How is firm leverage related to other firm-level variables?

- An empirical research based on three capital structure theories



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Table of Contents

Abstract	3
Introduction	3
Data & Methodology	5
Results	7
Conslusion	15
References & Appendix	16

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Abstract

This report analyses how firm leverage is related to other firm-level variables based on the Modigliani-Miller-Theorem, the static trade-off theory of capital structure as well as the pecking order theory. By analysing the real-life panel-data of 1710 firms over several years, we find out that the leverage ratio is statistically significant correlated with profitability, tangibility, the logarithm of sales and profitability of the firm. Apart from this, we conclude that the trade-off theory may be in the most keeping with the financing method of firms. We utilise the OLS regression model to estimate our hypothesis.

Introduction

Financial leverage is essential to the survival of a company. It is the debt-to-asset ratio, which measures how much capital comes in the form of debt and indicates the use of company financial resources. As market expansion capital of companies is always limited, they can use debt to finance assets acquisitions. Therefore, leverage can help companies determine how much they can borrow to increase their profitability. There is, however, no fixed answer to the question of how leverage is related to other firm-level variables, and we used the following three theories as assistance mediums to determine just that.

The first one is the Modigliani-Miller(MM) theorem stating that in well-functioning markets without taxes, bankruptcy costs, agency costs, and asymmetric information, the market value of the firm is unaffected by how the firm is financed. Then comes the static trade-off theory, which suggests that firms are supposed to substitute debt for equity or vice versa until the value of the firm is maximised, which means there has to be one optimal point of a debt-equity ratio The last pecking order theory

points out that firms financing sources follow an order, they prioritise the internal financing, then debt and lastly equity. Since managers know more about the company than shareholders do, issuing debt indicates an under-valuation of a stock signalling their confidence in the company, while the issuance of equity would signal an over-valuation.

The paper form S. C. Myers has given us a good starting point of testing the best capital structure, and it makes us predict that the trade-off theory may be the best fit of strategic choices for a firm. Given the importance of debt financing and taxes, Myers points out that static trade-off theory makes sense to some extent. However, as its R² value is too low in the empirical observations, and the actual debt ratios vary widely across similar firms, the trade-off theory should find a middle point between itself and the pecking order theory, namely by introducing adjustment costs, possibly including those stemming from asymmetric information and agency problems to make it more applicable.

Based on the theories above, we have drawn the following hypothesis: Debt is essential to the firm financing policy. So leverage, as a standard measurement of the debt load degree, should be strongly

To prove our hypothesis, we use the real-life panel-data of 1710 firms amounting to 5358 observations over several years, to see the extent of relations between leverage and the market-to-book ratio, tangibility and sales revenue as the logarithm of net sales. We run regressions under several different conditions as well as observing the variables individually to see the mean, minimum and maximum. Market-to-book serves as a proxy for growth opportunities and net sales as a proxy for size and profitability.

related to other firm-level variables.

Our finding shows that the leverage is statistically significant correlated with profitability, tangibility, the logarithm of sales and profitability on the 1% level and that the optimal debt-equity ratio is greater than 0. The effect of leverage on our four specified variables is independent of the industry sector, so the importance of debt financing in firms is proven regardless of the industry type.

To be exact, we find a positive correlation between the debt amount of the company and the number of tangible assets the company holds, as well as the number of log-sales it has. Market-to-book ratio

and profitability have a relatively weak to very weak negative correlation with leverage. Moreover, in our sample, the leverage has a mean of 0.269 and 603 observations have 0 leverage. As expected, the group with 0 leverage has a lower tangibility and log-sale value than the observations with leverage over 0. The average market-to-book ratio is also higher than the market-to-book ratio in the 0-leverage sample. However, interestingly, the value of profitability is negative, which indicates that the trade-off theory may hold the truth.

Data & Methodology

Upon gaining access to our data sample consisting of 7705 observations, we need to clean up the non-relevant data firstly to ensure our result correctness. As we focus only on the US dollar, we start with unifying our data by dropping all observations whose currencies are not USD, which helps us to limit our sample size to 7514. Then, we exclude the observations which are missing value in total assets. After the basic configuration, we were left with 7513 observations.

The next step we take is generating our variables. We start with the leverage (lev), which is the sum of long term debt and debt in current liabilities all divided by the book value of total assets ((long term debt + debt in current liabilities) / total assets). Then comes the tangibility (tan), namely the ratio of net property, plant and equipment to the book value of total assets. The third variable that we generate is the logarithm for net sales (log_sale) that stands for the sales revenue and the company size. The last two variables we considered in relations to leverage are market-to-book ratio(mb) and the profitability measurement ROA(roa). The mb represents the growth opportunities and profitability of a company, (total assets – common/ordinary equity + price per share * shares outstanding) / total assets is its expression.

