

Hisse Senedi Piyasalarının Zayıf Form Piyasa Etkinliğinin Küresel Ölçekte Karşılaştırılması: G-20 Üyeleri Üzerine Ampirik Bir Çalışma

Oktay Özkan^{a, b}

Özet

Bu çalışma, G-20 üyelerini hisse senedi endekslerinin 07.06.2009 ve 09.02.2020 tarihleri arasındaki haftalık verilerini kullanarak G-20 üyelerinin hisse senedi piyasalarının getiri öngörülebilirliğini, diğer bir ifadeyle zayıf formdaki piyasa etkinliğini karşılaştırma açısından analiz etmektedir. Kim (2009) tarafından geliştirilen doğal bootstrap otomatik varyans oranı testi analizleri neticesinde, Brezilya, Güney Afrika ve Almanya hisse senedi piyasalarının çalışma kapsamındaki tarih aralığında zayıf formda etkin olduğu, dolayısıyla getirilerin öngörülemez olduğu, diğer piyasaların ise zayıf form etkinliğinin (getiri öngörülebilirliğin) periyodik olarak değiştiği bulunmuştur. Brezilya, Güney Afrika ve Almanya'ya ek olarak, Rusya, Fransa, İtalya, ABD, İngiltere ve Kanada hisse senedi piyasalarında tarihsel fiyat hareketleri veya getirileri ile getirilerin tahmin edilebilme şansı oldukça düşüktür. Ayrıca Japonya, Avustralya, Çin, Suudi Arabistan ve özellikle Meksika hisse senedi piyasalarının getiri öngörülebilirlik dönemlerinin diğer piyasalardan daha yüksek olduğu ve bu piyasalarda tarihsel fiyat bilgilerini kullanarak getiri tahmininde başarı şansının oldukça yüksek olduğu tespit edilmiştir.

Anahtar Kelimeler

Doğal Bootstrap Otomatik Varyans Rasyo Testi Hisse Senedi Piyasaları Etkin Piyasalar Hipotezi Getiri Öngörülebilirliği

Makale Hakkında

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Weak-Form Market Efficiency Comparison of Stock Markets on Global Scale: An Empirical Study on G-20 Members

Abstract

This paper analyzes stock markets of G-20 members in terms of comparing return predictability, in other words, weak-form market efficiency using stock indexes weekly data of the G-20 members between 07.06.2009 and 09.02.2020. As a result of the wild bootstrap automatic variance ratio test analysis developed by Kim (2009), it is found that the stock markets of Brazil, South Africa, and Germany were weak-form efficient in the date range within the scope of the study, so the returns are unpredictable, while the weak-form efficiency (return predictability) of other markets are time-varying. In addition to Brazil, South Africa, and Germany, there is a very low chance to estimate returns with historical price movements or returns in Russia, France, Italy, United States, United Kingdom, and Canada stock markets. It is also found that the return predictability periods of Japan, Australia, China, Saudi Arabia, and especially Mexico's stock markets are higher than other markets and the chance of success in estimating returns by using historical price information in these markets is quite high.

Wild Bootstrap Automatic Variance Ratio Test Stock Markets Efficient Markets Hypothesis Return Predictability

About Article

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Keywords

^a İletişim Yazarı: oktay.ozkan@gop.edu.tr

^b Arş. Gör. Dr., Tokat Gaziosmanpaşa Üniversitesi, İktisadi ve İdari Bilimler Fakültesi, İşletme Bölümü, ORCID: 0000-0001-9419-8115

Introduction

Modern Portfolio Theory states that the investor, who diversifies his portfolio very well, will get a return approximately as much as the return provided by the market portfolio. One of the most frequently asked questions, especially as the stock markets began to develop worldwide, was whether the future price movements of the securities could be determined and the abnormal return would be obtained. As a result of the academic studies carried out to answer this question, the Efficient Markets Hypothesis developed especially by Samuelson (1965) and Fama (1965, 1970) has emerged, which reveals that asset prices fully and instantaneously reflect all available and relevant information (Arı and Yüksel, 2017: 78; Karan, 2013: 277).

