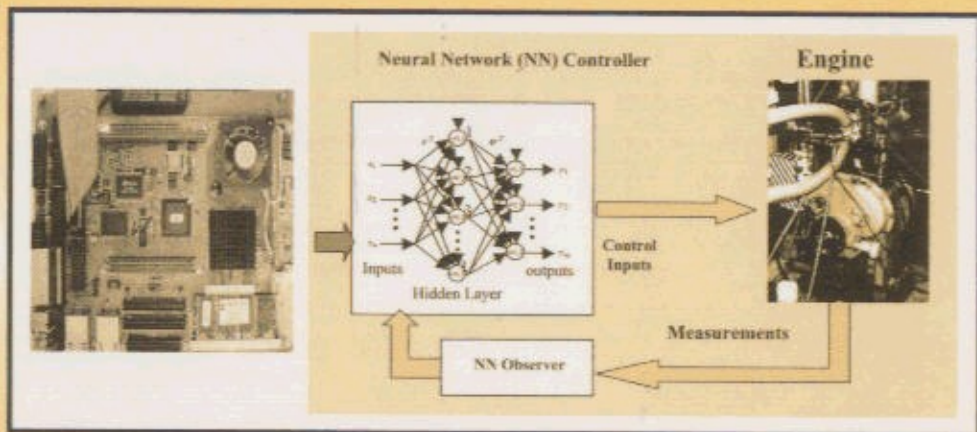


Control Engineering Series

Neural Network Control of Nonlinear Discrete-Time Systems



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Contents

Chapter 1	Background on Neural Networks.....	1
1.1	NN Topologies and Recall.....	2
1.1.1	Neuron Mathematical Model.....	3
1.1.2	Multilayer Perceptron	8
1.1.3	Linear-in-the-Parameter NN	12
1.1.3.1	Gaussian or Radial Basis Function Networks	12
1.1.3.2	Cerebellar Model Articulation Controller Networks.....	13
1.1.4	Dynamic NN.....	15
1.1.4.1	Hopfield Network.....	15
1.1.4.2	Generalized Recurrent NN.....	19
1.2	Properties of NN	24
1.2.1	Classification and Association	25
1.2.1.1	Classification	25
1.2.1.2	Association	28
1.2.2	Function Approximation	31
1.3	NN Weight Selection and Training	35
1.3.1	Weight Computation	36
1.3.2	Training the One-Layer NN — Gradient Descent	38
1.3.2.1	Gradient Descent Tuning.....	39
1.3.2.2	Epoch vs. Batch Updating	42
1.3.3	Training the Multilayer NN — Backpropagation Tuning ..	47
1.3.3.1	Background	49
1.3.3.2	Derivation of the Backpropagation Algorithm	51
1.3.3.3	Improvements on Gradient Descent	63
1.3.4	Hebbian Tuning.....	67
1.4	NN Learning and Control Architectures.....	69
1.4.1	Unsupervised and Reinforcement Learning.....	69
1.4.2	Comparison of the Two NN Control Architectures	70
References	71
Problems	73

Chapter 2	Background and Discrete-Time Adaptive Control	75
2.1	Dynamical Systems	75
2.1.1	Discrete-Time Systems	75
2.1.2	Brunovsky Canonical Form	76
2.1.3	Linear Systems	77
2.2	Mathematical Background	79
2.2.1	Vector and Matrix Norms	79
2.2.2	Continuity and Function Norms	82
2.3	Properties of Dynamical Systems	83
2.3.1	Stability	83
2.3.2	Passivity	86
2.3.3	Interconnections of Passive Systems	87
2.4	Nonlinear Stability Analysis and Controls Design	88
2.4.1	Lyapunov Analysis for Autonomous Systems	88
2.4.2	Controller Design Using Lyapunov Techniques	92
2.4.3	Lyapunov Analysis for Nonautonomous Systems	97
2.4.4	Extensions of Lyapunov Techniques and Bounded Stability	99
2.5	Robust Implicit STR	102
2.5.1	Background	104
2.5.1.1	Adaptive Control Formulation	105
2.5.1.2	Stability of Dynamical Systems	106
2.5.2	STR Design	111
2.5.2.1	Structure of the STR and Error System Dynamics	111
2.5.2.2	STR Parameter Updates	112
2.5.3	Projection Algorithm	116
2.5.4	Ideal Case: No Disturbances and No STR Reconstruction Errors	117
2.5.5	Parameter-Tuning Modification for Relaxation of PE Condition	119
2.5.6	Passivity Properties of the STR	123
2.5.7	Conclusions	127
	References	127
	Problems	129
	Appendix 2.A	131
Chapter 3	Neural Network Control of Nonlinear Systems and Feedback Linearization	139
3.1	NN Control with Discrete-Time Tuning	142

