



# Do Chinese Social Media Delineate the Optimistic Bias of Traditional Media?

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# Chinese Media Coverage on the Trade War





#### May 5, 2019

...the 10% will go up to 25% on Friday..

#### May 6, 2019

The traditional media all are silent on t event even with the witness of a crash stock and currency market.



#### 中国股汇急挫 官媒全面噤声

特朗普对美中贸易谈判态度突变, 令中国 的股市和汇市大幅下跌。如果大陆股民不 看海外媒体报道、可能不知道大跌原因。 因为直至当天下午, 中国各路媒体对美方 加征关税一事集体失声,连社交媒体亦不

2019-05-06









周一,中国香港及内地的股市大跌。(路透社)

市大幅下跌。如果大陆股民不看海外媒体报道, 可能 不知道大跌原因, 因为直至当天下午, 中国各路媒体 对美方加征关税一事集体失声, 连社交媒体亦不容许

#### **CUHK Business School**

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Yes 215855555555 2,44-88,886565584

我并以此本有本意理不得不明明以有 13.00的主体、公安基于整金企業的

Ф

#### 中共中央国务院关于建立健全城乡 融合发展体制机制和政策体系的意见

#### 习近平《在纪念五四运动 100 周年大会上的讲话》单行本出版

#### 全国人大常委会委员长会议组成 人员专题学习习近平外交思想

#### 社團70年 奋斗新时代 来自一致的推点调研

江西岸多以新发展理念引领城市特型

#### 百年煤城



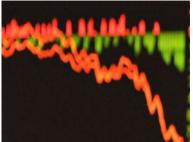
容许讨论。











特朗普对美中贸易谈判态度突变, 令中国的股市和汇

May 6, 2019 Baidu Tieba: The BBS is closed according to the law.



抱歉,根据相关法律法规和政策,本吧暂不开放。



May 6, 2019 Sina Finance: All should avoid topics related to trade war recently.

### 新浪财经头条号对外服...



蚂蚁财富黄龙书院全员

May 6, 2019

A social media platform affiliated with

Alibaba: Any topics related to trade

war will be definitely deleted.



JHK

ESS SCHOOL

蚂蚁财富黄龙书院

#### 新浪财经郑洋洋

@所有人

大家好: 近期请各位注意避免 中美贸易战等相关话题!

另附: wap测试版发

ns 万俚沟通

请修改群业



@所有人 关于贸易战的文 章,大家不要写了,只要写, 无论观点如何,一概删除!



May 7, 2019:
People's Daily and
Global Times cover
the trade war: China
economy is flexible
enough to handle
the trade war.



May 14-22, 2019: Nine Comments on China-US relationship

- 《谁在"为赋新词强说愁"——"美国吃亏论"可以休矣》
- 《不要陶醉于自欺欺人的"胜利" ——"加征关税有利论"可以休矣》
- 《谁在"出尔",谁在"反尔"——"中国出尔反尔论"可以休矣》
- 《从来就没有什么救世主——"美国重建中国论"可以休矣》
- 《欲加之罪,何患无罪——"中国强制转让技术论"可以休矣》
- 《香者自香, 臭者自臭"中国技术有害论"可以休矣》
- 《捕风捉影者,风必摧之——"中国盗窃知识产权论"可以休矣》
- 《不要逆历史潮流而动——"对华文明冲突论"可以休矣》
- 《轻舟已过万重山——"中国退步论"可以休矣》













# We focus on corporate news.





## Media bias of corporate news in autocracies

- There is significant media bias in autocratic regimes (Djankov et al., 2003; Enikolopov et al., 2011; Qin et al., 2018)
- This optimistic bias extends to corporate news as well in statecontrolled traditional media (newspapers) in autocracies (Stockmann, 2013; Piotroski et al., 2017)
  - ➤ Stronger bias in papers under Party control and for SOEs





# Research Question

Do Chinese social media (online stock platforms) delineate the optimistic bias of traditional media?





