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January 28, 2020

Edgar Meij, PhD
Head of AI Discovery

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DATA

ANALYTICS

NEWS

COMMUNITY

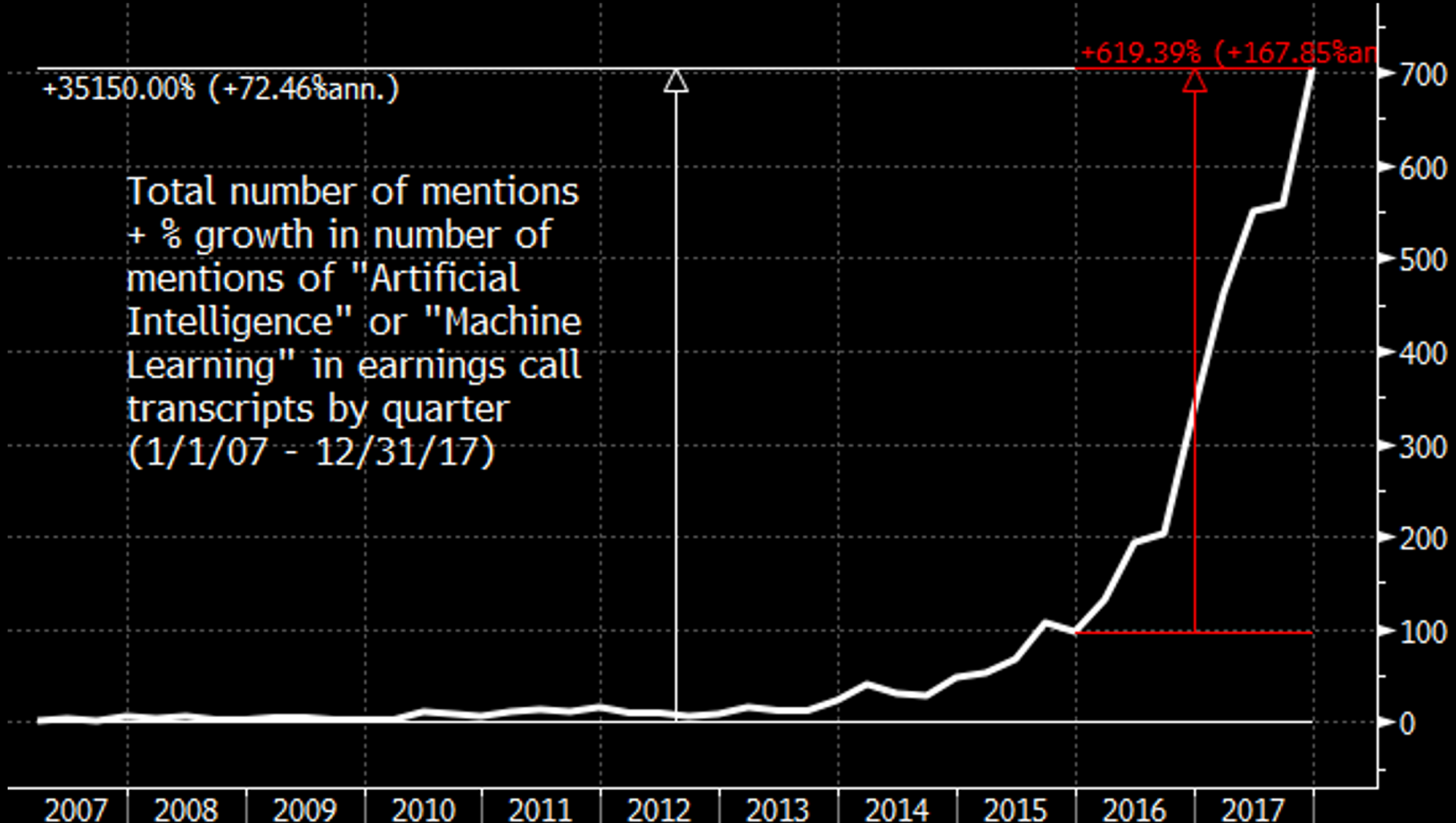
...to facilitate financial decision-making.

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The "AI Revolution" is changing the world



AI at Bloomberg

- Making Sense of News & Social Media
- Making Sense of Financial Documents
- Making Sense of Market Signals
- Making Sense of Communication Data
- Outreach

