



IsENBIS 21.10.2012

Integrating Operational and Financial Risks

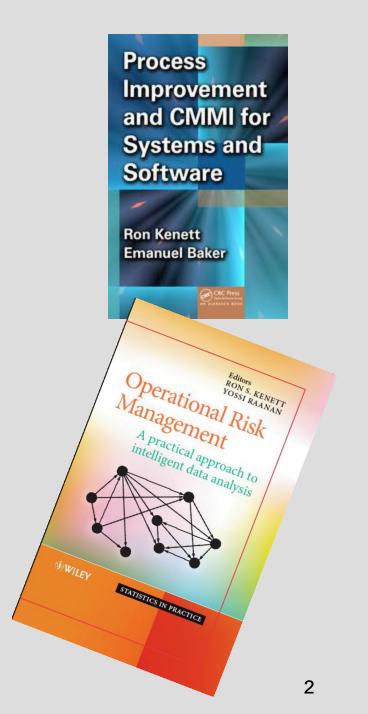
Ron S. Kenett

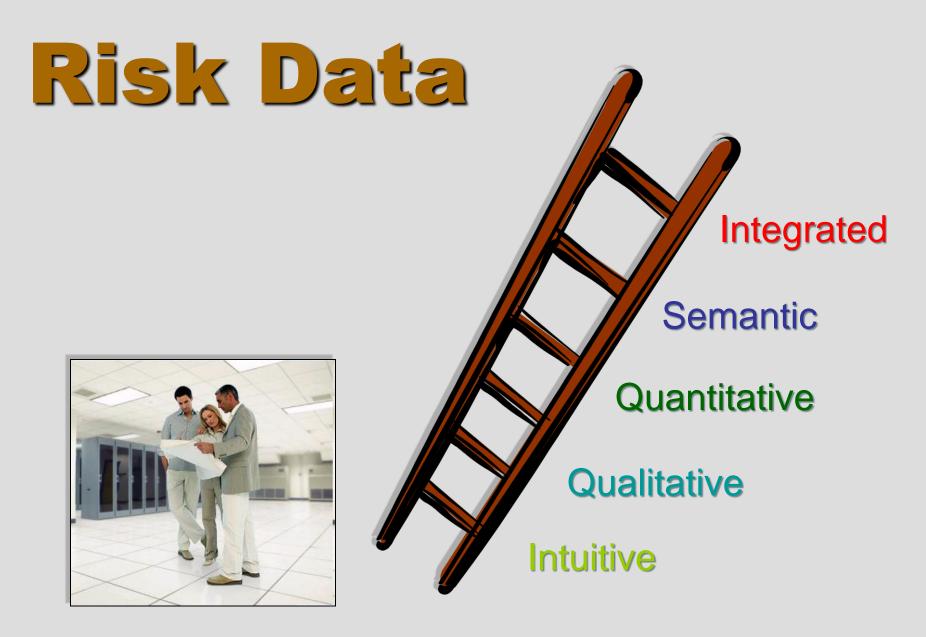
ron@kpa-group.com

KPA Ltd., Raanana University of Turin, Italy Center for Finance and Risk Engineering, NYU-Poly, New York

Agenda

- 1. Risk data
 - Qualitative data
 - Semantic data
 - Financial data
 - Operational data
- 2. Case studies
- 3. Integrating risks





Function	FCTN FAILURE EFFECT		Severity (S)	Causes of Failure (0) CAUSE		Controls	Detection (D)	RPN (Risk)	Plan PLAN
HPLC DS Impurities Method	Unknown Impurity is quantified which is not present in batch	Repeat Testing (if specification initially fails or atypical result is observed)	3	Contamination - glassware	4	Method states that Wheaton vial should be used in preference to volumetric flasks. Blank Injections	4	48	Develop wash procedure for Volumetric flasks (Detergent could react with Drug Substance)
		Repeat Testing (if specification initially fails or atypical result is observed) Repeat Testing (if	3	Contamination - sample handling	2	Blank Injections should pick up any aberrant peaks	2	12	Ensure Blank Solutions are prepared exactly the same way as for samples Ensure Blank Solutions
		specification initially its or atypical result observed)	Ĵ	Cor min p - live p	Į	Blank Injections should pick up any aberrant peaks	2	18	are prepared exactly the same way as for samples
	Å	Report invalid results	10	Contamination - glassware	4	Method states that Wheaton vial should be used in preference to volumetric flasks. Blank Injections	4	160	Develop wash procedure for Volumetric flasks Ensure Blank Solutions
		Report invalid results	10	Contamination - sample handling	2	Blank Injections should pick up any aberrant peaks	2	40	are prepared exactly the same way as for samples Ensure Blank Solutions
		Report invalid results	10	Contamination - solvents	3	Blank Injections should pick up any aberrant peaks	2	60	are prepared exactly the same way as for samples Brainstorm what
		Report invalid results	10	HPLC method cannot detect it	2	Orthogonal analytical techniques should pick up other unknowns	3	60	potential impurities can be produced by process. Assess whether current methodology would pick these up
		Report invalid results	10	Co-elution with another named peak	2	None although considerable elevation in named impurity would lead to repeat testing	3	60	Assess impurity profile against historical batches
	C	Repeat Testing (if specification initially fails or atypical result is observed)	3	Poor quantification of peaks (setting of RT window)	2	Test mixture with elevated imps.	2		alitative

System 1950 Update Beta Customer Survey

Dear customer,

As part of the Beta test that your company is taking part of I would like to ask you some questions regarding the System 1950 Update. We value your feedback and intend to use it as the basis for future improvements of the hardware and software. Please answer the following questions, which should take an estimated 30 minutes of your time.

Before starting with the questions let me explain that on this survey you will be asked about the various new features of the System 1950 Update the questionnaire's objective is to hear your opinion regarding the improvements made in the System 1950 Update compared to the System 1950. The questionnaire will focus on your level of satisfaction from the improvement in your productivity, print quality and proficability generated by the new features.

In order to answer these questions please state the number which best reflects how satisfied you feel about the subject asked, on a scale from 1 to 5 when:

5 means Very high satisfaction level

- 4 means High satisfaction level
- 3 means Average satisfaction level 2 means Low satisfaction level
- 1 means Very Low satisfaction level

And 0 means Not relevant- you did not use the feature

Thank you in advance for your cooperation

John Doe

Technical Marketing Systems Inc.