Fama (1970) states that if the prices of securities in a market constantly reflect all available information, that market is an efficient market. In an efficient market, new information is spreading very quickly and is reflected in asset prices without delay (Malkiel, 2003: 59). The Efficient Markets Hypothesis, based on the rationality assumption, states that rational investors quickly and accurately reflect all available and new information in the market to asset prices. According to the hypothesis, since asset prices in the markets reflect all available information, it is not possible to make any profit over the market average using any information. In addition, the Efficient Markets Hypothesis emphasizes that asset prices are changing with new information coming to the markets, in other words, they occur randomly, so it is not possible to estimate future price movements by looking at past price movements of assets (Karadağlı and Omay, 2012: 235; Korkmaz et al., 2010: 1139).

According to the Efficient Markets Hypothesis, market efficiency is divided into three different forms, namely weak, semi-strong and strong, according to the information reflected by asset prices (Degutis and Novickytė, 2014: 8; Fama, 1970: 383). In the weak-form market efficiency, current securities prices reflect all historical price information (Verheyden et al., 2015: 295). Therefore, in a weak-form efficient market, future prices (returns) of assets cannot be estimated using historical price information. In semi-strong market efficiency, securities prices reflect all information (Bayraktar, 2012: 42). In strong market efficiency, securities prices reflect all information including non-public information within the company (Rossi, 2015: 286). Market efficiency forms are not independent of each other. A market efficient in a semi-strong form is also efficient in a weak-form too. Likewise, a market efficient market in a weak-form is neither efficient in a semi-strong form. Therefore, an inefficient market in a weak-form is neither efficient in a semi-strong form nor is it efficient in a strong form (Karan, 2013: 279).

This study focuses on return predictability, in other words, weak-form market efficiency. The main purpose of this study is to compare stock markets in terms of return predictability (weak-form market efficiency) on a global scale. This study also reveals in which markets the individual and institutional investors and portfolio managers can increase their chances of success by using historical price movements, in which markets they may have a high chance of failure. Within this framework of purpose, analysis will be carried out with the weekly data of the indexes representing the stock markets of 19 countries and the European Union members of the G-20 between 07.06.2009 and 09.02.2020 using wild bootstrap automatic variance ratio test developed by Kim (2009) to test return predictability (weak-form market efficiency), provides highly successful results in data sets that are not normally distributed and showing conditional heteroscedasticity and also provides test statistics used to

determine the return predictability or the degree of market efficiency (inefficiency) and the findings will be interpreted.

According to the best knowledge of the author, this study is one of the first studies conducted on the G-20 members within the scope of the comparison of the return predictability, in other words, the weak-form market efficiency. With this aspect of the study, it is thought that it will make important contributions to the literature. The following sections of the study include literature review, methodology, data and empirical findings, and finally information about the result, respectively.

Literature Review

In this part of the study, there is a literature review regarding the studies carried out within the scope of the stock market of all G-20 members or some members. The literature review related to the studies carried out within the scope of the stock markets of all G-20 members is given in Table 1.

Author/Authors	Year	Purpose	Methodology	Findings	
Veito et al.	2013	Analyze weak-form	Serial correlation,	The markets of most G-	
		market efficiency of G-	RWH, ADF, ranks	20 countries is weak-	
		20 countries before and during the 2007 crisis	and signs based multiple variance ratio, and variance ratio test	form efficient	
Gümüş and	2014	Analyze the weak-form	Unit root tests	Turkey, China,	
Zeren		stock markets efficiency of G-20 countries except for the European Union, South Africa, and Saudi Arabia		Indonesia, Mexico, Canada, Mexico, Russia, South Korea, and Brazil stock markets are not weak- form efficient	
Özcan and Gültekin	2016	Examine the weak-form market efficiency of G- 20 countries except for the European Union and Saudi Arabia	Panel Stability test	Stock exchange markets of G-20 countries except for Argentina, Canada, China, and Russia are weak-form efficient	
Kayral and Alagoz	2019	Investigate the weak- form stock exchanges efficiency of G-20 countries	Variance analysis and unit root tests	Stock exchanges of G- 20 countries except for US, India, Saudi Arabia, and China are weak-form efficient	

Table 1. Literature Review Related to the Studies Carried out under All G-20 Members

No other study of return predictability or weak-form market efficiency for all G-20 members has been found in the literature. The literature review related to the studies carried out within the scope of the stock markets of some members of G-20 is given in Table 2.

