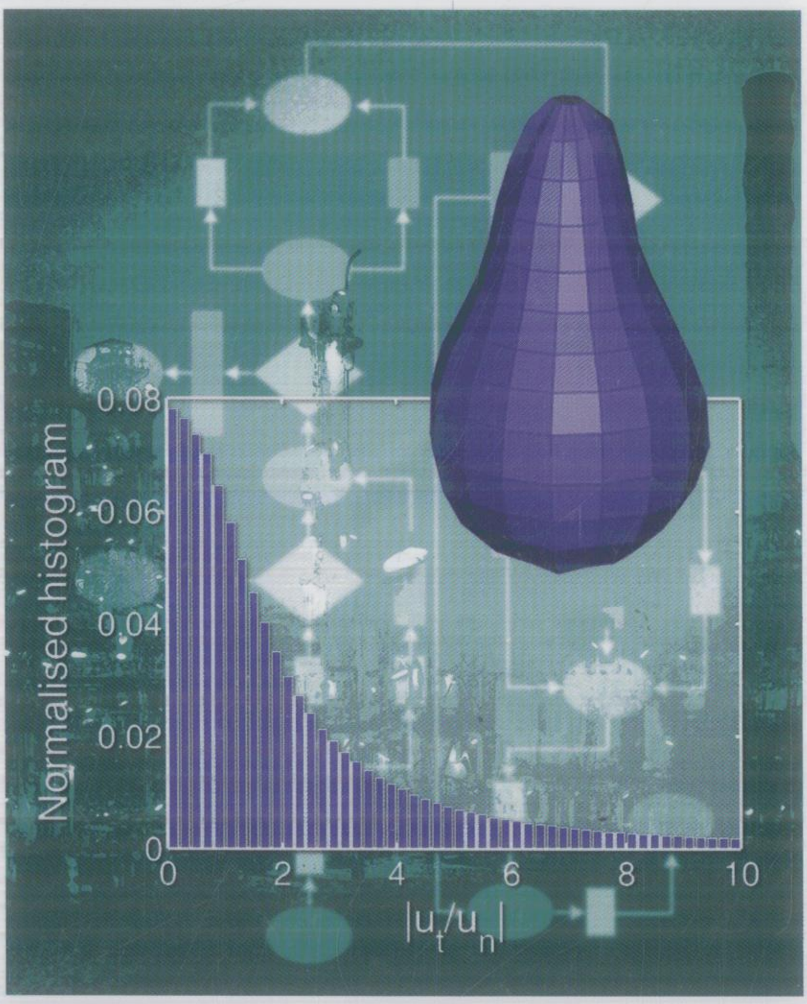
Dynamic Process Modelling



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Centre for Process Systems Engineering

Contents

Preface *XV*
List of Contributors *XXI*

Part I Chemical and Other Processing Systems 1

1 **Dynamic Process Modeling: Combining Models and Experimental Data to Solve Industrial Problems** *3*
M. Matzopoulos *3*
1.1 Introduction *3*
1.1.1 Mathematical Formulation *4*
1.1.2 Modeling Software *5*
1.2 Dynamic Process Modeling – Background and Basics *5*
1.2.1 Predictive Process Models *6*
1.2.2 Dynamic Process Modeling *6*
1.2.3 Key Considerations for Dynamic Process Models *7*
1.2.4 Modeling of Operating Procedures *9*
1.2.5 Key Modeling Concepts *10*
1.2.5.1 First-Principles Modeling *10*
1.2.5.2 Multiscale Modeling *10*
1.2.5.3 Equation-Based Modeling Tools *11*
1.2.5.4 Distributed Systems Modeling *12*
1.2.5.5 Multiple Activities from the Same Model *13*
1.2.5.6 Simulation vs. Modeling *13*
1.3 A Model-Based Engineering Approach *14*
1.3.1 High-Fidelity Predictive Models *14*
1.3.2 Model-Targeted Experimentation *16*
1.3.3 Constructing High-Fidelity Predictive Models – A Step-by-Step Approach *16*
1.3.4 Incorporating Hydrodynamics Using Hybrid Modeling Techniques *22*
1.3.5 Applying the High-Fidelity Predictive Model *22*

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1.4 An Example: Multitubular Reactor Design 23
1.4.1 Multitubular Reactors – The Challenge 24
1.4.2 The Process 25
1.4.3 The Solution 25
1.4.4 Detailed Design Results 29
1.4.5 Discussion 30
1.5 Conclusions 31

