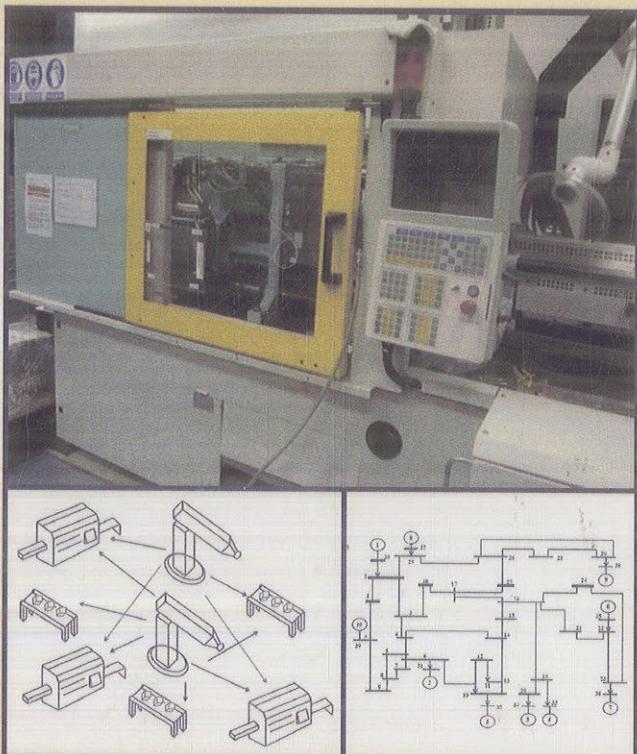


## Automation and Control Engineering Series

# Intelligent Diagnosis and Prognosis of Industrial Networked Systems



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# Contents

Preface.....	xi
Nomenclature .....	xv
List of Figures .....	xxii
List of Tables.....	xxi
<b>Chapter 1</b> Introduction .....	1
1.1 Diagnosis and Prognosis.....	2
1.1.1 Parametric Based .....	2
1.1.2 Non-Parametric Based .....	3
1.2 Applications in Industrial Networked Systems .....	5
1.2.1 Modal Parametric Identification (MPI) .....	5
1.2.2 Dominant Feature Identification (DFI).....	6
1.2.3 Probabilistic Small Signal Stability Assessment.....	6
1.2.4 Discrete Event Command and Control .....	7
<b>Chapter 2</b> Vectors, Matrices, and Linear Systems .....	9
2.1 Fundamental Concepts .....	9
2.1.1 Vectors .....	9
2.1.2 Matrices .....	11
2.2 Linear Systems .....	14
2.2.1 Introduction to Linear Systems.....	14
2.2.2 State-Space Representation of LTI Systems.....	15
2.2.3 Linearization of Non-Linear Systems.....	18
2.3 Eigenvalue Decomposition and Sensitivity .....	19
2.3.1 Eigenvalue and Eigenvector.....	19
2.3.2 Eigenvalue Decomposition .....	21
2.3.3 Generalized Eigenvectors .....	23
2.3.4 Eigenvalue Sensitivity to Non-Deterministic System Parameters.....	27
2.3.5 Eigenvalue Sensitivity to Link Parameters .....	28
2.4 Singular Value Decomposition (SVD) and Applications .....	32
2.4.1 Singular Value Decomposition (SVD) .....	32
2.4.2 Norms, Rank, and Condition Number .....	34
2.4.3 Pseudo-Inverse.....	34
2.4.4 Least Squares Solution .....	34

2.4.5 Minimum-Norm Solution Using SVD .....	36
2.5 Boolean Matrices .....	37
2.5.1 Binary Relation.....	38
2.5.2 Graphs.....	40
2.5.3 Discrete-Event Systems.....	40
2.6 Conclusion .....	44
<b>Chapter 3 Modal Parametric Identification (MPI) .....</b>	<b>47</b>
3.1 Introduction .....	47
3.2 Servo-Mechanical-Prototype Production Cycle .....	50
3.2.1 Modal Summation .....	53
3.2.2 Pole-Zero Product.....	54
3.2.3 Lumped Polynomial .....	55
3.3 Systems Design Approach.....	55
3.4 Modal Parametric Identification (MPI) Algorithm.....	62
3.4.1 Natural Frequencies $f_i$ and Damping Ratios $\zeta_i$ .....	64
3.4.2 Reformulation Using Forsythe's Orthogonal Polynomials....	68
3.4.3 Residues $R_i$ .....	73
3.4.4 Error Analysis.....	75
3.5 Industrial Application: Hard Disk Drive Servo Systems.....	76
3.6 Results and Discussions.....	82
3.7 Conclusion .....	84
<b>Chapter 4 Dominant Feature Identification (DFI) .....</b>	<b>85</b>
4.1 Introduction .....	85
4.2 Principal Component Analysis (PCA).....	90
4.2.1 Approximation of Linear Transformation $X$ .....	90
4.2.2 Approximation in Range Space by Principal Components ..	91
4.3 Dominant Feature Identification (DFI).....	92
4.3.1 Data Compression.....	92
4.3.2 Selection of Dominant Features .....	93
4.3.3 Error Analysis.....	95
4.3.4 Simplified Computations .....	97
4.4 Time Series Forecasting Using Force Signals and Static Models ...	97
4.4.1 Determining the Dominant Features.....	99
4.4.2 Prediction of Tool Wear .....	99
4.4.3 Experimental Setup.....	100
4.4.4 Effects of Different Numbers of Retained Singular Values $q$ and Dominant Features $p$ .....	105
4.4.5 Comparison of Proposed Dominant Feature Identification (DFI) and Principal Feature Analysis (PFA) .....	108
4.5 Time Series Forecasting Using Acoustic Emission Signals and Dynamic Models.....	113
4.5.1 ARMAX Model Based on DFI.....	114