	Questions	Respor	ISES				
1	What is your company name?						
	What is your name?						
	What is your title? Technical, Supervisor, plant manager, other (please specify)	1. Operator	2. Supervisor	3. Manager	4.Other:		
	Site Preparation	VeryLow	Low	Average	High	Very High	Not relev
	Your satisfaction level with the site preparation instructions	1	2	3	4	5	0
	Your satisfaction level with the site preparation timing	1	2	3	4	5	0
	Your satisfaction level with the site preparation requirements	1	2	3	4	5	0
	Installation	VersLow	Low	Average	High	Vers High	Not relev
	Your satisfaction level with the shipment timing	1	2	3	4	5	0
	Your satisfaction level with the installation length	1	2	3	4	5	0
	Your satisfaction level with the cleanliness of equipment after installation	+ ÷	2	3	4	- <u>-</u>	
	Tour satisfaction level with the cleaniness of equipment after installation Training	VersLow	Low	Average	High	Very High	Not relev
		1	2	2		5	0
	Your satisfaction level with the operator training	+ ÷	*	2	4	5	0
	Your satisfaction level with the technical training	+÷	*	2			0
	Your satisfaction level with the on site training	YersLow	Low	Average	High	VersHigh	Not relev
_	Production ramp up	Terg Low	2	Average	-	verg High	
13	What was the expected usage of system 1950 Update	<u>'</u>	2	3	4	5	0
14	Actual usage of system 1950 Update during beta test	<u>'</u>	2	50	75	95	0
	What is the billable usage during the beta test? (%)						
	Diagnostics	Yery Low	Low	Average	High	Very High	Not relev
	In how many problems did you use the diagnostics tools (%)	5	25	50	75	95	0
	In how many of these cases did the diagnostics tool help resolve the problem? (%)	5	25	50	75	95	0
	Reliability and maintenance	Very Low	Low	Average	High	Very High	Not relev
	How many cases of part replacements did you experience during the beta test?	1	5	10	15	20	0
	Your satisfaction level with component A replacement procedure	1	2	3	4	5	0
	Your satisfaction level with component B replacement procedure	1	2	3	4	5	0
21	Your satisfaction level with component C replacement procedure	1	2	3	4	5	0
22	Your satisfaction level of other replacements and handling procedures	1	2	3	4	5	0
23	Comments:		-		-		
	Overall productivity	VeryLow	Low	Average	High	Very High	Not relev
24	Rate the overall productivity od System 1950 Update	1	2	3	4	5	0
25	Rate the failure rate in the System 1950 Update	1	2	3	4	5	0
26	Rate the improvement in supplies that can be used in the System 1950 Update	1	2	3	4	5	0
27	Rate the improvement in the System 1950 Update utilization level	1	2	3	4	5	0
	Rate the performance of system user interface	1	2	3	4	5	0
	Rate the ease-of-use when fixing a technical problem	1	2	3	4	5	0
	Software	VeryLow	Low	Average	High	Very High	Not relev
30	The number of restarts needed when using the System 1950 Update was	5	25	50	75	35	0
	Comments on main software restart cause:						
	Rate the user inteface connectivity	1	2	3	4	5	0
	Comments on user interface connectivity:						
	Overall satisfaction level	VeryLow	Low	Average	High	Very High	Not rele
	Your satisfaction level of improvements in the quality of the System 1950 Update	1	2	3	4	5	0
	Your satisfaction of improvements in the ease-of-use of the System 1950 Update	1	2	3	4	5	0
	What is your overall satisfaction level from the System 1950 Update?	1	2	3	4	5	0
	If you were in the market to buy a system, with what likelihood would you purchase the System 1950 Update?	1	2	3	4	5	0
	General comments on the System 1950 Update:						

Questionnaire

Heavy/Light Workload SME/Large Company Basic/Sophisticated Usage

Group	Workload	Size	Usage
1	HW	SME	В
2	LW	SME	В
3	HW	LC	В
4	LW	LC	В
5	HW	SME	s
6	LW	SME	s
7	HW	LC	s
8	LW	LC	S

Group	Workload	Size	Usage
2	LW	SME	В
3	HW	LC	В
5	HW	SME	S
8	LW	LC	S

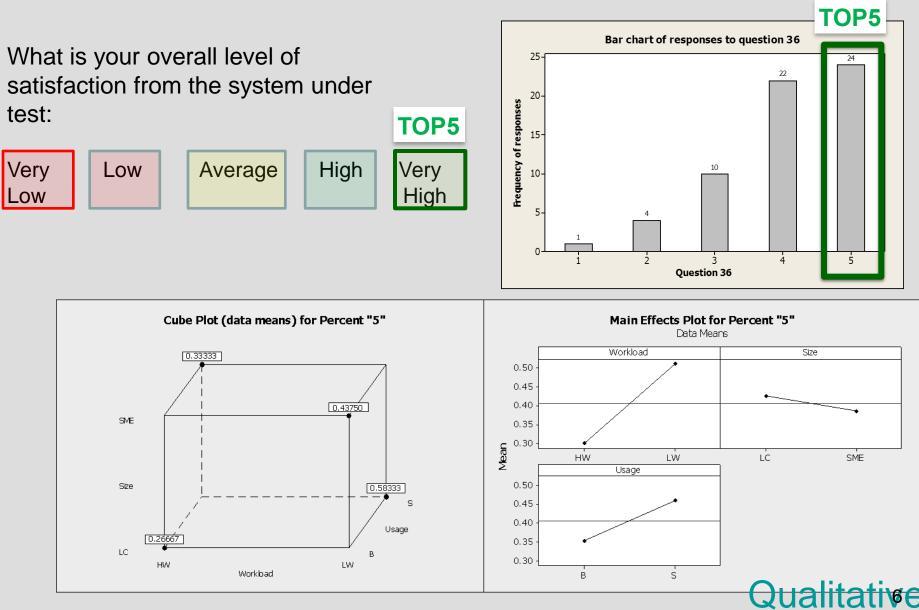


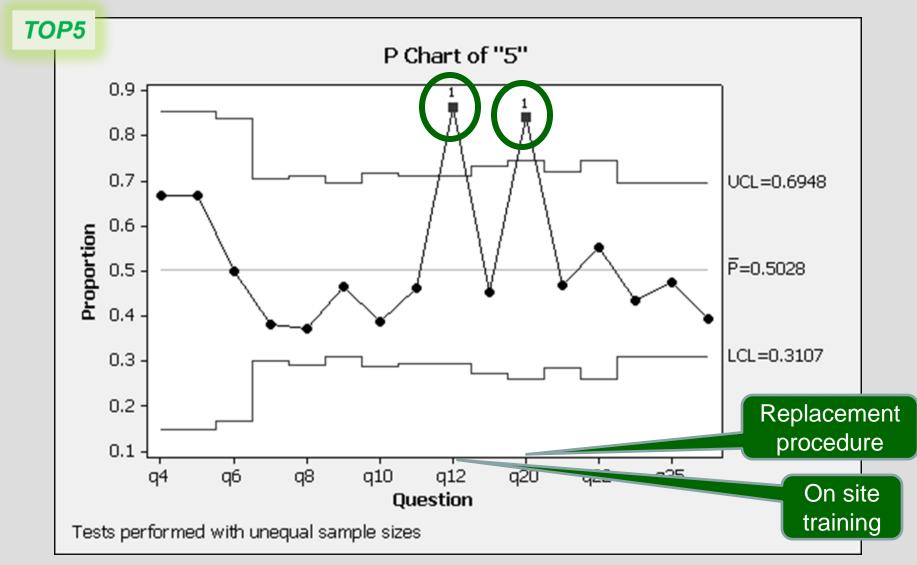
site per run
 systems
 respondents
 per site:

