

# Increasing Returns and Firm Performance:

## **Toenemende Meeropbrengsten en Bedrijfsprestatie: Een Em'pirisch Onderzoek**

Proefschrift

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## TABLE OF CONTENTS

1. INTRODUCTION.....	1
1.1 Why study increasing returns?.....	1
1.2 Increasing returns, market structure, firm behavior and firm performance ...	3
1.3 Central problem and research approach of the thesis.....	5
1.3.1 Central problem.....	5
1.3.2 Industrial organization approach.....	6
1.3.3 Analytical framework.....	7
1.4 Contribution of the thesis.....	8
1.4.1 Existing literature streams on increasing returns.....	8
1.4.2 Perspective and aims of this thesis.....	9
1.5 A managerial definition of increasing returns.....	10
1.5.1 Existing definitions of increasing returns.....	10
1.5.2 Definitions of the separate mechanisms.....	11
1.5.3 Towards an integrative definition of increasing returns.....	12
1.6 Research design of the thesis.....	14
1.7 Structure of the thesis.....	15
1.8 Glossary.....	17
2. INTRODUCTION TO INCREASING RETURNS LITERATURE.....	21
2.1 Increasing returns and the history of economic thought.....	21
2.2 The classical economic perspective.....	23
2.2.1 Before Smith.....	24
2.2.2 Smith.....	25
2.2.3 After Smith: Malthus and Ricardo.....	26
2.2.4 The difference between Smith and Ricardo.....	27
2.2.5 Mill.....	27
2.3 The neoclassical economic perspective.....	28
2.3.1 Walras and general equilibrium theory.....	28
2.3.2 Marshall.....	29
2.3.3 Bullock, Clapham and the classification of industries.....	30
2.3.4 Sraffa and the Economic Journal discussion.....	31
2.3.5 Hicks.....	33
2.4 Alternatives and new directions in economics.....	33
2.4.1 Young and the foundations of endogenous growth theory.....	34
2.4.2 Verdoorn.....	37
2.4.3 The Austrian School.....	37

2.4.4	Kaldor.....	38
2.4.5	Arrow.....	40
2.4.6	Romer and endogenous growth theory.....	41
2.4.7	New division of labor theory.....	43
2.5	Complexity science, sociology and social economics.....	44
2.5.1	Arthur.....	47
2.5.2	Sociology.....	48
2.5.3	Social economics.....	48
2.6	The management sciences.....	50
2.6.1	Inside-out approaches.....	50
2.6.2	Outside-in approaches.....	52
2.6.3	Increasing returns mechanisms in management literature.....	53
2.6.4	Product adoption and diffusion.....	54
2.6.5	Technology battles.....	55
2.6.6	Double jeopardy.....	58
2.6.7	Positive feedbacks in marketing.....	58
2.7	Conclusions.....	59
3.	LITERATURE REVIEW.....	61
3.1	Systematic literature overview.....	61
3.2	Classification of the literature according to the structure-conduct-performance paradigm.....	110
3.3	Perspectives on increasing returns in literature.....	111
3.4	Mechanisms addressed and definitions provided in literature.....	112
3.5	Research designs used in literature.....	113
3.6	Results obtained in literature.....	114
3.7	Conclusions.....	114
4.	MARKET-BASED INCREASING RETURNS.....	117
4.1	Network effects.....	117
4.1.1	Defining network effects.....	117
4.1.2	Direct network effects.....	118
4.1.3	Indirect network effects.....	120
4.1.4	The double network effect.....	121
4.2	Social interaction effects.....	122
4.2.1	Defining social interaction effects.....	122
4.2.2	Information exchange.....	122
4.2.3	Self-reinforcing expectations.....	123

## Table of contents

4.2.4	The double social interaction effect.....	124
4.3	Extent of network and social interaction effects.....	125
4.3.1	Marginal gains of network size.....	125
4.3.2	Conformity and individuality.....	126
4.3.3	Degree and structure of economic and social" interdependence.....	126
4.3.4	Nature of product.....	128
4.3.5	Complementarity.....	129
4.3.6	Substitutability.....	130
4.3.7	Compatibility.....	130
4.4	Influence of network effects and social interaction effects on market outcomes.....	131
4.4.1	Technology battles.....	131
4.4.2	Competition at network level.....	133
4.4.3	Multiple possible equilibria.....	134
4.4.4	Lock-in.....	135
4.4.5	Excess inertia and excess momentum.....	137
4.4.6	Path dependence.....	138
4.4.7	Market imperfections and inefficiency?.....	138
4.5	The market potential for scale and learning effects.....	140
4.6	Conclusions.....	142
5.	FIRM-BASED INCREASING RETURNS.....	143
5.1	Increasing returns and increasing returns to scale.....	144
5.1.1	Increasing returns to scale.....	145
5.1.2	Increasing returns.....	147
5.2	Scale effects.....	148
5.2.1	Defining scale effects.....	148
5.2.2	Economies of scale, scope and sequence.....	149
5.3	Learning effects.....	150
5.3.1	Defining learning effects.....	150
5.3.2	Induced learning effects.....	152
5.3.3	Exogenous learning effects.....	153
5.3.4	Autonomous learning effects.....	153
5.3.5	The relation between scale effects and learning effects.....	155
5.4	Extent of scale and learning effects.....	155
5.4.1	Extent of scale effects.....	155
5.4.2	Extent of learning effects.....	159
5.4.3	Information and knowledge intensity.....	161