Author/Authors	Year	Purnose	Methodology	Findings	
Choudhry	1994	Analyze the weak-form	ADF, KPSS, and	All stock indexes within	
Choudiny	1//1	efficiency of Canada.	Johansen	the scope of the study are	
		France, Germany, Japan	cointegration	weak-form efficient	
		and Italy stock indexes	tests		
Vaidvanathan	1994	Examine the weak-form	Runs tests and	Weak-form efficient	
and Gali		market efficiency of India	serial correlation		
			analysis		
Urrutia	1995	Analyze the weak-form	Variance ratio	Weak-form efficient	
		stock markets efficiency of	analysis		
		Argentina, Brazil, Chile,	5		
		and Mexico			
Chan et al.	1998	Investigate the weak-form	Unit root tests	All international stock	
		stock markets efficiency of		markets within the scope	
		18 countries		of the study are weak-	
				form efficient	
Dahel and	1999	Analyze the weak-form	Unit root tests	Only stock market of	
Laabas		stock markets efficiency of		Kuwait is weak-form	
		the Bahrain, Kuwait,		efficient	
		Saudi Arabia, and Oman			
Yinggang	2001	Analyze the weak-form	Generalized	Not weak-form efficient	
		stock market efficiency of	spectral analysis		
		the China			
Abrosimova et	2002	Examine the weak-form	Unit root tests	Weak-form efficient	
al.		stock exchange efficiency			
		of Russia			
Worthington	2003	Analyze the weak-form	Serial correlation	All stock markets within	
and Higgs		stock markets efficiency of	runs, unit root,	the scope of the study are	
		Argentina, Brazil, Chile,	and multiple	not weak-form efficient	
		Colombia, Mexico, Peru,	variance ratio		
		and Venezuela	tests.		
Gupta and Basu	2007	Investigate the weak-form	Unit root tests	Not weak-form efficient	
		efficiency of two major			
		equity markets in India			
Narayan and	2007	Examine the weak-form	Two-break LM	All stock markets within	
Smyth		stock markets efficiency of	unit root test	the scope of the study are	
		the G-7 countries		weak-form efficient	
Narayan	2008	Examine the weak-form	Panel LM unit	All stock markets within	
		stock markets efficiency of	root test	the scope of the study are	
		the G-7 countries		not weak-form efficient	
Qian et al.	2008	Analyze the weak-form	Threshold unit	Weak-form efficient	
		stock market efficiency of	root test		
		the China			
Ergül	2009	Examine weak-form stock	Unit root tests	Weak-torm efficient	
		market efficiency of			
	0010	Turkey	D 1 14 -		
Suresh et al.	2013	Analyze the weak-form	Panel unit root	Not weak-form efficient	
		stock markets efficiency of	tests		
		the BRICS members			

Table 2. Literature Review Related to the Studies Carried out under Some G-20 Members

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Said and Harper	2015	Examine the weak-form stock market efficiency of Russia	Box-Ljung and the variance ratio tests	Not weak-form efficient
Malcıoglu and Aydin	2016	Investigate weak-form stock market efficiency of Turkey	Harvey linearity test	Not weak-form efficient
Hamid et al.	2017	Examine the weak-form efficiency of 14 countries stock markets	Autocorrelation, Ljung box, runs, unit root, and the variance ratio tests	All stock markets within the scope of the study are not weak-form efficient
Kiran et al.	2019	Analyze the weak-form stock markets efficiency of the BRICS members	Serial correlation, Ljung box, and runs tests	Weak-form efficient

Methodology

In this study, wild bootstrap automatic variance ratio test developed by Kim (2009) was applied for predictability of returns (or weak-form market efficiency). Lo and MacKinlay's (1988) variance ratio test is a method frequently used in the finance literature to evaluate the return predictability of assets. However, the method reveals unsuccessful results in small samples due to insufficient properties, particularly under conditional heteroscedasticity typical features of financial data. In addition, since it requires ad hoc choices for lag length or holding period, this also weakens its small sample properties. Kim (2006) developed the wild bootstrap variance ratio test and tried to improve its small sample properties, especially under conditional heteroscedasticity. To overcome the problem of choosing lag length or holding period with an ad hoc way, Kim (2009) developed the wild bootstrap automatic variance ratio (WBAVR) test, where the optimal holding period is automatically chosen with the fully data-dependent procedure. Charles et al. (2011) in their study with Monte Carlo test, stated that the WBAVR test showed quite sufficient small sample (size and power) properties and was more successful than other variance ratio tests for return predictability (or weak-form market efficiency). This part of the study presents brief details about the WBAVR test.

