

# A Study of IPOs Aftermarket Performance:

## **Evidence from Taiwan Stock Market**

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## Abstract

This paper studies the aftermarket stock performance of IPOs in short-run and long-run, and examines whether the long-run underperformance is existing in Taiwan stock market. This paper applies the measure of expected skewness suggested by Zhang (2006) to verify that the highly expected skewed IPO firms are likely to be overpriced and to experience the long-run underperformance. We find that IPO firms are underpriced 48.54% and severely underperform from three to five years in comparison to the reference portfolios. Skewness is reported to be positively related with the level of 1st day's underpricing, however, our findings suggest that this skewness measure can't explain for the long-run phenomenon of IPOs.

Keywords: Aftermarket Performance, IPO, Expected Skewness.

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## 1. Introduction

Examining the existence of IPOs long-run underperformance has a significant implication. First, as Ritter (1991) asserts, the long-run systematic price patterns challenge the efficient market hypothesis. Second, it encourages the active trading strategies of investors, who are fortunate to receive IPO share allocation, will sell it immediately as the trading is started. Third, it implies that cost of external equity capital for the issuing firm will be lower. Additionally, there is considerable variation in the measures of abnormal returns and the statistical tests that empirical researchers are used to detect long-run abnormal stock returns.

Numerous studies have examined long-run performance of initial public offerings. Ritter (1991), Loughran and Ritter (1995) whose studies on U.S. sample of IPOs report the severe underperformance of IPOs relative to a benchmark portfolio from three to five years after their IPO date. The poor long-run performance of IPOs has also been well documented in other markets. Levis (1993), Keloharju (1993), Kooli and Suret (2004) also find the underperformance in British, Finland, and Canadian. This phenomenon is not limited to developed countries, but also extends to emerging markets. Aggarwal et al. (1993) examine IPOs in Brazil, Chile, and Mexico that report short-term returns of 78.5%, 16.7% and 2.8%, respectively.

While developed countries report a persistent result of long-run underperformance, emerging countries have mixed results. Dawson (1987) examines the 1-year market-adjusted return for IPOs in HK, Singapore, and Malaysia during 1978-1984. While the underperformance in HK and Singapore is insignificant, Malaysia IPOs over-perform significantly 18.2%. The same result of Malaysian IPOs with high long-term return up to 3-year after listing is reported in Jelic et al. (2001). Kim et al. 1995) study on 169 IPOs listed on KSE during 1985–1989, revealing that the Korean IPOs outperform seasoned firms with similar characteristics in the first month, quite not statistically different from seasoned firms in the long-run.

Not only examining the existence of long-run underperformance, many researchers suggest some hypotheses to explain the anomaly. Aggarwal and Rivoli (1990) suggest that IPOs are subject to overvaluation or fads caused by over-optimism on the part of investors. Miller (1977) argues that divergence of opinions among investors arises, and investors who hold the most optimistic expectation will lead the demand for a particular security. Over time, as the restriction weakens and more information is revealed, share price will be corrected. Teoh et al. (1998) suggest the overstated earning management by accounting adjustment can fool rational investors, which leads to the underperformance in the long-run when investors adjust the share prices. Barberis and Huang (2008) study the pricing of financial securities in cumulative prospect theory framework, and suggest that if new security is sufficiently skewed, some investors may choose to hold large undiversified position and are willing to pay a very high price for the skewed securities. Thus the skewed securities can become overpriced and earn a very low average return, which can explain for the low long-run average return on IPO stocks.

In Taiwan, the long-run performance has mixed results. Chen (2001) employs multi-factor models and Jensen's alpha to measure the raw and market-adjusted return of long-run performance. He argues that the performance of IPOs in Taiwan is sensitive to the measurement models of expected returns. Under the market adjusted return, the IPOs perform better than the market, while IPOs underperform in the long-run if size and book-to-market effect are taken into consideration. A later study conducted by Cheng and Shiu (2005) employs monthly trimmed buy-and-hold excess return and cumulative abnormal return, and finds a negative three-year abnormal return.