## On the One Hand-Social Media CAN

- Computer-mediated communication widens the scope of communication by increasing access and others (Spears and Lea, 1994).
- The relative anonymity compared to face-to-face communication will lead to a freer and fuller expression of views and make critical feedback more possible.
- Government regards info generated by social media as a source of grass root info (Qin et al., 2017)
- They are more worried about instigation of collective actions, not negtaive news (King et al., 2013, 2014)





## On the Other Hand – Social Media CAN NOT

- Computer-mediated communication is also associated with uninhibited behavior and more polarized, risky, and extreme decision compared to faceto-face interaction (Spears and Lea, 1994).
- Social media are "rumor mills" in China and the info they generate is simply noise.
- Social media are subject to central surveillance and censorship.
  - ➤ Users refrain from posting critical info on the site, especially in politically sensitive periods during which traditional media are expected to be particularly pressured to bias the reporting.



# Question 1: Will social media remain less biased when traditional media are more biased?



- We use the association of the tone of traditional media articles and social media posts of the same firm on the same day to examine if social media play such a delineating role.
- We posit that for the same underlying information, there is positive association in the tone of the two types of media.
- However, the positive association is attenuated when traditional media's tone is positive than when their tone is neutral or negative.
- We expect traditional media is more likely bias their reporting more positively when their tone is positive than when it is neutral or negative.



# Two reasons for the stronger optimistic bias when tone is positive



- Since the tone of the newspaper articles is the sum of the optimistic bias and the tone of the underlying news events, the tone of the articles and the optimistic bias can be mechanically related.
- The sentiment of the underlying events and optimistic bias are likely to be positively associated because the cost to bias the reporting of the events will likely to decrease if the underlying event is positive.







- The benefit of the positive bias can be much greater especially when the tone of the underlying events becomes very negative.
- We do not expect that this benefit effect will outweigh the cost of optimistic bias in our analysis.
  - Traditional media are likely to omit reporting the event than manipulating the tone of the reports.



# Testing model



```
(1) Social Media Tone_{it} = \alpha + \beta_1 Traditional \ Media \ Tone_{it} + 
 \beta_2 Traditional \ Media \ Tone_{it} \times TM \ Positive_{it} + \beta_3 TM \ Positive_{it} + \beta_4 Size_{it} + 
 \beta_5 ROA_{it} + \beta_6 Market \ to \ Book_{it} + \beta_7 Leverage A_{it} + Firm \ Dummy + 
 Year \ Month \ Dummy + \varepsilon_{it}
```

- We expect  $\beta_1$  is expected to be positive and  $\beta_2$  is expected to be negative.
- TM positive is equal to one when traditional tone is positive, and zero otherwise.





### Data

- Traditional media: 3.7m newspaper articles between 2009 to 2016 by 162 unique newspapers from Wisenews.
- Social media: 38.4m posts between 2009 to 2016 from a popular online stock platform called Guba by Eastmoney (aka, East Guba).
- We use machine learning to measure the tone of the news articles and posts of the East Guba.
- We limit our sample to firm-days with at least 1 news article and 3 posts for the same firm on the same day.



# Measuring Tone of Traditional Media Article



- Importance-weighted tone:
  - ➤ Sentences from first and last paragraph x 2
  - First and last sentence from first and last paragraph x 3
  - ➤Other sentences x 1
- Tone of the text body
  - (#of positive sentences-# of negative sentences)/(#of positive sentences+# of negative sentences+1)
- Over-all TM Tone
  - $\triangleright$ TM tone = (tone of text body\*0.7+tone of title\*0.3).





# Measuring Tone of Social Media

- Textual Analysis is similar to Traditional Media
- The tone of social media for a firm-day is defined as the relative weight of the number of positive posts and negative posts = (# of positive posts-# of negative post)/ (# of positive posts+# of negative post+1)





#### **Table 1: Sample Selection Process**

#### Panel A

	Firms	Firm-day
CSMAR-Financial Statement File Merged with		
Stock Price File	3,171	4,421,222
Less firm-days with less than 3 posts	(132)	(136,019)
Social Media with no less than 3 posts/day	3,039	4,285,203
Less firm-days with no news articles	-	(3,273,687)
Traditional Media with no less than 1 news/day	3,039	1,011,516
Less firm-days with missing control variables	(28)	(40,534)
Final Sample	3,011	970,982

