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# Intelligent Optimization and Control of Complex Metallurgical Processes





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## Preface

Iron and steel industry is the basis for the development of a country. Its level of development determines the economic level and comprehensive national power of a country. However, accelerated energy consumption and significant  $CO_2$  emissions have limited the development of the iron and steel industry. Metallurgical automation technologies have been developed to yield the green manufacturing of the iron and steel industry.

The iron and steel industry involves complex processes, such as raw material proportioning, sintering, blast furnace ironmaking, steelmaking, continuous casting, and rolling. They have the common characteristics of strong nonlinearity and a large number of parameters. In order to achieve the green manufacturing of the iron and steel industry, we have to consider the problems of energy saving, emission reduction, environmental protection, etc. These problems involve the modeling, optimization, and control of complex processes. However, conventional methods of modeling, optimization, and control are not suitable for actual applications for complex processes with uncertainties. Advanced intelligent optimization and control technologies have been applied to the iron and steel industry to improve production efficiency and reduce  $CO_2$  emissions.

We summarized our work and experience in the control of complex metallurgical processes over the last two decades in this monograph. We hope that it would be a useful reference for engineers in the field of metallurgical automation and complex process control, and for graduate students interested in computational intelligence and its applications of industrial process control.

The monograph consists of six chapters. Chapter 1 describes the current status of metallurgy processes and explains conventional intelligent algorithms in the aspects of modeling, optimization, and control. Chapter 2 describes the methods of how to optimize the proportioning of a coal blending process in an iron ore sintering process. An expert control strategy is designed based on a combination of back-propagation networks, mathematical models, and rule models to accurately determine and track the target percentages for a coal blending process. An intelligent integrated optimization system with a hierarchical configuration is devised to solve the problem of optimizing the proportioning for an iron ore sintering process.

Chapter 3 focuses on the problems of how to measure and control the coke-oven temperature. An integrated soft-sensing model of the coke-oven temperature and a hybrid hierarchical control system of a coke-oven combustion process are developed to solve these problems. Chapter 4 describes control methods of thermal state parameters in sintering process. An intelligent control of a sintering ignition process is designed to stabilize the ignition temperature. An intelligent control system for the burn-through point is designed to stabilize the point in an actual sintering process. Chapter 5 describes intelligent decoupling control methods for both the gas collection process in an iron and steel company. Chapter 6 focuses on the problem of how to control the rolling temperature and reduce the energy consumption of the process of a reheating furnace. An optimization and control system for the heating furnace is devised to solve this problem.

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# Contents

1 Introduction			1	
	1.1	Comp	lex Metallurgical Processes	1
	1.2	Model	ling, Control, and Optimization of Complex	
			lurgical Processes	3
		1.2.1	Modeling	3
		1.2.2	Control	4
		1.2.3	Optimization	6
	1.3	Intellig	gent Control and Optimization Methods	6
		1.3.1	Neural Network Modeling	6
		1.3.2	Fuzzy Control	11
		1.3.3	Expert Control.	12
		1.3.4	Decoupling Control	16
		1.3.5	Hierarchical Intelligent Control	19
		1.3.6	Intelligent Optimization Algorithms	21
	1.4	Outlin	e of This Book	29
	Refe			30
2	Inte	lligent	Optimization and Control of Raw Material	
		-	ing Processes	33
	2.1		ss Description and System Configuration	36
			Process Description and Characteristic Analysis	36
		2.1.2	Control Architecture	40
	2.2	Intellig	gent Optimization and Control of Coal Blending	
			SS	41
		2.2.1	Quality-Prediction Models for Coal Blend	41
		2.2.2	Quality-Prediction Models for Coke	43
		2.2.3	Rule Models	45
		2.2.4	Determination of Target Percentages Based	
			on Rule Models	46