News at Bloomberg

325K+

subscribers

News search

16M queries

per day

Stories available for search in ~100ms

Average query response time <200ms

Volume

2M

stories per day

Index of

650M

stories

500

documents ingested
per second

News alerting

1.5M

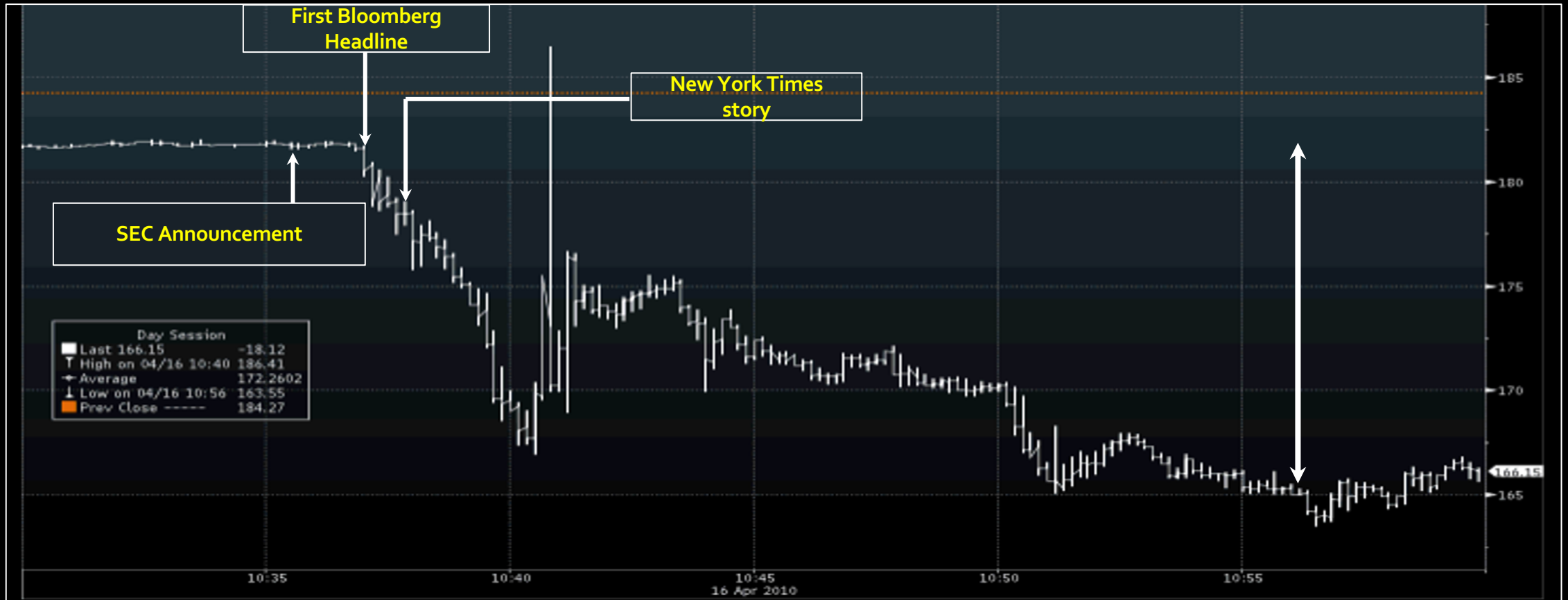
subscriptions

500 stories

matched per second

Alerts delivered in <100ms

News moves markets



Trending Topics

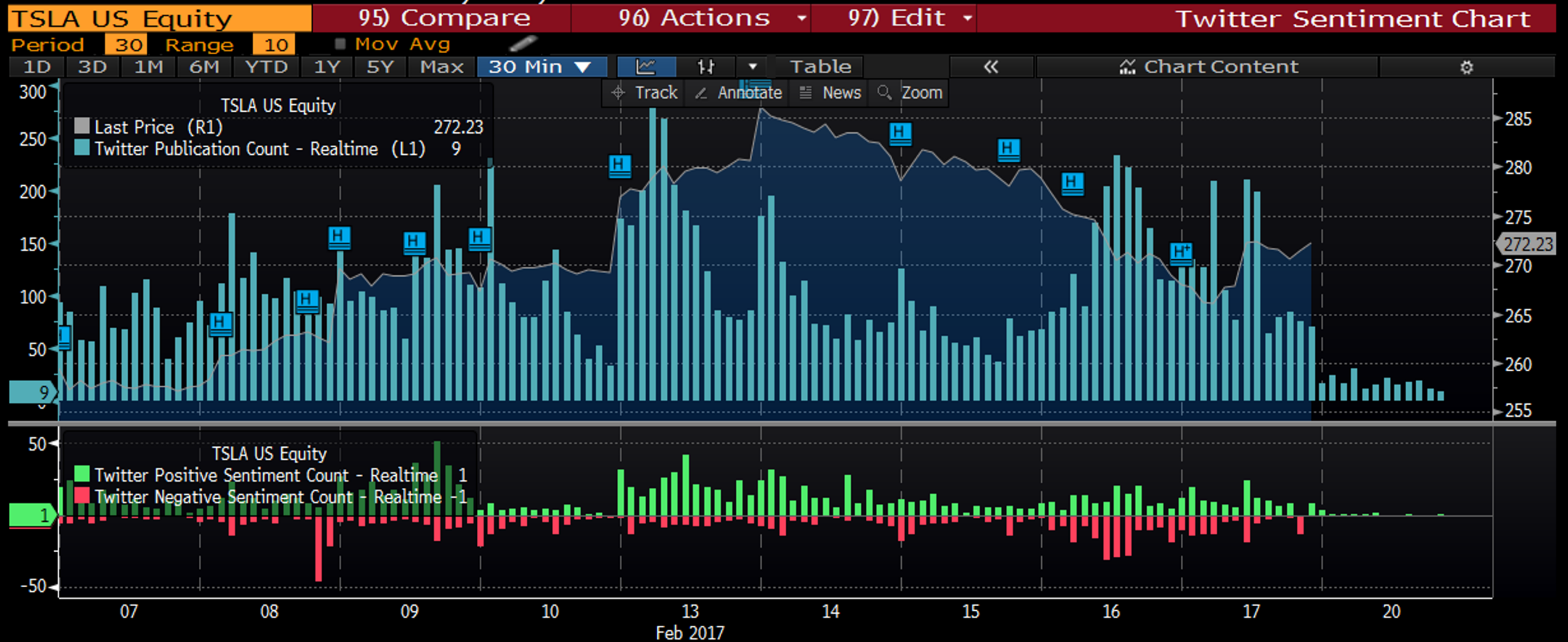
Companies Security List **Topics** Trend Period 8 Hours