Only doing basic univariate tests on these variables with ranges from min to max would not make sense due to the outliers. For example, a maximum of leverage ratio 881 and the minimum of

profitability -474 are incredibly unrealistic because the mean values of both are only 0.503 and -0.230, respectively. Considering the fact that only the mb under the two-digit level is considered to be reasonable, a ratio of 1673 would signal an unreal overvaluation.

Also, a tan ratio of 0.992 means that the firm has almost 0 intangible assets, which is unreasonable, too. Unlike other variables, log_sale does not appear to have a huge outlier, but it still skews the expected results. More data details can be found in the appendix below (Table A).

To prevent errors that may be generated by outliers, we winsorize our data on the 1% level by replacing the bottom 1% with the variable at the 1% level and equally on the 99% level. We will only talk about the winsorized data from now on, which will also be acknowledged by the W standing before the variable name. Our last step in the data-slicing process is eliminating observations that have one missing value in one of our five variables. After this step, we have filtered our sample to 5358 observations of 1710 firms over a total maximum of 12 years from 2005 to 2017.

Having cleaned our data, we want to take a look at each specific variable and examine them. Instead of doing a simple correlation test, we used the significance command to see not only the correlations but also the p-values to determine the usefulness of each variable in drawing any conclusions.

To refute our null hypothesis stating that leverage does not affect firm-specific variables, we looked

for all the observations in our sample without leverage data by generating a dummy variable equal to 0 and replacing Wlev = 0 by Wlev=1. The total amount of observations in our sample with Wlev = 0 is 603. The mean is the fraction of total observations meaning that 11.2542% of our observations have the Wlev ratio of 0. (Table D)

We also want to figure out the fraction of firms with Wlev=0. We have managed to collect this data by collapsing the minimum and maximum value of our Wlev data by generating a new variable called alwayszero if the minimum and the maximum is equal to 0. The results show us that 9.59% of firms have 0 in Wlev every year.

Since our main objective is to see if there exist differences in the specific firm variables with Wlev \geq 0 and Wlev == 0, we have done four univariate T-tests on Wtan, Wmb, Wsale and Wroa between our

original sample and the dummy null sample. Having done that, we finally get to the regressions. We used the OLS – Regression based on the following equation:

$$Wlev = \beta_0 + \beta_1 Wtan + \beta_2 Wmb + \beta_3 Wsale + \beta_4 Wroa + \epsilon$$
 Equation 1

We then included year and sector dummies in our previous regression because we have not only different years in our panel data but also SIC-sectors of firms,

Equation 2

Wlev =
$$\beta 0 + \beta 1 \text{ Wtan} + \beta 2 \text{ Wmb} + \beta 3 \text{ Wsale} + \beta 4 \text{ Wroa} + \sum_{d=5}^{17} \beta d \sum_{e=5}^{17} f y ear f + \sum_{f=18}^{92} \beta f \sum_{g=18}^{92} sic2 + \varepsilon$$

we need to determine if an industry sector has a specific effect on leverage.

In the next step instead of including sector dummies, we used the fixed effects model on the variable gvkey in our model with year dummies to see if there were any differences. We have to use the fixed effects model to try and refute our hypothesis that the optimal leverage ratio is equal for every firm and every year.

Results

The information we gather from our basic univariate test is that our extremes for Wlev are realistic, and have a wider variation in the upper percentile. Wmb also has a higher variation in the upper percentiles where the maximum far deviates from the minimum of the mean. We interpret a low Wmb as a stock being undervalued and a high Wmb as an overvaluation.

Wtan is distributed almost equally in our sample and shows a good variety of different kind of firms, although the maximum is still an outlier; Wsale which we use as a proxy for size is normally distributed, and the only variable that does not show uniformity is Wroa, our proxy for profitability.

The values are deformed negatively, but we have decided that even though the variation is quite substantial, we would not want to influence the data sample any more.

The Stata results in Table C show that the correlation of Wroa is statistically significant on the p<0.05 level, while the other four variables on the p<0.01 level. The tangibility ratio has a positive but relatively weaker correlation with regard to the leverage. So we conclude that there is a significant positive relationship between the debt and the number of tangible assets the firm owns. In addition, the weak negative correlation between Wmb and Wlev may stem from the fact that as overvaluation rises, issuance of equity gets more profitable for shareholders than the acquisition of debt. (Table C) Since debt is easier to acquire than equity, it makes sense that the bigger the company is, the higher the leverage ratio it has. And as the correlation of Wroa is too weak, it is hard to make a conclusive argument out of this matrix.

We then come to find the fraction with 0 leverage. Having a sample of observations with no leverage gives us the ability to do a reverse causality test, where we test that if there is no leverage at all the optimal leverage ratio does not exist. Before we do that, we look at the number of firms that have 0 leverage every year in our sample, which amounts to 9.59% of firms (Table E).

The following t-test is made to compare the positive leverage sample with the zero leverage sample. We used it to examine the trade-off theory using empirical research. We expect to find evidence of an optimal leverage ratio (Table F below and in appendix).

