

Article

Supplementary material: Measuring the Impact of Financial News and Social Media on Stock Market Modeling Using Time Series Mining Techniques

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Table S1. AYLIEN API and SentiWordNet sentiment analysis. The bold letters show the points of failures of the two tools. The success rate of the two tools is the same.

Texts	Real Tone	AYLIEN API Sentiment Score	SentiWordNet Sentiment Score
aaplfileOut1143.txt	negative	−1	−0.029098903
aaplfileOut125.txt	positive	−1	0.059778419
aaplfileOut17.txt	negative	−1	−0.02376973
aaplfileOut400.txt	positive	0	0.049518749
aaplfileOut775.txt	negative	−1	−0.033881106
aaplfileOut803.txt	positive	1	0.051150107
aaplfileOut815.txt	positive	0	0.026146443
aaplfileOut819.txt	negative	−1	0.005474361
aaplfileOut827.txt	positive	−1	−0.022682547
aaplfileOut9.txt	positive	1	0.050961712
gefileOut23.txt	negative	−1	0.071823314
gefileOut921.txt	negative	1	−0.020717845
ibmfileOut1215.txt	positive	1	0.046201612
ibmfileOut1225.txt	negative	−1	−0.062144748
ibmfileOut1243.txt	positive	1	0.049842484
ibmfileOut1245.txt	negative	−1	−0.018343307
ibmfileOut1313.txt	positive	1	0.075927778
ibmfileOut229.txt	positive and negative	−1	0.011129105
msftfile3Out.txt	positive	1	0.050961712
msftfile496Out.txt	positive	0	0.066421665
msftfile55Out.txt	positive	1	0.032976019

Table S2. Sentiment analysis of news about AAPL. The total sentiment score for 7 August 2015 is equal to 4.

Day	Text	AYLIEN API Sentiment Score	−1, 1, 0
07/08/2015	file1.txt	negative	−1
07/08/2015	file2.txt	negative	−1
07/08/2015	file3.txt	positive	1
07/08/2015	file4.txt	positive	1
07/08/2015	file5.txt	negative	−1
07/08/2015	file6.txt	neutral	0
07/08/2015	file7.txt	positive	1
07/08/2015	file8.txt	negative	−1

Table S2. Cont.

Day	Text	AYLIEN API Sentiment Score	−1, 1, 0
07/08/2015	file9.txt	negative	−1
07/08/2015	file10.txt	positive	1
07/08/2015	file11.txt	neutral	0
07/08/2015	file12.txt	negative	−1
07/08/2015	file13.txt	negative	−1
07/08/2015	file14.txt	positive	1
07/08/2015	file15.txt	negative	−1
07/08/2015	file16.txt	neutral	0
07/08/2015	file17.txt	positive	1
07/08/2015	file18.txt	positive	1
07/08/2015	file19.txt	neutral	0
07/08/2015	file20.txt	positive	1
07/08/2015	file21.txt	neutral	0
07/08/2015	file22.txt	positive	1
07/08/2015	file23.txt	positive	1
07/08/2015	file24.txt	positive	1
07/08/2015	file25.txt	positive	1
07/08/2015	file26.txt	negative	−1
07/08/2015	file27.txt	positive	1
07/08/2015	file28.txt	positive	1
07/08/2015	file29.txt	positive	1
07/08/2015	file30.txt	negative	−1
07/08/2015	file31.txt	negative	−1
07/08/2015	file31.txt	neutral	0

Day sentiment score: 4

Table S3. Sentiment score of news per day from 20/04/2015 to 30/10/2015.