News Reader Activity News Sentiment Twitter Sentiment News Volume Twitter Volume Social Velocity

Largest Increase Largest Total

News Topic	Δ Pub.	NT	Key News Theme
1) Virgin Islands (U.S.)			Tropical Storm Dorian Becoming A Hurricane
2) Singapore Monetary Authty			Singapore Sets Guidelines for Digital Banks
3) BTPs, Italian Bonds			Conte Get Mandate to Form New Italian Government
4) Shanghai Stock Exchange			China Bourse May Reclaim 2
5) Pakistan Stocks			PSX Gains to Close at 30637 Points
6) Financial Stability Board			Deutsche Bank Turns Into Government Headache
7) Hungary Bonds			CEE Markets 2-Hungary Forint Sets Record Low
8) France Bonds			Japanese Take Profit on Foreign Bonds
9) CBOE Volatility Index			Fed Needs to Cut by 75 Basis Points
10) China Development Bank			NBU and China Sign Loan Agreement for 500 Million
11) Bloomberg Russian News			No News Theme Found
12) Osaka Stock Exchange			No News Theme Found
13) Singapore			Singapore Ranked World's Safest Cities
14) Ukraine			Trump Reviewing Military Aid to Ukraine
15) Israel Stocks			Israel Equities Climb as Hints Policy Reversal
16) Canada Bonds			Pressured by Bank of Canada Rate Cut Speculation
17) Saudi Stock Market			Tadawul Completed Inclusion on MSCI Emerging Index
18) Egypt Stocks			Arab Land Release Results
19) Hot Headlines			No News Theme Found
20) Bermuda			Hurricane Dorian Hits Virgin Islands

Sentiment = Signal



A disaster in the White House is huge!

AP The Associated Press  

@AP

Breaking: Two Explosions in the White House and Barack Obama is injured

 Reply  Retweet  Favorite  Buffer  More

3,242 RETWEETS **153** FAVORITES

12:07 PM - 23 Apr 13



Over \$136 billion was wiped out in minutes

Entities are central to ML for Finance

- What named entities are contained in news stories?
- E.g., which company, person, etc.
- Named Entity Recognition and Linking

Defiant Johnson Meets Irish Leader for Talks: Brexit Update

By Alex Morales and Kitty Donaldson

(Bloomberg) -- The beleaguered U.K. Prime Minister [Boris Johnson](#) is in Dublin on Monday for talks with his Irish counterpart, [Leo Varadkar](#), as he presses ahead with his hardline plan to leave the European Union "do or die" by Oct. 31.

Key Developments:

- Irish Finance Minister [Paschal Donohoe](#) says his country is open to Brexit extension
- Parliament set to vote again on an early general election on Monday evening, with opposition parties expected to reject the measure
- Over the weekend, [Amber Rudd](#) quit the cabinet with a furious attack on Johnson's leadership
- Chancellor of the Exchequer [Sajid Javid](#) and Foreign Secretary [Dominic Raab](#) said on Sunday that the Brexit plan is unchanged

- 1) Kitty Donaldson (Bloomberg LP)
- 2) Thomas Penny (Bloomberg LP)
- 3) Leo Varadkar (Republic of Ireland)
- 4) Theresa May (United Kingdom of Great Britain and Northern...
- 5) Jeremy Bernard Corbyn (United Kingdom of Great Britain an...
- 6) Dominic Raab (United Kingdom of Great Britain and Norther...
- 7) Paschal Donohoe (Republic of Ireland)
- 8) Amber Augusta Rudd (United Kingdom of Great Britain and ...
- 9) Tim Ross (Bloomberg LP)
- 10) Sajid Javid (United Kingdom of Great Britain and Northern I...
- 11) Boris Johnson (United Kingdom of Great Britain and Norther...
- 12) Dara Doyle (Bloomberg LP)
- 13) Alex Morales (Bloomberg LP)

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Named Entity Linking & Relationships

STARBUCKS CORP Equity AID Related Functions Menu Message

SBUX US \$ ↑ 57.86 +1.11 Q57.85 / 57.86Q 9x6
At 14:55 d Vol 6,237,626 O 56.94Q H 58.01K L 56.77Q Val 358.948M

SBUX US Equity Save as Note Send via MSG Automated Insights on Demand

Data generated at 03:10 PM EDT.