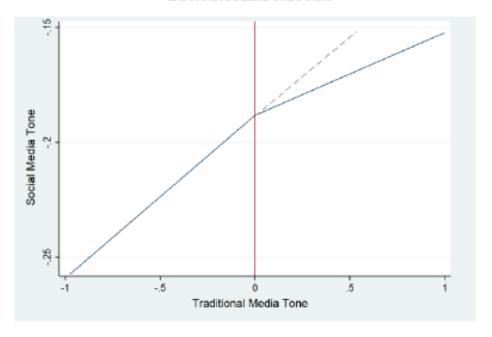


Main result for Question 1: Will social media remain less biased when traditional media are more biased?

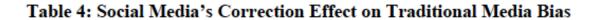


Figure 1

Linear Prediction Plot of Association Between the Tone of Social Media and the Tone of Traditional Media







Dependent Variable: Social Media Tone

				_	-
Independent Variables	1	2	3	4	5
Traditional Media Tone	0.0331***	0.0306***	0.0711***	0.0415***	0.0426***
Traditional Media Tone	51.43	43.68	23.62	16.67	17.11
Traditional Media Tone x			-0.0676***	-0.0224***	-0.0235***
TM_Positive			-19.99	-7.84	-8.23
TM Positive			0.0145***	0.0056***	0.0056***
Tivi_Fositive			8.32	3.97	3.95
Size					-0.0327***
Size					-24.78
DOA					0.0429***
ROA					5.84
26.1					-0.0025***
Market to Book					-13.64
					0.0262***
Leverage					12.52
Adj-R2	0.003	0.092	0.005	0.092	0.093
N N	970,982	970,982	970.982	970,982	970,982
Firm-Fixed Effect	NO	YES	NO	YES	YES
Year-Month-Fixed Effect	NO	YES	NO	YES	YES
Total Montal-Trace Effect	110	110	110	110	110

<sup>\*\*\*</sup> P<0.01 \*\* P<0.05 \* P<0.1





Influence of political incentive on role of benchmarking role of social media





### Media intervention in 2015

- Crash in stock market in 2015
- On July 23<sup>rd</sup>, 2015, to stabilize the turbulence in the stock market, the National Bureau of Television, Broadcast, and Newspaper (a bureau under GAPP) issued an authoritative order to all press in China, demanding them to decrease the coverage of stock market-related news, and stop using negative words such as "tumble or "crash" in the news.

Figure 4
Screenshots of the Reports on the Media Intervention Order

#### CHINADAILY TO THE

广电总局: 少量报道股市 不得使用暴跌崩盘等词

环球时报-环球网 2015-06-26 17:57:00

广电总局要求广播电视台等媒体,要少量报道股市。

广电总局要求广播电视台等媒体,要少量报道股市。(资料图)

环球时报-环球网6月26日报道广电总局要求广播电视台等媒体,要少量报道股市, 而在必要的报道中要做到全面平衡、客观理性,不集中唱多,不合力唱空,合理引导市 场预期,防止因报道不当引起股市大涨大跌。

此外,广电总局还强调,一律不再组织评论言论、专家访谈、现场连线,不做深度解读,不猜测、评价股市走向,不渲染恐慌、悲情气氛,不使用'暴跌''暴涨''崩盘'等煽情用语。



Table 5: Social Media's Correction Effect on Traditional Media Bias: Pre and Post Media Intervention

Dependent Variable: Social Media Tone

	(1)	(2)	Difference
Independent Variables	Pre-Intervention	Post-Intervention	(2)-(1)
Traditional Media Tone	0.0425***	0.0360***	-0.0065
Traditional Media Tone	16.26	5.99	1.02
Traditional Media Tone x TM Positive	-0.0209***	-0.0352***	-0.0143**
TM_Positive	-7.00	-5.15	3.96
TM Positive	0.0052***	0.0098***	
	3.44	2.75	
Size	-0.0204***	-0.0805***	
	-16.96	-14.61	
ROA	0.0096	0.0404	
	1.55	1.49	
Market to Book	-0.0010***	-0.0059***	
	-6.09	-14.13	
Leverage	0.0227***	0.0516***	
-	12.62	7.99	
Adj-R2	0.084	0.095	
N	802,523	168,459	
Firm-Fixed Effect	YES	YES	
Year-Month-Fixed Effect	YES	YES	

We use Chow Test and report Chi-square Statistics to test the equality of two coefficients across sample.