Date	AAPL SentSc	GE SentSc	IBM SentSc	MSFT SentSc	ORCL SentSc
20/04/15	6	11	9	20	2
21/04/15	4	3	6	10	0
22/04/15	7	9	2	8	0
23/04/15	8	2	5	14	1
24/04/15	11	3	3	22	0
27/04/15	21	0	−3	3	3
28/04/15	23	4	8	5	5
29/04/15	20	9	5	14	0
30/04/15	12	2	1	6	4
01/05/15	15	0	3	5	2
04/05/15	14	6	8	8	0
05/05/15	11	3	4	9	4
06/05/15	11	2	12	6	5
07/05/15	9	2	4	5	4
08/05/15	9	3	1	6	2
11/05/15	4	2	3	6	2
12/05/15	5	−1	3	6	1
13/05/15	7	0	4	5	0
14/05/15	10	1	5	11	3
15/05/15	6	5	4	10	2
18/05/15	16	8	5	2	0
19/05/15	17	4	0	0	−1
20/05/15	3	8	0	8	−1
21/05/15	10	3	−1	6	0

Table S3. Cont.

Date	AAPL SentSc	GE SentSc	IBM SentSc	MSFT SentSc	ORCL SentSc
22/05/15	6	3	1	5	−2
26/05/15	6	2	5	13	3
27/05/15	5	−2	6	7	0
28/05/15	18	4	6	8	0
29/05/15	19	3	0	8	2
01/06/15	12	5	7	7	3
02/06/15	4	3	1	11	3
03/06/15	15	−1	3	3	0
04/06/15	17	2	4	7	3
05/06/15	8	4	1	−1	0
08/06/15	20	−1	8	6	3
09/06/15	2	−2	3	13	2
10/06/15	6	4	1	9	0
11/06/15	8	0	10	7	2
12/06/15	6	0	3	5	1
15/06/15	14	5	3	6	4
16/06/15	19	−3	2	10	2
17/06/15	12	4	−1	13	6
18/06/15	22	4	3	7	17
19/06/15	2	7	7	8	3
22/06/15	5	3	−4	4	2
23/06/15	14	4	2	4	2
24/06/15	18	4	8	8	2
25/06/15	7	3	3	4	3
26/06/15	15	0	1	9	1
29/06/15	3	0	0	11	1
30/06/15	17	8	2	14	2
01/07/15	4	−6	2	9	0
02/07/15	4	−5	4	4	−1
06/07/15	11	1	4	8	2
07/07/15	9	1	0	7	0
08/07/15	8	6	6	4	7
09/07/15	8	1	2	14	1
10/07/15	9	4	3	6	1
13/07/15	3	6	7	18	4
14/07/15	6	3	0	8	0
15/07/15	14	3	4	9	3
16/07/15	5	6	5	9	5
17/07/15	16	16	3	2	3
20/07/15	8	9	5	−3	1
21/07/15	9	0	7	8	0
22/07/15	−5	5	5	−11	0
23/07/15	13	3	0	6	0
24/07/15	16	5	6	6	3
27/07/15	3	3	0	−2	−1
28/07/15	9	8	5	12	1
29/07/15	9	0	−1	10	0
30/07/15	1	2	2	8	1
31/07/15	3	4	2	15	0
03/08/15	8	2	0	6	0
04/08/15	12	1	3	6	2
05/08/15	8	3	4	7	3
06/08/15	7	3	10	3	0
07/08/15	4	5	12	8	1
10/08/15	4	4	4	3	1

Table S3. Cont.