 3 decision makers
 3 technical experts
 3 operations staff

2 sites per run 8 systems 9 respondents per site

Qualitative





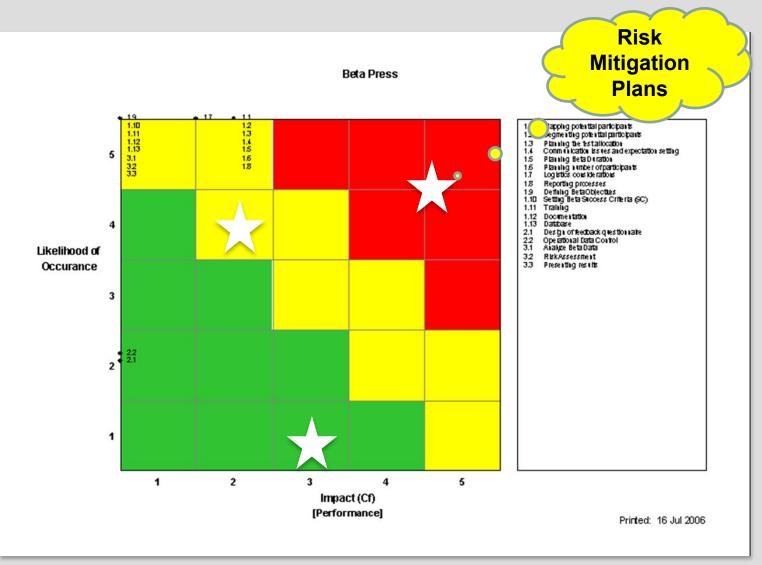
Qualitative

NA Call Data- Apr

sheet

Title FSE	Resolution ONSITE	Engineer Name DARLING JOE	Engineer 1 FSE		rimary Case # 276646	Assist Case #	Call Date 3/21/20	Time Opened	d Cl 12:04	lose Date 3/26/2006			
FSE	ONSITE	DARLING JOE	FSE		277372		3/27/20		13:49	3/29/2006			
T1/HW	ASSIST	RICKET BRENT	REMOTE		277629	C2776291	3/29/20		8:36	3/29/2006			
T2/HW	REMOTE	SHEPHERD DOUG			2776291	02110231	3/29/20		8:37	3/29/2006			
FSE	ONSITE	DARLING JOE	FSE		277822		3/30/20		8:12	4/16/2006			
FSE	ONSITE	DARLING JOE	FSE		277849		3/30/20		8:22	4/19/2006			
FSE	ONSITE	DARLING JOE	FOF	~	077050		0.000.000	~~	0.00	111010000			
FSE	ONSITE	DARLING JOE		ub Region	Press Serial			Blk/Pip			tep. Time Eng#	Total	
FSE	ONSITE	DARLING JOE	Europe, Mi U			22100251 u6.6		BLANKET		/29/06	63216 P1		16196170
FSE	ONSITE	DARLING JOE	Europe, Mi U			22100251 u6.6		BLANKET		/28/06	123414 P1		16182194
SE	ONSITE	DANIEL JONATHA	Europe, Mi U	V 9 Iroland		22100251 u6.6		BLANKET BLANKET		/27/06 /26/06	131001 P1 145624 P1		16136797 16088645
T1/HW	REMOTE					22100251 u6.6 22100251 u6.6				/26/06	91927 P1		16076021
T2/HW	ASSIST	SHEPHERD DOUG	Europe, Mi U	K & Ireland				BLANKET BLANKET		/25/06	181859 P1		16060043
SE	ONSITE	DANIEL JONATHA	Europe, Mi U	K & Ireland		22100251 u6.6 22100251 u6.6		BLANKET		/25/06	120410 P1		16028682
FSE	PHONE	DARLING JOE	Europe, Mi U			22100251 u6.6		BLANKET		/25/06	62332 P1		15999836
			Europe, Mi U			22100251 u6.6		BLANKET		/23/06	62344 P1		15999836
			Europe, Mi U			22100251 u6.6				/20/06	204659 P1		15978330
			Europe, Mi U			22100231 00.0				/20/06	115903 P1		15943676
(ET		/20/06	63043 P1		15925964
	Cause							ET		/19/06	135447 P1		15884725
								ET		/19/06	63704 P1		15854039
						<		ET		/18/06	63527 P1		15806987
	Cause	Event		tion	Outcome			ET		/13/06	65457 P1		15782720
	Cause	Event			Outcome			ET	04	12/4/2006	124647 P1		15757103
								ET ET		11/4/2006	180533 P1		15727376
								ET		10/4/2006	163457 P1		15696524
					Outco	ome		LET LET LET		7/4/2006	171259 P1		15676034
				ction 📂				ET		6/4/2006	175451 P1		15648151
	Cause Y							ET		6/4/2006	64137 P1		15613026
								ET		5/4/2006	172634 P1		15595906
			Cause		event (Action Action	Outcon	le					

Quantitative



Qualitative/Quantitative

	INTERNATIONAL STANDARD	-	SO 000			
			tediton 9-11-15		GUIDE 73	
	_		-		Risk management — Vocabulary	
	Risk management — Princi guidelines Management du risque — Principes et lignes d				Management du risque — Vocabulaire	
			SI 14971	-		תקן ישראלי ת"י 71 14971: 2000, FDAM 1: 2002
		0 31010	February 200		2	אדר א התשס"ג - פברואר 003
	INTERNATIONAL STANDARD	200-11	איים	פוש־	איים - יישום ניהול סיכונים להתקנים ו	התקנים רפו
	NORME INTERNATIONALE				ical devices - Application of risk management to med	-
		BS 31100:		ne	nt – Code of	
	Risk management – Risk assessment techniques Gestion des risques – Techniques d'évaluation des risques	practic the im	e and g plemen	jui	dance for	
Ent	erprise Risk Management	BS ISO	31000			10

Semantic Data in a Bank Logbook

Booked on fixed income trade that was in the wrong partfund code. Have cancelled trade re: Cash contribution not invested due to incorrect fax number used by client. Not a BGI error bu Client sent in an instruction to invest £1.7m in their M&S Investment Portfolio (MSIP) o Barclays Private Clients (BPC) conduct the asset allocation for the LIPS (L&G Investment

"Booked on fixed income trade that was in the wrong partfund code. Have cancelled trade resultant in error of 15000"