2 Dynamic Multiscale Modeling – An Application to Granulation Processes 35
G.D. Ingram and I.T. Cameron 35
2.1 Introduction 35
2.2 Granulation 36
2.2.1 The Operation and Its Significance 36
2.2.2 Equipment, Phenomena, and Mechanisms 37
2.2.3 The Need for and Challenges of Modeling Granulation 39
2.3 Multiscale Modeling of Process Systems 41
2.3.1 Characteristics of Multiscale Models 41
2.3.2 Approaches to Multiscale Modeling 43
2.4 Scales of Interest in Granulation 45
2.4.1 Overview 45
2.4.2 Primary Particle Scale 47
2.4.3 Granule Scale 48
2.4.4 Granule Bed Scale 48
2.4.5 Vessel Scale 49
2.4.6 Circuit Scale 50
2.5 Applications of Dynamic Multiscale Modeling to Granulation 52
2.5.1 Overview 52
2.5.2 Fault Diagnosis for Continuous Drum Granulation 55
2.5.3 Three-Dimensional Multiscale Modeling of Batch Drum Granulation 56
2.5.4 DEM-PBE Modeling of Batch High-Shear Granulation 58
2.5.5 DEM-PBE Modeling of Continuous Drum Granulation 59
2.6 Conclusions 61

3 Modeling of Polymerization Processes 67
B.S. Amaro and E.N. Pistikopoulos 67
3.1 Introduction 67
3.2 Free-Radical Homopolymerization 68
3.2.1 Kinetic Modeling 68
3.2.2 Diffusion-Controlled Reactions 69
3.2.2.1 Fickian Description of Reactant Diffusion 71
3.2.2.2 Free-Volume Theory 72

3.2.2.3 Chain Length Dependent Rate Coefficients *73*
3.2.2.4 Combination of the Free-Volume Theory and Chain Length Dependent Rate Coefficients *75*
3.2.2.5 Fully Empirical Models *76*
3.3 Free-Radical Multicomponent Polymerization *77*
3.3.1 Overview *77*
3.3.2 Pseudo-Homopolymerization Approximation *78*
3.3.3 Polymer Composition *80*
3.4 Modeling of Polymer Molecular Properties *80*
3.4.1 Molecular Weight Distribution *80*
3.5 A Practical Approach – SAN Bulk Polymerization *90*
3.5.1 Model *90*
3.5.1.1 Kinetic Diagram *90*
3.5.1.2 Mass Balances *91*
3.5.1.3 Diffusion Limitations *92*
3.5.1.4 Pseudo-Homopolymerization Approximation *94*
3.5.2 Illustrative Results *95*
3.6 Conclusions *97*

4 Modeling and Control of Proton Exchange Membrane Fuel Cells *105*
C. Panos, K. Kouramas, M.C. Georgiadis and E.N. Pistikopoulos *105*
4.1 Introduction *105*
4.2 Literature Review *108*
4.3 Motivation *109*
4.3.1 Reactant Flow Management *112*
4.3.2 Heat and Temperature Management *112*
4.3.3 Water Management *113*
4.4 PEM Fuel Cell Mathematical Model *113*
4.4.1 Cathode *114*
4.4.2 Anode *117*
4.4.3 Anode Recirculation *119*
4.4.4 Fuel Cell Outlet *120*
4.4.5 Membrane Hydration Model *120*
4.4.6 Electrochemistry *122*
4.4.7 Thermodynamic Balance *123*
4.4.8 Air Compressor and DC Motor Model *125*
4.4.9 DC Motor *126*
4.4.10 Cooling System *127*
4.5 Reduced Order Model *128*
4.6 Concluding Remarks *132*

5 Modeling of Pressure Swing Adsorption Processes *137*
E.S. Kikkinides, D. Nikolic and M.C. Georgiadis *137*
5.1 Introduction *137*

5.2 Model Formulation *144*
5.2.1 Adsorbent Bed Models *144*
5.2.2 Single-Bed Adsorber *145*
5.2.3 Adsorption Layer Model *146*
5.2.3.1 General Balance Equations *146*
5.2.3.2 Mass Balance *147*
5.2.3.3 Heat Balance *147*
5.2.3.4 Momentum Balance *148*
5.2.3.5 Equation of State *148*
5.2.3.6 Thermophysical Properties *148*
5.2.3.7 Axial Dispersion *148*
5.2.3.8 Transport Properties *149*
5.2.3.9 Boundary Conditions *149*
5.2.4 Adsorbent Particle Model *150*
5.2.4.1 General Mass Balance Equations *150*
5.2.4.2 Local Equilibrium *151*
5.2.4.3 Linear Driving Force (LDF) *152*
5.2.4.4 Surface Diffusion *152*
5.2.4.5 Pore Diffusion *153*
5.2.4.6 Gas–Solid Phase Equilibrium Isotherms *154*
5.2.5 Gas Valve Model *157*
5.2.6 The Multibed PSA Model *158*
5.2.7 The State Transition Network Approach *158*
5.2.8 Numerical Solution *162*
5.3 Case-Study Applications *163*
5.3.1 Simulation Run I *165*
5.3.2 Simulation Run II *165*
5.3.3 Simulation Run III *166*
5.4 Conclusions *167*