4.5.2 Experimental Setup.....	116
4.5.3 Comparison of Standard Non-Dynamic Prediction Models with Dynamic ARMAX Model .....	121
4.5.4 Comparison of Proposed ARMAX Model Using ELS with DFI, MRM Using RLS with DFI, and MRM Using RLS with Principal Feature Analysis (PFA).....	123
4.5.5 Effects of Different Numbers of Retained Singular Values and Features Selected .....	125
4.5.6 Comparison of Tool Wear Prediction Using AE Measure- ments and Force Measurements.....	130
4.6 DFI for Industrial Fault Detection and Isolation (FDI) .....	131
4.6.1 Augmented Dominant Feature Identification (ADFI) .....	132
4.6.2 Decentralized Dominant Feature Identification (DDFI)....	132
4.6.3 Fault Classification with Neural Networks.....	132
4.6.4 Experimental Setup.....	134
4.6.5 Fault Detection Using 120 Features .....	142
4.6.6 Augmented Dominant Feature Identification (ADFI) and NN for Fault Detection .....	143
4.6.7 Decentralized Dominant Feature Identification (DDFI) and NN for Fault Detection .....	145
4.7 Conclusion .....	149
<b>Chapter 5 Probabilistic Small Signal Stability Assessment.....</b>	<b>151</b>
5.1 Introduction .....	152
5.2 Power System Modeling: Differential Equations .....	155
5.2.1 Synchronous Machines.....	156
5.2.2 Exciter and Automatic Voltage Regulator (AVR).....	163
5.2.3 Speed Governor and Steam Turbine .....	165
5.2.4 Interaction between a Synchronous Machine and Its Con- trol Systems .....	167
5.3 Power System Modeling: Algebraic Equations.....	168
5.3.1 Stator Equations.....	168
5.3.2 Network Admittance Matrix $\mathbf{Y}_N$ .....	171
5.3.3 Reduced Admittance Matrix $\mathbf{Y}_R$ .....	172
5.4 State Matrix and Critical Modes.....	173
5.5 Eigenvalue Sensitivity Matrix.....	178
5.5.1 Sensitivity Analysis of the New England Power System ...	183
5.5.2 Statistical Functions.....	187
5.5.3 Single Variate Normal PDF of $\alpha_i$ .....	193
5.5.4 Multivariate Normal PDF .....	194
5.5.5 Probability Calculations .....	195
5.5.6 Small Signal Stability Region.....	198
5.6 Impact of Induction Motor Load .....	201
5.6.1 Composite Load Model for Sensitivity Analysis.....	203

5.6.2 Motor Load Parameter Sensitivity Analysis.....	205
5.6.3 Parametric Changes and Critical Modes Mobility.....	214
5.6.4 Effect of the Number of IMs on Overall Sensitivity (with 30% IM load) .....	215
5.6.5 Effect on Overall Sensitivity with Different Percentages of IM Load in the Composite Load.....	220
5.7 Discussion.....	221
5.8 Conclusion .....	222
<b>Chapter 6 Discrete Event Command and Control.....</b>	<b>225</b>
6.1 Introduction .....	225
6.2 Discrete Event C2 Structure for Distributed Teams .....	227
6.2.1 Task Sequencing Matrix (TSM) .....	229
6.2.2 Resource Assignment Matrix (RAM).....	233
6.2.3 Programming Multiple Missions .....	235
6.3 Conjunctive Rule-Based Discrete Event Controller (DEC).....	237
6.3.1 DEC State Equation .....	237
6.3.2 DEC Output Equations .....	239
6.3.3 DEC as a Feedback Controller .....	239
6.3.4 Functionality of the DEC .....	239
6.3.5 Properness and Fairness of the DEC Rule Base .....	241
6.4 Disjunctive Rule-Based Discrete Event Controller (DEC).....	244
6.5 DEC Simulation and Implementation.....	245
6.5.1 Simulation of Networked Team Example.....	246
6.5.2 Implementation of Networked Team Example on Actual WSN .....	247
6.5.3 Simulation of Multiple Military Missions Using FCS .....	247
6.6 Conclusion .....	252
<b>Chapter 7 Future Challenges.....</b>	<b>255</b>
7.1 Energy-Efficient Manufacturing .....	255
7.2 Life Cycle Assessment (LCA).....	257
7.3 System of Systems (SoS).....	260
References.....	263
Index .....	279