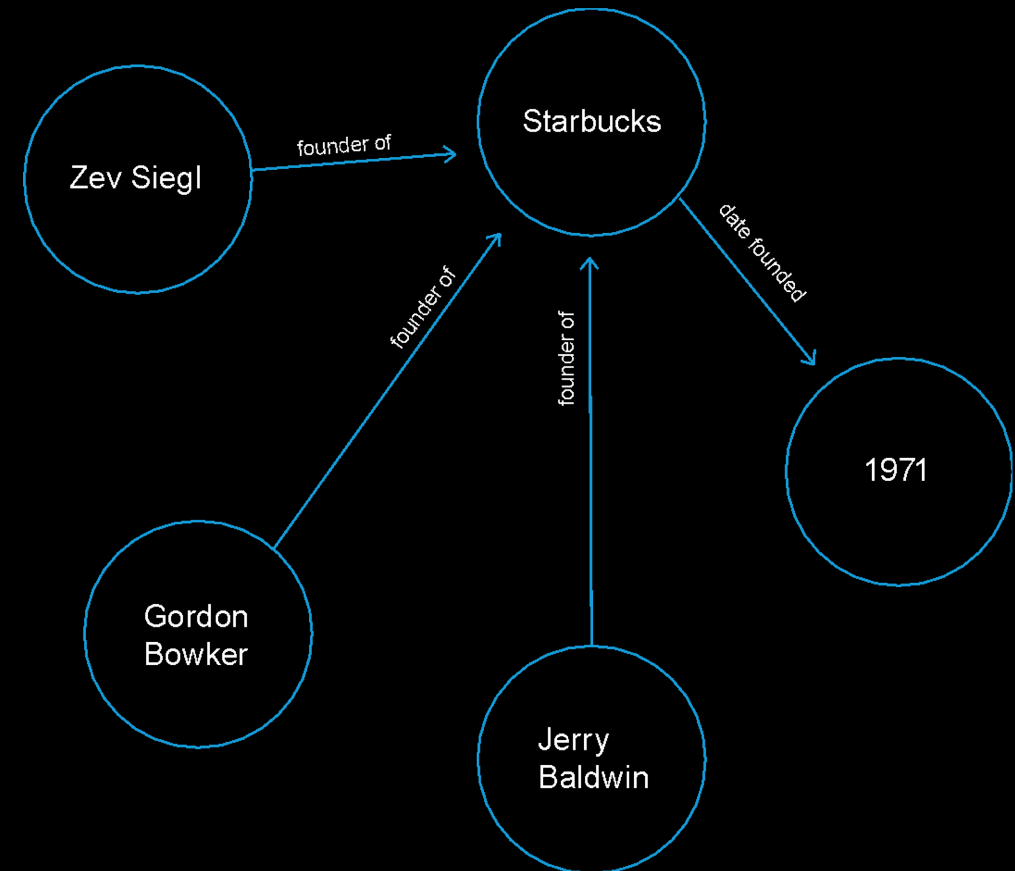
Starbucks Jumps 2%, Outpaces S&P 500 Index Gains

Starbucks Corp. rose 2 percent as the S&P 500 Index advanced.

The shares increased to \$57.86 from \$56.75. Trading volume was almost the same as the 20-day average for this time of day. Starbucks's move compares with the 2 percent rise in the Russell 3000 Consumer Discretionary Index and the 1.9 percent gain in the S&P 500 Index.

In the past year, the stock had a similar or greater gain 10 times and was little changed the next day. It advanced four times for an average 1 percent and declined six times for an average 1.2 percent.

The stock rose 5.7 percent in the past month, compared with the 0.5 percent increase for the company's Bloomberg peers, the 4.8 percent loss in its industry index and the 3.5



Automated News

DEEP ECO: Starbucks Pressured, Industry Sales Slowest in 8 Yrs

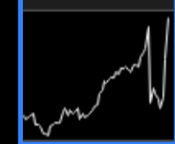
By Bloomberg Automation [Feedback?](#)

(Bloomberg) -- Starbucks Corp.'s revenue may be pressured after a U.S. Census Bureau report showed limited-service eating places nominal retail sales fell 0.1 percent in November, the first decrease in eight years.

- The monthly report may provide an indication of the performance of companies in the industry Bloomberg classifies as limited service restaurants; Starbucks gets 89 percent of its revenue from this industry.
- Analysts estimate the company's revenue will rise 8.2 percent in the current fiscal quarter.
- This retail sales index was up 1 percent in the first two months of the company's current fiscal quarter.
- Starbucks' first quarter started on Oct. 2, 2017.
- In the past six years, Starbucks' revenue has had a 0.7 correlation with this index, according to data compiled by Bloomberg.

SBUX US Equity
Graphic Dashboard»

1M Imp Vol 3M
28.07



Top Contacts

- [Bijan Segha...](#)
- [Nimish Patel](#)
- [Joanna Fowl...](#)
- [Steven Wats...](#)
- [Greda E Irel...](#)

Starbucks Shares Fall After Chain's U.S. Sales Disappoint Again

By Leslie Patton



Signal Extraction from SEC 10-K/10-Q Filings

- Federal securities law requires publicly-traded companies to disclose information on an ongoing basis
- For example, domestic issuers must submit annual reports on Form 10-K, quarterly reports on Form 10-Q.

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Item 4.	Mine Safety Disclosures						
Item 5.	Other Information						
Item 6.	Exhibits						
		10K	10Q	10Q	10Q	10K	

comparable comparable

Signal Extraction from SEC 10-K/10-Q Filings

Item 1A. Risk Factors

The following description of risk factors includes any material changes to, and supersedes the description of, risk factors associated with the Company's business previously disclosed in Part I, Item 1A of the 2018 Form 10-K and in Part II, Item 1A of the Form 10-Q for the quarter ended December 29, 2018, in each case under the heading "Risk Factors." The business, financial condition and operating results of the Company can be affected by a number of factors, whether currently known or unknown, including but not limited to those described below, any one or more of which could, directly or indirectly, cause the Company's actual financial condition and operating results to vary materially from past, or from anticipated future, financial condition and operating results. Any of these factors, in whole or in part, could materially and adversely affect the Company's business, financial condition, operating results and stock price.

