

Book-to-Market Ratio, return on equity and Brazilian Stock Returns

Rebeca Cordeiro da Cunha Araújo

*Instituto Federal de Educação, Ciência e Tecnologia da Paraíba,
João Pessoa, Brazil, and*

Márcio André Veras Machado

Universidade Federal da Paraíba, João Pessoa, Brazil

Abstract

Purpose – This study aims to analyze the influence of future expectations of the book-to-market ratio (B/M) and return on equity (ROE) in explaining the Brazilian capital market returns.

Design/methodology/approach – The study analyzed the explanatory power of risk-factor approach variables such as beta, size, B/M ratio, momentum and liquidity.

Findings – The results show that future expectations of the B/M ratio and ROE, when combined with proxies for risk factors, were able to explain part of the variations of Brazilian stock returns. With respect to risk factors approach variables, the authors verified the existence of size and B/M effects and a liquidity premium in the Brazilian capital market, during the period analyzed.

Research limitations/implications – This research was limited to the non-financial companies with shares traded at Brasil, Bolsa and Balcão, from January 1, 1995 to June 30, 2015. This way, the conclusions reached are limited to the sample used herein.

Practical implications – The evidences herein presented can also contribute to establishing investment strategies, considering that the B/M ratio may be calculated through accounting information announced by companies. Besides, using historical data enable investors, in a specific year, to calculate the predictor variables for the B/M ratio and ROE in the next year, which enhance the explanatory power of the current B/M, when combined in the form of an aggregate predictor variable for stock returns.

Originality/value – The main contribution of this study to the literature is to demonstrate how the expected future B/M ratio and ROE may improve the explanatory capacity of the stock return, when compared with the variables traditionally studied in the literature.

Keywords Anomalies, Risk factors, Return on equity, Fundamental valuation, Book-to-market ratio

Paper type Research paper

1. Introduction

The efficient market hypothesis and the asset pricing models constitute one of the main pillars of the modern finance theory. Despite much questioning about the assumptions of the asset pricing models, it is important to restate their theoretical and practical contribution to the field of finance. Regarding corporate finance, the asset pricing models allow determining



the return rate used to assess alternatives of investment; concerning investment management, they are very much used to analyze risk and asset returns.

The capital asset pricing model (CAPM), developed by Sharpe (1963, 1964), Lintner (1965) and Black (1972), is a single-factor model for which the beta can explain the differences in asset returns. Despite the simplifications imposed by its hypotheses, the CAPM is very useful for making financial-related decisions because it quantifies and prices risk.

While developing tests to validate and apply the CAPM, the researchers found several regularities that the model did not explain. For this reason, they were named capital market anomalies. To Schwert (2003), anomalies are empirical results that seem to be inconsistent with the asset pricing theories. They indicate either market inefficiency (profit opportunities) or inadequacies in the underlying asset-pricing model. Several approaches seek to explain market anomalies and analyze them from different perspectives.

The risk-factor approach considers that asset risk is multidimensional and that financial indicators are factors that capture part of the systematic risk not covered by the CAPM. The exponents of this approach are the works of Fama and French (1992, 1993), who developed a three-factor model using the following variables: market (CAPM beta), firm size (market value) and book-to-market ratio (B/M), that is, book value divided by market value.

Based on psychology and the limits-to-arbitrage concept, the behavioral approach considers that the causes of anomaly reside in investor irrationality. The momentum effect, proposed by Jegadeesh and Titman (1993, 2001), shows that the strategies to buy stocks that had good results in the past (*Win*) and sell stocks that had bad results in the same period (*Los*) generate significantly positive returns over the following months. Carhart (1997) included momentum to the three-factor model of Fama and French (1993) and created that which is now known as the four-factor model.

Like the risk-factor approach, the fundamental valuation of Clubb and Naffi (2007) is based on the assumption that stocks are rationally priced. The difference between the former and the latter approach is that fundamental valuation is not based on the existence of a relation between a firm's particular characteristic and its risk. Fundamental valuation seeks to demonstrate that many of the market anomalies are nothing but regularities in the relations across the said variables. Therefore, regardless of which process generates the firm return, the empirically demonstrated relation between variables and returns will always be observed.

The fundamental perspective developed by Berk (1995, 1997) suggests that the traditional interpretation of the empirical relation between market value and average stock return may be flawed. Rather than the evidence of a "size effect", the relation may occur because of an endogenous inverse relation between the firms' market value and discount rate. Berk (1995) states that, if a firm's market value is set, in equilibrium, as the discounted value of the expected future cash flows, it depends on a discount rate. Therefore, the bigger the cash flow discount rate (and, consequently, the bigger the expected return), the lower the market value will be. According to this view, the expected returns will always have a negative correlation with the firms' market value, *ceteris paribus*.

Likewise, fundamental valuation considers the B/M ratio to be a more consistent variable than firm size to explain stock returns. According to this perspective, the relation between the B/M and the future returns is not given by the fact that B/M captures a risk factor but, rather, because it is a proxy for the expected cash flows, which correspond to an omitted term in the relation between market value and the expected returns.

Along the line of this approach, the study of Clubb and Naffi (2007) on companies of the UK from 1991 to 2000 suggests that the explanatory power of current B/M for future stock returns is enhanced by the inclusion of simple estimates of future B/M and return on equity (ROE) as additional explanatory variables. This way, this paper aimed to analyze the

influence of the B/M ratio and expected future B/M ratio and ROE on explaining Brazilian stock market returns. As a comparison, this study analyzed the explanatory power of traditional pricing models, formed by the following variables: beta, size, B/M ratio, momentum and liquidity. Eventually, the three fundamental variables were checked for consistency through robustness tests, in which the variables of the two approaches were combined.

For this, the following hypotheses were tested:

- H1.* The B/M ratio explains part of the variations of Brazilian stock returns.
- H2.* The expected future B/M ratio explains part of the variations of Brazilian stock returns.
- H3.* The expected future ROE explains part of the variations of Brazilian stock returns.

These three fundamental variables are expected to explain part of the Brazilian stock returns; they are also expected to remain significant, even after including the risk-factor approach variables.

The results found in this paper may contribute to setting investment strategies, considering that the B/M ratio may be calculated through accounting information announced by the companies. In addition, using historical data enables investors, in a specific year, to calculate the variables to forecast the B/M ratio and the ROE for the following year, which enhance the explanatory power of the current B/M ratio, when combined in the form of aggregate predictor variable of the stock returns.

The main contribution of this study to the literature resides in focusing on Fundamental Valuation, which is an alternative perspective to analyze market anomalies that has few empirical evidences, especially in emerging countries. For the market, the results herein reported may contribute to setting investment strategies, considering that the fundamental variables under analysis may be calculated through accounting information announced by companies.