<sup>\*\*\*</sup> P<0.01 \*\* P<0.05 \* P<0.1



# National Congress Meeting of CCP

- Government intensifies its monitoring over media during the congress period
  - ➤ Congress Period [-45, 45]
  - ➤ Non-congress Period



# Congress Meeting vs. non-Congress Meeting Periods



Table 7: Social Media's Correction Effect on Traditional Media Bias: National Congress Meeting Period vs Non-National Congress Meeting Period

Dependent Variable: Social Media Tone Day 0

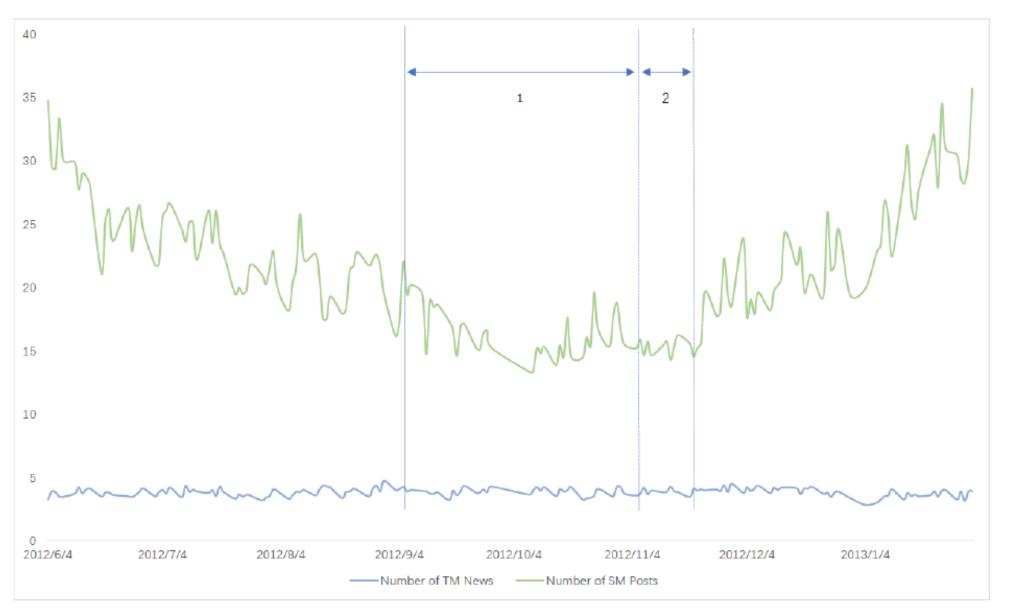
-	l .	•
	1	2
Independent Variables	Congress Meeting	Non-Congress Meeting
Traditional Media Tone	0.0206	0.0431***
	1.55	17.02
Traditional Media Tone x	0.0094	-0.0248***
TM_Positive	0.62	-8.51
TM_Positive	0.0021	0.0058***
	0.29	4.03
Size	-0.0436	-0.0331***
	-1.48	-14.86
ROA	-0.0252	0.0468***
	-0.01	6.26
Market to Book	-0.0738	-0.0025***
	-1.11	-13.41
Leverage	0.3566***	0.0266***
	3.29	12.59
Adj-R2	0.196	0.092
N	41,110	929,872
Firm-Fixed Effect	YES	YES
Year-Month-Fixed Effect	YES	YES

<sup>\*\*\*</sup> P<0.01 \*\* P<0.05 \* P<0.1



Figure 3: The Daily Number of News Articles and Social Media Posted Around 18<sup>th</sup> CCP National Congress Meeting





<sup>1:</sup> Preparation Period of the CPC 18th National Congress Meeting.



<sup>2:</sup> Meeting Period of the CPC 18th National Congress Meeting



# Alternative interpretation

 Social media are noisy or reporting on topics different from those of traditional media when traditional media are more positively biased.

