FINANCE INDIA
© Indian Institute of Finance
Vol. XXXV No. 1, March 2021
Pages – 135-150

An Empirical study of the Financial Ratios of the Indian Information Technology Sector by applying Factor Analysis and substantiation of the results using Cluster Analysis

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Abstract

Financial Ratios play an important role in analysing the performance of a company. The current study based on the empirical data collected, financial ratios are reduced and categorised for the Information Technology sector. Fifty ratios grouped into five categories are calculated for ten years covering eighty eight percent of the market capitalisation of the sector, being an effective representative sample. Initially variables with low correlation are eliminated. Factor Analysis is conducted on the remaining variables which led to eight factors. Multiple Regression Analysis is conducted by taking the factor scores as dependent variable and the constituent ratios as independent variables. Insignificant variables identified through the analysis are eliminated. Factor Analysis is conducted on the remaining eighteen variables which lead to five factors. It aids in understanding the integration of mission, quality of management along with various stakeholders perception.

I. Introduction

FINANCIAL RATIOS ARE an important tool to interpret and analyse financial statements. They help in understanding the financial performance and position of an organisation. It aids in undertaking the evaluation of the business for particular time period and facilitates in understanding the integration of the mission, vision, quality of management along with various stakeholders perceptions.

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Appendix A List of Financial Ratios

	List of Financial Ratios					
Group	Ratio Co	de Ratio				
Profitability & Efficiency	P_R1	Pre-Tax Profit Margin				
Profitability & Efficiency	P_R2	Post-Tax Profit Margin				
Profitability & Efficiency	P_R3	Return on Equity Ratio				
Profitability & Efficiency	P_R4	Return on Assets Ratio				
Profitability & Efficiency	P_R5	Return on Capital Employed Ratio				
Profitability & Efficiency	P_R6	Return on Average Equity Ratio				
Profitability & Efficiency	P_R7	Return on Average Capital Employed Ratio				
Profitability & Efficiency	P_R8	Equity Div. Distribution Ratio				
Profitability & Efficiency	P_R9	Total Div. Distribution Ratio				
Profitability & Efficiency	P_R10	Return on Average Assets Ratio				
Profitability & Efficiency	P_R11	Sales to Employees Expenses				
Profitability & Efficiency	P_R12	Sales to Administrative Expenses				
Liquidity & Cash Flow	LC_R13	Current Ratio				
Liquidity & Cash Flow	LC_R14	Quick Ratio				
Liquidity & Cash Flow	LC_R15	Net Working Capital Ratio				
Liquidity & Cash Flow	LC_R16	Cash flow from operations to Total Income				
Liquidity & Cash Flow	LC_R17	Cash flow from operations to Total Assets				
Liquidity & Cash Flow	LC_R18	Cash flow from operations to Equity				
Liquidity & Cash Flow	LC_R19	Cash flow from operations to Capital Employed				
Liquidity & Cash Flow	LC_R20	Cash flow from operations to Net working Capita				
Liquidity & Cash Flow	LC_R21	Cash flow from operations to Average Total Assets				
Liquidity & Cash Flow	LC_R22	Cash flow from operations to Average Equity				
Liquidity & Cash Flow	LC_R23	Cash flow from operations to Average Capital Employe				
Liquidity & Cash Flow	LC_R24	Cash flow from operations to Current Laiblites				
Liquidity & Cash Flow	LC_R25	Cash flow from operations to Current Assets				
Liquidity & Cash Flow	LC_R26	Cash flow from operations to Sales Ratio				
Liquidity & Cash Flow	LC_R27	Cash flow from operations to Total Assets				
Solvency	S_R28	Interest Coverage Ratio				
Solvency	S_R29	Debt/Equity Ratio				
Solvency	S_R30	Dividend Coverage Ratio				
Solvency	S_R31	Long Term Debt to Capital Employed				
Solvency	S_R32	Net Worth to Capital Employed				
Solvency	S_R33	Capital Gearing Rato				
Solvency	S_R34	Total Debt to Total Assets				
Solvency	S_R35	Total Debt to Turnover				
Assets Management	AM_R36	Fixed Assets Turnover				
Assets Management	AM_R37	Average Fixed Assets Turnover				
	AM_R38	Working Capital Turnover				
Assets Management Assets Management	AM_R39	DebtorsTurnover Ratio				
	AM_R40	Total Income to Capital Employed				
Assets Management Assets Management	AM_R41	Working Capital to Total Assets				
	AM_R41	Total Assets Turnover				
Assets Management Market & Valuation	_					
Market & Valuation	MV_R43 MV_R44	Price Earnings Ratio Enterprise Value to EBIT				
	MV_R45	•				
Market & Valuation	_	Enterprise Value to Assets				
Market & Valuation	MV_R46	Enterprise Value to Cash From Operations				
Market & Valuation	MV_R47	Enterprise Value to Sales				
Market & Valuation	MV_R48	Price Sales Ratio				
Market & Valuation	MV_R49	Price-Cash Ratio				
Market & Valuation	MV_R50	Price-Book Valu Ratio				