6 A Framework for the Modeling of Reactive Separations *173*
E.Y. Kenig *173*
6.1 Introduction *173*
6.2 Reactive Separations *174*
6.3 Classification of Modeling Methods *176*
6.4 Fluid-Dynamic Approach *178*
6.5 Hydrodynamic Analogy Approach *183*
6.6 Rate-Based Approach *188*
6.7 Parameter Estimation and Virtual Experiments *193*
6.8 Benefits of the Complementary Modeling *196*
6.9 Concluding Remarks *199*

7 Efficient Reduced Order Dynamic Modeling of Complex Reactive and Multiphase Separation Processes Using Orthogonal Collocation on Finite Elements *203*
P. Seferlis, T. Damartzis and N. Dalaouti *203*
7.1 Introduction *203*
7.2 NEQ/OCFE Model Formulation *205*
7.2.1 Conventional and Reactive Absorption and Distillation *207*
7.2.2 Multiphase Reactive Distillation *213*
7.3 Adaptive NEQ/OCFE for Enhanced Performance *218*
7.4 Dynamic Simulation Results *220*
7.4.1 Reactive Absorption of NO_x *220*
7.4.1.1 Process Description *220*
7.4.1.2 Dynamic Simulation Results *223*
7.4.2 Ethyl Acetate Production via Reactive Distillation *225*
7.4.2.1 Process Description *225*
7.4.2.2 Dynamic Simulation Results *227*
7.4.3 Butyl Acetate Production via Reactive Multiphase Distillation *231*
7.4.3.1 Process Description *231*
7.4.3.2 Dynamic Simulation Results *232*
7.5 Epilog *234*

8 Modeling of Crystallization Processes *239*
A. Abbas, J. Romagnoli and D. Widenski *239*
8.1 Introduction *239*
8.2 Background *240*
8.2.1 Crystallization Methods *241*
8.2.1.1 Recrystallization Methods *241*
8.2.2 Driving Force *242*
8.3 Solubility Predictions *243*
8.3.1 Empirical Approach *243*
8.3.2 Correlative Thermodynamic *244*
8.3.3 Predictive Thermodynamic *244*
8.3.3.1 Jouyban–Acree Model *245*
8.3.3.2 MOSCED Model *245*
8.3.3.3 NRTL-SAC Model *246*
8.3.3.4 UNIFAC Model *247*
8.3.3.5 Solubility and Activity Coefficient Relationship *247*
8.3.4 Solubility Examples *247*
8.3.5 Solution Concentration Measurement Process Analytical Tools *250*
8.4 Crystallization Mechanisms *251*
8.4.1 Nucleation *251*
8.4.1.1 Modeling Nucleation *252*
8.4.2 Growth and Dissolution *254*
8.4.3 Agglomeration and Aggregation *255*

8.4.4 Attrition *255*
8.5 Population, Mass, and Energy Balances *256*
8.5.1 Population Balance *256*
8.5.2 Solution Methods *257*
8.5.2.1 Method of Moments *257*
8.5.2.2 Discretization Method *258*
8.5.3 Mass and Energy Balances *264*
8.6 Crystal Characterization *264*
8.6.1 Crystal Shape *264*
8.6.2 Crystal Size *265*
8.6.3 Crystal Distribution *265*
8.6.4 Particle Measurement Process Analytical Tools *266*
8.7 Solution Environment and Model Application *266*
8.7.1 Simulation Environment *266*
8.7.2 Experimental Design *267*
8.7.3 Parameter Estimation *268*
8.7.4 Validation *269*
8.8 Optimization *270*
8.8.1 Example 1: Antisolvent Feedrate Optimization *270*
8.8.2 Example 2: Optimal Seeding in Cooling Crystallization *274*
8.9 Future Outlook *276*