Group	Obs	Mean	Std. Err.	Std. Dev.	[95% Conf.	Interval]
0	4,755	.3401695	.0032607	.2248469	.333777	.346562
1	603	.1629306	.0075206	.1846763	.1481607	.1777004
combined	5,358	.3202227	.0031104	.2276754	.314125	.3263203
diff		.1772389	.0095403		.158536	.1959419
diff =	mean(0) -	mean(1)			t ·	- 18.5778
Ho: diff =				4	of freedom :	= 5356

The earlier found positive correlation can also be observed here and is statistically significant because a t-value of 18.5 is equal to a p-value < 0.01. The mean that the sample with a Wlev > 0 shows a significantly higher mean than the sample with Wlev = 0. This confirms that as Wlev increases, Wtan increases.

Below is our second t-test result (Table G); it examines the mean between the two leverage samples and finds, that the sample with zero Wlev has a higher mean Wmb than the positive Wlev sample. This is also in line with what we found in our correlation that stated, if the Wmb increases, Wlev decreases. The t-test is statistically significant on the p < 0.01 level.

. ttest Wm	b, by (Dum	mynull)				
Two-sample	t test wi	th equal var	iances			
		Mean		Std. Dev.	[95% Conf.	Interval
0 1	4,755 603	2.23449 3.351932	.0312008 .1283295			
combined	5,358	2.360249	.031595			
		-1.117442				
diff = Ho: diff =	mean(0) -	mean(1)		degrees	of freedom	= -11.308 = 535
Ha: di Pr(T < t)		Pr(Ha: d Pr(T > t	

The Pecking-order theory states exactly this occurrence, where an overvalued company is more likely to issue equity than taking on additional debt because equity is more accessible and cheaper to them.

The logarithm of net sales, Wsale has a weak positive correlation and shows the same premise in our t-test here.

Moreover, we find that the sample with positive leverage has a higher mean of Wsale than the sample with zero leverage. The test is also significant on the p < 0.01 level. It presents a clear correlation between firm size and leverage ratio, which shows the easier acquisition of debt over equity again. (Table H).

```
. ttest Wroa, by (Dummynull)
Two-sample t test with equal variances
  Group | Obs Mean Std. Err. Std. Dev. [95% Conf. Interval]
    0 | 4,755 .0175374 .0053108 .3662164 .0071257 .0279491
1 | 603 -.0804727 .0209891 .5154105 -.1216936 -.0392519
combined | 5,358 .0065072 .0052881 .3870792 -.0038596
                                                    .016874
______
  diff | .0980102 .0166806
                                           .0653093
______
                                   t = 5.8757
degrees of freedom = 5356
   diff = mean(0) - mean(1)
Ho: diff = 0
  Ha: diff < 0
                        Ha: diff != 0
                                               Ha: diff > 0
Pr(T < t) = 1.0000 Pr(|T| > |t|) = 0.0000 Pr(T > t) = 0.0000
```

We have a statistically significant t-test on the p <0.01 level and can see that the average profitability is higher for firms with leverage. We also see mean negative profitability for the sample with leverage = 0 standing in contradiction to the correlation matrix. What this shows us, is that the Trade-off Theory holds true, there is an optimal leverage ratio, and it is neither 0 nor our mean in this sample. Otherwise, the Wroa would be positive for our sample with Wlev = 0 (Table I)

reg Wlev Wta	n Wmb Wsal	e Wroa						
Source	SS		df	MS	Number	of ob	s =	5,358
					F(4, 53	53)	-	152.89
Model	38.47287	32	4	9.61821829	Prob >	F	-	0.0000
Residual	336.7482	44	5,353	.062908321	R-squar	ed	-	0.1025
				_	Adj R-s	quare	d =	0.1019
Total	375.2211	18	5,357	.070043143	Root MS	Е	-	.25082
Wlev	Coef	. Std	Err.	t	P> t	[95%	Conf.	Interval]
Wtan	.28702	6 .0	15522	18.49	0.000	.2565	966	.3174553
Wmb	017342	6 .00	17083	-10.15	0.000 -	.0206	915	0139936
Wsale	.01092	3 .00	18087	6.04	0.000	.0073	773	.0144687
Wroa	131242	8 .01	12315	-11.69	0.000 -	.1532	612	1092245
					0.000		396	.1974524

This is our equation 1 regression. Every one of our variables as well as the constant, is statistically significant on the p < 0.01 level. Our R^2 is 0.1025, telling us that the explanatory variables explanations account for 10.25% of the movements that leverage has in our model. Wtan, as well as Wsale hold a positive relationship with leverage, with almost the same values as in the correlation matrix. Wsale being a logarithmic operator shows the stated percent point increase in leverage for every unit that it raises while the linear explanatory variables show their value as a unit decrease or increase on leverage. The stark contrast is seen in Wroa and Wmb. Wroa increases in negative value from - 0.039 to - 0.13 and decreases from - 0.1258 to -0,173. Important is that Wroa contradicts our t-test here because we saw a positive correlation between Wroa and Wlev there. This has to do with

the before mentioned the trade-off theory. Our constant, which is the value of leverage if every here stated explanatory variable was 0 is 0.179.