This paper includes five sections, including the introduction. Section 2 presents the theoretical framework and focuses on this study's theoretical model, based on the Fundamental Analysis. Section 3 presents the methodological procedures used to reach the previously set objectives. Section 4 presents the results found on the empirical analysis. Finally, Section 5 conveys the conclusion.

2. Theoretical framework

The seminal work of [Fama and French \(1992\)](#) is a cornerstone of the study of efficient markets, asset pricing models and market anomalies. The authors demonstrated that size and B/M ratio have a greater explanatory power for stock returns than the CAPM beta estimates, and these variables have inspired numerous discussions on the role of financial and accounting indices as predictors of stock returns.

The positive relation between the B/M ratio and the expected stock returns has been documented for decades, regardless of the adopted perspective. Under the risk-factor approach, the B/M factor is believed to explain part of the systematic risk variation not captured by the CAPM. On the other hand, the fundamental valuation assumes that the relation between the B/M ratio and future returns is not given by the fact that B/M captures a risk factor but, rather, because it is a proxy for the expected cash flows, corresponding to an omitted term in the relation between market value and expected returns ([Berk, 1995; 1997](#)).

Using data from the US market, [Frankel and Lee \(1998\)](#) found evidence of a variable for predicting B/M ratio. This variable, which incorporates market analysts' forecasts, had a

greater explanatory power than the book value, because it incorporated both past and present information. They also show that the relation between B/M and ROE is inverse. This occurs because the book value is a proxy for expected cash flows and, in a competitive equilibrium, a firm's ROE should be close to its cost of equity capital (discount rate). [Lee and Zhang \(2014\)](#) ratified this evidence with data from the Chinese market.

[Clubb and Naffi \(2007\)](#) heightened this perspective, as they also focused on the role of ROE as a determinant of stock returns. They noted that the identity linking ROE, expected returns and B/M implies that expected stock returns for a period can be explained by a comparison of expected ROE and the expected change in the B/M ratio. This identity originated the fundamental analysis model to be analyzed in this study.

The logics underlying this argument is that inclusion of expected future ROE (in addition to current B/M) as an explanatory variable for stock returns, controls for cross-firm variation in current B/M caused by differences in expectations of short-term fundamental economic performance. Meanwhile, additional inclusion of expected future B/M as an explanatory variable for stock returns controls for the impact of expectations of longer term fundamental performance ([Clubb and Naffi, 2007](#)).

The B/M ratio relates both to the firms' book value and market value. For this reason, it allows identifying its future perspectives both from the internal context and on the investors' view. In the fundamental perspective, the B/M is positively related to the stock returns, considering the book value as a proxy for the firm's future cash flows.

The fundamental analysis model of [Clubb and Naffi \(2007\)](#) is based on an identity that relates the current B/M ratio (t) and the expected future B/M ratio and ROE at time $t + 1$, assuming that the Clean Surplus Relation – CSR (accounting normative proposition for which a firm's book value must be changed only as a function of dividends or profits) is valid for the net profits. The CSR may be described as follows:

$$BV_t = BV_{t-1} + NP_t - D_t \quad (1)$$

Where:

- BV_t = book value at time t ;
- NP_t = net profits for the period $t + 1$; and
- D_t = dividends paid at time $t + 1$.

The B/M ratio at time $t + 1$ for a specific company may be described as:

$$\frac{BV_{t+1} + D_{t+1}}{MV_{t+1} + D_{t+1}} = \frac{(1 + ROE_{t+1})BV_t}{(1 + R_t)MV_t} \quad (2)$$

where:

- MV_t = market value at time t ;
- $MV_{t+1} + D_{t+1} = (1 + R_t) MV_t$ denotes the market price at time $t + 1$;
- $ROE_{t+1} = \frac{NP_{t+1}}{BV_t}$ denotes the ROE for the period $t + 1$; and
- R_t = stock return for period t .

Applying a logarithmic transformation on this equation, we have:

$$\ln(1 + R_t) = \ln\left(\frac{BV_t}{MV_t}\right) - \ln\left(\frac{BV_{t+1} + D_{t+1}}{MV_{t+1} + D_{t+1}}\right) + \ln(1 + ROE_{t+1}) \quad (3)$$

Taking the expectations at t ([.] represented by E_t), we find the expression for the logarithm of the expected stock returns for the period $t + 1$:

$$E_t[\ln(1 + R_t)] = \ln \frac{BV_t}{MV_t} - E_t \left[\ln \left(\frac{BV_t + 1 + D_{t+1}}{MV_{t+1} + D_{t+1}} \right) \right] + E_t[\ln(1 + ROE_{t+1})] \quad (4)$$

Which, in turn, implies the following equation for the logarithm of the realized returns in period t :

$$\ln(1 + R_t) = \ln \frac{BV_t}{MV_t} - E_t \ln \left[\ln \left(\frac{BV_{t+1} + D_{t+1}}{MV_{t+1} + D_{t+1}} \right) \right] + E_t[\ln(1 + ROE_{t+1})] + v_t \quad (5)$$

where:

v_t = zero mean disturbance term.

Equation (5) provides the basis for the empirical analysis of this paper. The main objective was to verify whether this model, comprising the current B/M ratio, the expected B/M and ROE and a random disturbance term, explains stock return variations in Brazil. For this, this study used two regression models proposed by Clubb and Naffi (2007):

$$RET_T = \alpha_0 + \alpha_1 BM_t - \alpha_2 FBM_{t+1} + \alpha_3 FROE_{t+1} + \varepsilon_t \quad (6)$$

where:

BM_t = current B/M;
 FBM_{t+1} = expected future B/M; and
 $FROE_{t+1}$ = expected future ROE.

$$RET_T = \alpha_0 + \alpha_1 FRM_{t+1} + \varepsilon_t \quad (7)$$

where:

FRM_t = aggregate predictor variable $FRM \equiv BM_t - FBM_{t+1} + FROE_{t+1}$.

Equation (6) is a multivariate model and equation (7) is an aggregate univariate model, where, by definition, the explanatory variable $FRM \equiv BM_t - FBM_{t+1} + FROE_{t+1}$. According to Clubb and Naffi (2007), the coefficients are expected to be within the following intervals: $0 < \alpha_1 < 1$, $0 < \alpha_2 < -1$ and $0 < \alpha_3 < 1$ for equation (6) and $0 < \alpha_1 < 1$ for equation (7). Although the model premises imply that the explanatory power of the stock returns for equations (6) and (7) should be identical, it is expected that differential measurement error in the proxy market forecast variables (FBM_{t+1} and $FROE_{t+1}$) will result in a difference of explanatory power across the two models (Clubb and Naffi, 2007).