		2.2.5	Determination of Target Percentages Based	
			on Simulated Annealing Algorithm	49
		2.2.6	Tracking Control of Target Percentages	51
	2.3	Syster	n Implementation for Coal Blending Process	52
		2.3.1	System Configuration and Implementation	52
		2.3.2	Results of Actual Runs of Coal Blending Process	53
	2.4	Intelli	gent Integrated Optimization System for Proportioning	
		of Iron	n Ore in Sintering Process	54
		2.4.1	Cascade Integrated Quality-Prediction Model	
			for Sinter	56
		2.4.2	Verification of Quality-Prediction Model	63
		2.4.3	Optimization Model of Proportioning	65
		2.4.4	Optimization Method	68
		2.4.5	Verification of Optimization Algorithms	73
	2.5		n Implementation for Proportioning of Iron Ore	
			tering Process	77
		2.5.1	System Configuration and Implementation	77
		2.5.2	Results of Actual Runs in Sintering Process	79
	2.6		usion	80
	Refe	rences		81
3	Inte	lligent	Optimization and Control of Coking Process	83
	3.1		cteristic Analysis and System Configuration	85
		3.1.1	Process Description	86
		3.1.2	Analysis of Characteristics	88
		3.1.3	Control Requirements	90
		3.1.4	System Configuration	91
	3.2	Integra	ated Soft Sensing of Coke-Oven Temperature	93
		3.2.1	Choice of Auxiliary Variables and Measurement	
			Points	93
		3.2.2	Structure of Soft-Sensing Model for Coke-Oven	
			Temperature	93
		3.2.3	Integrated Linear Regression Model	95
		3.2.4	Supervised Distributed Neural Network Model	97
		3.2.5	Model Adaptation	100
	3.3		gent Optimization and Control of Coke-Oven	
		Comb	ustion Process	101
		3.3.1	Configuration of Hybrid Hierarchical Control System	101
		3.3.2	Determination of Operating State	103
		3.3.3	Design of Coke-Oven Temperature Controller	105
		3.3.4	Design of Controller for Gas Flow Rate	110
		3.3.5	Design of Air Suction Power Controller	111

### Contents

	3.4	Opera	tion Planning and Optimal Scheduling of Coking	112
		3.4.1	Analysis of Operations Planning and Optimal	
			Scheduling of Coking	112
		3.4.2	Configuration of Optimal Scheduling	114
		3.4.3	Optimal Scheduling of Operating States	115
	3.5	Syster	n Implementation and Results of Actual Runs	122
		3.5.1	System Implementation	123
		3.5.2	Results of Actual Runs for Integrated Soft Sensing	
			of Coke-Oven Temperature	124
		3.5.3	Results of Actual Runs for Intelligent Optimization	
			and Control of Coke-Oven Combustion Process	124
		3.5.4	Results of Actual Runs for Coke-Oven Operation	
			Planning and Optimal Scheduling	129
	3.6	Concl	usion	130
	Refe	rences		131
4	Inte	lligent	Control of Thermal State Parameters in Sintering	
		-	· · · · · · · · · · · · · · · · · · ·	135
	4.1		ss Description and Characteristics Analysis	135
		4.1.1	Description of Sintering Process	135
		4.1.2	Characteristic Analysis of Thermal State Parameters	
			in Sintering Process	136
		4.1.3	Control Requirements	139
	4.2	Intelli	gent Control of Sintering Ignition Process	140
		4.2.1	Control System Architecture	140
		4.2.2	Intelligent Optimization and Control Algorithm	141
		4.2.3	Subspace Modeling of Sintering Ignition Process	142
		4.2.4	Periodic Disturbance Rejection Using	
			Equivalent-Input-Disturbance Estimation	147
		4.2.5	Experimental Simulation	151
	4.3	Intelli	gent Control System for Burn-Through Point	155
		4.3.1	Control System Architecture	155
		4.3.2	Soft Sensing and Prediction of Burn-Through Point	157
		4.3.3	Hybrid Fuzzy-Predictive Controller	161
		4.3.4	Bunker-Level Expert Controller	165
		4.3.5	Coordinating Control Algorithm	165
	4.4		rial Implementation and Results of Actual Runs	168
		4.4.1	Industrial Implementation	168
		4.4.2	Results of Actual Runs	169
	4.5		usion	172
	Refe	rences		173