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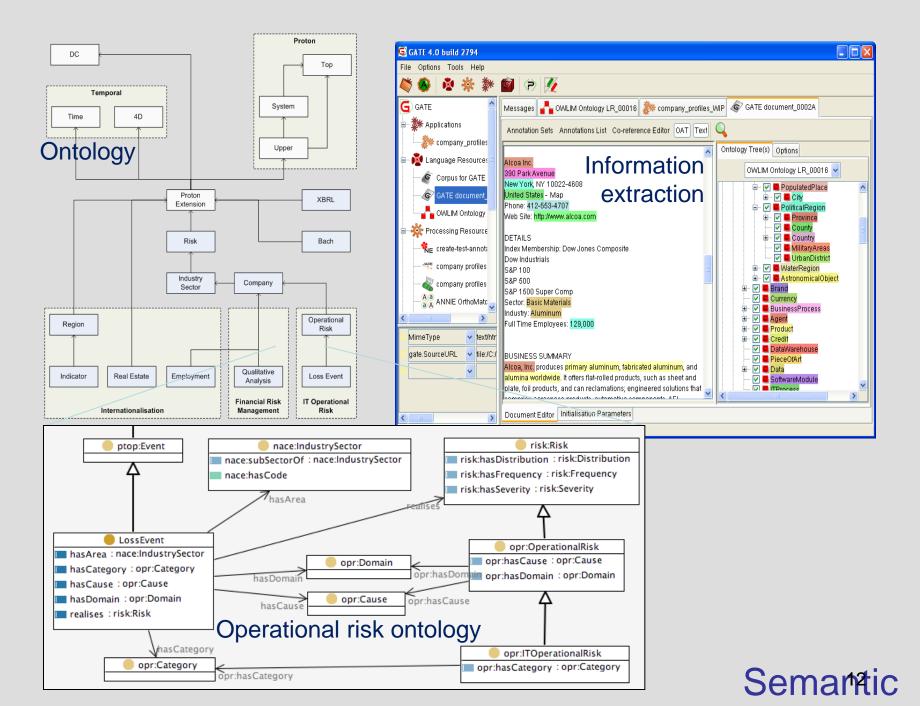
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The

"Cash contribution not invested due to incorrect fax number used by client. Not our error but noted due to performance impact on the fund."

"The client sent a disinvestment instruction that was incorrectly processed as an investment. Due to a positive movement in the equity markets the correction of the error led to a gain."

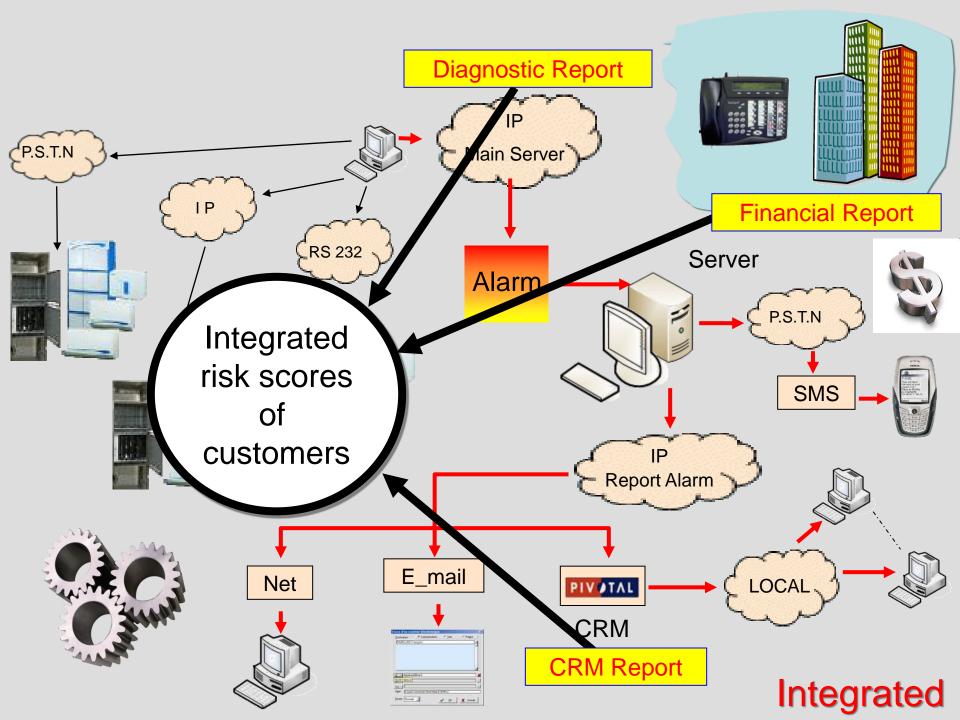
Historic prices were sent to Hewitts with a zero price by Fund Accounting in error on 03.03.03 Purchase instruction was received from Transitions for 16,264,591,827 Indonesian Rupiah, (ID Asset Allocation provided Alex with a paper trade instruction to buy £2.6m index-linked gilts Income was posted to the Capital account in error which caused the fund to breach. I rebalan Client instructed a disinvestment of \$195,070.00, however the cashflow inst

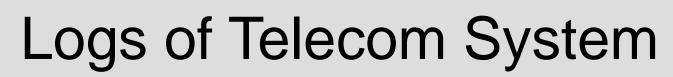


A Telcom Operator Case Study

- Compute operational risk scores by combining information from PBX logs with CRM and technical data.
- Combine XBRL financial data to determine credit scores.
- Integrate risk scores for overall integrated risk management.







SITE NAME	CCS VERS	SYS. TYPE	GC DUP		LAST BOOT & CAUSE	DC_ SNAP	SNAP	NET	ALARMS	FAULT	RESOURCES	SYSTEM & TASK RESTART	DATE-T
90006	14.66.35	HDC		8.4	2-SEP -2007 09:20		0			pl4_tab-177 cpn_tab-10	DTMF-15	RESET_POWER_UP-1 TOTAL_RESTARTS-1	
90009	11.11.17	SX		7.23	AUG -07-20 08:06 AM		116			pl4_tab-255 pl6_ma-4 call_tab-24 call_rec-25	-	NMI_WD-1 SUSPECT_ACF-1 RESET_POWER_UP-1 TOTAL_RESTARTS-1	11-Sep- 04:03:1
90021	11.11.17	MEX		38.13	6-JUN -2006 11:38		0			p14_tab-235			11-Sep 04:10:
90033	11.11.16	sx	[7.19	14-FEB -2007 05:56		0		PCM TIME SLOT	p14_tab-39	-		11-Sep- 04:13:1
90049	11.11.17	SX		7.23	4-AUG -2007 13:29		0		T	status-255 features-255 timers-255 ts_pool-255	-		11-Sep- 04:17:2
90067	11.11.17	SX		7.23	25-MAY -2007 10:31		0		<u>k</u>	pl4_def-1 pl4_tab-177 call_tab-1 call_rec-1	DTMF-9	OVERLOAD-1	11-Sep 04:32:
90098	11.11.16	SX		38.13	25-JUL -2007 11:47		0			p14_tab-219 call_tab-5			11-Sep- 04:40:3
90100	11.11.16	sx		7.5	1-APR -2007 23:22		0			pl4_tab-29 pl6_ma-2 call_tab-12 call_rec-32	-	H u	11-Sep; 04:42:0
90105	15.68.14	IPx50		8.5	14-AUG -2007 15:54		0		CARD SUBUNIT	p14_tab-106			11-Sep(04:44:5
90118	11.11.11	sx		38.10	23-NOV -2006 16:31		0		CARD SUBUNIT	p14_tab-38		¹	11-Sep 04:51:0
90125	11.11.16	SX		0.0	19-AUG -2007 15:10		0			status-255 features-255 timers-255 *:-3	-	POWER_FAIL-1 SUSPECT_ACF-1 RESET_POWER_UP-1 TOTAL_RESTARTS-1	11-Sep+ 04:58:1
90126	14,66.35	svc		38.10	SEP -25-20 11:42 AM		0			p14_def-9 p14_tab-227	-		11-Sep- 05:01:1
90128	11.11.16	sx		38.10	4-JUN -2006 07:48	A.	0			pl4_tab-19		RDY_TMOUT-2 OVERLOAD-7 PC 3_F/_1-12	11-Sep- 05:04;