This paper aims to examine the aftermarket performance of Taiwanese IPOs stock extended to five years after the IPO date, and to study whether they outperform or under-perform comparing to the portfolio benchmark. Later, we try to verify if the expected skewness has an explanatory power to predict the initial underpricing and long-run performance of IPO stocks, as the result suggested by Barberis and Huang (2008).

The outline of this paper is as followings. Section 2 focuses on previous studies on the role of security's skewness. Next section discusses the research methods, variables and the sample, followed by the empirical results. The last section offers some concluding remarks.

#### 2. Previous Study on Security's Skewness

Skewness is a measure of the asymmetry of frequency distribution (Aczel, 1989). Distribution can be either skewed to the left or to the right. Positive skew (right-skewed) distribution will have a long tail extends to the right, which the mean and median are both greater than the mode.

Literature suggests that skewness plays an important role in the risky decision-making. Analysis of actual gambling behavior indicates that both gamblers on horse races and lottery have a preference for positive skewness and they will accept a lower expected payoff in return for greater skewness. Asterbro et al. (2011) conduct a laboratory experiment to investigate how positive skew influences risky choices. He finds that risk-averse choices decrease monotonically with an increase in skewness indicating skew-seeking choices. This means that with a preference for skewness, a risk-averse individual will accept a lower-expected return (but not a negative one) or a higher level of overall risk if the distribution of payoffs is more skew to the right. Not only applicable for explaining the gamble behavior, skewness also plays a role in modern asset pricing model. While traditional theory on asset pricing only relies on the mean and variance features of the asset allocation, considerable evidences show that investor preferences go beyond mean and variance to higher moments: skewness and kurtosis (Xiong and Idzorek, 2011). Rubinstein (1973), Kraus and Litzenberger (1976) develop models of expected returns that incorporate skewness, and find that the co-movement with the aggregate market portfolio is a higher moment relevant for individual securities.

Other recent papers suggest that additional features of individual securities' payoff distribution may be relevant for understanding differences in assets' returns. Barberis and Huang (2008) study the

pricing of financial securities when investors make decisions according to cumulative prospect theory. Their results show that probability weighting can have unusual pricing effects in an economy with a positively skewed security. If a new security is sufficiently skewed, some investors may choose to hold large undiversified positions in it, thereby making the distribution of their overall wealth lottery–like. Since investors of cumulative prospect theory overweight the tails of a probability distribution, they love lottery-like distributions, and are therefore willing to pay a very high price for the skewed securities. Thus the skewed securities can become overpriced, relative to the price that would be set by investors who do not weight probabilities, and thus earn a very low average return. Their results suggest the explanation for low long-run average return on IPO stocks, which under the cumulative prospect theory, may not be so puzzling. Nonetheless, the security needs to be sufficiently positively skewed before investors are willing to take undiversified position in it, and to compensate for the lack of diversification in their portfolios.

However, the framework and assumption of Barberis and Huang(2008) explaining the role of expected skewness with asset prices are similar to the optimal expectation theory of Brunnermeier and Parker(2005), Brunnermeier et al.(2007). In their studies, Barberis and Huang (2008) suggest the distinct difference in cumulative prospect theory's prediction. They assert that negatively skewed asset will earn a high average return, while optimal expectation predicts the contradict result. Therefore, this is a premise for us to set up a hypothesis on relation between expected skewness and long-run performance based on cumulative prospect theory.

Conrad et al. (2013) examine the relation of ex-ante skewness with expected stock returns in option price of individual stocks. The result is consistent with Barberis and Huang (2008) and Brunnermeier et al. (2007), which predicts that investors will trade off the benefits of diversification and skewness, and hold more concentrated positions in skewed securities, resulting negative relation between idiosyncratic skewness and expected returns.