Kothari (2001) and Lee (2001) convey a review of the academic literature on stock market anomalies and fundamental analysis before the year 2000, while Richardson *et al.* (2010) conduct a similar research with studies after year 2000. Table I sums up the main empirical evidences, both national and international, on the relation between fundamental variables and stock return.

3. Methodological procedures

3.1 Population and sample

The sample comprised all the firms listed at B3 (Brasil, Bolsa and Balcão), from January 1, 1995 to June 30, 2015. To guarantee the exactitude of the accounting data, some filters were used. This way, this study excluded: financial firms, because, according to Fama and French (1992), their high leverage may distort the B/M ratio and it does not have the same meaning as for the high leverage of non-financial firms; firms that did not have a market value on

Empirical evidence	Country	Variables		Method
		B/M	ROE	
Fairfield (1994)	USA	X	X	Accounting valuation model
Ryan (1995)	USA	X		B/M decomposition
Berk (1995)	USA	X		Market value decomposition
Berk (1997)	USA	X		Portfolio analysis/regression
Frankel and Lee (1998)	USA	X	X	Accounting valuation model
Pontiff and Schall (1998)	USA	X		Regression analysis
Lev and Sougiannis (1999)	USA	X	X	Portfolio analysis/regression
Beaver and Ryan (2000)	USA	X	X	B/M decomposition
Billings and Morton (2001)	USA	X		B/M decomposition
Vuolteenaho (2002)	USA	X	X	VAR model
Chen and Zhao (2006)	USA	X		Portfolio analysis/regression
Clubb and Naffi (2007)	UK	X	X	Regression analysis
Fama and French (2008)	USA	X		B/M decomposition
Almeida and Eid (2010)	Brazil	X		B/M decomposition
Skogsvik and Skogsvik (2010)	Sweden		X	Accounting valuation model
Dorantes (2013)	Mexico	X		Portfolio analysis/regression
Lee and Zhang (2014)	USA and China	X		Portfolio analysis/regression
Evrard <i>et al.</i> (2015)	Brazil	X	X	Forward selection regression/event study

Note: X = yes

Table I.
Main papers that
analyze the relation
between fundamental
variables and stock
return

December 31 and June 30 of each year; firms that did not have a positive book value on December 31 of each year; firms that did not have monthly quotations for 24 consecutive months. In the latter case, the 12 months prior to the beginning of each year t were used to calculate momentum, while the 12 months after that were used to calculate stock returns.

The analysis was based on individual assets. On average, 318 stocks were analyzed per year, which shows the reduced number of Brazilian companies whose stocks are traded at the Stock Exchange. As a comparison, the study of [Clubb and Naffi \(2007\)](#) analyzed, on average, stocks of 500 UK firms each year, from 1991 to 2000. Considering that the predictor variables would be estimated through a linear dynamic panel, a balanced panel was put up for each analyzed company to have the same number of observations over time. Therefore, the sample included the stocks that had valid observations of the fundamental variables object of this study (B/M ratio and ROE), over the full period of analysis (19 years). Thus, the final sample comprised 89 stocks (28 per cent of the population, on average). The list of the firms comprising the sample can be found at the [Appendix](#). It is important to underscore that analysis started in 1996, and that 1995 was used only to calculate the predictor variables. All the secondary data needed to conduct this study were taken from the Economatica database.

3.2 Model description

To compare the explanatory capacity of the fundamental variables presented in the previous section to the risk factors suggested in the literature, in addition to [equations 6 and 7](#) (Models 1 and 2, respectively), regression models were estimated and were formed on the following variables: beta (β_i), firm size (market value) ($SIZE_i$), B/M ratio (BM_i), momentum (MOM_i) and liquidity (LIQ_i). Regression models estimated in this study sums up the main regression models estimated in this study:

3.2.1 Regression models estimated in this study

(1) Fundamental valuation models:

- Model 1: $RET_T = \alpha_0 + \alpha_1 BM_t - \alpha_2 FBM_{t+1} + \alpha_3 FROE_{t+1} + \varepsilon_t$
- Model 2: $RET_T = \alpha_0 + \alpha_1 FRM_{t+1} + \varepsilon_t$

(2) Risk-factor approach models:

- Model 3: $RET_T = \alpha_0 + \alpha_1 \beta_t + \varepsilon_t$
- Model 4: $RET_T = \alpha_0 + \alpha_1 \beta_t - \alpha_2 SIZE_t + \alpha_3 BM_t + \varepsilon_t$
- Model 5: $RET_T = \alpha_0 + \alpha_1 \beta_t - \alpha_2 SIZE_t + \alpha_3 BM_t + \alpha_4 MOM_t + \varepsilon_t$
- Model 6: $RET_T = \alpha_0 + \alpha_1 \beta_t - \alpha_2 SIZE_t + \alpha_3 BM_t + \alpha_4 MOM_t - \alpha_5 LIQ_t + \varepsilon_t$

(3) Joint regression models:

- Model 7: $RET_T = \alpha_0 + \alpha_1 BM_t - \alpha_2 FBM_{t+1} + \alpha_3 FROE_{t+1} + \alpha_4 \beta_t + \varepsilon_t$
- Model 8: $RET_T = \alpha_0 + \alpha_1 BM_t - \alpha_2 FBM_{t+1} + \alpha_3 FROE_{t+1} + \alpha_4 \beta_t - \alpha_5 SIZE_t + \varepsilon_t$
- Model 9: $RET_T = \alpha_0 + \alpha_1 BM_t - \alpha_2 FBM_{t+1} + \alpha_3 FROE_{t+1} + \alpha_4 \beta_t - \alpha_5 SIZE_t + \alpha_6 MOM_t + \varepsilon_t$
- Model 10: $RET_T = \alpha_0 + \alpha_1 BM_t - \alpha_2 FBM_{t+1} + \alpha_3 FROE_{t+1} + \alpha_4 \beta_t - \alpha_5 SIZE_t + \alpha_6 MOM_t - \alpha_7 LIQ_t + \varepsilon_t$
- Model 11: $RET_T = \alpha_0 + \alpha_1 FRM_{t+1} + \alpha_2 \beta_t + \varepsilon_t$
- Model 12: $RET_T = \alpha_0 + \alpha_1 FRM_{t+1} + \alpha_2 \beta_t - \alpha_3 SIZE_t + \alpha_4 BM_t + \varepsilon_t$
- Model 13: $RET_T = \alpha_0 + \alpha_1 FRM_{t+1} + \alpha_2 \beta_t - \alpha_3 SIZE_t + \alpha_4 BM_t + \alpha_5 MOM_t + \varepsilon_t$
- Model 14: $RET_T = \alpha_0 + \alpha_1 FRM_{t+1} + \alpha_2 \beta_t - \alpha_3 SIZE_t + \alpha_4 BM_t + \alpha_5 MOM_t + \alpha_6 LIQ_t + \varepsilon_t$

Source: Adapted from [Clubb and Naffi \(2007\)](#).