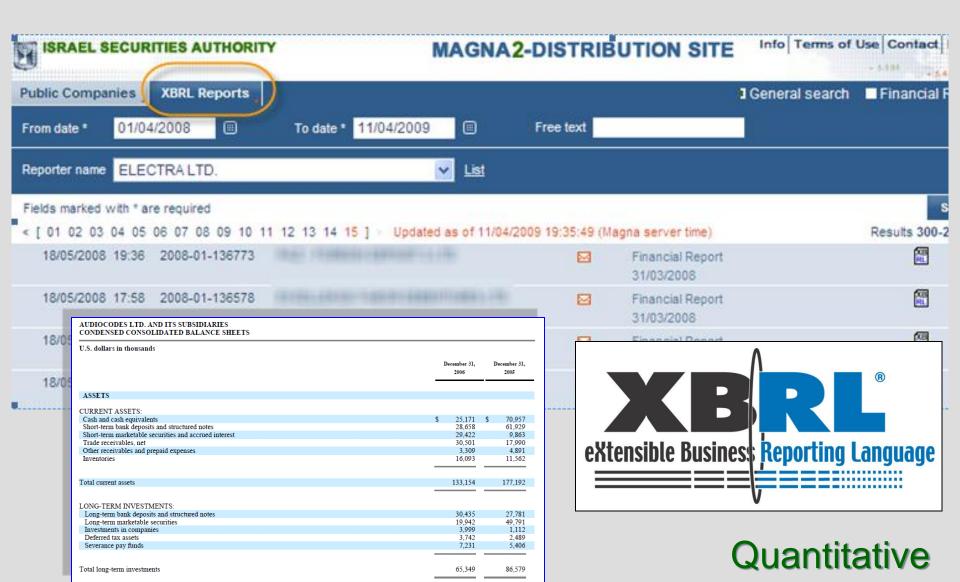
Semantic



Site	Туре	Ports	Trunks	Phones	Complaint	Action
90009	High Tech	956	246	116	COUNTL "A TEMPTER TELEVISION	without and many stations. And the
90009	High Tech	956	246	116	TERMINATION - SPACE TOTAL AND INC.	(P10515 75019 (22)
90009	High Tech	956	246	116	STATES. A TERMINE TAXABLE COM	
90009	High Tech	956	246	116	ENGINE TA PERSONAL TAXABLE VALUE.	42770 mining received a
90009	High Tech	956	246	16	M Data	Gib numer (Date
90009	High Tech	956	246		VI Dala	2 months if with
90021	Municipalities	66	34	2	Charlend, "a "scholarsk ranger salitar	presidente delle della di al 1 a di 1
90033	Transportation	491	316	123	PERMITTER PERMIT VERMIT	#**128
90033	Transportation	491	316	123	TERMINAL APPEND TO PERMIT	DEDT-1, Brane Brane and
90033	Transportation	491	316	123	(87594) (214)	+
90033	Transportation	491	316	123	THE REAL STOCKS WITCH	1.0.0
90033	Transportation	491	316	123	inter states and the	973
90033	Transportation	491	316	123	"EDWERTHE TALENT TALENT	ADWY 2 am AND ALL WE A
90033	Transportation	491	316	123	VERSION VERSION	#19279-2 A
90049	Municipalities	423	114	119	Children, "as represented thanks represent	2
90049	Municipalities	423	114	119	TERRITOR SPACE STATISTICS	770083a. #`#
90049	Municipalities	423	114	119	manuffage (multiple)	17mm H 17m
90049	Municipalities	423	114	119	NUMBER OF THE PERSON NAMES OF TAXABLE	1. C.
90049	Municipalities	423	114	119	PERSONAL APPENDIX OF ADDRESS.	water territor
90049	Municipalities	423.		MAQ	Musmin.	American and and and and and and and and and a

Semartic





The Data

CRM Report

PBX	Open On	Code	Problem	Sevirity	Trunk	SLT	DKT	Туре
94095	28/05/2009 09:38	23	version change from support	2	170	103	383	Finance
94095	12/05/2009 09:26	23	version change from support	2	170	103	383	Finance
94095	03/05/2009 15:11	23	version change from support	2	170	103	383	Finance
94095	10/05/2009 16:00	333	Customer remote handling	3	170	103	383	Finance
94095	10/05/2009 14:50	333	Customer remote handling	3	170	103	383	Finance
94095	19/05/2009 12:28	334	Customer remote handling	3	170	103	383	Finance
94095	11/05/2009 16:27	334	Customer remote handling	3	170	103	383	Finance
94095	26/05/2009 17:02	E202	Remote Programing	3	170	103	383	Finance
94095	26/05/2009 10:32	E202	Remote Programing	3	170	103	383	Finance
94095	24/05/2009 13:00	E202	Remote Programing	3	170	103	383	Finance
94095	10/05/2009 17:39	E202	Remote Programing	3	170	103	383	Finance
94095	05/05/2009 18:58	E202	Remote Programing	3	170	103	383	Finance
94095	05/05/2009 14:26	E202	Remote Programing	3	170	103	383	Finance
94095	05/05/2009 07:59	E202	Remote Programing	3	170	103	383	Finance
94095	04/05/2009 15:39	E202	Remote Programing	3	170	103	383	Finance





