# **Engineering Applications of Computational Methods**

Volume 2

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## Effective Methods for Integrated Process Planning and Scheduling





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### **Foreword**

In the international academia and industry, scheduling theory and method of manufacturing system is an interdisciplinary research direction, involving systems engineering, operations research, artificial intelligence, control theory, computer technology, management engineering, and other disciplines. Process planning and shop scheduling are two highly important subsystems in the modern manufacturing system. Process planning decides the process route and processing resource allocation of the jobs, which can transform raw materials into finished form. Scheduling system is to arrange the jobs to the actual processing machines properly, linking the process designing and the production action. The integration of process planning and scheduling in the manufacturing procedure can optimize the production process, improving the efficiency and reducing the cost, which is a key to realize the intellectualization of manufacturing system. The contents in book mainly include the following problems, including flexible process planning problem, shop scheduling problem, integrated process planning scheduling problem, etc. These problems have a large amount of complexity, such as difficulty in modeling, complexity in calculation, multi-constraint, uncertainty, multi-minimal, large problem scale, multi-objective, coexistence of discrete and continuous variables, etc. Therefore, the research of IPPS has important academic and engineering value.

This book is a monograph about the effective methods for IPPS. Based on the research, teaching and engineering experience of the authors and their team for many years, the book mainly classifies in the following three aspects: flexible process planning, job shop scheduling, integrated process planning and shop scheduling. Furthermore, the book also summarizes Genetic Algorithm (GA), Genetic Programming (GP), Particle Swarm Optimization (PSO) algorithm, and other intelligent algorithms for solving the above problems. In addition, this book systematically describes the design thought of the intelligent algorithms, which may provide effective methods for the researchers to solve the practical engineering problems.

This book is divided into five parts, the first part is from Chaps. 1 to 3, which introduces the review of IPPS problem, including the models, methods, and applications. The second part mainly discusses the single-objective optimization of IPPS. The third part introduces IPPS from the aspect of multi-objective optimization. As

vi Foreword

for the fourth part, it belongs to the dynamic scheduling problem. Finally, the fifth part is the IPPS simulation prototype system. In general, the main contents of the book are from the second part to the fourth part, where process planning, scheduling, and IPPS will be discussed in details.

The second part is the single-objective optimization, which is discussed in the order of Process Planning (PP), Job shop Scheduling (JSP), Flexible Job shop Scheduling (FJSP), Integrated Process Planning and shop Scheduling (IPPS). In Chaps. 4 and 5, GP algorithm and PSO algorithm are used to solve the PP problem. Chapter 6 introduces the application of hybrid PSO and Variable Neighborhood Search (VNS) algorithm on JSP. In Chap. 7, a modified GA is introduced to solve FJSP, including total new Global Selection (GS) and Local Selection (LS) to generate high-quality initial population in the initialization. Chapter 8 introduces a Multi-Swarm Collaborative Evolutionary Algorithm (MSCEA) to solve FJSP. In Chap. 9, the mathematical model of IPPS and the application of evolutionary algorithm are presented. In Chap. 10, an agent-based approach is applied to solve IPPS. Chapter 11 introduces the application of modified GA on IPPS.

The third part is multi-objective optimization, which is introduced from FJSP to IPPS. Chapter 12 is the application of GA and TS algorithm in multi-objective FJSP. Chapter 13 introduces PSO and TS algorithm to multi-objective FJSP. Chapter 14 presents a Multi-Objective Genetic Algorithm (MOGA) based on immune and entropy principle to solve the multi-objective FJSP. In Chap. 15, an effective genetic algorithm is proposed to optimize the multi-objective Integrated Process Planning and Scheduling (IPPS) problem with various flexibilities in process planning. The research in Chap. 16 focuses on the multi-objective IPPS problem, and a game theory based approach is used to deal with the multiple objectives.