 Do stock return discount the traditional media according to its media bias?





- (3)  $CAR_{it} = \alpha + \beta_1 Traditional\ Media\ Tone_{it} + \beta_2 Trditional\ Media\ Tone_{it} \times TM\ Bias_{it} + \beta_3 TM\ Bias_{it} + \beta_4 Social\ Media\ Tone_{it} + \beta_5 CAR[-5,-1]_{it} + \gamma' Control\ Variables_{it} + Firm\ Dummy + Year\ Month\ Dummy + \epsilon_{it}$
- $\beta_1$  is expected to be positive and  $\beta_2$  is expected to be negative.
- TM Bias = 1 when (traditional media tone social media tone) is in the top quintile (most positive), and zero otherwise.
- CAR is from day 1 to day 5, 10 and 20. Day 0 is the day of the info released.



Table 9: The Informativeness of Traditional Media and Social Media in Predicting Abnormal Returns: The Impact of Traditional Media Bias

	1	2	3
	CAR(1,5)	CAR(1,10)	CAR(1,20)
Independent Variables			
Traditional Media Tone	0.0009***	0.0007***	-0.0001
	5.23	2.82	-0.21
Traditional Media Tone x TM	-0.0042***	-0.0047***	-0.0067***
Bias	-5.47	-4.41	-4.43
TM Bias	0.0035***	0.0045***	0.0075***
	5.58	5.14	5.99
Social Media Tone	0.0056***	0.0069***	0.0080***
	21.24	18.47	15.13
Size	-0.0052***	-0.0099***	-0.0189***
	-14.17	-16.05	-19.44
ROA	-0.0026	-0.0042	-0.0124**
	-1.25	-1.21	-2.21
Market to Book	-0.0006***	-0.0011***	-0.0022***
	-10.63	-12.42	-15.11
Leverage	0.0033***	0.0062***	0.0126***
	6.03	6.76	8.46
CAR [-5,-1]	0.0031*	0.0044**	-0.0024***
	1.91	2.13	3.79
Adj- R2	0.0143	0.0223	0.0345
N	970,982	970,982	970,982
Firm Fixed Effect	Yes	Yes	Yes
Year-Month Fixed Effect	Yes	Yes	Yes

<sup>\*\*\*</sup> P<0.01 \*\* P<0.05 \* P<0.1









- SOEs v.s. Non-SOEs
- Official Newspaper v.s. Non-Official Newspaper
- Bias defined by the cutoff at median
- Requiring 5/10 posts on the day
- Requiring 3/5 articles on the day
- Three days surrounding earnings announcement





## Conclusion

- The tone of East Guba's posts is less optimistic than that of the newspapers when the latter are more likely to be positively biased.
- The political intervention has increased the newspapers' optimistic bias and the deviation in tone between the newspapers and East Guba.
- The positive stock return response to the tone of the newspapers' articles is significantly attenuated when it deviates positively from that of East Guba.





# Thank you!



Table 10: Social Media's Correction Effect on Traditional Media Bias: Party Media and Non-Party Media

Dependent Variable: Social Media Tone Day 0

	1	2	Diff.
Independent Variables	Party Media	Non-Party Media	(2) – (1)
Traditional Media Tone	0.0192**	0.0586***	0.0394***
	2.50	17.70	8.57
Traditional Media Tone x	-0.0145*	-0.0392***	-0.0247
TM_Positive	-1.70	-11.33	0.974
TM_Positive	0.0038	0.0054***	
	0.82	3.19	
Size	-0.0443***	-0.0326***	
	-14.08	-24.65	
ROA	0.0623***	0.0443***	
	3.39	6.03	
Market to Book	-0.0036***	-0.0025***	
	-7.84	-13.55	
Leverage	0.0318***	0.0261***	
	6.49	12.49	
Adj-R2	0.115	0.093	
N	124,616	970,982	
Firm-Fixed Effect	YES	YES	
Year-Month-Fixed Effect	YES	YES	

We use Chow Test and report Chi-square Statistics to test the equality of two coefficients across sample.