Green and Hwang (2011) use the approach of Zhang (2006) to examine the effect of high expected skewness stock with initial returns and long-run performance. They find that IPOs with high expected skewness experience significantly greater first-day return. The skewness effect is stronger during periods of high investor sentiment and is related to differences in skewness across industries as well as time-series variation in the overall level of market skewness. IPOs with high expected skewness earn more negative abnormal returns in one to five years after the IPO issue date. In addition, their results show that the underperformance of IPOs pertain significant only with highly expected skewness, while the medium and low expected skewness are insignificant.

## 3. Data and Methodology

#### 3.1 Data

To examine the aftermarket performance of IPO firms extend to five years after the initial trading, this paper tests the IPO sample with issue date ranging from March 2005 to 2007. Therefore it will cover the stock return data from 2005 to 2012. The sample consists of 121 IPOs of common stocks listed on TSE and OTC markets, and stocks transferring from OTC market to TSE market as well as finance stocks are already excluded. All the data are extracted from Taiwan Economic Journal (TEJ) database.

The reason why March 2005 is chosen to be the beginning for the study of IPOs aftermarket performance is that the price limit rule in Taiwan is loosened for IPOs since March 2005. Therefore, in the first five trading day, IPO stocks can be freely traded without 7% price limit on price fluctuation, which is more efficient to reflect the true investors' expectation with the newly issues. Before this rule is enacted, insufficient supply in the aftermarket of IPOs might happen if the investors expected the intrinsic value higher than 7 percent of the offer price. Therefore, in this period the excess initial return in the honeymoon period is considered as the level of underpricing. By solely examining from March 2005, this paper considers the excess initial return at the 1st trading day will be used to measure the underpricing. The aftermarket period includes the 60 months following the issue, where months are defined as 21-trading-day interval, hence a 1-year window has 252 trading days, a 3-year window has 756 trading days, and 1,260 trading days for 5-year period. The first trading month is started from the 2nd day after the IPO date. Distributions of IPOs are displayed by year and industry as table 1.

# 3.2 Measurement Method3.2.1 Underpricing Measurement

From March 2005, IPO stocks are freely traded without 7% price fluctuation limit for the first five trading days. Therefore, it is expected that the excess initial return reflect all the demand and expectation of investors with the issuing of IPO stocks. Therefore, underpricing is defined as:

$$UP_i = \frac{P_1}{P_0} - \frac{R_{m1}}{R_{m0}}$$
(1)

Where  $P_1$  is the closing price on the 1<sup>st</sup> trading day of the IPO;

P<sub>0</sub> is the offering price of IPO;

R<sub>m1</sub> is the TAIEX market index at the end of the 1<sup>st</sup> trading day;

R<sub>m0</sub> is the TAIEX market index at the end of a trading day before the IPO issue date.

Panel A: Distribution of IPOs b	y issuing year
Year	Number of IPOs
2005	37
2006	34
2007	50
Total	121
Panel B: Distribution of IPOs b	y industry (*: Electronic related industries)
Industry	Number of IPOs
Biotech & Medical	5
Building Material	1
Chemical	2
Comm& Internet*	7
Computer & Peripheral*	13
Elec. Parts & Comp*	25
Elec. Products Dist*	3
Electric & Machinery	6
Information Service*	2
Iron & Steel	3
Optoelectronic*	20
Other Electronic*	11
Others	4
Semiconductor*	18
Trading & Cons	1
Total	121

Table 1: Distributions of IPOs by year and industry

#### 3.2.2 Long-Run Return Measurement

The proper method to measure long-run returns is widely debated. A growing amount of literature questions the methodology used in many empirical long-horizon studies. Barber and Lyon (1997), Kothari and Warner (1997), Barber et al.(1999), Fama (1998) all argue that the method of performance measurement influences both the magnitude of the abnormal returns as well as the size and the power of the statistical test.