The fourth part focuses on the dynamic scheduling problem from Chaps. 17 to 20. In Chaps. 17 and 18, a genetic tabu search algorithm is developed for dynamic rescheduling job shop problem, while Chap. 18 is considering multi-objectives. In Chap. 19, Dynamic Flexible Job shop Scheduling Problem (DFJSSP) with job release dates is studied, and an approach based on GEP also proposed. In Chap. 20, a new dynamic IPPS model is formulated, the combination of hybrid algorithm and rolling window technology is applied to solve the dynamic IPPS problem.

The fifth part, shown in Chap. 21, introduces a IPPS simulation prototype system which is developed based on the practical requirements of the work shop and theoretical research results. Firstly, the application background of the system is introduced, and then the structure of the system is analyzed. Finally, the implementation and operation of the prototype system are represented through an engineering example, verifying the availability and effectiveness of the prototype system.

Foreword

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This book is written by Dr. Xinyu Li and Dr. Liang Gao, from State Key Laboratory of Digital Manufacturing Equipment and Technology, School of Mechanical Science and Engineering, Huazhong University of Science and Technology (HUST). In addition, postdoctoral Chunjiang Zhang, graduate students including Guangchen Wang, Yingli Li, Jin Xie, Qihao Liu, Di Fang, Haoran Li, Lin Gui, Yang Li, and other graduate students also participated in the relevant research work.

Due to the limited knowledge of the authors, the book will inevitably have some limitations and even errors. And many contents need to be improved and in-depth researched, so readers are requested to criticize and correct.

Wuhan, China Xinyu Li Liang Gao

### Contents

1	Intro	oduction for Integrated Process Planning and Scheduling
	1.1	Process Planning
	1.2	Shop Scheduling
		1.2.1 Problem Statement
		1.2.2 Problem Properties
		1.2.3 Literature Review
	1.3	Integrated Process Planning and Shop Scheduling 6
	Refe	rences
2	Revi	ew for Flexible Job Shop Scheduling
_	2.1	Introduction
	2.2	Problem Description
	2.3	The Methods for FJSP
		2.3.1 Exact Algorithms
		2.3.2 Heuristics
		2.3.3 Meta-Heuristics
	2.4	Real-World Applications
	2.5	Development Trends and Future Research Opportunities 33
		2.5.1 Development Trends
		2.5.2 Future Research Opportunities
	Refe	rences
3	Revi	ew for Integrated Process Planning and Scheduling 47
	3.1	IPPS in Support of Distributed and Collaborative
		Manufacturing
	3.2	Integration Model of IPPS
		3.2.1 Non-Linear Process Planning
		3.2.2 Closed-Loop Process Planning
		3.2.3 Distributed Process Planning
		3.2.4 Comparison of Integration Models 51

x Contents

	3.3	Implementation Approaches of IPPS	52
		3.3.1 Agent-Based Approaches of IPPS	52
		3.3.2 Petri-Net-Based Approaches of IPPS	54
		3.3.3 Algorithm-Based Approaches of IPPS 5	54
		3.3.4 Critique of Current Implementation Approaches 5	55
	Refe		56
4	Impr	oved Genetic Programming for Process Planning	51
	4.1		51
	4.2	Flexible Process Planning 6	52
			52
		4.2.2 Representation of Flexible Process Plans	54
			54
	4.3		<b>57</b>
	4.4		58
			58
			59
			71
			72
	4.5		74
			74
			75
	4.6		78
	Refe	ences	78
5	An E	fficient Modified Particle Swarm Optimization	
3			31
	5.1		31
	5.2		31 32
	3.2		32 32
		$oldsymbol{arepsilon}$	34 34
	5.3	Tr	3 <del>4</del> 34
	3.3		3 <del>4</del> 34
			3 <del>-</del> 35
	5.4		35 36
	3.4	· · · · · · · · · · · · · · · · · · ·	30 36
			30 38
	5.5		94
	ر. ر		94 94
		5.5.2 Discussion	
	5.6	Conclusions and Future Research Studies	
		ences 10	
	NEIC	MINAS	-