5.5	Firm strategies for internalizing the potential for scale and learning effects.....	166
5.5.1	Making the right strategic choices: shaper, follower or reserving the right to play.....	167
5.5.2	Fighting the battle for the technological standard.....	168
5.5.3	Influencing expectations.....	169
5.5.4	Avoiding lock-out situations.....	170
5.5.5	Competition on the network level.....	171
5.5.6	Exploiting the installed base.....	171
5.6	Realizing and exploiting the potential for scale and learning effects.....	172
5.6.1	Closing the positive feedback loop.....	172
5.6.2	Generic strategies for value creation.....	174
5.6.3	Relationship of the exploitation of the potential with firm performance.....	176
5.7	Conclusions.....	177
6.	FRAMEWORK & HYPOTHESES.....	179
6.1.1	Conceptual framework.....	179
6.2	Research hypotheses.....	180
6.2.1	The effect of social interaction effects on network effects.....	180
6.2.2	The effect of network effects and social interaction effects on the potential for scale and learning effects.....	181
6.2.3	The effect of the potential for scale and learning effects on the realization of scale and learning effects.....	182
6.2.4	The effect of the realization of scale and learning effects on product and organizational performance.....	183
6.3	Research design.....	185
6.3.1	First empirical study.....	185
6.3.2	Second empirical study.....	186
6.3.3	Third empirical study.....	187
6.3.4	Relations between the studies.....	188
6.3.5	Summary research design and hypotheses addressed.....	189
6.4	Measurement.....	191
6.4.1	Measurement of network and social interaction effects.....	191
6.4.2	Measurement of scale and learning effects.....	192
6.4.3	Measurement of firm performance.....	194
6.5	Conclusions.....	196

## Table of contents

I.	REPORT FIRST EMPIRICAL STUDY.....	197
7.1	Development of the measures.....	197
7.1.1	Specifying the domain of the constructs.....	197
7.1.2	Generating a sample of items.....	198
7.1.3	Collecting data and purifying the measures.....	199
7.2	Sample and data description.....	201
7.3	Validation of the measures.....	204
7.3.1	Unidimensionality.....	205
7.3.2	Reliability.....	212
7.3.3	Within-method convergent validity.....	213
7.3.4	Discriminant validity.....	214
7.3.5	Conclusions on construct validity.....	215
7.4	Results of testing the research hypotheses.....	218
7.4.1	Research model and hypotheses.....	218
7.4.2	The relationship between social interaction effects and network effects.....	219
7.4.3	The relationship between social interaction effects and network effects and the potential for scale and learning effects.....	219
7.4.4	The relationship between the potential for scale and learning effects and the realization of scale and learning effects.....	220
7.4.5	The relationship between the realization of scale and learning effects and product performance.....	221
7.4.6	The relationship between the realization of scale and learning effects and organizational performance.....	221
7.4.7	The relationship between product performance and organizational performance.....	221
7.5	Additional tests of the model.....	221
7.5.1	Testing an alternative research model.....	222
7.5.2	Testing model stability.....	224
7.5.3	Model stability for technology characteristics.....	226
7.5.4	Model stability for product characteristics.....	227
7.5.5	Model stability for market characteristics.....	230
7.6	Conclusions.....	231
8.	REPORT SECOND EMPIRICAL STUDY.....	235
8.1	Development of the measures.....	235
8.1.1	Measuring social interaction effects, network effects and market dominance.....	235

8.1.2	Measuring scale effects and learning effects.....	237
8.1.3	Measurement in physical or monetary units.....	237
8.1.4	Correlators for measuring output and input.....	239
8.1.5	Measuring-firm performance.....	240
8.2	Sample and data description.....	240
8.3	Validation of the subjective measures.....	244
8.3.1	Unidiimensionality.....	245
8.3.2	Reliability.....	247
8.3.3	Within-method convergent validity.....	248
8.3.4	Discriminant validity.....	248
8.3.5	Conclusions on construct validity.....	249
8.4	Validation of the objective measures.....	249
8.4.1	Consistency of the data definitions.....	250
8.4.2	Correction for inflation.....	250
8.4.3-	Correction for outliers.....	251
8.4.4	Correction for negative growth rates.....	251
8.4.5	Conclusions on construct validity.....	252
8.5	Results.....	253
8.5.1	Research model and hypotheses.....	253
8.5.2	Results for the main effects.....	253
8.5.3	Tests for mediation effects.....	256
8.6	Conclusions.....	261
9.	REPORT THIRD EMPIRICAL STUDY.....	265
9.1	Why the Verdoorn law?.....	265
9.1.1	Neoclassical analysis and the Solow residual.....	266
9.1.2	Zegveld's firm-level analysis.....	267
9.1.3	Endogenous growth.....	268
9.1.4	The Verdoorn law.....	270
9.2	The Verdoorn model and its interpretation.....	273
9.2.1	The original Verdoorn model.....	274
9.2.2	Choosing a model specification.....	274
9.2.3	Including capital in the Verdoorn equation.....	276
9.2.4	Single relationship or ^system of equations.....	279
9.2.5	The static-dynamic paradox.....	280
9.2.6	The firm-level Verdoorn model and its interpretation.....	281
9.2.7	The productivity-performance model and its interpretation.....	283

