# A Reformulation-Linearization Technique for Solving Discrete and Continuous Nonconvex Problems

by

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## CONTENTS

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FAC	<b>E</b>	. xiv
KNO	WLEDGMENTS	xx
PYRI	GHT PERMISSIONS	. xxi
INT	<b>RODUCTION</b>	1
1.1	Discrete Linear and Nonlinear Mixed-Integer Problems	2
1.2	Continuous Nonconvex Polynomial Programming Problems	14
1.3	Coping with Large-Scale Representations	17
RT I	DISCRETE NONCONVEX PROGRAMS	21
		23
2.1		25
2.2	Validity of the Hierarchy of Relaxations and the Convex Hull Representation	34
2.3	Further Insights Into the Structure of the Relaxations	43
2.4	Characterization of the Facets of the Convex Hull of Feasible Solutions	49
2.5	Extension to Multilinear Polynomial Programs and Specializations for Equality Constraints	52
SPE	CIAL STRUCTURES IN MIXED-INTEGER	61
	KNO YRI INT 1.1 1.2 1.3 RT I RL7 Z.1 2.2 2.3 2.4 2.5 GEI SPE	<ol> <li>Continuous Nonconvex Polynomial Programming Problems</li> <li>Coping with Large-Scale Representations.</li> <li>Coping with Large-Scale Representations.</li> <li><b>RLT HIERARCHY FOR MIXED-INTEGER</b></li> <li><b>RLT HIERARCHY FOR MIXED-INTEGER</b></li> <li>Basic RLT Process for Linear Mixed-Integer 0-1 Problems</li> <li>Validity of the Hierarchy of Relaxations and the Convex Hull Representation .</li> <li>Further Insights Into the Structure of the Relaxations .</li> <li>Characterization of the Facets of the Convex Hull of Feasible Solutions.</li> </ol>

۰.

3.1	Generalized RLT for Exploiting Special Structures (SSRLT)		
3.2	Validat	tion of the Hierarchy for SSRLT	75
3.3	Compo	osing S and S-Factors for Some Special Structures	78
	3.3.1	Generalized Upper Bounding (GUB) or Multiple Choice Constraints	78
	3.3.2	Variable Upper Bounding Constraints	87
	3.3.3	Sparse Constraints	90
3.4	Using Constra	Conditional Logic to Strengthen RLT/SSRLT aints	91
	3.4.1	Examining Sequential Lifting as an RLT Process.	93
	3.4.2	Numerical Example to Illustrate Conditional Logic Based Enhancement of SSRLT	
	3.4.3	Application to the Traveling Salesman Problem	98
		RARCHY FOR GENERAL DISCRETE NTEGER PROBLEMS	103
4.1	The Di Repres	iscrete Problem and its Equivalent Zero-One sentation	104
4.2	Hieraro Space.	chy of Relaxations in the Transformed Zero-One	106
4.3		are of a Parallel Hierarchy in the Original Variable	110
4.4		alence of the Hierarchies in the Transformed and al Spaces	112
4.5	Illustra	ative Example	125
4.6	Transla Discret	ating Valid Inequalities from Zero-One to General te Spaces	127

#### viii

ţ

5	GENERATING VALID INEQUALITIES AND FACETS USING RLT			
	5.1	Conve Boolea	x Hull Characterization and Facets for the Quadric in Polytope	133
	5.2		x Hull Characterization and Facets for GUB ained Knapsack Polytopes	146
	5.3	Tight H for Set	Representations and Strong Valid Inequalities Partitioning Problems	160
		5.3.1	Notation	161
		5.3.2	A Specialized Hierarchy of Relaxations for the Set Partitioning Polytope	163
		5.3.3	Insights into Deleting Fractional Vertices and Generating Manageable Relaxations	177
6	PER	RSISTE	ENCY IN DISCRETE OPTIMIZATION	185
	6.1	RLT-E Polync	Based Persistency for Unconstrained 0-1 omial Programs	188
	6.2		Based Persistency for Constrained 0-1 Polynomial	212
	6.3	A Mod	lified RLT Approach	228
		6.3.1	Persistency for unconstrained 0-1 Polynomial Programs	237
		6.3.2	Persistency for Constrained 0-1 Polynomial Programs	247
	6.4	Relatio	onships to Published Results	257
РАІ	рт П	CON	TINUOUS NONCONVEX PROGRAMS	261