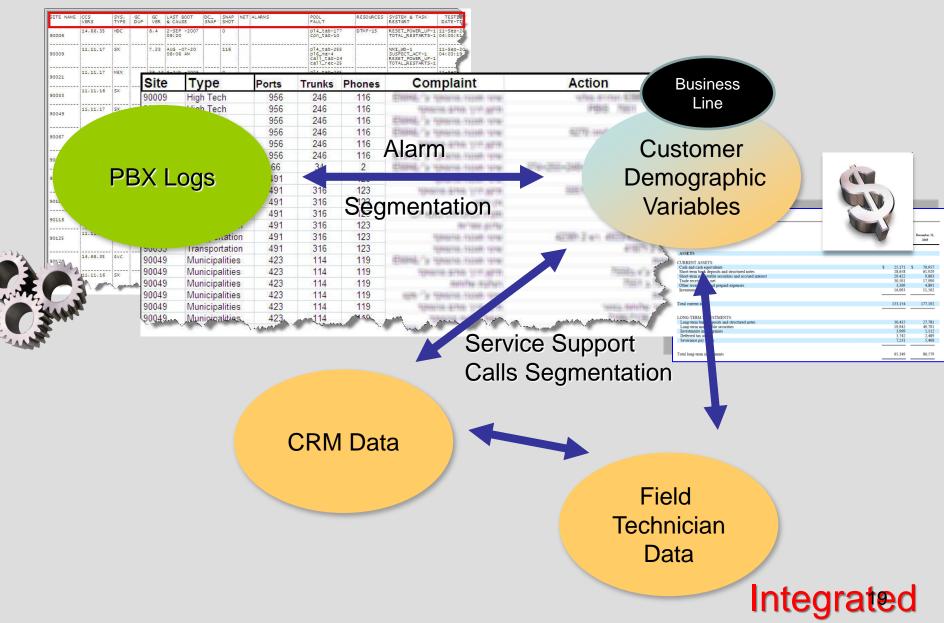
Financial Report

PBX 91068		
Period (Quarter & Year or Annual)	Jan-08	Sep-09
IFRS	IFRS	IFRS
Balance Sheet		
Balance Sheet Total	114,677	150,80
Current Assets	58,935	73,68
Non-Current Assets	55,742	77,12
Equity	26,963	37,073
Of which: Minority Rights	0	3,564
Current Liabilities	82,884	106,72
Non-Current Liabilities	4,831	7,01
Profit & Loss Statement		
Total Revenues	161,560	162,79
Gross Profit	66,506	65,70
Operational Profit	9,001	7,19
Pre-Tax Profit	4,826	5,66
Net Profit	4,876	6,13
Net Profit attributed to Share Holders	#VALUE!	6,19
Basic Ernings Per Share	5	
Additional Data		
Dividend		
Net Cash from regular Operations	18,874	17,14
Finanacial Ratios		
Market to Equity		
Multiplier		
Equity to Balance Sheet		
Return on Equity		

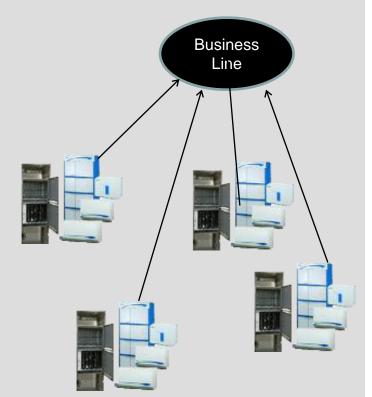
Diac	nostic	Rer	ort
Diag	JIOSUC	I VO	JUIT

SITE NAME	CCS VERS	SYS. TYPE	GC VER	LAST BOOT & CAUSE	DC_ SNAP		POOL FAULT	RESOURCES	SYSTEM & TASK RESTART	TESTING DATE-TIME
91068	11.11.17	4gc	7.23	SEP-12-2009 06:15		0	p]4_tab-101	DTMF-12		08-APR-2010 06:22:06
92780	15.85.16	HDC	7.23	21-MAY -2009 13:20		0	p14_tab-70		 	08-APR-2010 06:45:36
94486	10.21.05	4gc	7.23	07-Feb -2008 09:45 PM			status-31 features-2 timers-2 ts_pool-34		RESET_POWER_UP-7 TOTAL_RESTARTS-9 GENERAL_P-1	
94095	15.68.28	4gc	7.23	16-Jun-2009 06:17 PM		i	p]4_tab-197 p]6_ma-78 [call_tab-7 [call_rec-15	i	RESET_POWER_UP-7 TOTAL_RESTARTS-9 GENERAL_P-1	

ETL Integration



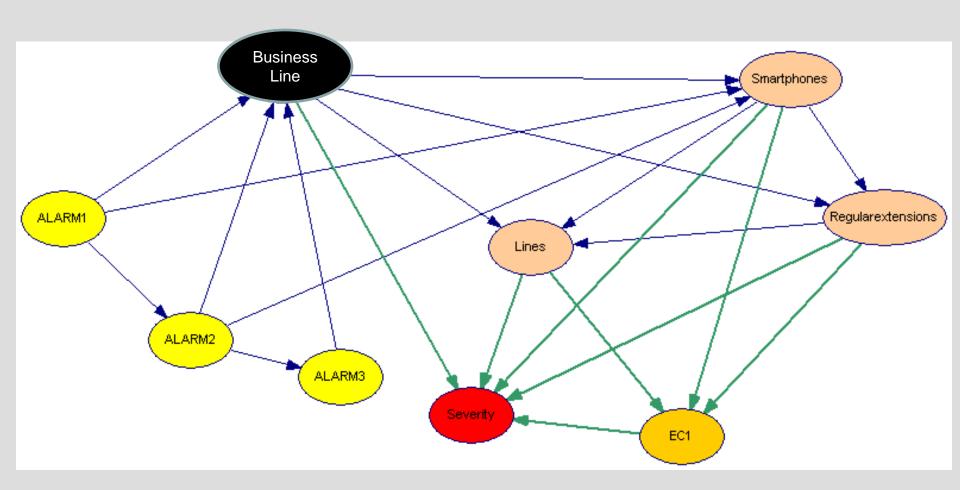


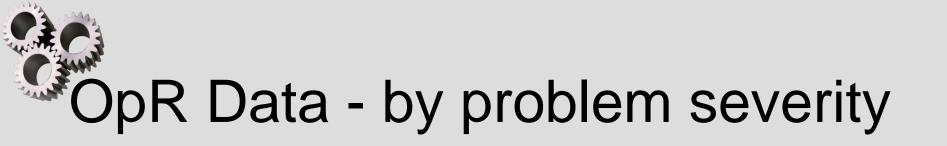


Business Line	Total Events
Health	699
Banking	481
Defence	323
General	270
Finance	260
Industry	248
Cooperatives	225
Municipalities	221
Government owned company	209
Hotels	197
Leisure and Consumerism	153
Transportation	134
Lawyer/accountant offices	83
Education	56
Computers	49
Operating company	49
Electronics	42
Elderly citizens' home	40
Government	25
Construction	4