## Table, of contents

9.3	Operational measurements of growth of output, productivity and firm performance.....	284
9.4	Sample and data description.....	288
9.5	Validation of the measures.....	290
9.5.1	Consistency of the data definitions.....	290
9.5.2	Correction for inflation.....	291
9.5.3	Correction for outliers.....	292
9.5.4	Correction for negative growth rates.....	293
9.5.5	Small number of data points.....	293
9.5.6	The danger of spurious regression.....	294
9.5.7	Check for changes in the capital-labor and capital-output ratio.....	297
9.5.8	Test for autocorrelation.....	308
9.6	Results.....	310
9.6.1	Research model and hypotheses.....	310
9.6.2	Estimation method.....	310
9.6.3	Estimation of the firm-level Verdoorn model for individual firms .....	313
9.6.4	Estimation of the productivity-performance model for individual firms.....	327
9.6.5	Estimation of the Verdoorn model for industries.....	340
9.6.6	Estimation of the productivity-performance model for industries .....	345
9.6.7	Estimation of the Verdoorn model for the entire population.....	348
9.6.8	Estimation of the productivity-performance model for the entire population.....	351
9.6.9	Results of the estimations of the Verdoorn model.....	352
9.6.10	Results of the estimations of the productivity-performance model.....	353
9.7	Conclusions.....	354
10.	CONCLUSIONS, MANAGEMENT IMPLICATIONS AND SUGGESTIONS FOR FURTHER RESEARCH.....	357
10.1	Conclusions from the research.....	358
10.1.1	How can market-based and firm-based mechanisms of increasing returns be theoretically specified and defined?.....	358
10.1.2	How can market-based and firm-based mechanisms of increasing returns be measured?.....	360
10.1.3	What is the effect of market-based mechanisms of increasing returns on firm-based mechanisms of increasing returns?.....	362
10.1.4	What is the joint effect of market-based and firm-based mechanisms of increasing returns on firm performance?.....	363



10.1.5	Summarizing the conclusions on the hypotheses.....	364
10.2	Limitations and suggestions for further research.....	364
10.2.1	Limitations and further research with regard to the choice of the research paradigm- theory of the firm.....	365
10.2.2	Limitations and further research with regard to the measurement tools and the methods of analysis.....	366
10.2.3	Limitations and further research with regard to the research results.....	368
10.3	Management implications.....	370
10.3.1	Management framework.....	370
10.3.2	Management implications and further research.....	372
10.3.3	Concluding.....	374
REFERENCES..... I'		377
APPENDIX I: ITEMS FROM THE QUESTIONNAIRE USED IN THE FIRST EMPIRICAL STUDY.....		
	Market-based mechanisms of increasing returns.....	405
	Product-related social interaction effects.....	405
	Technology-related social interaction effects.....	405
	Product-related network effects.....	406
	Technology-related network effects.....	406
	Firm-based mechanisms of increasing returns.....	406
	Potential for scale and learning effects.....	406
	Realization of scale and learning effects.....	407
	Firm performance.....	407
	Product performance.....	407
	Organizational performance.....	408
	Moderators.....	408
	Product complementarity and compatibility.....	408
	Technology complementarity and compatibility.....	408
	Path dependence.....	409
	Lock-in effects.....	409
	Product substitution effects.....	410
	Technology substitution effects.....	410
	Market predictability.....	410
	Labor-capital-knowledge intensity.....	411

*Table of contents*

APPENDIX 11: ITEMS FROM THE QUESTIONNAIRE USED IN THE SECOND EMPIRICAL STUDY.....413

    Market-based mechanisms of increasing returns.....413

        Product-related social interaction effects.....413

        Technology-related social interaction effects.....413

        Product-related network effects.....414

        Technology-related network effects.....414

    Dependent variables: market dominance.....415

APPENDIX III: LIST OF FIRMS FROM THE SECOND AND THIRD EMPIRICAL STUDIES.....417

APPENDIX IV: DETAILED REPORT ON THE ESTIMATION OF THE VERDOORN LAW AND THE PRODUCTIVITY-PERFORMANCE RELATIONSHIP.....421

    Analyses of the firms.....422

    Analyses of the industries.....467

    Analysis of the entire population.....477

APPENDIX V: SUPPORTING ESTIMATIONS FOR THE CORRECTIONS ON THE VERDOORN LAW ESTIMATION.....479

EXECUTIVE SUMMARY.....499

SAVIENVATTING (SUMMARY IN DUTCH).....507