3.1.1	Dynamics of the m th Order Multi-Input and Multi-Output Discrete-Time Nonlinear System	143
3.1.2	One-Layer NN Controller Design	145
3.1.2.1	NN Controller Design	146
3.1.2.2	Structure of the NN and Error System Dynamics	147
3.1.2.3	Weight Updates of the NN for Guaranteed Tracking Performance	148
3.1.2.4	Projection Algorithm	155
3.1.2.5	Ideal Case: No Disturbances and No NN Reconstruction Errors	156
3.1.2.6	Parameter Tuning Modification for Relaxation of PE Condition	160
3.1.3	Multilayer NN Controller Design	167
3.1.3.1	Error Dynamics and NN Controller Structure	170
3.1.3.2	Multilayer NN Weight Updates	172
3.1.3.3	Projection Algorithm	179
3.1.3.4	Multilayer NN Weight-Tuning Modification for Relaxation of PE Condition	185
3.1.4	Passivity of the NN	191
3.1.4.1	Passivity Properties of the Tracking Error System	191
3.1.4.2	Passivity Properties of One-Layer NN	192
3.1.4.3	Passivity of the Closed-Loop System	195
3.1.4.4	Passivity of the Multilayer NN	196
3.2	Feedback Linearization	197
3.2.1	Input–Output Feedback Linearization Controllers	197
3.2.1.1	Error Dynamics	198
3.2.2	Controller Design	199
3.3	NN Feedback Linearization	200
3.3.1	System Dynamics and Tracking Problem	201
3.3.2	NN Controller Design for Feedback Linearization	204
3.3.2.1	NN Approximation of Unknown Functions	204
3.3.2.2	Error System Dynamics	206
3.3.2.3	Well-Defined Control Problem	209
3.3.2.4	Controller Design	210
3.3.3	One-Layer NN for Feedback Linearization	211
3.3.3.1	Weight Updates Requiring PE	211
3.3.3.2	Projection Algorithm	222
3.3.3.3	Weight Updates not Requiring PE	223
3.4	Multilayer NN for Feedback Linearization	233
3.4.1	Weight Updates Requiring PE	234

3.4.2	Weight Updates Not Requiring PE.....	236
3.5	Passivity Properties of the NN	254
3.5.1	Passivity Properties of the Tracking Error System.....	255
3.5.2	Passivity Properties of One-Layer NN Controllers	256
3.5.3	Passivity Properties of Multilayer NN Controllers.....	256
3.6	Conclusions	259
	References	259
	Problems	262

Chapter 4	Neural Network Control of Uncertain Nonlinear Discrete-Time Systems with Actuator Nonlinearities	265
4.1	Background on Actuator Nonlinearities	266
4.1.1	Friction	266
4.1.1.1	Static Friction Models.....	267
4.1.1.2	Dynamic Friction Models	268
4.1.2	Deadzone.....	269
4.1.3	Backlash.....	272
4.1.4	Saturation	273
4.2	Reinforcement NN Learning Control with Saturation	274
4.2.1	Nonlinear System Description	276
4.2.2	Controller Design Based on the Filtered Tracking Error ...	277
4.2.3	One-Layer NN Controller Design	279
4.2.3.1	The Strategic Utility Function	279
4.2.3.2	Critic NN.....	280
4.2.3.3	Action NN	281
4.2.4	NN Controller without Saturation Nonlinearity	283
4.2.5	Adaptive NN Controller Design with Saturation Nonlinearity	287
4.2.5.1	Auxiliary System Design.....	287
4.2.5.2	Adaptive NN Controller Structure with Saturation	288
4.2.5.3	Closed-Loop System Stability Analysis.....	288
4.2.6	Comparison of Tracking Error and Reinforcement Learning-Based Controls Design	296
4.3	Uncertain Nonlinear System with Unknown Deadzone and Saturation Nonlinearities	297
4.3.1	Nonlinear System Description and Error Dynamics	300
4.3.2	Deadzone Compensation with Magnitude Constraints	300
4.3.2.1	Deadzone Nonlinearity	300
4.3.2.2	Compensation of Deadzone Nonlinearity	301
4.3.2.3	Saturation Nonlinearities	303

4.3.3	Reinforcement Learning NN Controller Design	304
4.3.3.1	Error Dynamics	304
4.3.3.2	Critic NN Design	305
4.3.3.3	Main Result	306
4.4	Adaptive NN Control of Nonlinear System with Unknown Backlash	309
4.4.1	Nonlinear System Description	310
4.4.2	Controller Design Using Filtered Tracking Error without Backlash Nonlinearity	311
4.4.3	Backlash Compensation Using Dynamic Inversion	312
4.5	Conclusions	319
	References	320
	Problems	323
	Appendix 4.A	325
	Appendix 4.B	329
	Appendix 4.C	330
	Appendix 4.D	338