As shown in regression models estimated in this study, two regression models were estimated on the fundamental perspective (Models 1 and 2) and four regression models were estimated on the risk-factor approach (Models 3, 4, 5 and 6). Note that the current B/M is an overlapping variable across the fundamental and the risk factor perspectives, as it is present in both model types. In addition, as a robustness test, eight joint regression models were estimated, formed by the combination of variables of the two approaches mentioned above. The objective was to identify the extent to which the fundamental variables and the risk-factor approach provide additional explanatory power for the stock returns found in each perspective, separately. This way, the study sought to analyze the extent to which the limited explanatory capacity of an approach could be compensated by including variables from the other approach.

3.3 Data analysis techniques

All the models listed in regression models estimated in this study were estimated through annual regressions with panel data. Using panel data allows the econometric analysis, over time, of cross-section study units ([Baltagi, 2005](#)). In this study, the basic study unit is formed by companies that had stocks listed at the B3, observed at different moments.

For each model specified in regression models estimated in this study, we calculated the student's *t*-test to verify if the analyzed variables had a significant influence on the stock return variations and the *F*-test to analyze the joint significance of the investigated

variables. In addition, tests were conducted to check the model assumptions, such as the modified Wald test, to test the homoskedasticity and the Wooldridge test (Lagrange Multiplier test), for panel data autocorrelation. In the cases where heteroskedasticity and/or autocorrelation were found, the Huber–White robust variance/covariance matrix was used. After estimating with fixed and random effects, the Hausman (1978) test was run to identify which model was the most adequate in each case.

3.4 Variable description

Table II sums up the procedures used to calculate the variables analyzed in this study. The models described in Section 3.2 were estimated for the 1996-2005 period. The explanatory variables were measured by taking the dependent variable as a basis – stock return – measured between July of year t and June of the following year. This procedure was used for all the analyzed period, that is, 1996-1997 to 2014-2015.

The predictor variables for B/M (FBM_{*t*}) and ROE (FROE_{*t*}), for each firm, were obtained through a linear dynamic panel estimation (Arellano *et al.*, 1991). Our study used the data from variables BM_{t-1} and ROE_{t-1} for all sample firms over the period of analysis (1995 to 2010) to estimate the prediction model of each variable. Next, this model was used to generate the forecasts for each firm individually, year after year, based on the data of year $t-1$.

Equation	Description	
$R_t = \ln\left(\frac{P_{it}}{P_{it-1}}\right)$	P_{it} = Nominal closing price of stock i in year t (adjusted to gain);	P_{it-1} = Nominal closing price of stock i in year $t-1$ (adjusted to gain)
$BM_t = \frac{BV_{t-1}}{MV_{t-1}}$	BV_{t-1} = book value on December 31 of year $t-1$;	VM_{t-1} = market value on December 31 of year $t-1$
$ROE_t = \frac{NP_{t-1}}{BV_{t-1}}$	NP_{t-1} = company's net profit on December 31 of year $t-1$;	BV_{t-1} = book value on December 31 of year $t-1$
$FBM_{t+1} = \gamma_0 + \gamma_1 BM_t$	γ_0 = intercept of a model to predict the B/M, estimated through a linear dynamic panel, using data from all sample companies, from 1995 to 2010;	γ_1 = slope coefficient of a model to predict the B/M, estimated through a linear dynamic panel, using data from all sample companies, from 1995 to 2010
$FROE_{t+1} = \lambda_0 + \lambda_1 ROE_t$	λ_0 = intercept of a model to predict the ROE, estimated through a linear dynamic panel, using data from all sample companies, from 1995 to 2010;	λ_1 = slope coefficient of a model to predict the ROE, estimated through a linear dynamic panel, using data from all sample companies, from 1995 to 2010
β_t	Calculated on the 60 months immediately prior the beginning of year t , in July	
$SIZE_t = \ln MV_t$	VM_t = Market value on June 30 of year t	
MOM_t	Calculated by summing up the return of the 12 months immediately prior to the beginning of year t , in July	
Trading quantity	Quantity of annual trading of a stock	
Traded volume	Volume of annual trading of a stock, in Brazilian Reais	
Negotiability index	$Negotiability = 100 \times \frac{p}{P} \times \sqrt{\frac{n}{N} \times \frac{v}{V}}$	

Table II.
Variables analyzed in
this study

4. Data analysis

4.1 Descriptive statistics

Table III shows the descriptive statistics of the analyzed variables. For most of the studied variables all the annual observations were valid (1691 observations). The average B/M was relatively low, if compared to its maximum value. According to Fama and French (1993), low B/M ratios indicate growth opportunities. Beta and momentum had low variability levels. However, size and liquidity had a high variability. Three proxies were used to measure liquidity (trading quantity, traded volume and negotiability index), as liquidity cannot be directly observed, and it has several aspects that cannot be captured in a single measure (Liu, 2006).

The relations among the eight explanatory variables of this study were also investigated, through a correlation matrix (Table IV). As expected, the B/M ratio had a high positive correlation (0.751) with its predictor variable (FBM); a positive correlation was also found between the aggregate predictor variable (FRM) and the three fundamental variables that comprise it (B/M, FBM and FROE), corresponding to 0.957, 0.542 and 0.320, respectively. It is worth mentioning the positive correlation between size and the three proxies for liquidity (0.493, 0.585, 0.507, respectively), corroborating the results of Machado and Medeiros (2011), who suggest that market value might be a reasonable proxy for liquidity. Finally, note the strong positive correlation between the three liquidity measures, which suggests that negotiability, trading quantity and traded volume may be capturing the same dimension as liquidity.

Considering the high correlation between some variables, as evidenced in Table IV, the authors found it was suitable to previously investigate a possible multicollinearity in the multivariate models. For this, the variance inflation factor test (VIF) was run for each explanatory variable. According to Levine et al. (2000), in case there is no correlation between a set of variables, the VIF will equal 1. In case the variables are highly correlated, the VIF may exceed 10. More conservative criteria suggest the presence of multicollinearity should the VIF exceed 5. The values found for the VIF test are in Table V.

The data in Table V show that, although not all the models had VIF test values around 1, none of them had a value over 5, considering a conservative analysis criterion. Therefore, the inexistence of collinearity across the explanatory variables may be confirmed. This finding ensures a more consistent use of multiple regression models; in this sense, the panel data estimation reduces the likelihood of multicollinearity problems.