Bayesian Network Cause and Effect Analysis



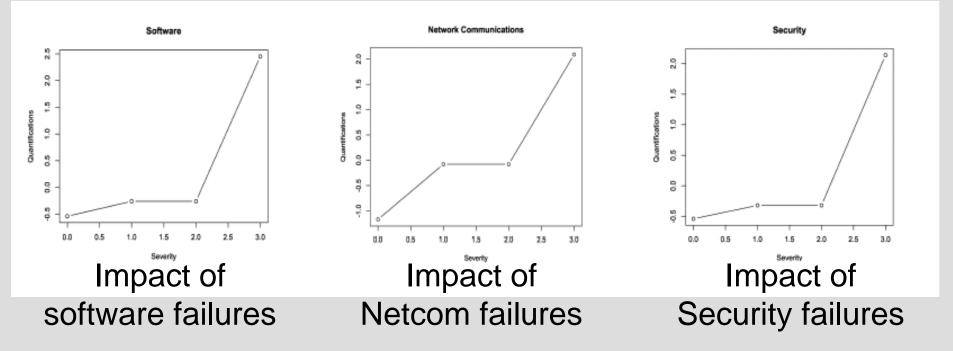


		Н	ardware	;		Software)	
PBX	Business Line	H_H	H_M	H_L	SF_H	SF_M	SF_L	
1	Banking	0	0	2	1	0	3	
2	Defence	0	0	1	1	3	0	
3	Health	2	0	0	1	1	1	
4	Finance	0	1	0	2	1	0	
n		2	0	1	2	0	1	



Non Linear Principal Components Analysis

Dimension	n Cronb	each's α Variance A Eigenvalue	Accounted For e % of Variance
1	,503	1,505	50,161
2	-,009	,994	33,130
Total	,900	2,499	83,290



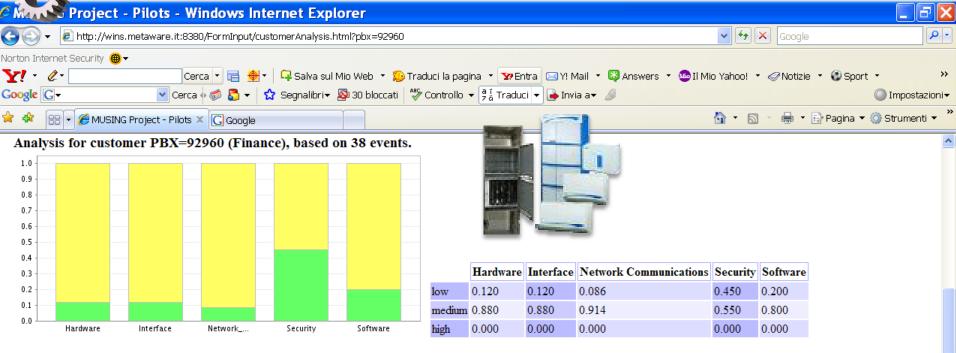


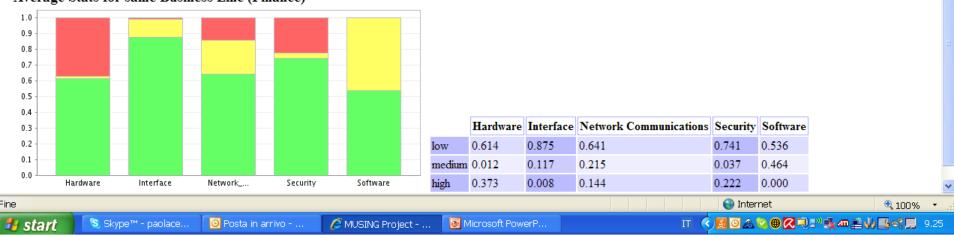
Non Linear Principal Components Analysis

1st dim.

PBX	BusinessLine	Software_Quan	Network_com_Quan	Security_Quan	Scores
31116	Industry	2.45	2.09	-0.54	0.593
32315	General	2.45	-0.08	2.14	0.913
32910	General	-0.54	-0.08	-0.54	0.043
33113	General	-0.54	-0.08	-0.54	0.043
33595	General	2.45	-1.17	2.14	0.867
35098	General	-0.26	-0.08	-0.54	0.087
40366	General	-0.54	-1.17	-0.54	0.000
50049	Finance	-0.54	-0.08	-0.54	0.043
50091	Industry	-0.26	-1.17	-0.32	0.076
50093	Hotels	2.45	-1.17	2.14	0.867
50115	Finance	-0.26	-1.17	-0.32	0.076
50123	Hotels	-0.26	-0.08	2.14	0.493
50181	Finance	-0.54	-0.08	-0.54	0.043
50215	General	2.45	-1.17	-0.54	0.463
60258	Finance	-0.54	-0.08	-0.54	0.043
60260	General	-0.54	-0.08	-0.54	0.043
60408	Finance	-0.54	-1.17	-0.32	0.033
60434	Industry	-0.54	-0.08	-0.54	0.043
60502	General	-0.26	2.09	-0.54	0.173

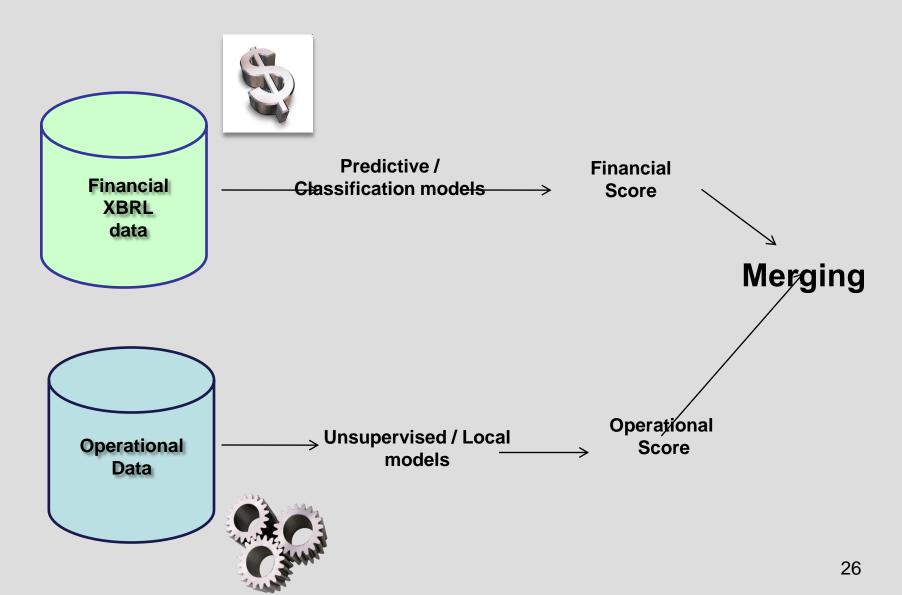






Average Stats for same Business Line (Finance)

Risk assessment



Financial data



- Collect Balance Sheets
- Extract quantitative information from XBRL balance sheets data
- Derive financial ratios useful to predict the default probabilities of companies
- The target variable is binary (0: good,1: bad)
- The final data matrix is composed of n companies and p covariates

