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Bank efficiency in Turkey during the recent global crisis

Abstract

This paper assesses the change in bank efficiency in Turkey during the recent financial crisis. Using a modified version of the standard data envelopment analysis (DEA) for a sample of 26 major Turkish banks, the authors find both substantial inefficiencies throughout the recent crisis, as well as a seeming deterioration in overall efficiency between 2007 and 2010.

Keywords: data envelopment analysis, banking efficiency.

JEL Classification: C61.

Introduction

In an increasingly competitive business environment, many business firms must operate efficiently to survive. This explains why in recent years many researchers have devoted considerable time and effort to delineate the conditions necessary for technical efficiency of productive units. Formally, technical efficiency is defined as the production of a desired level of output with the minimum amounts of inputs. Thus, a productive unit is technically efficient if it cannot increase any output or reduce any input without reducing other outputs or increasing other inputs. In economic jargon, a technically efficient firm is simply operating on its efficient frontier. Clearly, this is an absolute concept of efficiency, independent of how efficient other competitors are. For this reason, and in the absence of extensive laboratory-like experiments, it is difficult, if not impossible, to ascertain whether a typical firm is operating efficiently in an absolute sense. On matters of technical efficiency, thus, all we can determine is whether a productive unit is efficient relative to others, that is, whether a firm is efficient in a relative sense. More specifically, instead of considering technical efficiency as an absolute concept internal to a firm, it can be treated as a relative notion for a collection of firms. Thus, a typical business entity can be considered as technically efficient relative to its competitors, provided that it can produce more outputs with fewer inputs relative to the latter.

Based on the foregoing, the data envelopment analysis (DEA), developed by Charnes et al. (1978), offers an empirical approach to the efficient frontier for a collection of firms through an assessment of their individual performances. The DEA efficient frontier is thus not derived by empirically fitting some specific mathematical function to the data for individual firms, as this presupposes that all firms are efficient to begin with. Rather, the DEA efficient

frontier is derived as the locus of all outputs that are produced by the most efficient firms, or the so-called decision-making units (DMUs). In addition, and borrowing from the concept of efficiency in engineering, the DEA assigns a score of one to most efficient DMUs for any level of output, indicating a score of less than one for less efficient units.

The DEA has proved itself a particularly powerful tool for assessing operational efficiency in service organizations. For service organizations, such as commercial banks, it is often a challenging task to improve their operational efficiency without sacrificing service quality. Unlike manufacturing concerns, these organizations face a number of subjective factors that can seriously impact their service quality and customer satisfaction. Among the most important of these factors are customer needs and attitudes towards the services provided, the judgments and skills by which the services are offered, and the changing mix of the services themselves. The best service providers are characterized by both the high quality of their services as well as the efficient application of their resources. In an increasingly competitive business environment, it is thus of vital interest for many service providers to avail themselves of the existing analytical tools to assess their operational efficiency.

Since its inception, the DEA has been the subject of extensive theoretical refinements and empirical applications (see Cook and Seiford (2009) for an excellent review of the relevant literature over the past thirty years, covering over 130 citations). In the context of emerging economies, which is of special concern to the present study, although there are some applications of the DEA in the manufacturing sector (e.g., Duzkin and Duzkin (2007) for 500 Turkish industrial enterprises, and Saranga (2009) for 50 Indian auto manufacturers), most applications of DEA are centered in the services sector. And within the services sector, the financial industry has received the most attention. For example, Halkos and Salamouris (2004) using the DEA examine bank efficiency in Greece. Likewise, Sufian (2007) uses the DEA to study the trends in the efficiency of Singapore's commercial banking groups. In a simi-

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lar vein, Kao and Liu (2009) apply the so-called stochastic DEA to measure bank efficiency in Taiwan. All these studies highlight the efficacy of the DEA to pinpoint operational inefficiencies and the ways to deal with them. In particular, their results indicate the significant cost savings achievable through the adoption of the DEA.