Variable	No. of observations	Average	SD	Minimum	Maximum
BM	1,691	3.4787	9.04	-92.67	81.30
BM forecast	1,602	3.3170	2.94	-23.24	30.08
ROE forecast	1,602	0.0957	0.02	-0.25	0.36
Aggregate forecast (FRM)	1,691	0.4269	7.32	-80.43	64.36
Beta	1,339	0.7730	0.25	-0.07	2.10
Size (in thousand R\$)	1,688	5,592,396.33	20,413,196.54	376	286,390,438
Momentum	1,691	0.1125	0.47	-2.10	2.76
<i>Liquidity</i>					
Negotiability	1,691	0.4045	1.13	0.03	12.56
Trading quantity	1,691	146.748.55	615.960.03	6	8.114.196
Traded volume (R\$)	1,691	2,922,968	14,937,630.12	14	218,327,039

Table III. Descriptive statistics of the studied variables

Notes: The variables were calculated according to the procedures described in Table II. Size, trading quantity and traded volume are shown in gross figures. The remaining variables are indices

Finally, a stationarity test of the dependent variable (stock return) was run. We used the [Levin et al. \(2002\)](#) test because it is a unit root test in panel data, developed with the intention to improve the explanatory power of conventional stationarity tests, for combining time and cross-section information. The unit root test results are in [Table VI](#) and show that all the variables are stationary at level, as the null hypothesis of the unit root was rejected.

4.2 Predictor variable estimations

The expected future B/M ratio and ROE were estimated through a linear dynamic panel of [Arellano et al. \(1991\)](#), whose estimators are obtained through a Generalized Method of Moments (GMM). The study used the B/M ratio and ROE data of 89 stocks that comprised the sample for the whole period of analysis (1995 to 2015) to estimate the predictor models for each variable, considering the series stationarity ([Table VI](#)). [Equation \(8\)](#) has the predictor model for the B/M ratio and [equation \(9\)](#) has the predictor model for the ROE, both with a lag:

$$FBM_{t+1} = 2.078 + 0.344BM_t \quad (8)$$

	BM	FBM	FROE	FRM	BETA	SIZE	MOM	LIQ ¹	LIQ ²	LIQ ³
BM	1.000	0.751**	0.038	0.957**	0.007	-0.062*	0.006	-0.035	-0.034	-0.004
FBM		1.000	0.068**	0.542**	0.008	-0.072**	0.054*	-0.048	-0.044	-0.020
FROE			1.000	0.302**	0.027	0.054*	-0.047	0.027	0.032	0.044
FRM				1.000	0.001	-0.054*	-0.018	-0.030	-0.029	0.003
BETA					1.000	0.128**	-0.188**	0.195**	0.180**	0.338**
SIZE						1.000	0.025	0.493**	0.585**	0.507**
MOM							1.000	-0.066**	-0.037	0.013
LIQ ¹								1.000	0.843**	0.566**
LIQ ²									1.000	0.734**
LIQ ³										1.000

Table IV.
Correlation matrix of
the explanatory
variables

Notes: Proxies for liquidity: 1 = Trading quantity; 2 = Traded volume; 3 = Negotiability; *significant at 1%; **significant at 5%

Model	BM	FBM	FROE	FRM	Beta	Size	Momentum	Quant.	Volume	Negot.
1	2.291	2.299	1.005							
4	1.005				1.017	1.022				
5	1.005				1.057	1.025	1.040			
6	1.006				1.219	1.543	1.061	3.585	3.705	2.569
7	2.567	2.581	1.010		1.001					
8	2.567	2.586	1.013		1.019	1.028				
9	2.579	2.608	1.014		1.061	1.032	1.052			
10	2.580	2.609	1.016		1.223	1.550	1.070	3.597	3.994	2.814
11	3.063			3.065	1.001					
12	3.082			3.068	1.017	1.022				
13	3.230			3.076	1.057	1.026	1.053			
14	3.238			3.246	1.219	1.544	1.075	3.583	3.707	2.572

Table V.
Multicollinearity test
for the multivariate
models

Note: For each model described in regression models estimated in this study, a multicollinearity test was run, the VIF test statistics values are presented above

$$FROE_{t+1} = 0.938 + 0.024ROE_t \quad (9)$$

Next, these two models were used to generate the B/M ratio and ROE predictions for each firm individually, year after year, based on the data of year t . The main contribution of this estimation method for the expected future B/M ratio and ROE is the fact that it allows for an autoregressive estimation model that takes in consideration the heterogeneity of the stocks of firms that comprise the sample. In addition, the use of the linear dynamic panel with data for the whole period of analysis (1995-2015) is believed to favor obtaining a predictor model that is valid for the whole period.

4.3 Analyzing the explanatory capacity of the models

This section aims to analyze the contribution of the analyzed variables to explain stock returns in the Brazilian market. For this, the study used panel data regressions across the annual stock returns and the two groups of explanatory variables.

To start with, we present the results of the models proposed by [Clubb and Naffi \(2007\)](#), comprising fundamental variables. Next, we present the models comprising risk-factor approach variables. Finally, we analyze the models formed on combinations of these two groups of variables, as a robustness test for the results of previous phases.

4.3.1 Fundamental valuation models. [Table VII](#) shows the regression results for the fundamental valuation models. Model 1 constitutes the multivariate model proposed by [Clubb and Naffi \(2007\)](#), comprising the B/M ratio and the expected future B/M and ROE. The coefficient of determination (R^2) was 0.0287. In the study of [Clubb and Naffi \(2007\)](#), which used data from the UK from 1991 to 2000, this model's R^2 was 0.0932. The coefficients of the three fundamental variables were consonant with the theoretical framework that the model requires, as described in Section 3.2.1. The coefficient for the B/M ratio was positive and significant at the 1 per cent level. The predictor variables of the B/M and ROE also had a sign consistent with expectations; however, they were not statistically significant. The coefficients found by [Clubb and Naffi \(2007\)](#) for the B/M ratio at level and for the B/M ratio predictor variable were statistically significant at the 1 per cent level, and the coefficient for the ROE predictor variable was significant at the 5 per cent level.

Model 2, univariate, is formed by the aggregate predictor variable proposed by [Clubb and Naffi \(2007\)](#): $FRM \equiv BM_t - FBM_{t+1} + FROE_{t+1}$. The coefficient of determination (R^2)

Variable	<i>t</i> -statistic	<i>p</i> -value
Return	14.09*	0.0000
BM	7.84*	0.0000
BM forecast	4.53*	0.0000
ROE forecast	7.81*	0.0000
Aggregate forecast (FRM)	46.70*	0.0000
Beta	2.50*	0.0000
Size	1.80**	0.0353
Momentum	17.64*	0.0000
<i>Liquidity</i>		
Negotiability	10.56*	0.0000
Trading quantity	17.29*	0.0000
Traded volume	6.86*	0.0000

Table VI.
Stationarity test for
panel data

Notes: *Significant at 1%; **significant at 5%

was 0.0452, representing a considerable improvement compared to Model 1. Comparatively, [Clubb and Naffi \(2007\)](#) found a coefficient of determination of 0.0891 for this model. The coefficient of the FRM variable was significant at the 1 per cent level and the sign was consistent with that which was expected. [Clubb and Naffi \(2007\)](#) also found a positive and statistically significant coefficient for this variable.