Source	SS	df	MS		per of obs =	-,
			1 00040540	100000000000000000000000000000000000000	7 02///	
Model	82.2788389		1.02848549			
Residual	292.942279	5,277	.055513034	R-sc	quared =	
					R-squared =	
Total	375.221118	5,357	.070043143	Root	: MSE =	.23561
Wlev	Coef.	Std. Err.	t	P> t	[95% Conf.	Interval]
dmW	0098605	.0016846		0.000	013163	006558
Wtan	.2942219	.0192194	15.31	0.000	.256544	.3318998
Wsale	.017246	.0018728		0.000	.0135745	.0209175
Wroa	1376772	.0109257	-12.60	0.000	1590962	1162583
fyear						
2006	.0311943	.0249364		0.211	0176914	.08008
2007	.0454069	.0231398		0.050	.0000432	.0907705
2008	.0565928	.0229032		0.014	.011693	.1014926
2009	.0491495	.0228141		0.031	.0044243	.0938746
2010	.0390284	.0227479	1.72	0.086	0055669	.0836236
2011	.0146061	.0223051	0.65	0.513	029121	.0583333
2012	0029582	.0220229		0.893	0461323	.0402159
2013	031514	.0217594	-1.45	0.148	0741715	.0111434
2014	0362165	.0232471	-1.56	0.119	0817903	.0093573
2015	0013488	.0245909	-0.05	0.956	0495571	.0468595
2016	.0513899	.0338203		0.129	0149119	.1176917
2017	.0662206	.0815855		0.417	0937207	.226162
sic_2			(20)229			12122212
7	.2175188	.2385955		0.362	2502272	.6852647
10	.2659827	.1713678		0.121	0699691	.6019344
13	0885891	.0506785		0.081	1879399	.0107616
14	.0293451	.0959663		0.760	1587887	.2174788
15	.3003676	.0692595		0.000	.1645903	.436145
16	0405335	.055396		0.464	1491326	.0680656
17	074259	.0625667		0.235	1969156	.0483975
20	.0488172	.0398584		0.221	0293217	.1269562
21	517362	.2404866		0.031	9888152	0459089
22	.0908832	.0453673		0.045	.0019444	.179822
23	0420035	.0662979	-0.63	0.526	1719748	.0879677
24	.1181108	.0564708	2.09	0.037	.0074046	.228817
25	.1035779	.0549136	1.89	0.059	0040754	.2112312
26	0054583	.0466819	-0.12	0.907	0969741	.0860575
27 j	000117	.0440227		0.998	0864196	.0861856
28	030554	.0376318	-0.81	0.417	1043279	.04322
29	1484657	.0863971		0.086	3178398	.0209083
30	.035054	.0435461		0.421	0503145	.1204224
31	.2250002	.111384		0.043	.0066413	.443359
32	.1139836	.0591481		0.054	001971	.2299383
33	0019585	.041862		0.963	0840252	.0801083
34	.0514006	.0465868		0.270	0399287	.1427299
35	.0006732	.0384853		0.986	0747739	.0761203
36	.0149424	.0374267		0.690	0584293	.0883142
37		.03/426/		0.046		
550,500	.0844975				.0015068	.1674883
38	.0238792	.0379559		0.529	0505301	.0982885
39	.0254105	.048736	0.52	0.602	0701322	.1209533