The statistical form of the original variance ratio test is shown in equation 1.

$$\widehat{VR}(k) = 1 + 2\sum_{i=1}^{k-1} \left(1 - \frac{i}{k}\right) \hat{p}(i)$$
(1)

The k in the Eq. (1) refers to the holding period. Under the null hypothesis of MDS (no return predictability), a standardized version of Eq. (1) asymptotically follows the standard normal distribution (Lo and MacKinlay, 1988). Choi (1999) proposed the automatic variance ratio (AVR) test where holding period is chosen optimally using a fully data-dependent method of Andrews (1991) as the original variance ratio test requires an ad hoc choice of holding period. Kim (2009) developed the WBAVR test with the wild bootstrap of Mammen (1993) to overcome the deficiency of Choi's (1999) AVR test in data showing conditional heteroscedasticity. The WBAVR test is performed in the following three steps:

- 1. Form a bootstrap sample of size *T* as $Y_t^* = \eta_t Y_t (t = 1, ..., T)$,
- 2. Calculate $AVR^*(k^*)$,

3. Repeat 1 and 2 choosen bootstrap replications (B) times, to produce the bootstrap distribution of the AVR statistic $\{AVR^*(k^*;j)\}_{j=1}^B$.

If the p value obtained as a result of the WBAVT test is lower than the value determined as the level of significance (in this study 0.10), the null hypothesis of MDS (no return predictability) is rejected at the value determined as the level of significance. In this study, the number of bootstrap replications B is set at 500 as in Charles et al. (2015).

Data and Empirical Results

In this study, weekly data of the indexes representing the stock market of 19 countries (Argentina (ARG), Australia (AUS), Brazil (BRA), Canada (CAN), China (CHN), Germany (DEU), France (FRA), India (IND), Indonesia (IDN), Italy (ITA), Japan (JPN), Mexico (MEX), Russia (RUS), Saudi Arabia (SAU), South Africa (ZAF), South Korea (KR), Turkey (TUR), the United Kingdom (UK) and the United States (USA)) and the European Union (EU) members of the G-20 between 07.06.2009 and 09.02.2020 were used. The data of the indexes were obtained from Investing (Date of Access: 10.02.2020). Weekly returns are calculated by taking the natural logarithmic first differences of the data obtained as weekly closing prices. Also, logarithmic returns are multiplied by 100 to avoid the convergence problem. Table 3 shows the descriptive statistics regarding the logarithmic weekly returns of the stock indexes within the scope of the study.

Data	Mean	S.D.	Skewness	Kurtosis	JB	ARCH
DEU	0.176	2.598	-0.487	5.022	116.936***	59.975***
USA	0.226	1.963	-0.488	4.836	100.385***	67.725***
ARG	0.576	4.796	-1.098	10.285	1343.737***	17.949*
AUS	0.098	1.901	-0.471	4.475	71.145***	41.585***
BRA	0.133	2.899	0.087	4.712	68.726***	12.113
CHN	0.009	2.931	-0.586	5.638	193.356***	110.576***
IDN	0.188	2.166	-0.622	6.316	291.078***	37.046***
FRA	0.106	2.559	-0.4512	4.620	79.825***	57.773***
ZAF	0.162	2.093	-0.071	3.365	3.554	22.281**
KR	0.078	2.027	-0.694	5.197	156.748***	58.236***
IND	0.173	2.209	-0.144	4.098	29.893***	43.456***
JPN	0.152	2.676	-0.423	4.450	65.476***	15.963
CAN	0.092	1.711	-0.531	4.533	80.756***	75.210***
MEX	0.099	2.068	-0.016	4.072	26.704***	42.347***
RUS	0.052	3.906	-0.368	5.088	113.743***	54.328***
SAU	0.053	2.435	-0.676	9.354	979.363***	77.286***
TUR	0.220	3.161	-0.550	4.266	65.340***	12.169
ITA	0.033	3.071	-0.494	4.179	54.922***	49.040***
UK	0.093	1.988	-0.424	5.250	134.171***	27.325***
EU	0.074	2.608	-0.413	4.579	73.713***	55.037***

Table	3. D	escri	ptive	Statistics	
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Note: The null hypothesis of the JB test is based on the assumption that the relevant data is normally distributed. ***, **, * indicate 1%, 5% and 10% significance level, respectively. S.D., JB, and ARCH represent standard deviation, Jarque-Bera, and Autoregressive Conditional Heteroscedasticity, respectively.