There are two choices of long-run return measurement: cumulative abnormal return (CAR) and buy and hold return (BHR). In the study of Barber and Lyon (1997), they assert that CAR is a biased predictor of long–run buy and hold abnormal returns. Cumulative abnormal returns are subject to a measurement bias, a new listing bias, and a skewness bias. Consequently, they favor the use of the BHR method in test design to detect the long-run abnormal stock returns. This paper applies the BHARs over the three- and five-year periods following the offering to measure the long-run stock performance. Abnormal returns are estimated via the size and the book-to-market reference portfolio approaches.

At the end of year before the IPO, all the stocks on market are first ranked by size and created ten deciles on the basic of market value, then they are sorted each of ten size-decile portfolio into five additional portfolios on the basic of book-to-market ratio. After the sorting, we create 50 portfolios based on size and book-to-market ratio. Then each IPO firms will match with one reference portfolio that has the same size and close B/M ratio. The size of IPO firms is measured as the market value of common equity (share outstanding multiplied with first day closing price), while the B/M ratio for IPO firms using the first recorded post-issue book value, and the market capitalization using the closing market price on 1st trading day.

Matching portfolios are not re-ranked again to avoid the new listing bias and rebalancing bias. The reference portfolios returns are calculated by equally weighting the returns of firms in portfolios. Buy-and-hold return for horizon t is defined as:

$$BHAR_{k\tau} = \prod_{t=2}^{\tau} (1+R_{it}) - \prod_{t=2}^{\tau} (1+CR_{it})$$
(2)

BHAR: The Buy-and-hold abnormal returns for k set of comparison.

R<sub>it</sub>: The Buy-and-hold investment return of the IPO firms i at month t.

CR<sub>jt</sub>: The Buy-and-hold investment return for the reference portfolio j at month t.

All the investment returns are adjusted returns which are already adjusted for stock dividends, stock split events, and calculated as below:

$$R_{it} = \frac{(P_t^*(1+\alpha+\beta)+D)}{(P_{t-1}+\alpha^*C)} - 1$$
(3)

P <sub>t</sub> :	Closed price in t.
α:	Purchase rate in current ex-right.
β:	Stock dividend in current ex-right.
C:	Buy price in current ex-right.
D:	Dividend amount.

To test the robustness of long-run abnormal returns, this paper applies the conventional t-statistic mentioned in Barber and Lyon (1999) to test the null hypothesis that the mean of buy-and-hold abnormal return is equal to zero for a sample of n firms, which conventional t-statistic is defined as:

$$t = \frac{\overline{BHAR_T}}{\sigma(BHAR_T)/\sqrt{n}}$$
(4)

Where:  $\overline{BHAR_T} = \frac{1}{N} * \sum_{i=1}^{N} BHAR_{iT}$ 

 $\sigma(BHAR_T)$  – Cross-sectional sample standard deviation of abnormal returns of n firms.

#### 3.2.3 Expected Skewness Measurement

In order to capture the events of small probability, ex-ante skewness is needed to use a long history of returns which raises the concern of survivorship bias. In addition, it can overlook the possibility that the stock's skewness can dramatically change over its life cycle. Zhang (2006) finds an alternative method to measure expected skewness by using group approach. He groups similar stocks with similar characteristics such as industry, size or B/M ratio and calculate cross-sectional skewness with recent returns. By using only recent returns, this method avoids long history dependence. Moreover, it is more likely to capture events of small probabilities with group of stocks than time periods.

Following Zhang (2006) and Green and Hwang (2011), the expected skewness is measured as:

$$Skew_{i,t} = \frac{(P_{99} - P_{50}) - (P_{50} - P_{1})}{(P_{99} - P_{1})}$$
(5)

Pj is the jth percentile of the log monthly return distribution pooled across all stocks, within TSE assigned industry, of IPOi over three months preceding the offering. The distribution is right skewed,

if the right tail is further away from the median than the left tail, or  $Skew_{i,t}$  receives a positive value. The denominator controls for the dispersion of the distribution.