41	.3523123	.2385813	1.48	0.140	1154057	.8200303
42	.1053798	.047813	2.20	0.028	.0116465	.199113
44	.001688	.0498988	0.03	0.973	0961343	.0995103
45	.1057701	.0584213	1.81	0.070	0087598	.2203
47	0421847	.0826641	-0.51	0.610	2042404	.1198711
48	.1610784	.0405352	3.97	0.000	.0816125	.2405442
49	.0191388	.0434346	0.44	0.659	066011	.1042886
50	.0594738	.0433597	1.37	0.170	0255292	.1444768
51	.182505	.0448705	4.07	0.000	.0945402	.2704698
52	.0449518	.0661634	0.68	0.497	0847558	.1746595
53	0054044	.0460343	-0.12	0.907	0956507	.0848419
54	.0227915	.0442311	0.52	0.606	0639197	.1095028
55	.1407021	.0548051	2.57	0.010	.0332614	.2481427
56	136471	.0473036	-2.89	0.004	2292056	0437363
57	0476708	.0492134	-0.97	0.333	1441494	.0488079
58	0586766	.0398467	-1.47	0.141	1367926	.0194394
59	0173762	.0440417	-0.39	0.693	1037162	.0689638
60	.1294259	.1233027	1.05	0.294	1122984	.3711502
61	.4459795	.0524818	8.50	0.000	.3430935	.5488656
62	0210865	.0664612	-0.32	0.751	1513779	.1092049
63	0372952	.0455479	-0.82	0.413	126588	.0519976
64	124564	.0572175	-2.18	0.030	236734	012394
65	.0276146	.0500157	0.55	0.581	0704368	.1256661
67	.1965563	.0391675	5.02	0.000	.1197718	.2733408
70 I	.3781535	.0560938	6.74	0.000	.2681864	.4881205
72 i	0211536	.0627348	-0.34	0.736	1441398	.1018325
73 j	0131549	.0372404	-0.35	0.724	0861614	.0598516
75 I	.3038109	.0689839	4.40	0.000	.168574	.4390478
76 I	1332462	.0959535	-1.39	0.165	3213547	.0548622
78 I	.0907121	.0451134	2.01	0.044	.0022712	.1791529
79 I	.1118421	.0471311	2.37	0.018	.0194456	.2042386
80 i	.1050313	.038815	2.71	0.007	.0289379	.1811247
81 j	0966486	.2387524	-0.40	0.686	5647021	.3714049
82	0045672	.0583664	-0.08	0.938	1189895	.1098551
83 j	.1349853	.0674938	2.00	0.046	.0026695	.267301
87 i	0080113	.0419465	-0.19	0.849	0902438	.0742212
99	.0509305	.044158	1.15	0.249	0356375	.1374985
cons	.086995	.0422668	2.06	0.040	.0041345	.1698555

In our regression (TABLE J) we included year and sector dummy variables to see if there was a specific year that affected the leverage ratio and if the industry sector a firm resides in has an impact as well. We find a bigger R² by using the extra dummy variables, which doubled to now 21.93%. It is important to note that the year 2005 and SIC-sector 1 have been omitted because of a collinearity problem. Taking a look at the statistical significances, we can see the years 2007, 2008, 2009, having a real significant impact on the leverage ratio. The financial crisis, where firms took on additional debt is probably the cause of that. The higher R² is deceived, though because generating this, and many dummy variables create so much noise that it numbs out the gains from the additional data.

Our real differences in the regression model are, Wmb has become a little less negative, Wtan has risen marginally, Wsale has risen from 0.109 to 0.172, and the Wroa is almost precisely the same.

. asdoc xtreg (File Myfile.c					med)	
Fixed-effects Group variable		cession			of obs = of groups =	5,358 1,710
R-sq: within = between = overall =	0.0964			Obs per	group: min = avg = max =	1 3.1 12
corr(u_i, Xb)	= -0.0646			F(16,36 Prob >	50 St. 10 St	18.34 0.0000
Wlev	Coef.	Std. Err.	t	P> t	[95% Conf.	Interval]
Wtan Wmb Wroa Wsale	.002298 107285	.0308214 .0018735 .0123244 .004717	1.23 -8.71		.1679944 0013752 1314484 .0191092	.0059712 0831216
fyear 2006 2007 2008 2009 2010	.0215959 .0440497 .0713185 .0736379 .0800852	.017154 .0166882 .0167029 .0167996 .0169996	1.26 2.64 4.27 4.38 4.71	0.208 0.008 0.000 0.000 0.000	0120365 .0113305 .0385705 .0407004 .0467556	.1040665

2011	.0680091	.0168615	4.03	0.000	.0349502	.101068
2012	.0626584	.0169621	3.69	0.000	.0294021	.0959146 🧸
2013	.0481614	.0172518	2.79	0.005	.0143372	.0819855
2014	.0597768	.0188699	3.17	0.002	.0227802	.0967734
2015	.1064072	.021896	4.86	0.000	.0634775	.1493368
2016	.1565615	.0338673	4.62	0.000	.0901606	.2229624
2017	.0426292	.0686421	0.62	0.535	0919517	.1772101
cons	.0244226	.0231646	1.05	0.292	0209944	.0698395
sigma_u	.22952773					
sigma e	.15187368					
rho	.69549777	(fraction o	of variar	nce due t	o u_i)	

By having fixed effects within the group, we see a definite change in regards to our equation 1. Here we have every variable but Wmb and our constant statistically significant on the p < 0.01 level and have every year besides 2006 and 2017 on the p < 0.01 level as well.

Since the constant is not statistically significant, we can not refute the null hypothesis that the optimal leverage ratio is the same for every firm.

Conclusion

In conclusion, we can see from the low R² in every regression model, that we did not gather all the necessary control variables to explain the influence of leverage on a firm. We gathered that leverage and tangibility have a positive correlation, leverage and the logarithm of net sales, as a proxy for firm size in our research, are positively correlated as well and show that in the regression. Market-to-book ratio is negatively correlated with leverage meaning an increase in Wmb equals a decrease in Wlev. We explained that correlation because of the profitability that issuance of equity has when a firm is overvalued. Our most significant finding, however, was the confirmation of the Trade-Off Theory and the Pecking Order Theory. We saw that a firm has an optimal leverage ratio, because while it was negatively correlated with leverage when we had a mean of 0.269 and was negatively correlated in our regressions, we found that if we set Wlev to 0 the profitability is lower for the firms with 0 Wlev than with a definite amount of leverage. This proves that there is an optimal debt-equity ratio the negative correlation between Wmb and Wlev also show us that overvalued firm issue equity more than debt. In conclusion, we also want to add that we would have liked the variable of liquidity to play a role in our statistical analysis. Its relation to leverage is interesting because it determines the ability to repay the debt without raising additional external capital and should, in theory, work like the Wtan ratio.