Looking at Table 3, it is seen that Argentina's stock market index has the highest average return and volatility. Skewness values indicate that index returns except for Brazil's index return skewed to the right are skewed to the left. Kurtosis values show that the distributions of index returns except for South Africa's index return are leptokurtic (pointed and fattailed). The JB test for normality results also indicates that the null hypothesis will be rejected at 1% significance level, in other words, the return series except for South Africa are not normally distributed. Finally, the ARCH-LM test results developed by Engle (1982), which shows the conditional heteroscedasticity states of the data sets, shows that all data sets except for Brazil, Japan, and Turkey's data sets have conditional heteroscedasticity at 1% significance level. The vast majority of the data used in the study are not normally distributed and show conditional heteroscedasticity features. As mentioned earlier, the WBAVR test by which the analyzes will be conducted performs well against these features. Since the WBAVR test requires the data to be analyzed to be stationary, the stationarity states of the return series were examined with the Phillips-Perron (PP) unit root test developed by Phillips and Perron (1988). PP unit root test results are given in Table 4.

Dete	Inte	rcept	Trend and Intercept		
Data	t-Statistic	Probability	t-Statistic	Probability	
DEU	-25.088	0.000***	-25.084	0.000***	
USA	-26.912	0.000***	-26.904	0.000***	
ARG	-23.470	0.000***	-23.448	0.000***	
AUS	-26.662	0.000***	-26.636	0.000***	
BRA	-24.310	0.000***	-24.336	0.000***	
CHN	-22.142	0.000***	-22.123	0.000***	
IDN	-27.129	0.000***	-27.374	0.000***	
FRA	-25.499	0.000***	-25.475	0.000***	
ZAF	-25.941	0.000***	-26.930	0.000***	
KR	-25.038	0.000***	-25.133	0.000***	
IND	-24.811	0.000***	-24.785	0.000***	
JPN	-23.360	0.000***	-23.338	0.000***	
CAN	-25.870	0.000***	-25.849	0.000***	
MEX	-26.364	0.000***	-26.616	0.000***	
RUS	-24.022	0.000***	-23.999	0.000***	
SAU	-22.545	0.000***	-22.530	0.000***	
TUR	-25.296	0.000***	-25.297	0.000***	
ITA	-24.017	0.000***	-24.007	0.000***	
UK	-25.549	0.000***	-25.668	0.000***	
EU	-25.548	0.000***	-25.524	0.000***	

Table 4	PP '	Unit Root	Test Results
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Note: The null hypothesis indicates that the data has a unit root, in other words, the data is not stationary and ***, **, * indicates 1%, 5%, and 10% significance level, respectively.

When the stationary outputs in Table 4 are analyzed, it is understood that the null hypothesis is rejected at 1% significance level for all return series, in other words, all data sets are stationary. These results indicate that analysis can be carried out with the returns of the indexes used in the study. In order to compare the stock markets of G-20 members in terms of return predictability (weak-form market efficiency), this study used 2-year sub-samples consisting of approximately 104 weeks of observation. It was stated in the study

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conducted by Charles et al. (2011) that the data size determined within the scope of this study is ideal. Also, the 2-year sub-sample size is suitable for capturing the effects of changing market conditions (Charles et al., 2015: 15). The first sub-sample covers weekly returns between 14.06.2009 and 05.06.2011. After the analysis was applied to the first sub-sample window, the new sub-sample window was created by rolling the window 1 week forward. With this method, a total of 454 sub-sample windows were created and p values were calculated as a result of the analysis performed for each sub-sample window. The graphs of the p values obtained for each return series as a result of the analysis are given in Figure 1.





Figure 1. WBAVR Test Outputs

Note: The null hypothesis states that returns are unpredictable. The horizontal line indicates 5% and 10% significance levels.