The following discussion of risk factors contains forward-looking statements. These risk factors may be important to understanding other statements in this Form 10-Q. The following information should be read in conjunction with the condensed consolidated financial statements and related notes in Part I, Item 1, "Financial Statements" and Part I, Item 2, "Management's Discussion and Analysis of Financial Condition and Results of Operations" of this Form 10-Q.

Because of the following factors, as well as other factors, the Company's financial condition and operating results should be considered as a reliable indicator of future performance, and investors should be aware of the following risks:

Global and regional economic conditions could adversely affect demand for the Company's products and services.

The Company has international operations with manufacturing and assembly activities, are located in various countries.

Adverse macroeconomic conditions, including inflation, slower growth or recession, new or increased tariffs, changes to fiscal and monetary policy, tighter credit, higher interest rates, high unemployment and currency fluctuations could materially adversely affect demand for the Company's products and services. In addition, consumer confidence and spending could be adversely affected in response to financial market volatility, negative financial news, conditions in the real estate and mortgage markets, declines in income or asset values, changes to fuel and other energy costs, labor and healthcare costs and other economic factors.

In addition to an adverse impact on demand for the Company's products, uncertainty about, or a decline in, global or regional economic conditions could have a significant impact on the Company's suppliers, contract manufacturers, logistics providers, distributors, cellular network carriers and other channel partners. Potential effects include financial instability; inability to obtain credit to finance operations and purchases of the Company's products; and insolvency.

A downturn in the economic environment could also lead to increased credit and collectibility risk on the Company's trade receivables; the failure of derivative counterparties and other financial institutions; limitations on the Company's ability to issue new debt; reduced liquidity; and declines in the fair value of the Company's financial instruments. These and other economic factors could materially adversely affect the Company's business, results of operations, financial condition and growth.

Very long risk factor section, but actually nothing changed from the previous quarter!

Signal Extraction from SEC 10-K/10-Q Filings

ITEM 1A. Risk Factors

Except as set forth below, there have been no material changes to the risk factors previously discussed in Item 1A—Risk Factors in the Company's 2017 Form 10-K.

Risks and uncertainties related to the adoption and implementation of regulations restricting oil and gas development in Colorado.

The Company has substantial undeveloped reserves and unproved acreage in the North Park Basin area of Jackson County, Colorado. Recently, various initiatives have been promoted by interest groups in Colorado to increase regulations restricting oil and gas development. For example, on November 6, 2018, Coloradans considered Proposition 112, a ballot initiative that would have established a new statewide minimum distance requirement for new oil and gas development far in excess of existing Colorado Oil and Gas Conservation Commission ("COGCC") setback regulations. Although Coloradans did not approve Proposition 112, future similar initiatives, if implemented, could pose operational challenges, substantially limit our development activity and require higher levels of capital expenditures than we currently anticipate, and therefore have a significant adverse effect on our ability to develop proved undeveloped reserves in the North Park Basin. Even if we are able to develop these assets, delayed development of our reserves or increases in costs to drill and develop such reserves will reduce

Short risk factor section with updates only!

Item 1A. Risk Factors.

In addition to the other information set forth in this report, you should carefully consider the factors discussed in Part I, "Item 1A. Risk Factors" in our Annual Report on Form 10-K for the year ended November 27, 2011 and Quarterly Report on Form 10-Q for the quarterly period ended May 27, 2012, which could materially affect our business, financial condition or future results. The risks described herein and in our Annual Report on Form 10-K and Quarterly Report on Form 10-Q are not the only risks facing our Company. Additional risks and uncertainties not currently known to us or that we currently deem to be immaterial also may materially adversely affect our business, financial condition and/or operating results.

Extraction from financial documents

PART I — FINANCIAL INFORMATION

Item 1. Financial Statements

STARBUCKS CORPORATION

CONDENSED CONSOLIDATED STATEMENTS OF EARNINGS

(in millions, except per share data)

(unaudited)