Since companies within an industry share similar characteristics, technologies and react to the same macroeconomics factors, assigning an industry–level to calculate expected skewness likely produce a good estimator. Newly listing firms likely have high expected skewness if their industries recently have high returns. The classification of industries follows the industry classification assigned by TSE.

#### 3.3 Regression Model and Definition of Variables

Multiple regression models are used to test the post-IPO stock performance and the association between the expected skewness and level of underpricing. Dependent variables are underpricing level and BHAR five-year stock performance, while the expected skewness is the independent variable. We include along a variety of control variables based on firm's characteristics, deal characteristics, industry conditions, and market conditions. The description and justification of control variables are presented below:

#### A. Firm's Characteristics

#### (1) Age (Age)

The age variable is defined as the year from the firm's establishment to the IPO date. Beatty and Ritter (1986) suggest that young firms' returns tend to be more positively skewed than older firms' returns, therefore more underpriced in the first day trading. Ritter (1991) asserts that younger IPO firms underperform more than the established firms in the long-run. Hence, Age is expected to have negative relation with underpricing, while positive related with long-run performance.

(2) Industry Dummy (*Electronic*)

The industry variable will receive a value of 1 for electronic firms, while value of 0 for other firms.

Lowry and Shu (2002) suggest the severe underpricing of high-tech IPOs due to the uncertainty with their future growth opportunities. Hence, Variable *Electronic* is expected to positive related with severe underpricing.

(3) Market (*MK*):

A dummy variable is determined whether the IPO is listed on TSE (value of 1) or OTC (value of 0). Since the listing criteria of OTC exchange are lower than TSE, IPO stocks listed on TSE tend to have stronger financial background and information exposed.

#### B. Deal Characteristics

(1) Offering Size (OS)

The offering size is defined as the natural logarithm of total proceeds as follows.

 $OS = ln(Offer \ price \ * \ IPO \ outstanding \ stock \ at \ 1^{st} \ day) \tag{6}$ 

Ritter (1991) finds that small offerings tend to have worse long-run aftermarket performance compared to large offerings, and the sign of variable coefficient is predicted to be positive.

### (2) Underwriter Prestige (Pres)

Logue (1973) finds a negative relation between underwriter prestige and the degree of underpricing. Carter et al. (1998) show that IPOs with prestigious underwriters experience better long-term performance. Follow Megginson and Weiss (1991), the underwriter prestige is measured as:

 $Pres_i = Market share of the lead underwriter/Total IPO proceeds in 2005-2007$  (7)

#### C. Market and Industry Condition

To control for whether the volatility of recent IPO issue, the return, momentum and turnover of industry may affect the expectation of investors toward the questioned IPOs, therefore associate with the expected skewness and level of underpricing, we also include them in the regression.

#### (1) IPO Volatility (IPOV)

The IPO volatility measures the volatility of initial return of IPOs over three months prior to the IPO issue.

(2) Industry Return (*INDR*)

The industry return is defined as the IPO's industry return over month t-1.

(3) Industry Momentum (INDM)

The industry momentum is the cumulative industry return over month t-13 to t-2.

(4) Industry Turnover (*INDT*)

The industry turnover is defined as the average industry turnover over month t-1.

## 4. Empirical Results

#### 4.1 Descriptive Statistics

Table 2 lists the descriptive statistics for all variables of IPOs sample. The underpricing (UP) is noticeably high in this period (48.54%), as the result of removing limit on price fluctuation on first-five trading day. The mean of Skew variable is positive, suggesting that recent industry stock return is favorable prior to the IPO issues, therefore investors may place high expectation of good future return of IPO in the same industry. The sample is dominant by number of electronic IPO stocks (79%), it may raise the concern that the result in this study only applicable for Taiwanese electronic sector. In addition, the number of IPO listed on TSE is 23 % (27 firms) compare with 77% listed on OTC (94 firms). Table 3 describes the correlation matrix between these variables.