The horizontal line in the graphs showing the WBAVR test results in Figure 1 shows the 5% and 10% significance levels. The fact that the p value obtained for each sub-sample window is smaller than the significance levels indicates that the null hypothesis will be rejected in the relevant period, in other words, the returns are predictable in that period. The p values, which are greater than the significance levels, indicate that the null hypothesis will be accepted, so the returns cannot be predicted. When the graphs in Figure 1 are analyzed, it is seen that the returns are predictable in certain periods in the stock markets except for Brazil, South Africa, and Germany's stock markets, and the returns are unpredictable in certain periods. Table 5 shows the number of weeks in which the return series within the scope of the study are predictable.

B	RA	ZAF		DEU		RUS		
0	0	0	0 0 0 0		1	1		
FI	RA	II	ITA USA		SA	UK		
2	0	3	0	4	0	5	1	
C	AN	ID	IDN		EU		IND	
5	4	10	0	14	0	13	5	
K	(R	AI	ARG		TUR		SAU	
22	0	22	1	23	2	39	8	
CI	HN	A	AUS		'n	M	EX	
41	21	55	13	62	54	148	53	

Table 5. Number of Weeks in Which Returns Are Predictable

The numbers on the left in Table 5 show the number of weeks in which returns are predictable with a 10% significance level, while the numbers on the right show the number of weeks in which returns are predictable with a 5% significance level. When Table 5 is analyzed, it is understood that there is no return predictability period in the date range within the scope of the study in Brazil, South Africa, and Germany's stock markets. The stock markets of these countries are weak-form efficient while the weak-form efficiency (return predictability) of other markets varied periodically, therefore, individual and institutional investors and portfolio managers can not obtain abnormal returns by using historical data in the stock markets of these countries. In addition to these three countries, the chance of forecasting the returns of stocks is very low by using historical price movements or returns in Russia, France, Italy, United States, United Kingdom, and Canada country's stock markets. Looking at Table 5 again, it is understood that the Mexican stock market has by far the most period in which returns are predictable. Using the historical price movements or returns of stocks in the Mexican financial markets, the chance of obtaining abnormal returns is quite high. Besides Mexico, there is a high chance of obtaining abnormal returns by using historical price movements or returns in Japan, Australia, China, and Saudi Arabia stock markets which have less weak-form efficiency periods compared to other countries. The stocks of these countries are ideal for individual and institutional investors and portfolio managers who have an investment strategy on historical price movements.

Conclusion

In this study carried out to compare stock markets in terms of return predictability, in other words, weak-form market efficiency on a global scale, the weekly return data of the indexes representing the stock markets of 19 countries and the European Union members of the G-20 between 07.06.2009 and 09.02.2020 were used. Within this framework, analysis were carried out using wild bootstrap automatic variance ratio test developed by Kim (2009) to test weakform market efficiency or return predictability, provides highly successful results in data sets that are not normally distributed and showing conditional heteroscedasticity and also provides test statistics used to determine the return predictability or the degree of market efficiency (inefficiency). As a result of the analysis, it is determined that the returns in Brazil, South Africa, and Germany stock markets are unpredictable in the date range within the scope of the study, in other words, these markets are efficient in weak-form, while the weakform efficiency of other countries' stock markets changes time to time. For this reason, historical price movements or returns cannot be used in the stock markets of these countries for the estimation of returns. In addition to Brazil, South Africa, and Germany, there is a very low chance to estimate returns with historical price movements or returns in Russia, France, Italy, United States, United Kingdom, and Canada stock markets. After the analysis, it is also seen that the stock market, which has the highest return predictability period, belongs to the Mexican country. Besides Mexico, stock markets belonging to Japan, Australia, China, and Saudi Arabia also have high predictable periods compared to other stock markets. Successful results about the estimation of returns can be achieved by using historical price movements or returns in Mexico, Japan, Australia, China, and Saudi Arabia stock markets, which have less weak-form efficiency periods compared to other countries. My advice to individual and institutional investors and portfolio managers with an investment strategy based on historical price movements or returns to increase their chances of success is work on Mexico, Japan, Australia, China, and Saudi Arabia stock markets rather than Brazil, South Africa, Germany, Russia, France, Italy, United States, United Kingdom, and Canada.

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