Chapter 5 Output Feedback Control of Strict Feedback Nonlinear MIMO Discrete-Time Systems

5.1	Class of Nonlinear Discrete-Time Systems	345
5.2	Output Feedback Controller Design	345
5.2.1	Observer Design	346
5.2.2	NN Controller Design	347
5.2.2.1	Auxiliary Controller Design	348
5.2.2.2	Controller Design with Magnitude Constraints ...	349
5.3	Weight Updates for Guaranteed Performance	350
5.3.1	Weights Updating Rule for the Observer NN	350
5.3.2	Strategic Utility Function	351
5.3.3	Critic NN Design	351
5.3.4	Weight-Updating Rule for the Action NN	353
5.4	Conclusions	361
	References	362
	Problems	363
	Appendix 5.A	364
	Appendix 5.B	366

Chapter 6 Neural Network Control of Nonstrict Feedback Nonlinear Systems

6.1	Introduction	371
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6.1.1	Nonlinear Discrete-Time Systems in Nonstrict Feedback Form	371
6.1.2	Backstepping Design	373
6.2	Adaptive NN Control Design Using State Measurements	374
6.2.1	Tracking Error-Based Adaptive NN Controller Design	375
6.2.1.1	Adaptive NN Backstepping Controller Design ...	375
6.2.1.2	Weight Updates	378
6.2.2	Adaptive Critic-Based NN Controller Design	381
6.2.2.1	Critic NN Design	382
6.2.2.2	Weight-Tuning Algorithms.....	383
6.3	Output Feedback NN Controller Design.....	392
6.3.1	NN Observer Design	394
6.3.2	Adaptive NN Controller Design	396
6.3.3	Weight Updates for the Output Feedback Controller	400
6.4	Conclusions	406
	References	407
	Problems	409
	Appendix 6.A.....	411
	Appendix 6.B	419

Chapter 7 System Identification Using Discrete-Time Neural Networks

7.1	Identification of Nonlinear Dynamical Systems.....	425
7.2	Identifier Dynamics for MIMO Systems.....	426
7.3	NN Identifier Design.....	429
7.3.1	Structure of the NN Identifier and Error System Dynamics.....	430
7.3.2	Multilayer NN Weight Updates.....	432
7.4	Passivity Properties of the NN	439
7.5	Conclusions	443
	References	444
	Problems	444

Chapter 8 Discrete-Time Model Reference Adaptive Control.....

8.1	Dynamics of an m th-Order Multi-Input and Multi-Output System	448
8.2	NN Controller Design	451
8.2.1	NN Controller Structure and Error System Dynamics	451
8.2.2	Weight Updates for Guaranteed Tracking Performance	454
8.3	Projection Algorithm	460

8.4	Conclusions	468
	References	469
	Problems	470

Chapter 9 Neural Network Control in Discrete-Time Using Hamilton–Jacobi–Bellman Formulation 473

9.1	Optimal Control and Generalized HJB Equation in Discrete-Time	475
9.2	NN Least-Squares Approach	486
9.3	Numerical Examples	490
9.4	Conclusions	508
	References	508
	Problems	509

Chapter 10 Neural Network Output Feedback Controller Design and Embedded Hardware Implementation..... 511

10.1	Embedded Hardware-PC Real-Time Digital Control System	512
10.1.1	Hardware Description	512
10.1.2	Software Description	514
10.2	SI Engine Test Bed	514
10.2.1	Engine-PC Interface Hardware Operation	516
10.2.2	PC Operation.....	518
10.2.3	Timing Specifications for Controller	520
10.2.4	Software Implementation.....	521
10.3	Lean Engine Controller Design and Implementation	523
10.3.1	Engine Dynamics	526
10.3.2	NN Observer Design	528
10.3.3	Adaptive NN Output Feedback Controller Design.....	530
10.3.3.1	Adaptive NN Backstepping Design.....	531
10.3.3.2	Weight Updates for Guaranteed Performance.....	535
10.3.4	Simulation of NN Controller C Implementation	537
10.3.5	Experimental Results	539
10.4	EGR Engine Controller Design and Implementation	547
10.4.1	Engine Dynamics with EGR	549
10.4.2	NN Observer Design	551
10.4.3	Adaptive Output Feedback EGR Controller Design	553
10.4.3.1	Error Dynamics	554
10.4.3.2	Weight Updates for Guaranteed Performance.....	557
10.4.4	Numerical Simulation	559

10.5 Conclusions	563
References	564
Problems	565
Appendix 10.A	566
Appendix 10.B.....	570
Index	595