Contents xi

6	A H	ybrid Al	gorithm for Job Shop Scheduling Problem	107
	6.1	Introdu	uction	107
	6.2	Proble	m Formulation	110
	6.3	Propos	sed Hybrid Algorithm for JSP	112
		6.3.1	Description of the Proposed Hybrid Algorithm	112
		6.3.2	Encoding and Decoding Scheme	114
		6.3.3	Updating Strategy	116
		6.3.4	Local Search of the Particle	116
	6.4	The No	eighborhood Structure Evaluation Method Based on	
		Logisti	ic Model	117
		6.4.1	The Logistic Model	117
		6.4.2	Defining Neighborhood Structures	118
		6.4.3	The Evaluation Method Based on Logistic Model	119
	6.5	Experi	ments and Discussion	121
		6.5.1	The Search Ability of VNS	121
		6.5.2	Benchmark Experiments	122
		6.5.3	Convergence Analysis of HPV	124
		6.5.4	Discussion	128
	6.6	Conclu	usions and Future Works	128
	Refe	rences		129
7	An I	Effective	Genetic Algorithm for FJSP	133
	7.1		action	133
	7.2		m Formulation	134
	7.3		ure Review	135
	7.4		fective GA for FJSP	137
		7.4.1	Representation	137
		7.4.2	Decoding the MSOS Chromosome to a Feasible	
			and Active Schedule	139
		7.4.3	Initial Population	140
		7.4.4	Selection Operator	143
		7.4.5	Crossover Operator	143
		7.4.6	Mutation Operator	145
		7.4.7	Framework of the Effective GA	146
	7.5	Compu	utational Results	147
	7.6		asions and Future Study	149
	Refe			153
8	An F	Effective	Collaborative Evolutionary Algorithm for FJSP	157
	8.1		action	157
	8.2		m Formulation	158
	8.3		sed MSCEA for FJSP.	158
		8.3.1	The Optimization Strategy of MSCEA	158
			Encoding	159

xii Contents

		8.3.3 Initial Population and Fitness Evaluation	160
		8.3.4 Genetic Operators	160
		8.3.5 Terminate Criteria	161
		8.3.6 Framework of MSCEA	161
	8.4	Experimental Studies	163
	8.5	Conclusions	163
	Refer	rences	165
9	Math	nematical Modeling and Evolutionary Algorithm-Based	
		roach for IPPS	167
	9.1	Introduction	167
	9.2	Problem Formulation and Mathematical Modeling	168
		9.2.1 Problem Formulation	168
		9.2.2 Mathematical Modeling	169
	9.3	Evolutionary Algorithm-Based Approach for IPPS	173
		9.3.1 Representation	173
		9.3.2 Initialization and Fitness Evaluation	174
		9.3.3 Genetic Operators	174
	9.4	Experimental Studies and Discussions	178
		9.4.1 Example Problems and Experimental Results	178
		9.4.2 Discussions	187
	9.5	Conclusion	187
	Refer	ences	188
10	An A	gent-Based Approach for IPPS	191
	10.1	Literature Survey	191
	10.2	Problem Formulation	192
	10.3	Proposed Agent-Based Approach for IPPS	195
		10.3.1 MAS Architecture	195
		10.3.2 Agents Description	195
	10.4	Implementation and Experimental Studies	200
		10.4.1 System Implementation	200
		10.4.2 Experimental Results and Discussion	202
		10.4.3 Discussion	205
	10.5	Conclusion	205
	Refer	rences	207
11		odified Genetic Algorithm Based Approach for IPPS	209
	11.1	Integration Model of IPPS	209
	11.2	Representations for Process Plans and Schedules	210
	11.3	Modified GA-Based Optimization Approach	212
		11.3.1 Flowchart of the Proposed Approach	212
		11.3.2 Genetic Components for Process Planning	213
		11.3.3 Genetic Components for Scheduling	217