	Quarter Ended		Three Quarters Ended	
	Jul 1,	Jul 2,	Jul 1,	Jul 2,
Net revenues:				
Company-operated stores	\$ 5,060.4	\$ 4,509.0	\$ 14,630.3	\$ 13,173.7
Licensed stores	660.6	588.3	1,968.6	1,737.4
CPG, foodservice and other	589.3	564.2	1,817.0	
Total net revenues	6,310.3	5,661.5	18,415.9	16,688.5
Cost of sales including occupancy costs	2,554.9	2,249.1	7,573.7	
Store operating expenses	1,825.0	1,628.9	5,351.6	4,853.5
Other operating expenses	148.0	142.5	424.0	422.7
Depreciation and amortization expenses	330.0	252.6	920.4	756.0
General and administrative expenses	468.7	325.0	1,253.6	1,008.2
Restructuring and impairments	16.9	120.2	179.2	120.2
Total operating expenses	5,343.5	4,718.3	15,702.5	13,845.9
Income from equity investees	71.4	101.0	213.5	269.5
Operating income	1,038.2	1,044.2	2,926.9	3,112.1
Gain resulting from acquisition of joint venture	2.5	—	1,376.4	—
Net gain resulting from divestiture of certain operations	—	—	496.3	9.6
Interest income and other, net	31.5	31.7	155.2	114.1
Interest expense	(45.4)	(23.5)	(106.4)	(70.2)
Earnings before income taxes	1,026.8	1,052.4	4,848.4	3,165.6
Income tax expense	174.8	361.1	1,086.5	1,070.1
Net earnings including noncontrolling interests	852.0	691.3	3,761.9	2,095.5
Net loss attributable to noncontrolling interests	(0.5)	(0.3)	(0.9)	(0.6)
Net earnings attributable to Starbucks	\$ 852.5	\$ 691.6	\$ 3,762.8	\$ 2,096.1
Earnings per share - basic	\$ 0.62	\$ 0.48	\$ 2.69	\$ 1.44
Earnings per share - diluted	\$ 0.61	\$ 0.47	\$ 2.67	\$ 1.43
Weighted average shares outstanding:				
Basic	1,377.1	1,447.7	1,397.7	1,452.8
Diluted	1,388.5	1,459.4	1,409.9	1,464.9
Cash dividends declared per share	\$ 0.36	\$ 0.25	\$ 0.96	\$ 0.75

See Notes to Condensed Consolidated Financial Statements.

[Table of Contents](#)

STARBUCKS CORP Equity FA Related Functions Menu Message

SBUX US \$ ↓ 57.80 +1.05 Q57.80 / 57.81Z 15x11

At 14:57 d Vol 6,263,151 0 56.94Q H 58.01K L 56.77Q Val 360.424M

SBUX US Equity Actions Export Settings Financial Analysis

Starbucks Corp BQL Periodicity Annuals Cur FRC (USD)

Key Stats I/S B/S C/F Ratios Segments Addl ESG Custom Shared

1) Adj Highlights 12) GAAP Highlights 13) Earnings 14) Enterprise Value 15) Multiples 16) Per Share 17) Stock Value

In Millions of USD

	2014 Y	2015 Y	2016 Y	2017 Y	Current/LTM	2018 Y Est	2019 Y Est
12 Months Ending	09/28/2014	09/27/2015	10/02/2016	10/01/2017	07/01/2018	09/30/2018	09/30/2019
Market Capitalization	56,343.7	86,120.9	79,071.5	76,891.2	78,005.0		
- Cash & Equivalents	1,843.8	1,611.4	2,263.2	2,690.9	1,976.6		
+ Preferred & Other	1.7	1.8	6.7	6.9	6.0		
+ Total Debt	2,048.3	2,347.5	3,585.2	3,932.6	6,798.9		
Enterprise Value	56,549.9	86,858.8	80,400.2	78,139.8	82,833.3		
Revenue, Adj	16,447.8	19,162.7	21,315.7	22,386.8	24,114.1	24,694.9	26,124.5
Growth %, YoY	10.6	16.5	11.2	7.7	10.3	5.8	
Gross Profit, Adj	4,950.8	5,964.1	6,740.5	6,855.3	7,196.0	14,551.4	15,661.6
Margin %	30.1	31.1	31.6	30.6	29.8	58.9	60.0
EBITDA, Adj	3,809.3	4,589.4	5,259.4	5,418.3	5,626.0	5,500.2	5,914.3
Margin %	23.2	23.9	24.7	24.2	23.3	22.3	22.6
Net Income, Adj	1,985.9	2,578.7	2,855.0	3,055.9	3,527.6	3,345.8	3,421.3
Margin %	12.1	13.5	13.4	13.7	14.6	13.5	13.1
EPS, Adj	1.30	1.70	1.93	2.09	2.48	2.41	2.64
Growth %, YoY	17.8	31.3	13.1	8.4	30.4	15.3	9.7
Cash from Operations	607.8	3,749.1	4,575.1	4,174.3	4,589.1		
Capital Expenditures	-1,160.9	-1,303.7	-1,440.3	-1,519.4	-1,901.9	-2,012.9	-1,926.4
Free Cash Flow	-553.1	2,445.4	3,134.8	2,654.9	2,687.2	2,686.7	3,164.0

<Pg Dn> for More Results, <Back> to Return

chinese companies that had dividend yield over 5% last Page 1/3 Search Bloomberg: Results

- 1) Top Results
- General
- 2) Companies 0
- 3) Functions 2
- 4) People 0
- 5) FAQs 5
- 6) Definitions 0
- 7) Reference 5
- 8) Excel Library 0
- 9) Data Fields 0
- 10) News
- 11) Intelligence 0
- 12) Law
- Securities
- 13) Equities 0
- 14) Funds 0
- 15) Fixed Income 0
- 16) Currencies 0
- 17) Mtge Issuers 0
- 18) Muni Issuers 0
- 19) Commodities 0
- 20) Index/Stats 0
- Contributors
- 21) Pricing 0
- 22) Research 0

Equities | EQS »

Name	Dvd Yld:Y-1	Mkt Cap	1D % Chg	1Yr EPS Gr	P/E
42) EVERGREEN INTERNATIONAL HOLD	27.84	389.02M	2.50%	19.18%	--
43) HEBEI CONSTRUCTION GROUP C-H	25.65	9.25B	4.17%	-19.57%	7.54
44) CHINA DISTANCE EDUCATION-ADR	20.77	282.82M	-5.43%	76.67%	12.47