<sup>\*\*\*</sup> P<0.01 \*\* P<0.05 \* P<0.1

Table A1: Traditional Media Tone and Traditional Media – Social Media Tone
Difference

Traditional Media Tone Decile	Mean of TM Bias (Traditional Media Tone- Social Media Tone)	Standard Deviation	Frequency	
1	-0.3794	0.3760	98,421	<b>A</b>
2	0.0287	0.3535	97,206	Negative
3	0.2889	0.3410	97,943	Positive
4	0.4654	0.3279	94,736	▼
5	0.6061	0.3314	96,345	
6	0.7229	0.3316	97,796	
7	0.8421	0.3340	97,993	
8	0.9648	0.3337	98,644	
9	1.0683	0.3323	97,264	
10	1.1415	0.3294	94,634	
Total	0.5732	0.5722	970,982	

Table A2: Traditional Media Tone for SOE vs Non-SOE: The Impact of Media Intervention

Dependent Variable: Traditional Media Tone

Independent Variables	Pre-Intervention	Post-Intervention	Full-Sample
SOF	0.0158***	0.0009	0.0137***
SOE	13.54	0.30	12.66
Size	0.0074***	0.0058***	0.0073***
	19.01	5.16	19.71
ROA	0.468***	0.439***	0.464***
	23.44	23.23	27.66
Market to Book	-0.0057***	-0.0058***	-0.0058***
	-29.86	-16.31	-33.82
Leverage	-0.0161***	-0.0213***	-0.0173***
	-10.91	-6.01	-12.75
Adj-R2	0.018	0.014	0.018
•			
N	802,523	168,459	970,982
Year-Month Fixed Effect	YES	YES	YES
Industry Fixed Effect	YES	YES	YES

Table A3-A: Traditional Media Tone and Social Media Tone Around Media Intervention in 2015

	Mean Tone of	Mean Tone of Traditional	Difference
Year-Month	Social Media	Media	TM-SM
2015-01	0.4283	-0.2494	0.6777***
2015-02	0.4027	-0.2495	0.6522***
2015-03	0.4552	-0.2141	0.6693***
2015-04	0.4515	-0.2807	0.7323***
2015-05	0.4332	-0.2939	0.7271***
2015-06	0.4221	-0.3325	0.7546***
2015-07	0.4224	-0.3688	0.7912***
2015-08	0.4021	-0.3344	0.7365***
2015-09	0.4062	-0.3245	0.7308***
2015-10	0.4426	-0.2821	0.7247***
2015-11	0.4491	-0.3290	0.7781***
2015-12	0.4653	-0.3053	0.7706***
Total	0.4317	-0.2970	0.7287

Table A3-B: Traditional Media Tone and Social Media Tone by Year

		Mean Tone of	
Year	Mean Tone of	Traditional	Difference
	Social Media	Media	TM-SM
2009	0.3503	-0.2081	0.5584***
2010	0.3766	-0.1972	0.5738***
2011	0.3497	-0.2122	0.5618***
2012	0.3460	-0.1534	0.4994***
2013	0.3674	-0.1729	0.5403***
2014	0.4116	-0.1813	0.5928***
2015(Pre-Intervention)	0.4343	-0.2698	0.7041***
2015(Post-Intervention)	0.4282	-0.3256	0.7538***
2016	0.3964	-0.2846	0.6810***
Total	0.3704	-0.2028	0.5732

Table A3-C: Traditional Media Tone and Social Media Tone Around 18<sup>th</sup> CCP National Congress Meeting

		Mean Tone of	
	Mean Tone of	Traditional	Difference
Year-Month	Social Media	Media	TM-SM
2012.0=	0.0000	0.4.	0.4500444
2012-07	0.2923	-0.1760	0.4683***
2012-08	0.3018	-0.1638	0.4656***
2012-09	0.3483	-0.1470	0.4952***
2012-10	0.3591	-0.1068	0.4659***
2012-11	0.3893	-0.1331	0.5224***
2012-12	0.4042	-0.1274	0.5316***
2013-01	0.3481	-0.1480	0.4961***
2013-02	0.3071	-0.1384	0.4455***
2013-03	0.3271	-0.1762	0.5033***
Total	0.3419	-0.1463	0.4882