1. Model

The standard DEA model is based on a linear programming formulation by Ragsdale (2007). Specifically, the efficiency an arbitrary bank i ($i = 1, \dots, k$) is defined as follows:

$$H_i = \frac{\text{Weighted sum of bank } i\text{'s outputs}}{\text{Weighted sum of bank } i\text{'s inputs}} = \frac{\sum_{j=1}^n O_{ij} W_j}{\sum_{j=1}^m I_{ij} V_j} \tag{1}$$

Here O_{ij} represents the output j for bank i , I_{ij} represents the input j for bank i , W_j is a nonnegative weight assigned to output j , V_j is a nonnegative weight assigned to input j , n is the number of outputs, and m is the number of inputs. The problem in DEA is to determine values for weights W_j and V_j that will maximize the efficiency of bank i subject to the constraint that, at these same weights, the efficiencies of all banks, including bank i , will be greater than 100%. Thus, we have:

$$\text{Maximize: } H_i \tag{2}$$

Subject to

$$H_j \leq 1 \text{ for } j = 1, 2, \dots, k. \tag{3}$$

A separate optimization problem is solved for each bank to obtain the best possible weights to maximize the efficiency of that bank, subject to the similar constraints.

In addition, to be able to apply the linear programming techniques to the above optimization problem, as well as to prevent unbounded solutions, DEA requires the sum of the weighted inputs for each bank to equal one:

$$\sum_{j=1}^m I_{ij} V_j = 1. \tag{4}$$

More importantly, the use of linear averages involves the unrealistic assumption, not explicitly stated, that all outputs and inputs are perfect substitutes. In the context of inputs for banks, for example, the assumption asserts that bank employees and branches are perfectly substitutable, so that instead of adding to the number of its branches, a bank may

as well add new employees to its existing branches. In reality, of course, while there is some degree of substitutability among outputs and inputs, this substitutability is far from perfect.

To overcome the above difficulties, Shirvani, Taj and Mirshab (2011) modified the standard DEA by using nonlinear (geometric) weighted averages of outputs and inputs in measuring the efficiency ratios. Thus measured, the log of each efficiency ratio can be expressed as a linear function of the logs of all outputs and inputs for each DMU. This means that the linear programming techniques can now be directly used to solve our optimization problems. The use of this new approach has the added advantage that it makes no restrictive assumptions about the perfectly substitutability of outputs and inputs. However, to prevent unbounded solutions, we need to add the linear constraint that the sum of all (non-negative) weights, both for outputs and inputs, is one for each DMU. In light of the above, we can present the reformulation of our standard optimization problem as follows:

$$H_i = \frac{\prod_j O_{ji}^{W_j}}{\prod_j I_{ji}^{V_j}} \text{ for } i = 1, 2, \dots, k. \tag{5}$$

$$\text{Maximize: } \log H_i = \sum_j W_j \log O_{ji} - \sum_j V_j \log I_{ji}. \tag{6}$$

Subject to:

$$\log H_j \leq 0 \text{ for } j = 1, 2, \dots, k, \tag{7}$$

$$\sum_{j=1}^n W_j + \sum_{j=1}^m V_j = 1. \tag{8}$$

Having outlined the basic structures of the standard and modified DEA models, we can now proceed to apply these alternative approaches to assess bank efficiency in Turkey. This is done in the next section.

2. Empirical results

Our study of the changing character of bank efficiency in Turkey relies on an application of the DEA to 26 major Turkish banks for 2007 and 2010. Tables 1 and 2 list the input and output data for 2007 and 2010. To this end, we solve 26 optimization problems for our 26 banks for each year in the sample. The model assumes that more output and less input are always to be preferred from an efficiency point of view. Any output or input variable that does not conform to these rules should be transformed before applying the DEA (Ragsdale, 2007). Once the optimization problems for individual banks are solved, the best-practice banks are deemed as relatively efficient and are assigned a DEA efficiency score of 100%. The relatively inefficient (less-productive) units are then assigned efficiency ratings of less than 100%. Clearly, the lower

the efficiency rating for a unit, the less efficient that unit is. In addition, an inspection of the changing pattern of efficiency ratings over the sample period can shed considerable light on how bank efficiency in Turkey has evolved over time. In particular, we are interested to find out if the less efficient banks have been forced by competition to become more efficient with the passage of time, or whether the more efficient banks have gradually succumbed to lethargy to experience a loss of their competitive positions.