The results of the regressions on the fundamental variables show that the explanatory power of the B/M ratio is not enhanced by the inclusion of expected future B/M ratio and ROE, considered separately, as these variables were not statistically significant. However, when the three variables are jointly taken, in the form of aggregate predictor variable, their explanatory power is superior to the B/M ratio when taken individually.

According to [Clubb and Naffi \(2007\)](#), although the premises of the models imply that the explanatory power of both should be identical, possible distortions in measuring the predicted variables (FBM_{t+1} and $FROE_{t+1}$) may cause a difference in the explanatory power of Models 1 and 2. Therefore, the results found for the fundamental valuation suggest that the multivariate model proposed by [Clubb and Naffi \(2007\)](#) is apparently not suitable for the Brazilian stock market and is not relevant to explain stock returns. On the other hand, the univariate model shows that, when combined with the B/M ratio, in the form of aggregate variable, the B/M ratio and ROE predictor variables are superior to the B/M ratio found in the study in terms of explanatory capacity of the stock returns.

4.3.2 Risk-factor approach models. To compare the explanatory capacity of the fundamental variables presented in the previous section to the risk-factor approach variables, traditionally suggested in the literature, this section discusses the results of the regressions for the risk-factor approach models, which are shown in [Table VIII](#). In general terms, the results confirm the importance of some of these variables and the existence of specific anomalies in the Brazilian stock market.

The beta coefficient was statistically significant in all the estimated models. However, it had a negative sign, contradicting the theoretical hypothesis that risk and return are directly proportional variables. In Brazil, [Vieira and Milach \(2008\)](#) found the same evidence. According to these authors, such result might suffer the influenced of the behavior of return over the studied period (1995-2005).

Considering that most of each stock returns had negative values and that each stock betas had positive values, when regressed, the beta coefficients were, on average, negative. Another Brazilian evidence of the negative relation between the beta and return was found

Model	Constant	BM	Part 1-Coefficients		
			FBM	FROE	FRM
(1)	0.0400531*	0.07376*	-0.035035	0.111385	
(2)	0.0678418*				0.0180011*
Part 2-Tests					
	Adjusted R^2	F-Test	Wald	LM	Hausman
(1)	0.0287	3.88*	4.40*	6.66*	30.51*
(2)	0.0452	1.47*	3.13*	2.1900	10.99*

Notes: Part 1 of the Table shows fundamental valuation model regressions estimated annually through panel data. The expected future B/M ratio (FBM) and ROE (FROE) were estimated through the linear dynamic panel of [Arellano et al. \(1991\)](#). Standard errors were estimated using a Huber-White robust matrix, considering the results of the tests of regression assumptions, which are in Part 2 of the Table; *significant at 1%

Table VII.
Results of the
fundamental
valuation models'
regressions

by [Correia et al. \(2008\)](#), who used data from 1995 to 2004. To these authors, this result suggests that the beta cannot reflect the effect expected from the systematic risk. [Datar et al. \(1998\)](#) also found negative betas when using data from the US market from 1962 to 1991. They underscore that measuring the beta depends on the efficiency of the proxy used for market portfolio and on the interval extent and measuring procedure adopted.

This study used the beta coefficient available from the Economatica database, calculated on a 60-month period prior to each year's start date. The study found that a considerable part of the stocks had negative returns in the studied period (25.5 per cent), which comprehended the current world financial crisis. So, we believe that the estimated beta coefficient may not represent the systematic risk or simply may not be reflecting a specific characteristic of the Brazilian market in the context under study. It is important to note that the main objective of this study is to assess the importance of the fundamental variables to explain the stock returns and that the beta is being used solely as a control variable.

Regarding the B/M ratio, the study found, in all models, a positive relation that was previously expected. The B/M was, therefore, an important variable to explain Brazilian stock returns. This finding confirms classic evidence on the B/M effect, such as in [Chan et al. \(1991\)](#), [Fama and French \(1992, 1993\)](#), [Capaul et al. \(1993\)](#), [Lakonishok et al. \(1994\)](#).

Size did not present a statistically significant negative relation with return, which corroborates the classic evidence for size ([Banz, 1981](#)). [Clubb and Naffi \(2007\)](#) found a positive relation between size and return, though statistically insignificant in all risk-factor approach models.

Momentum had a positive coefficient, which corroborates the assumption found in the literature that there is a positive relation between momentum and the expected stock returns. However, there was no statistical significance in any of the estimated models. The momentum effect, proposed by [Jegadeesh and Titman \(1993, 2001\)](#), shows that the strategies to buy stocks that had good results in the past (*Win*) and sell stocks that had bad results in

Model	Constant	Beta	Part 1-Coefficients			
			Size	BM	Momentum	Liquidity
(3)	0.14159*	-0.11223*				
(4)	0.14632*	-0.13303*	-0.09829*	0.025361*		
(5)	0.14738*	-0.11559**	-0.10037*	0.02553*	0.03223*	
(6.1)	0.14902*	-0.12124*	-0.10166*	0.02568*	0.03264**	-0.09694
(6.2)	0.01294*	-0.83002*	-0.06897*	0.02671*	0.00879**	-0.02975**
(6.3)	0.13274*	-0.06710*	-0.05950*	0.02820*	0.00373*	-0.03780*
			Part 2-Tests			
	Adjusted R ²	F-test	Wald	LM	Hausman	
(3)	0.0235	1.21*	1.637*	12.815*	4.49**	
(4)	0.0623	18.05*	8.629*	52.680*	114.73*	
(5)	0.0636	21.08*	1.230*	57.436*	49.62*	
(6.1)	0.0637	11.76*	1.113*	56.218*	46.99*	
(6.2)	0.0703	12.11*	1.905*	56.610*	49.69*	
(6.3)	0.0723	13.19*	6.429*	57.73*	88.37*	

Table VIII.
Regression results
for the risk-factor
approach models

Notes: Part 1 of the Table shows the regression results for the risk-factor approach models estimated annually through panel data. Standard errors were estimated using a Huber-White robust matrix, considering the results of the tests of regression assumptions, which are in Part 2 of the Table, 1 = Negotiability, 2 = Trading quantity, 3 = Traded volume; *significant at 1%; **significant at 5%; and *** significant at 10%

the same period (*Los*) generate significantly positive returns over the following months. [Carhart \(1997\)](#) considered momentum a risk factor, which led to the four-factor model.

