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# Retail Credit Risk Management

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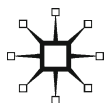
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# Contents

<i>List of Tables</i>	x
<i>List of Figures</i>	xi
<i>Notes on Contributors</i>	xiii
<b>Part I Regulatory Framework</b>	<b>1</b>
<b>1 Introduction</b>	<b>3</b>
<i>Mario Anolli and Elena Beccalli</i>	3
1.1 Why retail credit risk management?	3
1.2 The book	4
1.2.1 Part I: the regulatory framework	5
1.2.2 Part II: risk taking: measurement, pricing, and management	5
1.2.3 Part III: portfolio credit risk: measurement and management	7
1.2.4 Part IV: operational implications	8
<b>Part II Risk Taking: Measurement, Pricing, and Management</b>	<b>11</b>
<b>2 The Ever-evolving Basel Accord</b>	<b>13</b>
<i>Damiano Guadalupi</i>	13
2.1 Introduction	13
2.2 The 1988 Capital Accord	14
2.2.1 Regulatory capital	14
2.2.2 Risk-weighted assets	15
2.2.3 Basel I limits	18
2.3 The new Capital Accord (Basel II)	19
2.3.1 General features	19
2.3.2 Credit risk: the standardized approach	24
2.3.3 Credit risk: the Internal Rating Based (IRB) approach	29
2.4 Toward Basel III and beyond	48
2.4.1 Taking stock of the Basel II framework	48
2.4.2 The Basel Committee's response to the financial crisis	51

<b>3</b>	<b>Private Individuals: Credit Risk Modeling</b>	59
	<i>Corrado Giannasca and Tommaso Giordani</i>	59
3.1	Introduction	59
3.2	Retail credit risk	59
3.2.1	Judgmental versus statistical models	60
3.2.2	Individual versus portfolio models	61
3.2.3	The critical role of data	62
3.2.4	Model monitoring	63
3.3	Individual model framework and management	63
3.3.1	Individual models example: application risk scorecard	68
3.3.2	Impact of models on credit and underwriting policies	70
3.4	Portfolio model framework	71
3.4.1	Portfolio models: impairment forecasting	72
3.5	Conclusions	75
<b>4</b>	<b>SMEs: Credit Risk Modeling</b>	77
	<i>Emanuele Giovannini</i>	77
4.1	Introduction	77
4.2	Internal and external rating systems	78
4.3	External or agency rating	79
4.4	Internal or bank rating	80
4.4.1	Information for internal rating	82
4.4.2	Customer records	82
4.4.3	Qualitative information	82
4.4.4	Financial information	83
4.5	Risk management and rating	87
4.6	Capital allocation strategy is another way of using internal rating models	90
<b>5</b>	<b>The Critical Model Parameter: LGD</b>	91
	<i>Elisa Alghisi Manganello and Valentina Leucari</i>	91
5.1	Introduction	91
5.2	Overview of LGD	91
5.2.1	Definition and calculation	92
5.2.2	Basel II versus the IAS 39 framework	93
5.2.3	Cure rate/danger rate	95
5.3	Methods for LGD estimation	96
5.3.1	Overview of the estimation process	96
5.3.2	Conditional means model	99
5.3.3	Regression models	101

5.3.4	Chain-ladder model	103
5.3.5	Cure-rate estimation	107
<b>6</b>	<b>Model Validation</b>	<b>109</b>
	<i>Antonio Arfé and Paolo Gianturco</i>	109
6.1	Introduction	109
6.2	Internal validation – organizational structures	109
6.3	The validation process	111
6.4	Internal validation activities	112
6.4.1	Models	112
6.4.2	Process and governance	127
6.4.3	IT and data quality	131
<b>7</b>	<b>Risk-Adjusted Performance Measures</b>	<b>134</b>
	<i>Mario Anolli</i>	134
7.1	Introduction	134
7.2	Basic risk-adjusted performance measures	135
7.2.1	RAPM and capital allocation	136
7.3	RAROC	137
7.3.1	Allocated versus utilized capital	138
7.3.2	Diversified versus undiversified capital	141
7.4	Peculiarities of RAPM for retail credit risk management	144
7.4.1	Model inputs	145
<b>Part III Portfolio Credit Risk: Measurement and Management</b>		<b>149</b>
<b>8</b>	<b>Portfolio Credit Risk Modeling</b>	<b>151</b>
	<i>Lorenzo Bocchi and Tiziano Bellini</i>	151
8.1	Introduction	151
8.2	Portfolio credit risk modeling	152
8.2.1	Regulatory capital, risk-weighted assets, and economic capital	154
8.3	Default models	155
8.3.1	Regulatory formula	157
8.3.2	Economic capital measurement	160
8.4	Case study: portfolio analysis	164
<b>9</b>	<b>Stress Testing, Capital Planning, and Risk Integration</b>	<b>168</b>
	<i>Tiziano Bellini and Lorenzo Bocchi</i>	168
9.1	Introduction	168
9.2	Stress testing	169
9.2.1	Stress testing in practice	170