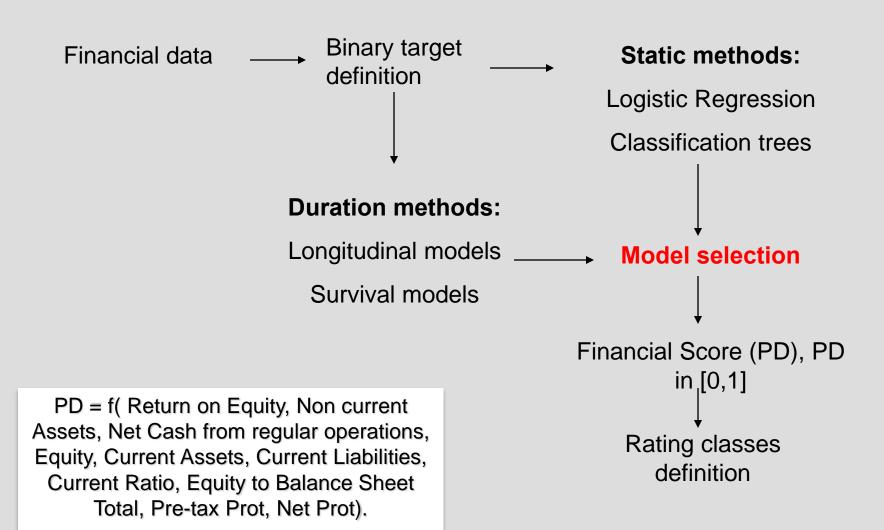


Financial data: an example

Customer	Financial Ratio 1	Financial Ratio 2	Financial Ratio 3	Financial Ratio p
1	11794200	10921774	393717	627750
2	47947	34813	13134	27058
•••	519440	130111	389330	62568
•••	111200	94573	16627	12914
•••	160747	120877	39870	111038
•••	2303915	1101978	1201937	591154
•••	97970	70909	27061	34268
n	127953	75586	52367	16526



Predictive/Classification models



Financial score



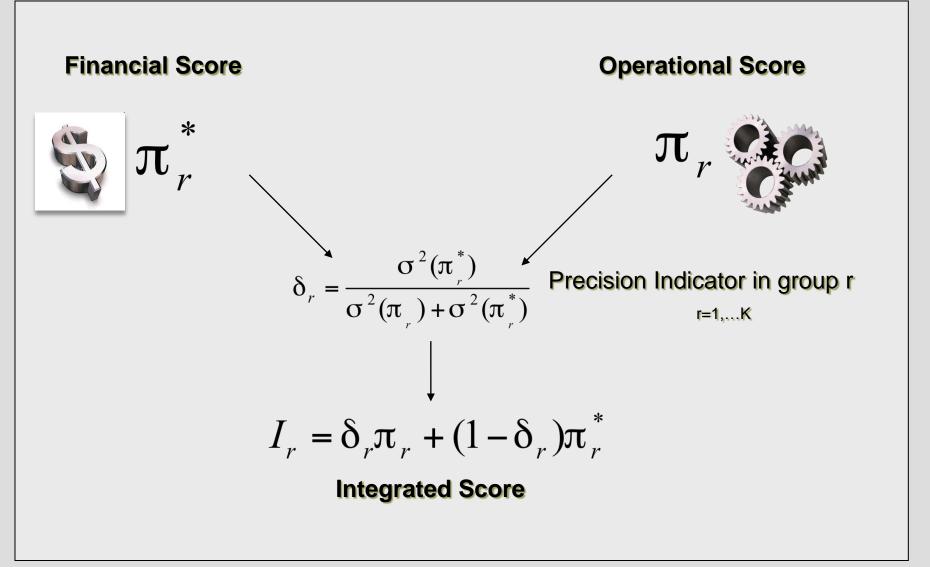
Customer	LogReg 1	LogReg 2	LogReg 3
1	0.590413725	0.483517201	0.60105205
•••	1	1	1
•••	0.198422752	0.288418151	0.193413586
•••	0.311519917	0.25348666	0.4165347
•••	0.58567025	0.481172502	0.59679867
•••	0.593873953	0.487455978	0.604682691
	0.606705681	0.499173616	0.616373138
n	0.59845664	0.492608605	0.609354881

The resulting PD are based on logistic regression. More precisely, Reg 1, Reg 2 and Reg 3 consider backward, forward and stepwise selection respectively.



Financial and Operational scores

Customer	Financial Score	Operational Score
1	0.60105205	0.453472222
2	1	1
•••	0.193413586	0.440277778
•••	0.4165347	0.247916667
•••	0.59679867	0.534722222
•••	0.604682691	0.360416667
•••	0.616373138	0.417361111
n	0.609354881	0.472222222

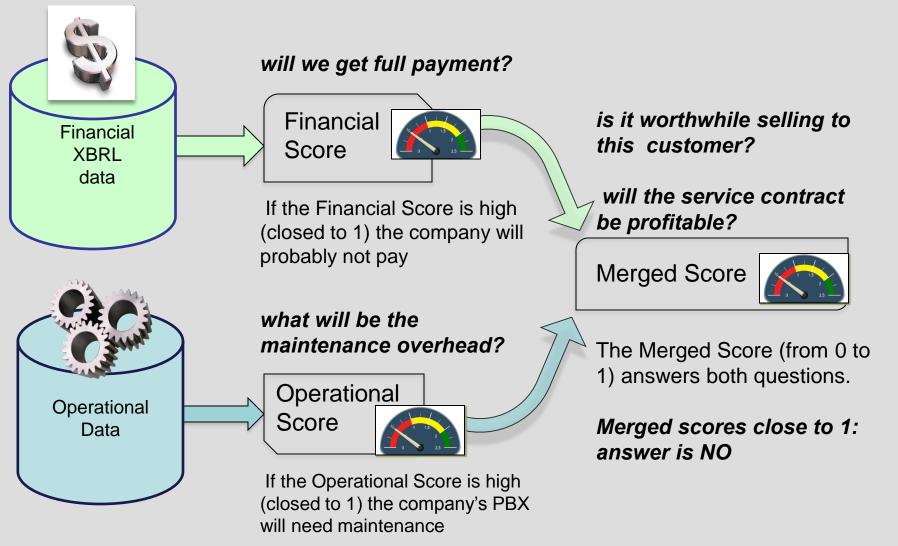


The precision indicator is derived on the basis of the variances estimated across "r" bootstrapped data sets.

Bayesian merging

Customer	Financial Score	Operational Score	Delta	Merged Score
1	0,60105205	0,453472222	0,78431851	0,569221813
2	1	1	1	1
•••	0,19341359	0,440277778	0,35931949	0,351574662
•••	0,4165347	0,247916667	0,76715999	0,377273676
•••	0,59679867	0,534722222	0,4185012	0,56070129
•••	0,60468269	0,360416667	0,86303567	0,571226958
•••	0,61637314	0,417361111	0,75822335	0,568256677
n	0,60935488	0,472222222	0,52974872	0,544868073

Results



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