Appendix B Results of Factor Analysis

	Results of Factor Analysis							
			Rotated	Component Matrixa				
	1	2	3	4	5	6	7	8
P_R3	.927925	.257433	.108077	.054894	.079122	.097399	.045332	.051178
P_R6	.927243	.249486	.120840	.043477	.057545	.059656	.016202	.038726
P_R7	.885058	.288957	.019332	.238218	.072451	.009469	.005161	.107405
P_R5	.871647	.235828	.022900	.269967	.080024	.148134	.016128	.183542
P_R10	.840455	.305680	.164700	.279326	.090336	.188385	.026747	.075215
AM_R42	.820693	.213173	.452029	.098527	.083810	.056152	.012355	.002801
P_R4	.794213	.316978	.206199	.327906	.080379	.212613	.060407	.156466
AM_R40	.785274	085168	.519659	.085715	.193955	.114002	.042931	.035228
MV_R46	.698919	.416373	.043630	.108581	.009098	.244645	.340309	.232442
MV_R49	.695215	.419391	.041430	.100807	.002367	.241035	.352893	.230353
MV_R43	.605947	.437044	.020050	.021709	.050496	.482474	.253577	.273209
LC_R21	.215448	.957050	.001209	.059438	.107052	.011064	.009449	.007933
LC_R17	.205482	.955562	.018641	.103141	.103400	.003933	.026193	.046045
LC_R18	.170305	.944418	.171994	.113582	.034846	.061164	.003397	.082029
LC_R19	.217105	.942582	.124209	.107633	.011397	.038747	.017761	.089007
LC_R23	.234218	.939783	.106036	.056158	.008626	.146781	.012453	.002460
LC_R22	.198643	.936587	.171515	.120765	.016185	.098940	.024132	.011430
LC_R16	.185800	.782648	.463201	.001899	.140108	.075431	.099647	.041891
LC_R20	.165170	.569317	.452311	.151445	.196562	.083730	.532815	.007593
LC_R14	.208529	.143035	.897409	.161549	.112178	.055879	.007886	.120270
LC_R13	.211717	.145226	.896914	.153027	.113397	.056812	.012649	.119584
LC_R41	.141562	.180260	.854796	.314714	.125149	.0358080	.077770	.112187
P_R1	.095146	.078288	.836769	.278360	.087026	.066342	.044352	.226862
LC_R15	.068667	.123182	.811337	.321684	.322504	.078644	.228249	.109316
P_R2	.196433	.164015	.810303	.267150	.119986	.278049	.102115	.059205
AM_R38	.014403	.031426	.608495	.149154	.253992	.123293	.589247	.007194
S_R34	.150446	.015123	.223220	.924196	.078792	.146003	.017203	.52558
S_R29	.152442	.018652	.222560	.924059	.075835	.146568	.015161	.053417
S_R35	.169736	.018374	.254703	.918077	.075596	.131543	.006520	.052137
S_R32	.174267	.010038	.265881	.915132	.088439	.142179	.004283	.052105
S_R31	.177013	.014980	.264894	.915013	.084277	.143060	.007084	.053278
S_R33	.255802	.007237	.480462	.569173	.122781	.009388	.504903	.126683
LC_R25	.059663	.078867	.065009	.055954	.978324	.006884	.012866	.076509
LC_R27	.030544	.048376	.142481	.110402	.972702	.003310	.052096	.073645
LC_R26	.118194	.032762	.230988	.101492	.946179	.27288	.049173	.054287
LC_R24	.045589	.041253	.291574	.107947	.922623	.062496	.004581	.045075
MV_R44	.066287	.184443	.01881	.123025	.007375	.882863	.176066	.227415
MV_R47	.095537	.066089	.463307	.210459	.035808	.838547	.086309	.019030
MV_R48	.069752	.056830	.465161	.245564	.113957	.826450	.031474	.022449
MV_R45	.572175	.017463	.081182	.174315	.022833	.770989	.005965	.013609
MV_R50	.661421	.025378	.056768	.094491	.013347	.718662	.077840	.035106
MV_R36	.325502	.040544	.138885	.503249	.69781	.215089	.598562	.274501
MV_R37	.383294	.003958	.202836	.459247	.035755	.192446	.552455	.242662
MV_R39	.043381	.099343	.048324	.092870	.548475	.060201	.037161	.673492
P_R11	.149766	.152408	.081057	.170206	.158239	.287780	.277991	.666970