9 Modeling Multistage Flash Desalination Process – Current Status and Future Development *287*
I.M. Mujtaba *287*
9.1 Introduction *287*
9.2 Issues in MSF Desalination Process *289*
9.3 State-of-the-Art in Steady-State Modeling of MSF Desalination Process *292*
9.3.1 Scale Formation Modeling *299*
9.3.1.1 Estimation of Dynamic Brine Heater Fouling Profile *301*
9.3.1.2 Modeling the Effect of NCGs *301*
9.3.1.3 Modeling of Environmental Impact *302*
9.4 State-of-the-Art in Dynamic Modeling of MSF Desalination Process *303*
9.5 Case Study *308*
9.5.1 Steady-State Operation *308*
9.5.2 Dynamic Operation *311*
9.6 Future Challenges *312*
9.6.1 Process Modeling *312*
9.6.2 Steady-State and Dynamic Simulation *313*
9.6.3 Tackling Environmental Issues *313*
9.6.4 Process Optimization *314*
9.7 Conclusions *315*

Part II Biological, Bio-Processing and Biomedical Systems 319

10 Dynamic Models of Disease Progression: Toward a Multiscale Model of Systemic Inflammation in Humans *321*
J.D. Scheff, P.T. Foteinou, S.E. Calvano, S.F. Lowry and I.P. Androulakis *321*
10.1 Introduction *321*
10.2 Background *322*
10.2.1 *In-Silico* Modeling of Inflammation *323*
10.2.2 Multiscale Models of Human Endotoxemia *325*
10.2.3 Data Collection *327*
10.3 Methods *328*
10.3.1 Developing a Multilevel Human Inflammation Model *328*
10.3.1.1 Identification of the Essential Transcriptional Responses *328*
10.3.1.2 Modeling Inflammation at the Cellular Level *330*
10.3.1.3 Modeling Inflammation at the Systemic Level *335*
10.3.1.4 Modeling Neuroendocrine–Immune System Interactions *336*
10.3.1.5 Modeling the Effect of Endotoxin Injury on Heart Rate Variability *338*
10.4 Results *340*
10.4.1 Transcriptional Analysis and Major Response Elements *340*
10.4.2 Elements of a Multilevel Human Inflammation Model *343*
10.4.3 Estimation of Relevant Model Parameters *345*
10.4.4 Qualitative Assessment of the Model *347*
10.4.4.1 Implications of Increased Insult *348*
10.4.4.2 Modes of Dysregulation of the Inflammatory Response *349*
10.4.4.3 The Emergence of Memory Effects *353*
10.4.4.4 Evaluation of Stress Hormone Infusion in Modulating the Inflammatory Response *354*
10.5 Conclusions *360*

11 Dynamic Modeling and Simulation for Robust Control of Distributed Processes and Bioprocesses *369*
A.A. Alonso, M.R. García and C. Vilas *369*
11.1 Introduction *369*
11.2 Model Reduction of DPS: Theoretical Background *372*
11.2.1 Model Reduction in the Context of the Finite Element Method *374*
11.2.1.1 Proper Orthogonal Decomposition *376*
11.2.1.2 Laplacian Spectral Decomposition *377*
11.3 Model Reduction in Identification of Bioprocesses *377*
11.3.1 Illustrative Example: Production of Gluconic Acid in a Tubular Reactor *378*
11.3.2 Observer Validation *379*

11.4 Model Reduction in Control Applications 383
11.4.0.1 Model Equations 384
11.4.1 Robust Control of Tubular Reactors 386
11.4.1.1 Controller Synthesis 389
11.4.1.2 Robust Control with a Finite Number of Actuators 392
11.4.2 Real-Time Optimization: Multimodel Predictive Control 394
11.4.2.1 Optimization Problem 395
11.4.2.2 The Online Strategy 396
11.5 Conclusions 397

12 Model Development and Analysis of Mammalian Cell Culture Systems *403*
A. Kiparissides, M. Koutinas, E.N. Pistikopoulos and A. Mantalaris *403*
12.1 Introduction 403
12.2 Review of Mathematical Models of Mammalian Cell Culture Systems 406
12.3 Motivation 410
12.4 Dynamic Modeling of Biological Systems – An Illustrative Example 413
12.4.1 First Principles Model Derivation 415
12.4.2 Model Analysis 421
12.4.3 Design of Experiments and Model Validation 432
12.5 Concluding Remarks 435