The inputs for each bank are the number of employees, the interest cost of deposits, the number of branches, and the total deposits. The outputs are the total loans and the interest income on loans. All the relevant data are presented in the Appendix. The information is from the selected non-consolidated financial tables from the Bank Association of Turkey (2009). We should add that the main purpose of this paper is to illustrate the use of the DEA methodology by referring to the Turkish banking system as a case study. No attempt is, thus, made here to offer a more comprehensive account of the Turkish banking policy and practice. Such information, however, can be found in Mercan et al. (2003), among others.

Our empirical findings concerning the bank efficiency in Turkey for the years 2007 and 2010 are

presented in Tables 3 and 4. In addition, to facilitate comparison, Table 5 offers the bank efficiencies for both 2007 and 2010. An examination of the information in Table 5 will thus make it possible to determine how the level of productive efficiency at the level of individual Turkish banks has evolved during the recent global financial crisis. A number of striking features from Table 5 immediately stand out. To begin with, as the table demonstrates, for each of the years under review, only four out of a total of 26 sample banks display full (100%) efficiency. Outside the efficient banks, the efficiency is quite low, averaging only 60.3 percent for 2007 and 54.1 percent for 2010. Thus, not only banks in Turkey have still a long way to go in terms of improving their efficiencies, it seems clear that the recent global crisis, if anything, has had a negative impact on these efficiencies. Furthermore, for comparative reasons, we also assessed bank efficiency in Turkey using the standard non-logarithmic approach, and obtained results which, if anything, tend to indicate even a more dramatic deterioration in bank efficiency in Turkey during the recent crisis. Specifically, the standard results indicate a decrease in average efficiency from 65.2 percent in 2007 to only 53.9 percent in 2010.

Table 1. The 2007 data for 26 Turkish banks

Banks	Outputs		Inputs		Total deposits
	Total loans	Total assets-total loan	# of employees	# of branches	
Ziraat	18635	51185	20872	1251	58872
Halk	15631	19075	11484	590	26603
Vakıflar	20245	16336	8700	362	24897
Akbank	31929	26904	13513	716	35404
Alternatifbank	1608	632	868	40	1470
Anadolubank	1522	1091	1724	76	1601
Sekerbank	3118	2134	3824	235	3584
Tekstil	1797	707	1547	59	1306
Turkish bank	111	534	272	22	315
Turk ekonomi	5921	4258	5141	273	6110
Garanti	32104	26188	14517	588	33726
Is	29311	39852	19414	939	41864
Yapi kredi	24591	18843	14249	676	27747
Arap turk	111	197	175	3	74
Citibank	1684	1934	2349	54	2805
Deutsche	148	494	82	1	194
Eurobank	761	1610	549	36	994
Finansbank	12227	5786	9061	411	11177
Fortis	4768	3764	5041	268	4871
Hsbc	8061	3525	5733	237	6610
Ing bank	7506	3587	6357	366	6556
Millennium	635	365	300	16	824
Turkland	361	188	390	16	286
Bank mellat	91	97	49	3	37
Societe generale	62	435	107	1	2
West LB A.G.	35	721	43	1	487