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Appendix C Results of Multiple Regressions

1. Multiple Regression Analysis on Factor 1

			Coefficie	nts		
		Unstan	dardized	Standardized		
		Coeff	icients	Coefficients		
Mod	del	В	Std. Error	Beta	t	Sig.
1	(Constant)	-2.381	.145	-16.397	.000	
	P_R3	10.341	2.516	1.097	4.110	.000
	P_R6	-3.862	2.053	500	-1.882	.066
	P_R7	4.302	1.070	.589	4.023	.000
	P_R5	-12.165	2.546	-1.528	-4.778	.000
	P_R10	-1.821	2.851	174	639	.526
	P_R4	13.051	4.403	1.082	2.964	.005
	AM_R42	-1.854	.812	516	-2.284	.027
	AM_R40	1.644	.530	.834	3.105	.003
	AM_R46	.017	.020	1.063	.816	.419
	AM_R49	009	.020	581	451	.654
	AM_R43	005	.004	092	-1.208	.233

2. Multiple Regression Analysis on Factor 2

			Coefficie	nts		
		Unstan	dardized	Standardized		
		Coeff	icients	Coefficients		
Mod	del	В	Std. Error	Beta	t	Sig.
1	(Constant)	-2.482	.071		-34.761	.000
	LC_R17	6.530	3.967	.457	1.646	.106
	LC_R18	1.809	2.280	.189	.793	.431
	LC_R19	-1.431	1.314	144	619	.539
	LC_R20	.273	.076	.120	3.583	.001
	LC_R21	304	3.149	025	097	.923
	LC_R22	1.315	2.060	.164	.638	.526
	LC_R16	3.943	.717	.236	5.498	.000
	LC_R23	1.003	1.584	.117	.725	.427

3. Multiple Regression Analysis on Factor 3

			Coefficie	nts		
			dardized icients	Standardized Coefficients		
Mod	lel	В	Std. Error	Beta	t	Sig.
1	(Constant)	-1.477	.408		-3.617	.001
	P_R2	4.028	3.002	.226	1.342	.185
	P_R1	2.473	2.221	.199	1.113	.271
	LC_R13	.209	1.889	.355	.111	.912
	LC_R14	.245	1.918	.418	.128	.899
	LC_R15	-3.166	1.029	524	-3.077	.003
	AM_R41	.125	.119	.170	1.051	.298
	AM_R38	079	.032	231	-2.455	.017

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4. Multiple Regression Analysis on Factor 4

			Coefficie	nts		
				Standardized Coefficients		
Model		В	Std. Error	Beta	t	Sig.
1	(Constant)	-1.775	32.918		.054	.957
	S_R31	14.214	33.802	1.298	.421	.676
	S_R32	-1.179	32.904	108	036	.972
	S_R33	546	.475	072	-1.151	.255
	S_R35	-18.516	13.574	-1.184	-1.367	.177
	S_R29	-8.442	3.435	-1.105	-2.458	.017