Variables	Obs	Mean	St. Dev	Min	Max
Underpricing (UP)	121	0.4854	0.8616	-0.121	7.2755
Skewness (Skew)	121	0.1146	0.1708	-0.426	0.5418
Age (Age)	121	14.3231	8.6889	1.5	51.2
Industry dummy (Electronic)	121	0.7933	0.4065	0	1
Market (MK)	121	0.2314	0.4234	0	1
Offering size (OS)	121	14.7047	1.1854	12.68	18.8266
Underwriter prestige (Pres)	121	0.0591	0.0393	0.0014	0.1693
IPO volatility (IPOV)	121	19.4818	24.1344	0.5483	89.4619
Industry return (INDR)	121	1.0919	8.9897	-15.52	34.78701
Industry turnover (INDT)	121	23.8144	12.7768	4.5867	68.7445
Industry momentum (INDM)	121	36.3391	42.0908	-33.69	129.635

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#### 4.2 IPO Aftermarket Performance

Table 4 reports the aftermarket performance of Taiwanese IPO firms from 1-year to 5-year event windows, also the conventional t-test is used to examine the possibility of zero mean. On average, the post-IPO BHARs over the 1-year, 3-year, and 5-year are -6.2%, -34% and severe -55% respectively. While the level of abnormal return and significance are high for 3-year and 5-year windows, however, in the 1-year, the underperformance of IPOs firm is slightly small and insignificant. Hence, we conclude that Taiwan IPOs perform comparably toward the matching size and B/M reference portfolios after 1-year period.

Given the fact that the level of underpricing is really high (48.54%) on the 1st trading day, this result suggests that market gradually adjust the stock performance of IPO firms after 1-year of trading. However, the longer-event window results prove that in the long-run, this trend continue to enlarge, and IPOs firm underperform compared with those firms have similar size and B/M ratio.

es	UP	BHAR36m	Skew	Age	Electronic	MK	OS	Pres	IPOV	INDR	INDT
	1.000										
6m	-0.046	1.000									
	(0.613)										
	0.157*	0.048	1.000								
	(0.084)	(0.598)									
	-0.189**	0.137	0.070	1.000							
	(0.037)	(0.133)	(0.446)								
nic	-0.078	0.075	0.065	-0.170*	1.000						
	(0.392)	(0.409)	(0.477)	(0.061)							
	-0.005	0.179**	-0.110	-0.196**	0.135	1.000					
	(0.959)	(0.048)	(0.225)	(0.030)	(0.14)						
	-0.016	-0.046	-0.034	-0.217**	0.231**	0.633***	1.000				
	(0.862)	(0.613)	(0.709)	(0.016)	(0.011)	(0.001)					
	-0.060	-0.060	-0.093	0.070	0.084	0.144	0.218**	1.000			
	(0.517)	(0.511)	(0.308)	(0.442)	(0.357)	(0.116)	(0.017)				
	0.258***	-0.023	0.285**	-0.002	0.098	0.042	0.109	-0.026	1.000		
	0.0042	(0.800)	(0.0015)	(0.98)	(0.283)	(0.647)	(0.232)	(0.773)			
	0.465***	-0.052	0.25***	-0.053	0.006	-0.099	-0.103	-0.034	0.226**	1.000	
	(0.001)	(0.571)	(0.005)	(0.562)	(0.944)	(0.278)	(0.263)	(0.713)	(0.012)		
				-							
	0.392**	-0.120	0.233***	0.181***	0.316***	0.003	0.153*	-0.093	0.410***	0.518***	1.000
	(0.004)	(0.19)	(0.01)	(0.047)	(0.000)	(0.971)	(0.094)	(0.308)	(0.001)	(0.001)	
	0.256***	0.039	0.117	-0.150	0.203**	0.236***	0.364***	-0.096	0.646***	-0.150	0.396***
	(0.001)	(0.667)	(0.201)	(0.108)	(0.025)	(0.009)	(0.001)	(0.296)	(0.001)	(0.101)	(0.001)
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Table 3: Correlation Matrix between Regression Variables

ble provides coefficients of correlation (p-value in parentheses) of various variables. , \*\*, \*\*\* represent the significance at the 10%, 5%, 1% level, respectively.