Bonds | SRCH »

R ↓	Issuer Name	Ticker	Coupon	Maturity Date	Currency	Amt Out
52)	Lenovo Perpetual Securitie...	LENOVO	5.375	Perpetual	USD	1MMM
53)	Huishang Bank Corp Ltd	HSBANK	5.500	Perpetual	USD	888MM
54)	Tewoo Group NO 5 Ltd	TEWOOG	5.800	Perpetual	USD	136.38MM
55)	Bank of Chongqing Co Ltd	BOCHON	5.400	Perpetual	USD	750MM
56)	Bank of Qingdao Co Ltd	QDBANK	5.500	Perpetual	USD	1.2MMM
57)	Bank of Jinzhou Co Ltd	JZCITY	5.500	Perpetual	USD	1.5MMM

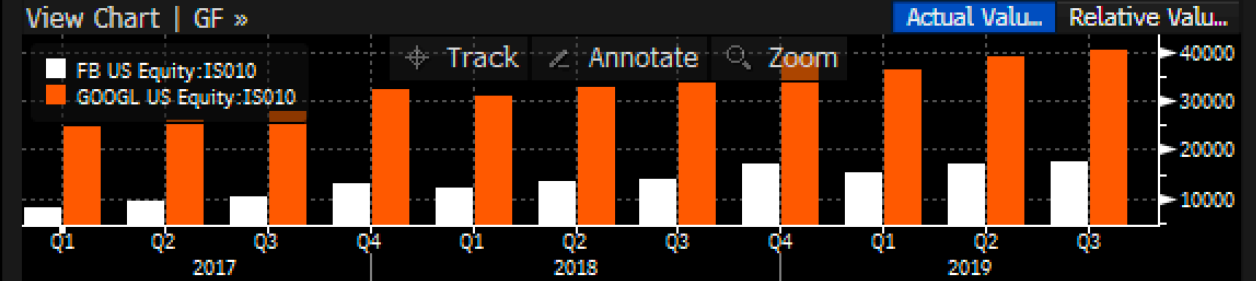
Do Japanese companies announce estimated dividends? FAQ
Yes. Dividend amounts for Japanese companies displayed on the Dividend/Split Summary (DVD) fu

<Pg Dn> for More Results, <Back> to Return

fb vs google revenue Page 1/2 Search Bloomberg: Results

- 1) Top Results
- General
- 2) Companies 0
- 3) Functions 0
- 4) People 0
- 5) FAQs 0
- 6) Definitions 0
- 7) Reference 0
- 8) Excel Library 0
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- 16) Currencies 0
- 17) Mtge Issuers 0
- 18) Muni Issuers 0
- 19) Commodities 0
- 20) Index/Stats 0
- Contributors
- 21) Pricing 0
- 22) Research 0

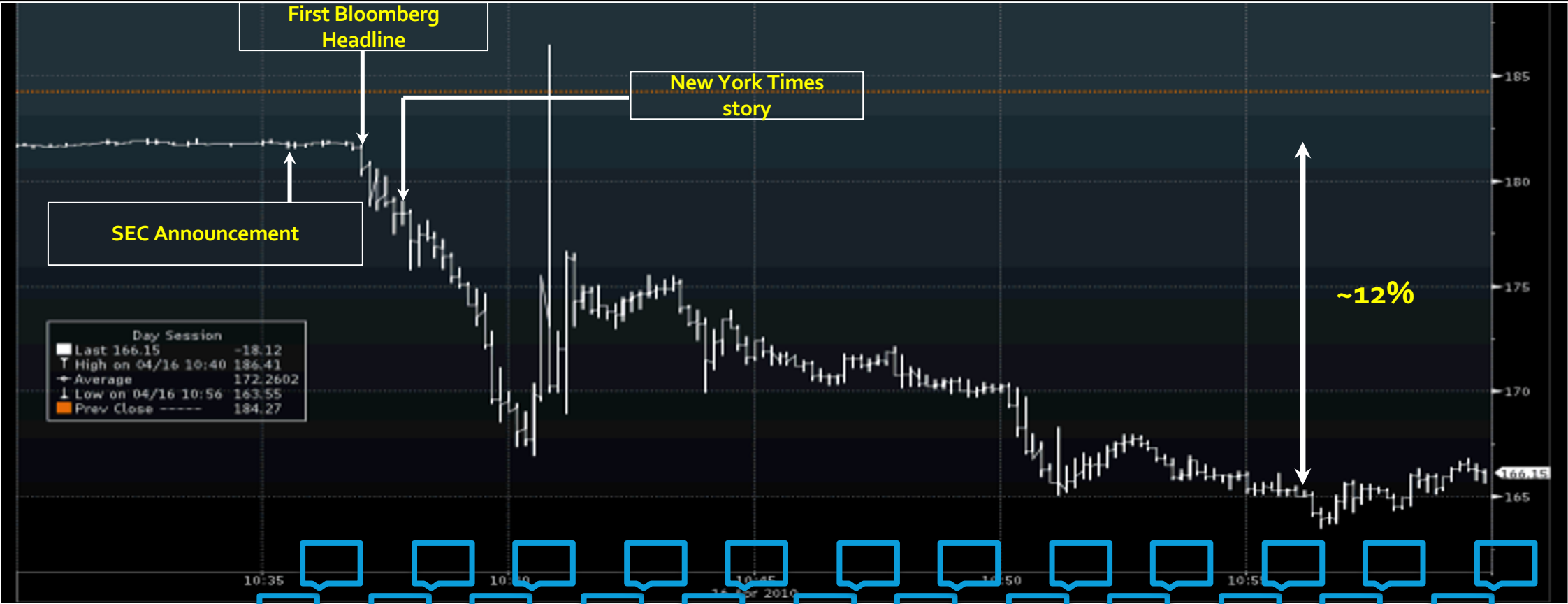
Comparing Revenue of FACEBOOK INC-A vs ALPHABET INC-A >>