Contents xiii

	11.4	Experimental Studies and Discussion	223
		11.4.1 Test Problems and Experimental Results	223
		11.4.2 Comparison with Hierarchical Approach	231
	11.5	Discussion	232
	11.6	Conclusion	232
	Refer	ences	232
12	An E	ffective Hybrid Algorithm for IPPS	235
	12.1	Hybrid Algorithm Model	235
		12.1.1 Traditionally Genetic Algorithm	235
		12.1.2 Local Search Strategy	235
		12.1.3 Hybrid Algorithm Model	236
	12.2	Hybrid Algorithm for IPPS	237
		12.2.1 Encoding and Decoding	237
		12.2.2 Initial Population and Fitness Evaluation	239
		12.2.3 Genetic Operators for IPPS	239
	12.3	Experimental Studies and Discussions	243
		12.3.1 Test Problems and Experimental Results	243
	12.4	Discussion	245
	12.5	Conclusion	249
	Refer	ences	249
13	An E	ffective Hybrid Particle Swarm Optimization	
		rithm for Multi-objective FJSP	251
	13.1	Introduction	251
	13.2	Problem Formulation	252
	13.3	Particle Swarm Optimization for FJSP	255
		13.3.1 Traditional PSO Algorithm	255
		13.3.2 Tabu Search Strategy	256
		13.3.3 Hybrid PSO Algorithm Model	257
		13.3.4 Fitness Function	258
		13.3.5 Encoding Scheme	259
		13.3.6 Information Exchange	261
	13.4	Experimental Results.	262
	10	13.4.1 Problem 4 × 5	262
		13.4.2 Problem 8 × 8	264
		13.4.3 Problem 10 × 10	264
		13.4.4 Problem 15 × 10	267
	13.5	Conclusions and Future Research.	276
	10.0	ences	276
14	A Mı	ulti-objective GA Based on Immune and Entropy	
- •		iple for FJSP	279
	14.1	Introduction	279
	14.2	Multi-objective Flexible Job Shop Scheduling Problem	

xiv Contents

	14.3	Basic Concepts of Multi-objective Optimization	283
	14.4	Handing MOFJSP with MOGA Based on Immune and	
		Entropy Principle	283
		14.4.1 Fitness Assignment Scheme	283
		14.4.2 Immune and Entropy Principle	284
		14.4.3 Initialization	286
		14.4.4 Encoding and Decoding Scheme	286
		14.4.5 Selection Operator	287
		14.4.6 Crossover Operator	288
		14.4.7 Mutation Operator	289
		14.4.8 Main Algorithm	290
	14.5	Experimental Results	290
	14.6	Conclusions	294
	Refer	enc <b>es</b>	300
15	An E	ffective Genetic Algorithm for Multi-objective IPPS	
		Various Flexibilities in Process Planning	301
	15.1	Introduction	301
	15.2	Multi-objective IPPS Description	302
		15.2.1 IPPS Description	302
		15.2.2 Multi-objective Optimization	304
	15.3	Proposed Genetic Algorithm for Multi-objective IPPS	305
		15.3.1 Workflow of the Proposed Algorithm	305
		15.3.2 Genetic Components for Process Planning	307
		15.3.3 Genetic Components for Scheduling	310
		15.3.4 Pareto Set Update Scheme	311
	15.4	Experimental Results and Discussions	312
		15.4.1 Experiment 1	312
		15.4.2 Experiment 2	315
		15.4.3 Discussions	316
	15.5	Conclusion and Future Works	321
	Refer	ences	321
16	Appli	ication of Game Theory-Based Hybrid Algorithm	
		Iulti-objective IPPS	323
	16.1	Introduction	323
	16.2	Problem Formulation	325
	16.3	Game Theory Model of Multi-objective IPPS	328
		16.3.1 Game Theory Model of Multi-objective Optimization	
		Problem	328
		16.3.2 Nash Equilibrium and MOP	329
		16.3.3 Non-cooperative Game Theory for Multi-objective	
		IPPS Problem	329
	16.4	Applications of the Proposed Algorithm on Multi-objective	
		IPPS	330