5			Decoupling Control of Gas Collection	
	and	Mixing	g-and-Pressurization Processes	177
	5.1	Proces	ss Description and Characteristic Analysis	180
		5.1.1	Description and Analysis of Gas Collection Process	180
		5.1.2	Description and Analysis of Gas	
			Mixing-and-Pressurization Process	183
	5.2	Intelli	gent Decoupling Control of Gas Collection Process	184
		5.2.1	Intelligent Decoupling Control Based on Coupling	
			Degree Analysis	185
		5.2.2	Configuration of Intelligent Decoupling Control	
			System	189
		5.2.3	Decoupling Control Strategies	191
		5.2.4	Design of Intelligent Decoupling Control System	191
	5.3		n Implementation and Results of Actual Runs for Gas	
		Collec	ction Process	197
		5.3.1	System Implementation	197
		5.3.2	Results of Actual Runs	198
	5.4		gent Decoupling Control of Gas Mixing-and-Pressurization	
			\$\$	200
		5.4.1	Configuration of Gas Mixing-and-Pressurization	
			Control System	203
		5.4.2	Design of Calorific-Value and Pressure Decoupling	
			Control Subsystem.	204
		5.4.3	Design of Pressurization Control Subsystem	212
	5.5	n Implementation and Results of Actual Runs for Gas		
			g-and-Pressurization Process	213
		5.5.1	System Framework	213
		5.5.2	System Implementation	215
		5.5.3	Results of Actual Runs	216
	5.6		usion	217
	Refe	erences		218
6	Inte	lligent	<b>Optimization and Control for Reheating Furnaces</b>	223
	6.1	Proces	ss Description and Control Requirements	224
		6.1.1	Combustion Process and Control Requirements	
			for the Regenerative Pusher-Type Reheating Furnace	224
		6.1.2	Combustion Process of and Control Requirements	
			for Compact Strip Production Soaking Furnace	226
	6.2	Temp	erature Prediction Models	229
		6.2.1	Recurrent-Neural-Network Model	229
		6.2.2	Estimation of Zone Temperature	232
		6.2.3	Estimation of Billet Temperature	233
		6.2.4	Integrated Model of Billet Temperature Prediction	234

Con	tents

6.3	3 Optimization and Control for Regenerative Pusher-Type		
	Reheating Furnace	237	
	6.3.1 Configuration of Optimization and Control System	237	
	6.3.2 Decoupling Control Based on Fuzzy Neural Network	239	
	6.3.3 Optimization for Temperature	241	
	6.3.4 Verification and Discussion	247	
	6.3.5 Implementation and Results of Actual Runs	252	
6.4	Intelligent Control System for Soaking Furnace of Compact		
	Strip Production	255	
	6.4.1 Configuration of Intelligent Control System	256	
	6.4.2 Intelligent Control	258	
	6.4.3 Implementation and Results of Actual Runs	264	
6.5	Conclusion	267	
Refe	ences	269	
Index .		273	

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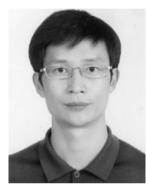
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# Abbreviations

ACO	Ant colony algorithm
ADO	ActiveX data object
AI	Artificial intelligence
ANN	Artificial neural network
ATL	ActiveX template library
BIBO	Bounded-input, bounded-output
BP	Backpropagation
BPNN	Backpropagation neural network
BTP	Burn-through point
C/S	Client/server
CIQPM	Cascade integrated quality-prediction model
COT	Coke-oven temperature
COTC	Coke-oven temperature on the coke side
COTM	Coke-oven temperature on the machine side
CSP	Compact strip production
CVPD	Calorific value and pressure decoupling
DCS	Distributed control system
DDE	Dynamic data exchange
DOB	Disturbance observer
ECS	Expert control system
EGT	Exhaust gas temperature
EGTRP	Exhaust gas temperature rise point
EID	Equivalent input disturbance
ES	Expert system
FCM	Fuzzy C mean
FL	Fuzzy logic
FNNDC	Fuzzy-neural-network decoupling controller
FNNIM	Fuzzy-neural-network inference machine
GA	Genetic algorithm
GAP-EKF	Growing and pruning with an extended Kalman filter

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HIC	Hierarchical intelligent control
HMI	Human–machine interface
HPSO	Hybrid particle swarm optimization
IIO	Intelligent integrated optimizer
IIOS	Intelligent integrated optimization system
JSP	Job scheduling problem
LP	Linear programming
LR	Linear regression
LTC	Longitudinal temperature on the coke side
LTM	Longitudinal temperature on the machine side
MFC	Microsoft foundation classes
MIMO	Multiple-input, multiple-output
NN	Neural network
OLEDB	Object linking and embedding database
OPC	OLE for process control
PID	Proportional-integral-differential
PLC	Programmable logic controller
PSO	Particle swarm optimization
QAP	Quadratic assignment problem
RBF	Radial basis function
RBF-RNN	Radial-base-function-based recurrent neural network
SA	Simulated annealing
SDF	Satisfactory degree function
SDNN	Supervised distributed neural network
SIP	Sintering ignition process
SSP	Satisfactory solution principle
TDF	Two-degrees-of-freedom
TSP	Traveling salesman problem
TTR	Temperature at the top of a regenerating chamber
TTRC	Temperature at the top of a regenerating chamber on the coke side
TTRM	Temperature at the top of a regenerating chamber on the machine side
VRP	Vehicle routing problem
WinCC	Windows control center