Ticker	Revenue	EPS	Diluted EPS	P/E	EBITDA
FB US Equity	\$17.65B	\$2.13	\$2.12	21.24	\$8.90B
GOOGL US Equity	\$40.50B	\$10.20	\$10.12	28.27	\$12.57B

Spread Analysis | HS >>
Graph Fundamentals | GF >>

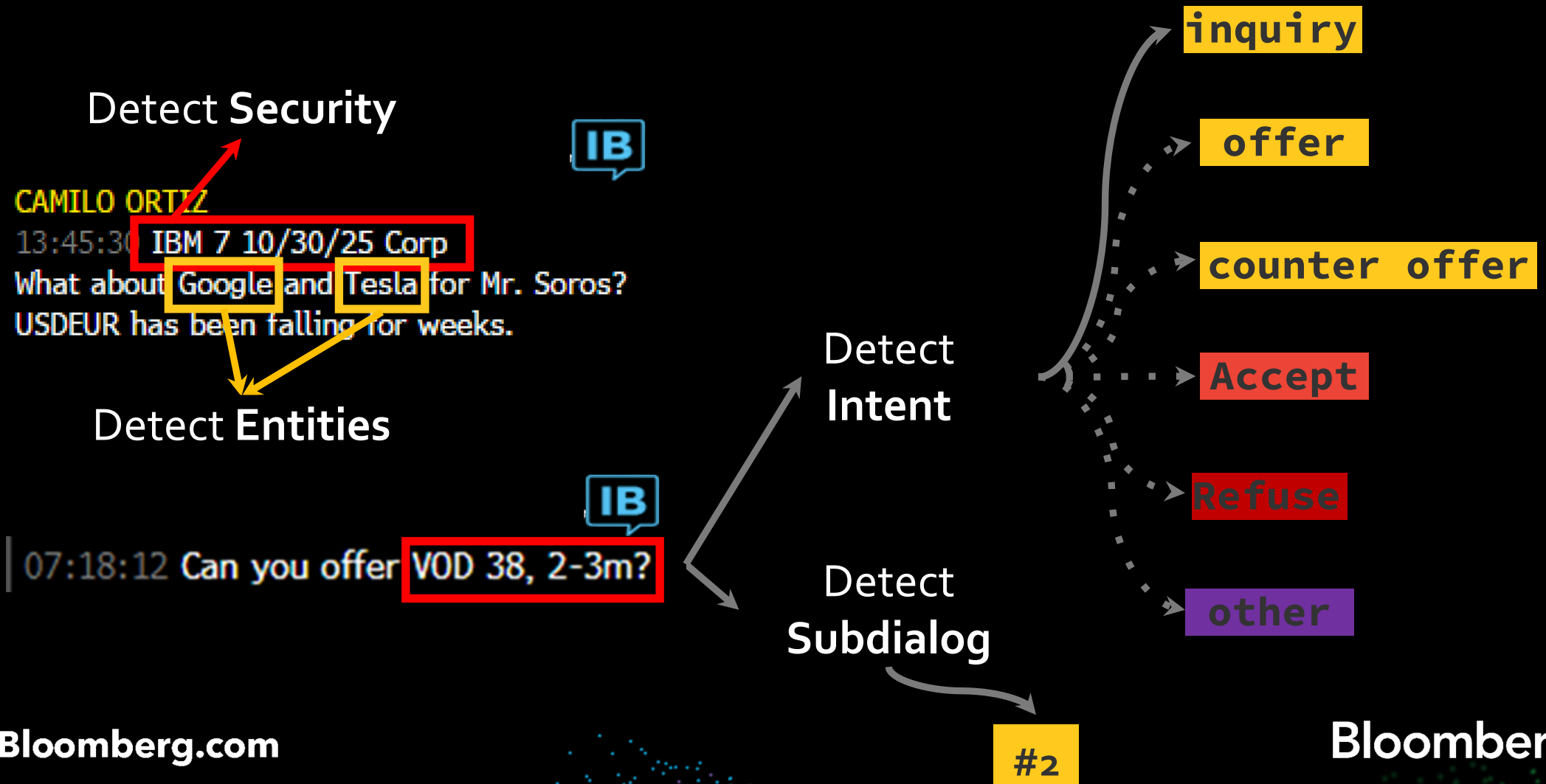
News moves markets



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Engineering

Structuring Communication Data



AI Outreach at Bloomberg

Foundations of Machine Learning

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Data Science Research Grants

www.TechAtBloomberg.com/data-science-research-grant-program-1/

Data Science Ph.D. Fellowships

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Thank you!

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