13 Dynamic Model Building Using Optimal Identification Strategies, with Applications in Bioprocess Engineering *441*
E. Balsa-Canto, J.R. Banga and M.R. García *441*
13.1 Introduction 441
13.2 Parameter Estimation: Problem Formulation 443
13.2.1 Mathematical Model Formulation 444
13.2.2 Experimental Scheme and Experimental Data 444
13.2.3 Cost Function 445
13.2.4 Numerical Methods: Single Shooting vs. Multiple Shooting 446
13.3 Identifiability 447
13.4 Optimal Experimental Design 449
13.4.1 Numerical Methods: The Control Vector Parameterization Approach 450
13.5 Nonlinear Programming Solvers 450
13.6 Illustrative Examples 453
13.6.1 Modeling of the Microbial Growth 453
13.6.2 Modeling the Production of Gluconic Acid in a Fed-Batch Reactor 457
13.7 Overview 463

14 Multiscale Modeling of Transport Phenomena in Plant-Based Foods *469*
Q.T. Ho, P. Verboven, B.E. Verlinden, E. Herremans and B.M. Nicolaï *469*
14.1 Introduction *469*
14.2 Length Scales of Biological Materials *470*
14.3 Multiscale Modeling of Transport Phenomena *472*
14.3.1 Mass Transport Fundamentals *472*
14.3.2 Multiscale Transport Phenomena *474*
14.3.2.1 Macroscale Approach *474*
14.3.2.2 Microscale Approach *474*
14.3.2.3 Kinetic Modeling *475*
14.3.2.4 Multiscale Model *476*
14.4 Numerical Solution *476*
14.4.1 Geometrical Model *476*
14.4.2 Discretization *478*
14.5 Case Study: Application of Multiscale Gas Exchange in Fruit *480*
14.5.1 Macroscale Model *480*
14.5.2 Microscale Model *482*
14.5.3 O_2 Transport Model *482*
14.5.4 CO_2 Transport Model (Lumped CO_2 Transport Model) *483*
14.6 Conclusions and Outlook *485*

15 Synthetic Biology: Dynamic Modeling and Construction of Cell Systems *493*
T.T. Marquez-Lago and M.A. Marchisio *493*
15.1 Introduction *493*
15.2 Constructing a Model with Parts *494*
15.2.1 General Nomenclature *494*
15.2.1.1 Parts and Devices *494*
15.2.1.2 Common Signal Carriers *496*
15.2.1.3 Pools and Fluxes *497*
15.2.2 Part Models *500*
15.2.2.1 Promoters *500*
15.2.2.2 Ribosome-Binding Sites *504*
15.2.2.3 Coding Regions *508*
15.2.2.4 Noncoding DNA *509*
15.2.2.5 Small RNA *511*
15.2.2.6 Terminator *511*
15.2.3 Introducing Parts and Fluxes into Deterministic Equations *512*
15.3 Modeling Regimes and Simulation Techniques *518*
15.3.1 Deterministic or Stochastic Modeling? *519*
15.3.1.1 Deterministic Regime *519*
15.3.1.2 Stochastic Regime *520*

15.3.2 Stochastic Simulation Algorithms *522*
15.3.2.1 Exact Algorithms *522*
15.3.2.2 Coarse-Grained Methods *527*
15.4 Application *532*
15.4.1 The Repressilator *533*
15.5 Conclusions *541*

16 Identification of Physiological Models of Type 1 Diabetes Mellitus by Model-Based Design of Experiments *545*
F. Galvanin, M. Barolo, S. Macchietto and F. Bezzo *545*
16.1 Introduction *546*
16.1.1 Glucose Concentration Control Issues *547*
16.2 Introducing Physiological Models *548*
16.3 Identifying a Physiological Model: The Need for Experiment Design *548*
16.4 Standard Clinical Tests *550*
16.5 A Compartmental Model of Glucose Homeostasis *551*
16.6 Model Identifiability Issues *552*
16.6.1 A Discussion on the Identifiability of the Hovorka Model *554*
16.7 Design of Experiments Under Constraints for Physiological Models *556*
16.7.1 Design Procedure *558*
16.8 Design of Experimental Protocols *560*
16.8.1 Modified OGTT (mOGTT) *561*
16.8.1.1 Effect of the Number of Samples *562*
16.9 Dealing with Uncertainty *563*
16.9.1 Online Model-Based Redesign of Experiments *565*
16.9.2 Model-Based Design of Experiment with Backoff (MBDoE-B) *566*
16.9.2.1 Backoff Application *567*
16.9.3 Effect of a Structural Difference Between a Model and a Subject *569*
16.10 Conclusions *572*

Index *583*