Table 2. The 2010 data for 26 Turkish banks

Banks	Outputs			Inputs	
	Total loans	Total assets-total loan	# of employees	# of branches	Total deposits
Ziraat	32429	62815	22708	1399	78593
Halk	28140	20066	13450	709	35787
Vakiflar	28694	21265	11077	636	32908
Akbank	33699	38761	15330	913	44008
Alternatifbank	2100	721	1086	53	1649
Anadolubank	1938	1188	1834	86	1820
Sekerbank	4462	2921	3485	260	4787
Tekstil	1072	426	903	44	978
Turkish bank	254	377	273	21	389
Turk ekonomi	7478	4142	5646	335	6750
Garanti	41710	36925	16675	859	48621
Is	40501	45981	23944	1142	55735
Yapi kredi	32266	19139	14411	868	32447
Arap turk	331	363	255	6	167
Citibank	1510	2759	2116	37	2811
Deutsche	99	1246	101	1	800
Eurobank	1073	1765	875	54	1369
Finansbank	15256	8198	11734	503	15284
Fortis	5651	2109	4572	269	3914
Hsbc	6411	4186	6570	333	6496
Ing bank	8204	3266	5865	323	6514
Millennium	452	189	292	18	523
Turkland	601	314	510	27	659
Bank mellat	413	352	51	3	262
Societe generale	225	135	259	16	69
West LB A.G.	35	482	42	1	121

Table 3. Log (outputs) and Log (inputs) and the DEA efficiency for 26 Turkish commercial banks in 2007

Banks	Outputs			Inputs		Efficiency
	Total loans	Total assets-total loan	# of employees	# of branches	Total deposits	
Ziraat	9.8328	10.8432	9.9462	7.1317	10.9831	44.9%
Halk	9.6570	9.8561	9.3487	6.3801	10.1888	55.3%
Vakiflar	9.9157	9.7011	9.0711	5.8916	10.1225	72.0%
Akbank	10.3713	10.2000	9.5114	6.5737	10.4746	69.9%
Alternatifbank	7.3827	6.4489	6.7662	3.6889	7.2930	77.9%
Anadolubank	7.3278	6.9948	7.4524	4.3307	7.3784	53.1%
Sekerbank	8.0449	7.6658	8.2491	5.4596	8.1842	47.8%
Tekstil	7.4939	6.5610	7.3441	4.0775	7.1747	60.5%
Turkish bank	4.7095	6.2804	5.6058	3.0910	5.7526	50.7%
Turk ekonomi	8.6863	8.3566	8.5450	5.6095	8.7177	54.7%
Garanti	10.3767	10.1731	9.5831	6.3767	10.4260	67.6%
Is	10.2857	10.5929	9.8737	6.8448	10.6422	55.9%
Yapi kredi	10.1101	9.8439	9.5644	6.5162	10.2309	60.4%
Arap turk	4.7095	5.2832	5.1648	1.0986	4.3041	64.5%
Citibank	7.4289	7.5673	7.7617	3.9890	7.9392	47.5%
Deutsche	4.9972	6.2025	4.4067	0.0000	5.2679	100.0%
Eurobank	6.6346	7.3840	6.3081	3.5835	6.9017	73.3%
Finansbank	9.4114	8.6632	9.1117	6.0186	9.3216	56.0%
Fortis	8.4697	8.2332	8.5254	5.5910	8.4911	50.2%
Hsbc	8.9948	8.1676	8.6540	5.4681	8.7963	59.2%
Ing bank	8.9235	8.1851	8.7573	5.9026	8.7881	54.2%
Millennium	6.4536	5.8999	5.7038	2.7726	6.7142	90.1%
Turkland	5.8889	5.2364	5.9661	2.7726	5.6560	61.2%
Bank mellat	4.5109	4.5747	3.8918	1.0986	3.6109	100.0%

Table 3 (cont.). Log (outputs) and Log (inputs) and the DEA efficiency for 26 Turkish commercial banks in 2007

Banks	Outputs			Inputs		Efficiency
	Total loans	Total assets-total loan	# of employees	# of branches	Total deposits	
Societe generale	4.1271	6.0753	4.6728	0.0000	0.6931	100.0%
West LB A.G.	3.5553	6.5806	3.7612	0.0000	6.1883	100.0%

Table 4. Log (outputs) and Log (inputs) and the DEA efficiency for 26 Turkish commercial banks in 2010