Date	AAPL SentSc	GE SentSc	IBM SentSc	MSFT SentSc	ORCL SentSc
11/08/15	0	3	3	1	1
12/08/15	−2	2	5	2	1
13/08/15	2	2	0	2	0
14/08/15	2	−1	3	3	1
17/08/15	3	5	3	−1	1
18/08/15	6	2	0	0	1
19/08/15	0	3	3	4	−1
20/08/15	9	4	−1	3	1
21/08/15	−3	2	−1	0	0
24/08/15	−1	3	2	5	1
25/08/15	0	7	6	0	3
26/08/15	4	2	7	1	1
27/08/15	14	5	0	4	1
28/08/15	−1	1	−2	1	1
31/08/15	8	4	5	0	2
01/09/15	9	−7	2	1	1
02/09/15	7	2	−1	0	1
03/09/15	5	0	3	2	0
04/09/15	2	2	2	0	0
08/09/15	5	8	2	2	2
09/09/15	16	4	2	1	1
10/09/15	10	3	1	2	2
11/09/15	3	9	2	1	0
14/09/15	10	5	1	−1	2
15/09/15	4	1	2	5	−3
16/09/15	9	2	3	5	4
17/09/15	6	6	1	7	5
18/09/15	9	5	3	2	1
21/09/15	13	3	4	9	−3
22/09/15	0	5	1	2	0
23/09/15	5	−2	2	3	3
24/09/15	7	4	0	6	1
25/09/15	6	0	5	0	0
28/09/15	9	3	4	2	3
29/09/15	5	3	−1	−3	2
30/09/15	7	3	−2	7	1
01/10/15	6	7	1	4	−1
02/10/15	2	2	2	4	0
05/10/15	7	10	5	3	3
06/10/15	6	1	−1	10	2
07/10/15	4	2	4	0	4
08/10/15	14	7	5	10	3
09/10/15	7	6	7	11	−1
12/10/15	3	7	4	3	−1
13/10/15	7	6	6	8	2
14/10/15	2	3	4	1	1
15/10/15	6	6	2	6	1
16/10/15	3	21	1	2	0
19/10/15	7	12	9	1	1
20/10/15	1	4	−4	0	2
21/10/15	3	9	−5	5	3
22/10/15	8	9	−1	3	0
23/10/15	3	3	7	26	0
26/10/15	11	6	6	9	4
27/10/15	21	3	11	9	1
28/10/15	35	1	6	13	1
29/10/15	10	0	−4	13	1
30/10/15	9	−2	3	13	1

Table S4. Total number of tweets for each stock per day from 20/04/2015 to 30/10/2015.

Date	# of Tweets				
	AAPL	GE	IBM	MSFT	ORCL
20/04/15	1920	387	1369	522	33
21/04/15	2241	390	1336	579	76
22/04/15	2013	318	304	462	74
23/04/15	2900	300	613	1403	130
24/04/15	3269	194	398	2344	83
27/04/15	8550	215	211	585	73
28/04/15	3935	207	451	717	96
29/04/15	4310	248	314	928	313
30/04/15	6486	183	445	925	388
01/05/15	488	19	42	143	21
04/05/15	2403	274	460	584	111
05/05/15	2541	250	479	854	124
06/05/15	3413	196	467	715	103
07/05/15	2981	208	420	391	74
08/05/15	2127	264	285	552	104
11/05/15	2150	248	282	382	72
12/05/15	2721	264	323	449	66
13/05/15	2270	367	274	418	71
14/05/15	2514	262	417	203	81
15/05/15	217	74	44	24	27
18/05/15	4758	431	424	370	138
19/05/15	3925	196	233	541	60
20/05/15	2678	665	670	485	100
21/05/15	2881	503	348	356	77
22/05/15	256	36	28	28	18
26/05/15	3636	586	551	812	143
27/05/15	3115	359	338	656	114
28/05/15	2896	595	445	398	121
29/05/15	344	71	53	44	14
01/06/15	2547	574	557	676	109
02/06/15	2820	509	496	691	144
03/06/15	2651	484	402	590	94
04/06/15	3160	557	494	479	122
05/06/15	269	95	79	51	32
08/06/15	5162	590	541	466	78
09/06/15	4971	859	589	529	174
10/06/15	3783	701	653	501	86
11/06/15	3083	597	592	554	182
12/06/15	314	57	71	90	16
15/06/15	2522	558	623	527	23
16/06/15	2420	606	602	617	161
17/06/15	2379	618	527	887	866
18/06/15	2842	693	555	517	1489
19/06/15	285	58	35	62	88
22/06/15	3182	512	374	359	198
23/06/15	2997	412	414	428	330
24/06/15	4077	579	760	471	198
25/06/15	5058	626	502	425	193
26/06/15	286	48	39	101	31
29/06/15	2795	677	416	606	226
30/06/15	405	702	699	744	222
01/07/15	2835	696	528	433	58
02/07/15	2681	270	205	380	110
06/07/15	181	145	190	2032	866
07/07/15	2530	431	444	424	145

Table S4. Cont.