9.2.2	Stress testing and Prometeia economic capital model	171
9.2.3	Case study: stress testing	173
9.3	Managerial portfolio analysis: from loan policies to capital planning	174
9.3.1	Case study: loan policies and capital planning	176
9.4	Risk integration	179
<b>10</b>	<b>Portfolio Management</b>	<b>183</b>
	<i>Tommaso Giordani and Corrado Giannasca</i>	183
10.1	Introduction	183
10.2	Team organization and competence model	184
10.3	Portfolio management cycle	185
10.4	Existing portfolio management	186
10.4.1	Economic cycle	187
10.4.2	Collection performance	189
10.4.3	Models	190
10.4.4	Managerial actions	190
10.5	New business portfolio management	191
10.5.1	Profitability and pricing	191
10.5.2	Cut-off strategy	194
10.5.3	Credit policy revision	195
10.5.4	Lending strategy monitoring	196
<b>Part IV</b>	<b>Operational Implications</b>	<b>199</b>
<b>11</b>	<b>IT Systems for Credit Risk Management</b>	<b>201</b>
	<i>Renzo Traversini and Anselmo Marmonti</i>	201
11.1	Introduction	201
11.2	Credit related information – CDW (Credit Data Warehouse)	202
11.2.1	Information quality management	203
11.2.2	Master data management	203
11.3	Models for risk components – the development environment of internal rating	203
11.3.1	Model management and model deployment components	204
11.3.2	Credit portfolio valuation and management system	204
11.3.3	Analytical information on credit risk – CR data mart	205
11.3.4	Dashboard e-reporting	206



11.4	IT system to support credit risk management activities – key functional issues	206
11.4.1	The general features of credit risk management systems	206
11.5	IT technologies for credit risk management – key aspects	209
11.5.1	Data management and data quality – warehousing technologies	210
11.5.2	Modeling environment	210
11.5.3	Integration – platform approach	211
11.5.4	The scoring engine	212
11.5.5	Portfolio risk engine	213
11.6	Current status and trends for IT credit risk management systems	214
<b>12</b>	<b>A New Retail Credit Risk Management Approach to Cope with the Crisis</b>	<b>219</b>
	<i>Francesco Merlin</i>	219
12.1	Introduction	219
12.2	The new ERM paradigm	219
12.3	Risk management in retail credit process	222
12.3.1	Origination and underwriting	223
12.3.2	Strengthen an end-to-end risk mindset in retail credit process	224
12.3.3	Credit monitoring and workout	226
12.3.4	The benefits of systematic procedures in credit workouts	227
12.3.5	Behavioral scoring	228
12.3.6	Reducing exposures to high-risk customers	229
12.3.7	Extracting value from debt recovery	230
	<i>Index</i>	233

# Tables

2.1	Components of regulatory capital in the Basel Accord	16
2.2	Risk weights in the standard approach	17
2.3	Pillar 1 approaches for the calculation of minimum capital requirements	21
2.4	Risk weightings in the standardized approach	28
2.5	Correlation values ( $\rho$ )	36
3.1	Model diffusion by product	64
3.2	Costs and benefits of alternative development/maintenance sourcing	66
3.3	Net margin by risk score	69
3.4	One month Markov matrix	74
5.1	Possible segmentation drivers for personal loans model	100
5.2	Possible segmentation for personal loans LGD model	100
5.3	Final LGD model for personal loans	100
5.4	Long list of regressors for the LGD mortgage model	102
5.5	Final LGD model for mortgages	102
5.6	The structure of the vintage recovery matrix	104
5.7	Vintage recovery matrix	105
5.8	Vintage recovery matrix with cumulative recoveries	105
5.9	Development factors calculation	105
5.10	LGD model with cure rates	108
7.1	AROA and AROWA calculation	136
7.2	Diversification benefit: apportionment approaches	143
8.1	Portfolio credit risk model's key elements	161
8.2	Comparison the portfolio's key elements	164
8.3	UL estimated by the factor model	165
8.4	Portfolio risk measures (original factor model)	165
8.5	Unexpected loss: sub-portfolio vs. marginal contribution	166
9.1	The stress test's impact on capital requirements and UL	175
9.2	RAROC analysis with EAD as-is vs. EAD target	177
10.1	Lifetime profitability by the client's risk rating	194
10.2	Lending strategy monitoring areas	197

# Figures

2.1	Asset value returns of firm i	40
3.1	Roll-rate exemplification	73
3.2	Markov chain exemplification	74
4.1	Simulation of bureau score	86
4.2	Example of treatment of two customers (A and B) with and without reform	87
4.3	Loan-granting process	89
5.1	Overview of LGD estimation process	97
5.2	Shape of development factors' curve	106
5.3	Possible default types	107
6.1	Graphical description of the key components of a validation process	110
6.2	Organizational structures for internal validation	111
6.3	CAP curve and the areas used to compute AR	117
6.4	ROC curve	123
6.5	Estimated values of LGD	124
8.1	Loss distribution: expected and unexpected loss	153
8.2	Portfolio total and name loss distribution	164
9.1	Stress-testing framework	169
9.2	Prometeia credit portfolio mechanics	172
9.3	Evolution of default rates for the whole banking system: Comparison of alternative stress test scenarios	174
9.4	Credit strategies: RAROC approach	178
9.5	Integrated economic capital: top-down vs. bottom-up approaches	180
10.1	Portfolio management goals	184
10.2	Portfolio management team radar	185
10.3	Risk appetite cycle	186
10.4	Existing portfolio management	187
10.5	The 0–1 roll down correspondent to different unemployment rates	189
10.6	Portfolio vulnerable segments to economic cycle	189
10.7	Collection strategy dimension	190
10.8	Managerial actions	191
10.9	New business portfolio management cycle	192
10.10	New business portfolio management	192
10.11	Lifetime profitability build-up	193

10.12	Efficient frontier by client's rating	195
10.13	Lending strategy monitoring areas	196
11.1	Internal rating model life cycle	212
11.2	Basel II risk model validation concept	217
12.1	Enterprise risk management paradigm	220
12.2	Synthesis of best practice survey of risk management	221
12.3	Upfront parameter for credit decision	224
12.4	Redefinition of scoring-based rating classes	228
12.5	Comparison of debt recovery strategies in Italian banking	230

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