References

S. C. Myers (July. 1984), *The Capital Structure Puzzle*, https://onlinelibrary.wiley.com/doi/full/10.1111/j.1540-6261.1984.tb03646.x

Appendix

Variable	Obs	Mean	Std. Dev.	Min	Max
lev	7,492	.50269	10.30578	0	881
tan	7,496	.3164887	.233008	0	.9919075
mb	5,559	3.088316	25.51958	.1993789	1673.361
roa	7,454	2302782	6.563043	-474	13.52381
log sale	7,223	3.51806	2.494934	-6.907755	11.27902

(Table A)

variable		mean	sd	min	p10	p50	p90
Wlev Wmb Wtan Wsale Wroa		.2685552 2.360249 .3202227 3.642214 .0065072		0 .5806862 0 -3.057608 -3.370349		.2138729 1.580133 .2928405 3.825048 .1081953	.6032981 4.474691 .6508325 6.445059 .2400126
variable		max	N				
Wlev Wmb Wtan Wsale Wroa		1.94633 17.14726 .9063205 8.967759 .4677013	5358 5358 5358 5358 5358				

(Table B)

. pwcorr Wlev	Wmb Wtan W	sale Wroa,	sig		
	Wlev	Wmb	Wtan	Wsale	Wroa
Wlev	1.0000				
Wmb	-0.1258 0.0000	1.0000			
Wtan	0.2658	-0.1221 0.0000	1.0000		
Wsale	0.1083	-0.3716 0.0000	0.2403 0.0000	1.0000	
Wroa	-0.0389 0.0044	-0.4770 0.0000	0.1182 0.0000	0.5376	1.0000

Variable	Obs	Mean	Std. Dev.	Min	Max
Dummynull	5,358	.112542	.3160616	0	1

(Table D)

Variable	Obs	Mean	Std. Dev.	Min	Max
alwayszero	1,710	.0959064	.294549	0	1

(Table E)

. ttest Wi	tan, by (Du	mmynull)				
Two-sample	e t test wi	th equal var	iances			
Group	Obs	Mean	Std. Err.	Std. Dev.	[95% Conf.	Interval]
0	4,755 603	.3401695 .1629306		.2248469		.346562
combined	5,358	.3202227	.0031104	.2276754	.314125	.3263203
diff		.1772389	.0095403		.158536	.1959419
diff =	= mean(0) - = 0	mean(1)		degrees	t = of freedom =	18.5778 5356
Ha: di	ff < 0		Ha: diff !=	0	Ha: di	ff > 0
Pr (T < t)	= 1.0000	Pr{	T > t = 0	0.0000	Pr (T > t)	= 0.0000

(Table F)

```
. ttest Wmb, by (Dummynull)
Two-sample t test with equal variances
  Group
              Obs
                         Mean
                                 Std. Err.
                                            Std. Dev.
                                                       [95% Conf. Interval]
      0
            4,755
                      2.23449
                                .0312008
                                            2.151497
                                                        2.173322
                                                                   2.295658
              603
                     3.351932
                                .1283295
                                            3.151267
                                                       3.099904
                                                                    3,60396
      1
            5,358
                     2.360249
                                .031595
                                              2.3127
                                                        2.29831
                                                                   2.422188
combined
   diff
                    -1.117442
                                .0988105
                                                        -1.31115
                                                                  -.9237329
   diff = mean(0) - mean(1)
                                                                t = -11.3089
Ho: diff = 0
                                               degrees of freedom = 5356
   Ha: diff < 0
                               Ha: diff != 0
                                                            Ha: diff > 0
 Pr\{T < t\} = 0.0000 Pr\{|T| > |t|\} = 0.0000 Pr\{T > t\} = 1.0000
```

(Table G)

Group	Obs	Mean	Std. Err.	Std. Dev.	[95% Conf.	Interval]
0	4,755	3.819528	.032807	2.262259	3.755211	3.883845
1	603	2.243992	.0945386	2.321495	2.058326	2.429657
combined	5,358	3.642214	.0317328	2.322788	3.580005	3.704423
diff		1.575536	.0980846		1.383251	1.767822
diff =	mean(0) -	mean(1)			t ·	= 16.0630
Ho: diff =	0			degrees	of freedom	= 5356
Ha: di	ff < 0		Ha: diff !=	0	Ha: d	iff > 0
Pr(T < t) = 1.0000		Pr(T > t) = 0.0000			$Pr\{T > t$	= 0.0000