Banks	Outputs			Inputs		Efficiency
	Total loans	Total assets-total loan	# of employees	# of branches	Total deposits	
Ziraat	10.3868	11.0479	10.0305	7.2435	11.2720	44.0%
Halk	10.2449	9.9068	9.5067	6.5639	10.4853	45.9%
Vakiflar	10.2644	9.9648	9.3126	6.4552	10.4015	49.5%
Akbank	10.4252	10.5652	9.6376	6.8167	10.6921	51.6%
Alternatifbank	7.6497	6.5806	6.9903	3.9703	7.4079	64.0%
Anadolubank	7.5694	7.0800	7.5143	4.4543	7.5066	55.5%
Sekerbank	8.4034	7.9797	8.1562	5.5607	8.4737	51.4%
Tekstil	6.9773	6.0544	6.8057	3.7842	6.8855	59.6%
Turkish bank	5.5373	5.9322	5.6095	3.0445	5.9636	65.4%
Turk ekonomi	8.9197	8.3289	8.6387	5.8141	8.8173	51.5%
Garanti	10.6385	10.5166	9.7217	6.7558	10.7918	50.3%
Is	10.6091	10.7360	10.0835	7.0405	10.9284	48.3%
Yapi kredi	10.3818	9.8595	9.5757	6.7662	10.3874	47.9%
Arap turk	5.8021	5.8944	5.5413	1.7918	5.1180	100.0%
Citibank	7.3199	7.9226	7.6573	3.6109	7.9413	55.8%
Deutsche	4.5951	7.1277	4.6151	0.0000	6.6846	100.0%
Eurobank	6.9782	7.4759	6.7742	3.9890	7.2218	68.2%
Finansbank	9.6327	9.0116	9.3702	6.2206	9.6346	46.5%
Fortis	8.6396	7.6540	8.4277	5.5947	8.2723	57.7%
Hsbc	8.7658	8.3395	8.7903	5.8081	8.7789	50.0%
Ing bank	9.0124	8.0913	8.6768	5.7777	8.7817	54.0%
Millennium	6.1137	5.2417	5.6768	2.8904	6.2596	60.7%
Turkland	6.3986	5.7494	6.2344	3.2958	6.4907	58.3%
Bank mellat	6.0234	5.8636	3.9318	1.0986	5.5683	100.0%
Societe generale	5.4161	4.9053	5.5568	2.7726	4.2341	100.0%
West LB A.G.	3.5553	6.1779	3.7377	0.0000	4.7958	100.0%

Table 5. Efficiencies comparison (pre- and post-recession periods)

Banks	2007 efficiency	2010 efficiency
Ziraat	44.9%	44.0%
Halk	55.3%	45.9%
Vakiflar	72.0%	49.5%
Akbank	69.9%	51.6%
Alternatifbank	77.9%	64.0%
Anadolubank	53.1%	55.5%
Sekerbank	47.8%	51.4%
Tekstil	60.5%	59.6%
Turkish bank	50.7%	65.4%
Turk ekonomi	54.7%	51.5%
Garanti	67.6%	50.3%
Is	55.9%	48.3%
Yapi kredi	60.4%	47.9%
Arap turk	64.5%	100.0%
Citibank	47.5%	55.8%
Deutsche	100.0%	100.0%
Eurobank	73.3%	68.2%
Finansbank	56.0%	46.5%

Table 5 (cont.). Efficiencies comparison (pre- and post-recession periods)

Banks	2007 efficiency	2010 efficiency
Fortis	50.2%	57.7%
Hsbc	59.2%	50.0%
Ing bank	54.2%	54.0%
Millennium	90.1%	60.7%
Turkland	61.2%	58.3%
Bank mellat	100.0%	100.0%
Societe generale	100.0%	100.0%
West LB A.G.	100.0%	100.0%

Conclusion

This paper has assessed the change in bank efficiency in Turkey during the recent financial crisis. Using a modified logarithmic version of the standard data envelopment analysis (DEA) for a sample of 26 major Turkish banks for 2007 and 2010, we find, first, the prevalence of substantial inefficiencies

among the Turkish banks, and, second, a deterioration in overall bank efficiency between 2007 and 2010 as a result of the recent financial crisis. In addition, using the standard DEA approach, we obtained essentially similar results with even show a more dramatic decline in recent bank efficiency in Turkey.

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