ŧ

#### ALGORITHMS FOR NONCONVEX POLYNOMIAL 7.1 7.1.1 7.2 7.2.1 8 **REFORMULATION-CONVEXIFICATION TECHNIQUE FOR QUADRATIC PROGRAMS** AND SOME CONVEX ENVELOPE Reformulation by Generating Quadratic Constraints 8.1 8.2 Fundamental Insights and Results for the Level-One RLT 8.3 Construction of Convex Hulls and Convex Envelopes: 8.4 8.5 Eigen-Transformation (RLT-NLPE) and 8.5.1 8.5.2 **Reformulation-Convexification Approach:** Inclusion of Suitable Nonlinear Constraints in A Lagrangian Dual Approach for Solving RLT 8.6

**RLT-BASED GLOBAL OPTIMIZATION** 

7

ţ

8.7	A Preliminary Computational Comparison of the Bounding Problems		
8.8	.8 Design of a Branch-and-Bound Algorithm		
	8.8.1	Scaling	347
	8.8.2	Branch-and-Bound Search Strategy	347
	8.8.3	Optimality Criterion	348
	8.8.4	Range Reductions	348
	8.8.5	Branching Variable Selection	352
	8.8.6	Finding Good Quality Feasible Solutions	355
	8.8.7	Summary of the Algorithm	357
8.9	Comp	utational Results	359
TEC	CHNIC	ULATION-CONVEXIFICATION QUE FOR POLYNOMIAL PROGRAMS: AND IMPLEMENTATION	369
9.1	Application of RLT to a Class of Quadrified Versus the Original Polynomial Program		
			372
	Origin 9.1.1	al Polynomial Program Quadrification Process and the Application of	373
9.2	Origin 9.1.1 9.1.2 A Con	al Polynomial Program Quadrification Process and the Application of RLT to the Quadrified Polynomial Program	373 378
9.2 9.3	Origin 9.1.1 9.1.2 A Con Quadr	aal Polynomial Program         Quadrification Process and the Application of         RLT to the Quadrified Polynomial Program         Dominance of LP(PP) over LP(QPP)         nputational Comparison: Evaluation of the	373 378 383
	Origin 9.1.1 9.1.2 A Con Quadr	aal Polynomial Program         Quadrification Process and the Application of         RLT to the Quadrified Polynomial Program         Dominance of LP(PP) over LP(QPP)         nputational Comparison: Evaluation of the         ification Process	373 378 383 385

9

	9.5 Computational Evaluation of Relaxations for Univariate Problems		389	
	9.6	9.6 Relaxations and an Algorithm for Multivariate Problems		
		9.6.1	Regular RLT and Convex Variable Bounding Constraints	391
		9.6.2	Constraint-Factor Based Restrictions	392
		9.6.3	Constraint Filtering Scheme and Lower Bounding Problem	
		9.6.4	Range-Reduction Strategies	397
		9.6.5	Branch-and-Bound <sub>2</sub> Algorithm	398
	9.7	Comp	utational Results	399
PART III SPECIAL APPLICATIONS TO DISCRETE AND CONTINUOUS NONCONVEX PROGRAMS403				
10	APF	PLICA	TIONS TO DISCRETE PROBLEMS	405
	10.1	Mixed	-Integer Bilinear Programming Problems	407
		10.1.1	An Equivalent Linear Reformulation	409
		10.1.2	2 Design of an Algorithm	412
		10.1.3	B Computational Experience	419
	10.2			172
		Zero-C	One Quadratic Programming Problems	
			An Equivalent Linear Reformulation	
		10.2.1		425
		10.2.1 10.2.2	An Equivalent Linear Reformulation	425 427
	10.3	10.2.1 10.2.2 10.2.3	An Equivalent Linear Reformulation	425 427 432

ţ

11.1	Squared Euclidean Distance Location-Allocation Problem4		
	11.1.1	RLT-Based Relaxation447	
	11.1.2	A Branch-and-Bound Enumeration Algorithm454	
	11.1.3	Computational Results459	
11.2 Linear Complementarity Problem			
	11.2.1	A Reformulation of the LCP466	
	11.2.2	Proposed Algorithm	
	11.2.3	Computational Results479	
11.3	11.3 Miscellaneous Applications		

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