(Table H)

. ttest Wroa, by (Dummynull)

Two-sample t test with equal variances

Group	Obs	Mean	Std. Err.	Std. Dev.	[95% Conf.	Interval]
0	4,755	.0175374	.0053108	.3662164	.0071257	.0279491
1	603	0804727	.0209891	.5154105	1216936	0392519
combined	5,358	.0065072	.0052881	.3870792	0038596	.016874
diff		.0980102	.0166806		.0653093	.130711

diff = mean(0) - mean(1)

t = 5.8757

Ho: diff = 0

degrees of freedom = 5356

Ha: diff < 0

Ha: diff != 0 Pr(T < t) = 1.0000 Pr(|T| > |t|) = 0.0000 Pr(T > t) = 0.0000

Ha: diff > 0

(Table I)

reg Wlev Wta	n www waar	e wroa						
Source	ss		df	MS	Numbe	er of ob	s =	5,358
	_				F(4,	5353)	-	152.89
Model	38.47287	132	4 9	61821829	Prob	> F	-	0.0000
Residual	336.7482	44 !	5,353	062908321	R-squ	uared	-	0.1025
	_				- Adj 1	R-square	d =	0.1019
Total	375.2211	18	5,357	.070043143	Root	MSE	-	. 25082
Wlev	Coef	. Std	Err.	t	P> t	[95%	Conf. I	nterval]
Wtan	.28702	26 .0	15522	18.49	0.000	.2565	966	.3174553
Wmb	017342	6 .00	17083	-10.15	0.000	0206	915 -	.0139936
Wsale	.01092	.00	18087	6.04	0.000	.0073	773	.0144687
Wroa	131242	8 .01	12315	-11.69	0.000	1532	612 -	.1092245
cons	.17864	6 .009	95931	18.62	0.000	.1598	396	.1974524

(Table J)

Source	SS	df	MS			= 5,358 = 18.53
Model	82.2788389	80	1.02848549	100011000000000000000000000000000000000		= 0.0000
Residual	292.942279	5,277	.055513034		uared	
residual		3,277	.033313031	. Adi	R-squared	= 0.2074
Total	375.221118	5,357	.070043143			= .23561
Wlev	Coef.	Std. Err.	t	P> t	[95% Conf	. Interval]
Wmb	0098605	.0016846		0.000	013163	006558
Wtan	.2942219	.0192194		0.000	.256544	.3318998
Wsale	.017246			0.000	.0135745	.0209175
Wroa	1376772	.0109257	-12.60	0.000	1590962	1162583
fyear						
2006	.0311943	.0249364		0.211	0176914	.08008
2007	.0454069	.0231398		0.050	.0000432	.0907705
2008	.0565928	.0229032		0.014	.011693	.1014926
2009	.0491495	.0228141		0.031	.0044243	.0938746
2010	.0390284	.0227479		0.086	0055669	.0836236
2011	.0146061	.0223051		0.513	029121	.0583333
2012	0029582	.0220229		0.893	0461323	.0402159
2013	031514	.0217594		0.148	0741715	.0111434
2014 2015	0362165 0013488	.0232471	-1.56 -0.05		0817903 0495571	.0093573 .0468595
2015	.0513899	.0338203		0.129	0149119	.1176917
2017	.0662206	.0815855		0.417	0937207	.226162
sic 2						
7	.2175188	.2385955	0.91	0.362	2502272	.6852647
10	.2659827	.1713678		0.121	0699691	.6019344
13	0885891	.0506785		0.081	1879399	.0107616
14	.0293451	.0959663		0.760	1587887	.2174788
15	.3003676	.0692595		0.000	.1645903	.436145
16	0405335	.055396	-0.73	0.464	1491326	.0680656
17	074259	.0625667	-1.19	0.235	1969156	.0483975
20	.0488172	.0398584		0.221	0293217	.1269562
21	517362	.2404866		0.031	9888152	0459089
22	.0908832	.0453673		0.045	.0019444	.179822
23	0420035	.0662979	-0.63	0.526		.0879677
24	.1181108	.0564708		0.037	.0074046	.228817
25	.1035779	.0549136		0.059	0040754	.2112312
26	0054583	.0466819		0.907	0969741	.0860575
27	000117	.0440227		0.998	0864196	.0861856
28	030554	.0376318		0.417	1043279	.04322
29	1484657	.0863971		0.086	3178398	.0209083
30	.035054	.0435461		0.421	0503145	.1204224
31	.2250002	.111384		0.043	.0066413	.443359
32	.1139836	.0591481		0.054	001971	.2299383
33 34	0019585 .0514006	.041862		0.963	0840252 0399287	.0801083 .1427299
35	.0006732	.0384853		0.986	0747739	.0761203
36	.0149424	.0374267		0.690	0584293	.0883142
37	.0844975	.0423333		0.046	.0015068	.1674883
38	.0238792	.0379559		0.529	0505301	.0982885
39	.0254105	.048736		0.602	0701322	.1209533
32 1	.020.100		0.02		10,01022	.120000