Excluded Variablesb

						Collinearity
Mo	del	Beta In	t	Sig.	Partial Correlation	Statistics Tolerance
1	S_R34	20.651	.092	.927	.013	.000

5. Multiple Regression Analysis on Factor 5

			Coefficie	nts			
		Unstandardized Coefficients		Standardized Coefficients			
Model		В	Std. Error	Beta	t	Sig.	
1	(Constant)	-1.057	.046		-22.745	.000	
	LC_R24	.038	.119	.032	.317	.753	
	LC_R25	3.318	.909	.692	3.652	.001	
	LC_R26	-1.012	.916	172	-1.105	.274	
	LC_R27	2.735	1.885	.427	1.451	.153	

6. Multiple Regression Analysis on Factor 6

			Coefficie			
		Unstandardized Coefficients		Standardized Coefficients		
Model		В	Std. Error	Beta	t	Sig.
1	(Constant)	2.401	.169		-14.239	.000
	MV_R44	.092	.016	.551	5.855	.000
	MV_R45	332	.143	682	-2.323	.024
	MV_R47	037	.274	068	135	.893
	MV_R48	.288	.256	.534	1.125	.265
	MV_R50	.239	.082	.714	2.916	.005

7. Multiple Regression Analysis on Factor 7

	Coefficients Unstandardized Standardized Coefficients Coefficients								
Model		В	Std. Error	Beta	t	Sig.			
1	(Constant)	-1.650	.310		-5.315	.000			
	AM_R36	.459	.206	.763	2.234	.029			
	AM_R37	091	.180	173	507	.614			

8. Multiple Regression Analysis on Factor 8

			Coefficie	entsa		
			dardized icients	Standardized Coefficients		
Model		В	Std. Error	Beta	t	Sig.
1	(Constant)	-1.593	.666		-2.392	.020
	AM_R39	.460	.099	.452	4.644	.000
	P_R11	366	.081	439	-4.509	.000

Appendix D Rotated Component matrix

1			Compone	ent	
	1	2	3	4	5
P_R7	.95755	02747	.06093	.02125	.04740
P_R5	.95347	03736	.17475	.05077	.07372
P_R3	.91233	.09533	.22200	.05979	05217
P_R4	.86885	26726	.23923	.13204	.22357
AM_R42	.85930	.28476	.09241	.01377	25204
AM_R40	.82583	.36333	.00824	05321	33825
AM_R36	.62130	.06719	37304	11055	.10082
LC_R15	13040	91866	.06622	.04564	.24048
AM_R38	.12914	.86259	18091	15929	04668
LC_R20	.04358	.85019	17789	06689	.43044
S_R29	40604	.56552	00710	.21686	33704
MV_R44	0764	20079	.90821	18504	07208
MV_R45	.53502	16683	.79084	.01176	.08150
MV_R50	.60747	01376	.74936	.02655	01022
AM_R39	.05332	00752	.00059	.89908	.01759
LC_R25	09899	31577	.01965	.69720	.12877
P_R11	20999	18827	.40445	63052	15315
LC_R16	05699	07628	03423	.22712	.90071

Appendix E Rotated Component matrix

	Component			
	1	2	3	
P_R7	.973	010	.072	
P_R5	.953	020	.199	
P_R3	.951	.087	.191	
P_R4	.883	274	.237	
AM_R42	.859	.342	.122	
AM_R40	.809	.441	.067	
AM_R38	.042	.933	077	
LC_R15	110	932	.057	
LC_R20	.004	.832	177	
MV_R44	080	171	.948	
MV_R45	.486	167	.839	
MV_R50	.556	008	.806	

Appendix F Cluster Membership

Case	3 Clusters
P_R5	1
P_R3	1
P_R4	1
P_R7	1
AM_R38	2
AM_R40	1
AM_R42	1
LC_R15	3
LC_R20	2
MV_R44	3
MV_R45	3
MV_R50	3

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