Contents xv

		16.4.1 Workflow of the Proposed Algorithm	330
		16.4.2 Nash Equilibrium Solutions Algorithm	221
	165	for Multi-objective IPPS	331
	16.5	Experimental Results	335
		16.5.1 Problem 1	335
		16.5.2 Problem 2	336
		16.5.3 Conclusions	341
		rences	342
<b>17</b>		brid Intelligent Algorithm and Rescheduling Technique	
		lynamic JSP	345
	17.1	Introduction	345
	17.2	Statement of Dynamic JSPs	347
		17.2.1 The Proposed Mathematical Model	347
		17.2.2 The Reschedule Strategy	350
		17.2.3 Generate Real-Time Events	351
	17.3	The Proposed Rescheduling Technique for Dynamic JSPs	353
		17.3.1 The Rescheduling Technique in General	353
		17.3.2 The Hybrid GA and TS for Dynamic JSP	355
	17.4	Experiential Environments and Results	360
		17.4.1 Experimental Environments	361
		17.4.2 Results and Discussion	362
	17.5	Conclusions and Future Works	372
	Refer	rences	374
18		brid Genetic Algorithm and Tabu Search	
		Iulti-objective Dynamic JSP	377
	18.1	Introduction	377
	18.2	Literature Review	378
	18.3	The Multi-objective Dynamic Job Shop Scheduling	379
	18.4	The Proposed Method for Dynamic JSP	381
		18.4.1 The Flow Chart of the Proposed Method	381
		18.4.2 Simulator	383
		18.4.3 The Hybrid GA and TS for Dynamic JSP	384
	18.5	Experimental Design and Results	387
		18.5.1 Experimental Design	387
		18.5.2 Results and Discussions	388
	18.6	Conclusions and Future Researches	400
	Refer	ences	401
19		-Based Reactive Scheduling Policies for Dynamic	
		with Job Release Dates	405
	19.1	Introduction	405
	19.2	Problem Description	407
	193	Heuristic for DEISSP	408

xvi Contents

	19.4	GEP-Based Reactive Scheduling Polices Constructing
		Approach
		19.4.1 Framework of GEP-Based Reactive Scheduling
		Policies Constructing Approach
		19.4.2 Define Element Sets
		19.4.3 Chromosome Representation 411
		19.4.4 Genetic Operators
	19.5	Experiments and Results
		19.5.1 GEP Parameter Settings 414
		19.5.2 Design of the Experiments 414
		19.5.3 Analysis of the Results 416
	19.6	Conclusion and Future Work
	Refer	ences
20		
20		brid Genetic Algorithm with Variable Neighborhood
		ch for Dynamic IPPS
	20.1	Introduction
	20.2	Related Work
	20.3	Dynamic IPPS Problem Formulation
		20.3.1 Problem definition
		20.3.2 Framework for DIPPS
		20.3.3 Dynamic IPPS Model 435
	20.4	Proposed Hybrid GAVNS for Dynamic IPPS 438
		20.4.1 Flowchart of Hybrid GAVNS 438
		20.4.2 GA for IPPS
		20.4.3 VNS for Local Search
	20.5	Experiments and Discussions
		20.5.1 Experiment 1
		20.5.2 Experiment 2
		20.5.3 Experiment 3
		20.5.4 Discussion
	20.6	Conclusion and Future Works
	Refer	ences
21	IPPS	Simulation Prototype System
_	21.1	Application Background Analysis
	21.2	System Architecture
	21.3	Implementation and Application
	21.4	Conclusion
		ences
	110101	VIIVO