Event period	Mean	Median	Conventional t-test
1 - year	-0.06298	-0.13298	-1.0496
3 - year	-0.34041***	-0.64731	-3.2933
5 - year	-0.55116***	-0.68384	-5.1110

Table 4: IPO's Aftermarket Performance Measured by Buy-And-Hold Abnormal Return

*Note:* \*, \*\*, \*\*\* represent the significance at the 10%, 5%, 1% level, respectively.

#### 4.3 Regression Results

As stated in section 1, the recent finance literature suggests the role of skewness in explaining the difference in asset pricing and return. Barberis and Huang (2008) assert that investors with preference for skewness are willing to pay a very high price for skewed securities, then makes the securities overprice the prices more than the normal investors are willing to pay, thus earn a very low average return. Hence, expected skewness of IPOs is predicted to positive related with the degree of underpricing, while negative related to the long-run performance of IPO stocks.

First, IPO stocks are sorted base on Skew<sub>*i*,*t*</sub> then formed into three skew sub-groups including: low-skew (25%), medium-skew (50%) and high-skew (25%). Then, we examine the level of underpricing and 3-year BHARs for each sub-skew group in table 5, and find that underpricing for the high group is significantly higher in magnitude compared to the low-skew group. However, 3-year BHARs for the high-skew group is more positive and indifferent compared with the low- and medium-skew groups. This result is contradicted with our prediction about the negative relation between highly-skew and long-run average return.

We next adopt multiple regression models to examine the post-IPO stock performance and the association of expected skewness and the underpricing level. Table 6 reports the regression results for the relation between the expected skewness and the underpricing level. Aside from the testable relationship in column #1, we expand the model to count for the effect of control variables (firms and deal characteristics, market and industry conditions). In model #2 and model #3, the effects of skewness are still significantly positive when firm's characteristics (variables of *Age, electronic,* and *MK*) and deal characteristics (variables of *OS* and *Pres*) are controlled in the regression.

1	1	0 2			U I
Show moun	Under	rpricing	BHA	Oha	
Skew group	Mean	Median	Mean	Median	- Obs.
Low	0.2308	0.0848	-0.3133	6395	31
Medium	0.5198	0.1487	-0.4239	6704	61
High	0.6855	0.4552	-0.2045	5302	29
$\Delta$ (High-Low)	0.4547***	0.3704***	-0.1087	0.1093	
t-value for mean difference	3.2893		-0.3337		
Wilcoxon z-value for median difference		2.729		0.096	

Table 5: Comparison of Underpricing and Three-year BHARs between Skew Sub-groups

Note: \*, \*\*, \*\*\* represent the significance at the 10%, 5%, 1% level, respectively

Variables	Model	#1	Model	# 2	Model	#3	Model	#4
	Coef.	t-stat	Coef.	t-stat	Coef.	t-stat	Coef	t-stat
Intercept	0.0936***	4.21	0.9219***	3.91	1.3022	1.04	2.0647*	1.92
Skew	0.7935*	1.74	0.9086**	2.00	0.9088**	1.97	0.1558	0.38
Age			-0.0224**	-2.46	-0.0225**	-2.42	-0.0142*	-1.81
Electronic			-0.2694	-1.39	-0.2571	-1.3	-0.3829**	-2.21
MK			-0.0244	-0.13	0.0229	0.1	0.0411	0.21
OS					-0.0261	-0.3	-0.1055	-1.38
Pres					-0.2382	-0.12	1.3555	0.78
IPOV							-0.0063	-1.57
INDR							0.051***	4.93
INDT							0.0029	0.38
INDM							0.0102***	3.84
<b>R</b> -squared	0.024	8	0.081	2	0.082	22	0.391	5
Adj. $R^2$	0.016	6	0.049	95	0.033	39	0.336	2
F value	3.02**	**	2.56**	**	1.7*	k	7.08**	**
Obs.	121		121		121		121	

Table 6: The Relation Between Expected Skewness And IPO Underpricing

Note: \*, \*\*, \*\*\* represent the significance at the 10%, 5%, 1% level, respectively.