Finally, we found the existence of a liquidity premium in the Brazilian market, as the three proxies used had a negative relation with return, trending quantity and traded volume were statistically significant. This result ratifies the findings of [Machado and Medeiros \(2012\)](#) in the Brazilian market and those of [Amihud and Mendelson \(1986\)](#), [Liu \(2006\)](#) and [Keene and Peterson \(2007\)](#) in the USA. In addition, the explanatory power of the said models was very close, thus confirming the evidence raised in Section 4.1, that the three measures may be capturing the same dimension as liquidity.

4.3.3 Robustness tests – joint models. In this section, we discuss the results of the joint model regressions, which combine the variables of the two approaches described above. The results found in this step were slightly different from the evidence presented in the previous steps. [Table VII](#) shows that B/M and ROE predictor variables did not have explanatory power for stock returns, when taken separately. However, in the joint model regressions, the expected future ROE (FROE) had statistical significance in all models and the expected future B/M ratio was significant in Models 8 to 10. Both presented the expected sign. The analysis of the models' coefficient of determination (adjusted R^2) shows that, in joint models, the explanatory capacity of the stock returns was enhanced, both in relation to the fundamental valuation models and to those formed by the risk factors, when considered separately. This result ratifies the findings of [Clubb and Naffi \(2007\)](#), in that the explanatory power of the models was enhanced by the B/M and ROE predictor variables.

The results found with the joint models that included the aggregate predictor variable (FRM) show that it remained consistent after the inclusion of all the risk-factor approach variables. In addition, the coefficients of determination of these models were superior to those found in the fundamental valuation models and risk-factor approach, separately. This result reinforces the evidence shown in [Table VIII](#), which indicates the contribution of such variable to explain Brazilian stock returns.

The control variables were found to keep presenting the same relations as those shown in [Table VIII](#). However, the beta had statistical significance only in Models 7 and 8, and momentum was not significant to explain the analyzed stock returns, after combined with the fundamental variables. The control variables that remained consistent across this phase were size and two liquidity proxies: trading quantity and traded volume.

Finally, all the analyzed models in this work were estimated again, using the period from 1995 to 2007, to verify whether they were being influenced by the world financial crisis, started in 2008. In general, there were no substantial changes in the results found. Because of space constraints, the results of such estimations were not presented in this paper, but they can be provided upon request to the authors.

Summing up, the results found show that the joint models ([Table IX](#)) had and explanatory power superior to the models of the two approaches, when taken separately. This result was also found by [Clubb and Naffi \(2007\)](#). This way, both the fundamental valuation and the risk-factor approach are important to explain stock returns in Brazil. Considering the coefficient of determination (R^2), the model that had the best explanatory power, when future expectations were taken separately, was 10.3.

Considering the aggregate predictor variable FRM, the model that had the best explanatory capacity was 14.2. Finally, it is worth mentioning the importance of the B/M ratio as an explanatory variable. The results found in this study show that the B/M has an explanatory capacity when combined with the expected future B/M and ROE, as an aggregate predictor variable and also as a risk factor.

Table IX.
Regression results of
the joint models

	Constant	BM	FBM	FROE	FRM	Beta	Size	Momentum	Liquidity	Adjust. R ²	F-Test	Wald	LM	Hausman
(7)	0.02960*	0.08493*	-0.00435	0.13289***		-0.12699*				0.0710	1.52*	7.330*	14.931*	18.40*
(8)	0.14009**	0.06029 *	-0.01210*	0.16633**		-0.14314***	-0.10259*			0.0682	12.19*	6.229*	44.771*	99.56*
(9)	0.14088*	0.04047**	-0.01330***	0.17683**		-0.12031	-0.10536*	0.04009		0.0701	10.58*	3.329*	47.399*	185.17*
(10.1)	0.14097*	0.04051**	-0.01331***	0.17682**		-0.12600	-0.10543*	0.04012	-0.00052 ¹	0.0725	12.17*	3.005*	47.016*	182.44*
(10.2)	0.12293*	0.03173**	-0.14549***	0.17929**		-0.08645	-0.07301*	0.01555	-0.03113 ² **	0.0774	10.39*	7.929*	46.554*	207.28*
(10.3)	0.12668*	0.03409**	-0.15325**	0.18273*		-0.06754	-0.062163*	0.00945	-0.04118 ³ *	0.0804	11.04*	2.305*	45.098*	104.19*
(11)	0.17215**	0.09632***			0.01248**	-0.11491				0.0717	2.31***	2.130*	14.121*	17.19*
(12)	0.20093**	0.09719**			0.01233**	-0.12204	-0.33109*			0.0716	7.09*	1.138*	14.814*	16.20*
(13)	0.19992**	0.09788**			0.01242**	-0.12015	-0.11208*	0.00342		0.0957	5.67*	2.937*	64.439*	43.61*
(14.1)	0.19928**	0.09805**			0.01244**	-0.19942	-0.32909*	0.00345	-0.0018 ¹	0.0964	5.54*	4.005*	64.154*	37.23*
(14.2)	0.63497*	0.01416**			0.01529**	-0.05131	-0.11309*	-0.01780	-0.05667 ² *	0.0980	9.14*	2.028*	54.598*	56.26*
(14.3)	0.85466*	0.01534**			0.01610**	-0.03159	-0.12309*	-0.01781	-0.06398 ³ *	0.0630	12.13*	1.235*	43.512*	46.36*

Notes: Part 1 of the Table shows the regression results of the joint models estimated annually. The expected future BM ratio (FBM) and ROE (FROE) were estimated through the linear dynamic panel of *Arellano et al. (1991)*. Standard errors were estimated using the Huber-White robust matrix, considering the results of the tests of regression assumptions, which are in Part 2 of the Table. 1 = Negotiability, 2 = Trading quantity, 3 = Traded volume; *significant at 1%; **significant at 5% and ***significant at 10%.

5. Conclusion

This paper aimed to study the influence of expected future B/M ratio and ROE on explaining Brazilian stock market returns. The study concluded that the estimated future B/M ratio and ROE do not show statistical significance in the multifactor model proposed by [Clubb and Naffi \(2007\)](#). However, when combined with the risk-factor approach variables, the predictor variables turn out to be significant and enhance the explanatory capacity of the models formed only by risk-factor approach variables.

The expected future B/M and ROE were also combined with the B/M ratio at level, forming an aggregate predictor variable. This variable was found to be statistically significant, both in the univariate model proposed by [Clubb and Naffi \(2007\)](#) and after the inclusion of five control variables. In addition, the explanatory capacity of the models that included such variable was very superior to that obtained with the risk-factor approach regressions. Therefore, this paper's initial hypotheses, that the expected future B/M ratio and the expected ROE explain part of the Brazilian stock return variations, cannot be rejected.