41	.3523123	.2385813	1.48	0.140	1154057	.8200303
42	.1053798	.047813	2.20	0.028	.0116465	.199113
44	.001688	.0498988	0.03	0.973	0961343	.0995103
45	.1057701	.0584213	1.81	0.070	0087598	.2203
47	0421847	.0826641	-0.51	0.610	2042404	.1198711
48	.1610784	.0405352	3.97	0.000	.0816125	.2405442
49	.0191388	.0434346	0.44	0.659	066011	.1042886
50	.0594738	.0433597	1.37	0.170	0255292	.1444768
51	.182505	.0448705	4.07	0.000	.0945402	.2704698
52	.0449518	.0661634	0.68	0.497	0847558	.1746595
53	0054044	.0460343	-0.12	0.907	0956507	.0848419
54	.0227915	.0442311	0.52	0.606	0639197	.1095028
55	.1407021	.0548051	2.57	0.010	.0332614	.2481427
56	136471	.0473036	-2.89	0.004	2292056	0437363
57	0476708	.0492134	-0.97	0.333	1441494	.0488079
58	0586766	.0398467	-1.47	0.141	1367926	.0194394
59	0173762	.0440417	-0.39	0.693	1037162	.0689638
60	.1294259	.1233027	1.05	0.294	1122984	.3711502
61	.4459795	.0524818	8.50	0.000	.3430935	.5488656
62	0210865	.0664612	-0.32	0.751	1513779	.1092049
63	0372952	.0455479	-0.82	0.413	126588	.0519976
64	124564	.0572175	-2.18	0.030	236734	012394
65	.0276146	.0500157	0.55	0.581	0704368	.1256661
67	.1965563	.0391675	5.02	0.000	.1197718	.2733408
70 I	.3781535	.0560938	6.74	0.000	.2681864	.4881205
72	0211536	.0627348	-0.34	0.736	1441398	.1018325
73	0131549	.0372404	-0.35	0.724	0861614	.0598516
75	.3038109	.0689839	4.40	0.000	.168574	.4390478
76 I	1332462	.0959535	-1.39	0.165	3213547	.0548622
78 i	.0907121	.0451134	2.01	0.044	.0022712	.1791529
79 i	.1118421	.0471311	2.37	0.018	.0194456	.2042386
80 i	.1050313	.038815	2.71	0.007	.0289379	.1811247
81	0966486	.2387524	-0.40	0.686	5647021	.3714049
82 i	0045672	.0583664	-0.08	0.938	1189895	.1098551
83	.1349853	.0674938	2.00	0.046	.0026695	.267301
87	0080113	.0419465	-0.19	0.849	0902438	.0742212
99	.0509305	.044158	1.15	0.249	0356375	.1374985
cons	.086995	.0422668	2.06	0.040	.0041345	.1698555

(Table K)

```
. asdoc xtreg Wlev Wtan Wmb Wroa Wsale i.fvear,fe
(File Myfile.doc already exists, option append was assumed)
                                                                             Number of obs = 5,358
Number of groups = 1,710
Fixed-effects (within) regression
Group variable: Dgvkey
                                                                             Obs per group:
                                                                                                                     1
3.1
        within = 0.0747
                                                                                                  min =
       between = 0.0964
                                                                                                   avg =
        overall = 0.0686
                                                                                                   max =
                                                                             F(16,3632)
                                                                                                = 0.0000
                                                                             Prob > F
corr(u_i, Xb) = -0.0646
           Wlev | Coef. Std. Err. t P>|t| [95% Conf. Interval]

      Wtan |
      .2284233
      .0308214
      7.41
      0.000
      .1679944
      .2888522

      Wmb |
      .002298
      .0018735
      1.23
      0.220
      -.0013752
      .0059712

      Wroa |
      -.107285
      .0123244
      -8.71
      0.000
      -.1314484
      -.0831216

      Wsale |
      .0283575
      .004717
      6.01
      0.000
      .0191092
      .0376059

           fyear |

      .0215959
      .017154
      1.26
      0.208
      -.0120365
      .0552283

      .0440497
      .0166882
      2.64
      0.008
      .0113305
      .0767689

      .0713185
      .0167029
      4.27
      0.000
      .0385705
      .1040665

      .0736379
      .0167996
      4.38
      0.000
      .0407004
      .1065754

      .0800852
      .0169996
      4.71
      0.000
      .0467556
      .1134148

           2006
           2007 |
           2008 |
2009 |
           2010 | .0800852 .0169996
                                                                                                                .1134148
   0.62 0.535 -.0919517
    2017
                   .0426292 .0686421
                                                                                                                   .1772101
                                                                                                                 .0698395
   _cons | .0244226 .0231646 1.05 0.292 -.0209944
```

(Table L)