However, in model #4, when we control for the fixed effect of market and industry conditions (variables of IPOV, INDR, INDT, and INDM), the explanatory power of skewness with underpricing becomes insignificant. Besides the consistent negative relation between Age and Underpricing (UP), we find that industry return (INDR) over month t-1 and industry momentum (INDM) over month t-13 to t-2, both have a positive relation with underpricing level. From this result, it is estimated that investors not only evaluate IPO stock by firm performance, but also consider about the trend and future prospect of industry. By using the previous three-month industry return to measure the IPO skewness as suggested by Zhang (2006), our Skew measure is expected to has correlation with industry control variables and then the reduction in meaning power is not so confusing.

Table 7 reports the relation between expected Skewness and IPO three-year BHAR. Regression result suggests that the expected skewness can't explain for the aftermarket underperformance of Taiwanese IPO firms. However, we find that underperformance in Taiwanese is worsen for IPOs with bigger firms. This is consistent with the findings in Cheng and Shiu (2005), which report that the mean of weighted buy-and-hold excess return is more negative (-10.03%) than the equally weighted mean (-3.411%).

In addition, Ritter (1991), Beatty and Ritter (1986) find that young IPO firms underperform than the established firms in the long-run. Our findings support this explanation since younger firms have high growth opportunity and short operational history, so that greater uncertainty for investors to evaluate their true potential. Finally, our findings suggest that the underperformance is lesser for IPOs firms listed on Taiwan Stock Exchange (TSE), rather than Over-the-Counter Exchange (GRETAI). Strict listing requirements on previous performance before firms are accepted to list in TSE, and information disclosure rules provide investors more information to evaluate the true value of stock prices.

Variables	Coef.	t-value
Intercept	2.966*	1.76
Skewness(Skew)	0.546	0.86
Age (Age)	0.022*	1.84
Industry dummy (Electronic)	0.44	1.62
Market (MK)	0.937***	2.99
<b>Offering size</b> (OS)	-0.258**	-2.14
<b>IPO volatility</b> ( <i>IPOV</i> )	-0.006	-0.94
Industry return (INDR)	0.014	0.89
Industry turnover (INDT)	-0.019	-1.64
Industry momentum (INDM)	0.005	1.41
R-squared	0.1498	
Adj. R-squared	0.0725	
F value	1.94**	
Observation	121	

Table /: The Relation between Expected Skewness and Three-year BHAR of IPO F
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*Note:* \*, \*\*, \*\*\* represent the significance at the 10%, 5%, 1% level, respectively.

## **5** Conclusion

Given the mixed results about aftermarket performance of IPO firms listed on Taiwan stock markets, this paper aims to examine whether IPOs suffer from systemic underperformance in the long run. Using the buy-and-hold return measurement via the size and B/M matching reference portfolios, conducted on 121 IPOs issued from March 2005 to 2007, we find that IPO firms are indifferent from reference portfolios on first trading year, while suffer severe underperformance in three-year to five-year after the issue date. Given the high level of underpricing on 1<sup>st</sup> day, individual investors who hold the stock from the 2<sup>nd</sup> trading day start to suffer from stock price adjustment in long-run.

Second, this paper employs the skewness measurement suggested by Zhang (2006), by using the previous industry return to examine if skewness plays a role in pricing the IPO stocks and enables to explain the long-run underperformance of IPO firms. Although it is reported to positive related with the level of 1<sup>st</sup> day underpricing, however, our findings suggest that this skewness measure can't explain for the long-run phenomenon of IPOs. However, due to limitation in sample size and method employed, this paper suggests that further researches need to conduct to examine the implication of cumulative prospect theory in explaining the long-run underperformance of Taiwan IPOs.

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