In this study, the B/M ratio was tested as a fundamental variable and with the risk-factor approach models. The findings show that the B/M ratio was positive and statistically significant in both classes of models. In addition, when inserted in the joint models, the study found the contribution of the expected future B/M, as a component of the aggregate predictor variable, as well as its additional explanatory capacity as a control variable.

In summary, the results found in this study indicate that the expected future B/M ratio and ROE, as well as an aggregate predictor variable, comprising the B/M ratio and the expected future B/M and expected ROE, influence the explanation of Brazilian stock returns. This means that these variables may be used in investment strategies in the stock market, because the B/M ratio plus the expected future B/M and ROE for the following year were capable of explaining part of the stock return variations in the same period. In addition, when combined with firm size and liquidity, the expected future B/M and ROE were also capable of explaining part of Brazilian stock returns.

The main contribution of this study to the literature is to demonstrate how the expected future B/M ratio and ROE may improve the explanatory capacity of the stock return, when compared with the variables traditionally studied in the literature. This study found special characteristics of the Brazilian stock market which do not match the assumptions of the asset pricing theories or the evidences indicated in the literature, especially those of developed countries. Therefore, alternative perspectives to analyze market anomalies, such as fundamental valuation, herein focused, are suitable.

The evidences herein presented can also contribute to establishing investment strategies, considering that the B/M ratio may be calculated through accounting information announced by companies. Besides, using historical data enables investors, in a specific year, to calculate the predictor variables for the B/M ratio and ROE in the next year, which enhance the explanatory power of the current B/M, when combined in the form of an aggregate predictor variable for stock returns.

Still, it is important to mention that this research was limited to the non-financial companies with shares traded at the B3, from January 1, 1995 to June 30, 2015. This way, the conclusions reached are limited to the sample used herein. In addition, excluding the companies with a negative market value and low liquidity to obtain proxies of variables of this study may lead to a sample of liquid, financially-healthy firms.

As this is a field that has not been very explored in Brazil, the study on fundamental valuation and stock return opens alternatives to develop future research studies. This study used annual data and a dynamic panel method to estimate the predictor variables. This way,

we suggest measuring the data with other bases, such as quarterly, for example, as well as using other methods to estimate the predictor variables. Another alternative is to carry out a comparative analysis per economic sector to confront the results herein presented.

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Company	Sector	Share	Share class
Alfa Consórcio	Other	BRGE11	PNE
Alfa Consórcio	Other	BRGE12	PNF
Alfa Consórcio	Other	BRGE3	ON
Alfa Holding	Other	RPAD3	ON
Alfa Holding	Other	RPAD5	PNA
Alfa Holding	Other	RPAD6	PNB
Alpargatas	Textile	ALPA3	ON
Alpargatas	Textile	ALPA4	PN
Ambev	Food and Beverage	AMBV3	ON
Ambev	Food and Beverage	AMBV4	PN
Ampla Energia	Electricity	CBEE3	ON
Bardella	Industrial machinery	BDLL4	PN
Bombril	Chemical industry	BOBR4	PN
Brasil Telecom	Telecommunications	BRT03	ON
Brasil Telecom	Telecommunications	BRT04	PN
Braskem	Chemical industry	BRKM5	PNA
Brasmotor	Electronics	BMT04	PN
CELESC	Electricity	CLSC6	PNB
CEMIG	Electricity	CMIG3	ON
CEMIG	Electricity	CMIG4	PN
CESP	Electricity	CESP3	ON
CESP	Electricity	CESP5	PNA
CONFAB	Steelmaking and Metallurgy	CNFB4	PN
COPERL	Electricity	CPLE3	ON
Coteminas	Textile	CTNM3	ON
Coteminas	Textile	CTNM4	PN
Panvel Farmácias	Commerce	PNVL3	ON
Panvel Farmácias	Commerce	PNVL4	PN
Eletróbrás	Electricity	ELET3	ON
Eletróbrás	Electricity	ELET6	PNB
Estrela	Other	ESTR4	PN
Eternit	Non-Metallic Minerals	ETER3	ON
Ferbasa	Steelmaking and Metallurgy	FESA4	PN
Forjas Taurus	Steelmaking and Metallurgy	FJTA4	PN
Fras-Le	Vehicles and parts	FRAS4	PN
Gerdau	Steelmaking and Metallurgy	GGBR3	ON
Gerdau	Steelmaking and Metallurgy	GGBR4	PN
Gerdau Metalúrgica	Steelmaking and Metallurgy	GOAU4	PN
Inepar	Other	INEP4	PN
Itaúsa	Other	ITSA3	ON
Itaúsa	Other	ITSA4	PN
Itautec Philco	Electronics	ITEC3	ON
Klabin S/A	Paper and Cellulose	KLBN4	PN
Light S/A	Electricity	LIGT3	ON
Lojas Americanas	Commerce	LAME4	PN
M G Poliest	Chemical industry	RHDS3	ON

Table AI.
Stocks that comprise
the research sample
(continued)

RAUSP
53,3

344

Company	Sector	Share	Share class
Mangels Indl	Steelmaking and Metallurgy	MGEL4	PN
Marcopolo	Vehicles and parts	POMO4	PN
Metisa	Steelmaking and Metallurgy	MTSA4	PN
Petrobras	Petrol and Gas	PETR3	ON
Petrobras	Petrol and Gas	PETR4	PN
Pettenati	Textile	PTNT4	PN
Pro Metalurg	Vehicles and parts	PMET6	PNB
Randon Participações	Vehicles and parts	RAPT4	PN
Recrusul	Vehicles and parts	RCSL4	PN
Sansuy Indústria de Plásticos	Other	SNSY5	PNA
Companhia Siderúrgica Nacional	Steelmaking and Metallurgy	CSNA3	ON
Souza Cruz	Other	CRUZ3	ON
Construtora Sultepa	Construction	SULT4	PN
Suzano Papel	Paper and Cellulose	SUZB5	PNA
Teka	Textile	TEKA4	PN
Telemar	Telecommunications	TMAR3	ON
Telesp	Telecommunications	TLPP3	ON
Telesp	Telecommunications	TLPP4	PN
Unipar Participações	Chemical industry	UNIP6	PNB
Usiminas	Steelmaking and Metallurgy	USIM3	ON
Usiminas	Steelmaking and Metallurgy	USIM5	PNA
Vale	Mining	VALE3	ON
Vale	Mining	VALE5	PNA
Valefert	Chemical industry	FFTL4	PN
Wetzel S/A	Vehicles and parts	MWET4	PN
Whirlpool	Electronics	WHRL4	PN
Wlm Indústria e Comércio	Commerce	SGAS4	PN
Yara Brasil Fertilizantes	Chemical industry	ILMD4	PN

Table AI.

Corresponding author

Rebeca Cordeiro da Cunha Araújo can be contacted at: rebecacordeiro1@gmail.com

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