Table A4: Robustness Check of Social Media's Correction Effect on Traditional Media Bias: Alternative Measurement of Traditional Media Bias

Dependent Variable: Social Media Tone

Independent Variables	
Traditional Media Tone	0.0414***
Traditional Media Tone	33.60
Traditional Media Tone x	-0.0463***
TM Above Median	-14.34
TM Above Median	0.0254***
TW Above Wedian	11.12
Size	-0.0326***
Size	-24.72
DO A	0.0426***
ROA	5.82
Market to Book	-0.0025***
Market to Book	-13.64
I	0.0262***
Leverage	12.50
Adj-R2	0.093
N	970,982
Firm-Fixed Effect	YES
Year-Month-Fixed Effect	YES

**Table 1: Descriptive Statistics** 

Panel B

	Variable	N	Mean	SD	P25	Median	P75
Traditional Media	Number of news	970,982	3.8953	9.2842	1.0000	1.0000	3.0000
	Traditional media tone	970,982	0.3704	0.4947	0.0742	0.4658	0.7958
	Party media tone	124,616	0.5115	0.4998	0.2682	0.7000	0.9182
	Non-party media tone	970,982	0.1602	0.4021	0.0000	0.0000	0.3979
	Traditional media positive	970,982	0.7790	0.4149	1.0000	1.0000	1.0000
Social Media	Social media tone	970,982	-0.2028	0.3145	-0.4118	-0.1778	0.0000
	Number of posts	970,982	39.4893	94.8157	3.0000	16.0000	43.0000
Stock Return	Raw return	970,982	0.0014	0.0339	-0.0157	0.0007	0.0169
	Abnormal return	970,982	0.0012	0.0275	-0.0130	-0.0017	0.0115
	CAR[1,5]	970,982	0.0006	0.0600	-0.0301	-0.0041	0.0253
Stoc	CAR[1,10]	970,982	0.0016	0.0821	-0.0416	-0.0054	0.0368
0,1	CAR[1,20]	970,982	0.0036	0.1122	-0.0587	-0.0062	0.0551
ıtals	SOE	18,499	0.4278	0.4948	0.0000	0.0000	1.0000
men	Size	18,499	21.9302	1.3771	20.9622	21.7418	22.6726
Firm Fundamentals	ROA	18,499	0.0539	0.0809	0.0142	0.0422	0.0834
	Market to Book	18,499	3.8148	3.8706	1.7172	2.7480	4.5508
	Leverage	18,499	0.2125	0.3827	-0.0000	0.0342	0.2606

**Table 2: Correlation Table** 

		1	2	3	4	5	6	7	8	9	10	11
1	number of news											
2	traditional media tone	-0.0184*										
3	party media tone	-0.0048*	0.2826*									
4	non-party media tone	-0.0199*	0.5905*	-0.1036*								
5	traditional media positive	0.0699*	0.8217*	0.2093*	0.4903*							
6	social media tone	-0.0113*	0.0523*	0.0042*	0.0446*	0.0459*						
7	number of posts	0.1523*	-0.0470*	-0.0301*	-0.0155*	-0.0221*	-0.0382*					
8	raw return	-0.0029*	0.0460*	-0.0009	0.0492*	0.0408*	0.2115*	-0.0125*				
9	abnormal return	-0.0028*	0.0524*	-0.0025	0.0582*	0.0474*	0.2183*	-0.0089*	0.8226*			
10	CAR[1,5]	-0.0059*	0.0109*	0.0041*	0.0067*	0.0087*	0.0324*	-0.0439*	0.0593*	0.0639*		
11	CAR[1,10]	-0.0083*	0.0098*	0.0044*	0.0049*	0.0084*	0.0305*	-0.0505*	0.0468*	0.0530*	0.7280*	
12	CAR[1,20]	-0.0109*	0.0079*	0.0051*	0.0043*	0.0052*	0.0274*	-0.0602*	0.0311*	0.0357*	0.5338*	0.7257*

<sup>\*</sup>Indicates correlation coefficient significant at 0.05 level