Date	# of Tweets				
	AAPL	GE	IBM	MSFT	ORCL
08/07/15	2955	211	211	1511	103
09/07/15	4970	102	314	1487	97
10/07/15	3968	389	477	988	80
13/07/15	225	240	214	472	130
14/07/15	2283	201	209	518	83
15/07/15	3198	430	325	495	145
16/07/15	2970	473	526	380	109
17/07/15	3529	766	256	456	111
20/07/15	3379	445	1497	544	114
21/07/15	9616	483	2171	2140	153
22/07/15	4155	442	862	2264	135
23/07/15	820	598	985	792	140
24/07/15	3640	482	610	891	86
27/07/15	331	121	198	320	29
28/07/15	622	481	436	470	96
29/07/15	2262	569	545	397	126
30/07/15	2011	422	336	529	154
31/07/15	2671	496	509	467	119
04/08/15	383	175	311	576	114
05/08/15	4253	155	274	518	123
06/08/15	3705	414	692	433	164
07/08/15	397	471	663	353	77
10/08/15	98	87	250	279	40
11/08/15	2937	239	219	367	93
12/08/15	323	252	154	25	81
13/08/15	1139	363	16	329	50
14/08/15	3104	530	515	340	67
17/08/15	2118	119	153	251	29
18/08/15	2120	135	166	290	68
19/08/15	2163	147	185	340	90
20/08/15	2264	154	130	311	86
21/08/15	3709	134	133	340	67
24/08/15	251	320	199	548	34
25/08/15	4301	571	405	367	71
26/08/15	5185	787	705	337	130
27/08/15	4316	499	494	345	74
28/08/15	3469	605	647	241	87
31/08/15	2447	251	305	239	1
01/09/15	2193	245	211	309	42
02/09/15	2661	192	170	356	58
03/09/15	208	127	185	354	50
04/09/15	0	8	9	53	3
08/09/15	47	482	530	325	35
09/09/15	50	419	425	543	35
10/09/15	544	423	252	45	44
11/09/15	248	784	389	479	130
14/09/15	48	139	96	350	63
15/09/15	52	9	300	28	110
16/09/15	151	55	244	156	458
17/09/15	51	570	559	15	686
18/09/15	251	62	17	38	144
21/09/15	16	84	84	10	33
22/09/15	50	194	147	252	73
23/09/15	48	380	288	288	56

Table S4. Cont.

Date	# of Tweets				
	AAPL	GE	IBM	MSFT	ORCL
24/09/15	51	312	226	87	39
25/09/15	49	53	53	11	3
28/09/15	402	311	203	6	0
29/09/15	51	533	371	114	50
30/09/15	47	212	158	37	56
01/10/15	52	33	198	9	38
02/10/15	49	0	19	41	3
05/10/15	48	607	397	519	67
06/10/15	1080	538	294	823	56
07/10/15	292	662	477	607	67
08/10/15	2984	601	528	520	55
09/10/15	320	44	56	119	1
12/10/15	1976	17	211	16	61
13/10/15	2080	214	220	128	69
14/10/15	5350	42	11	364	181
15/10/15	2641	191	73	429	80
16/10/15	477	102	76	26	5
19/10/15	2282	428	331	33	52
20/10/15	238	400	2927	249	123
21/10/15	2296	460	684	540	54
22/10/15	1811	180	346	1335	61
23/10/15	221	21	58	714	10
26/10/15	3771	179	192	975	128
27/10/15	8977	290	1042	886	144
28/10/15	2720	233	2111	1040	120
29/10/15	5049	216	444	921	149
30/10/15	3056	37	14	111	10

Table S5. A short excerpt example of normalization into [0, 1] for APPLE company.

Date	Normalization # of Tweets	Normalization	SentimentScore	Normalization Close
20/04/15	0.199667221	0.275		0.82898747
21/04/15	0.233049085	0.225		0.805621402
22/04/15	0.209338602	0.3		0.863528615
23/04/15	0.301580699	0.325		0.899085676
24/04/15	0.339954243	0.4		0.919742635
27/04/15	0.889143095	0.65		1
28/04/15	0.40921381	0.7		0.929224517
29/04/15	0.448211314	0.625		0.864205892
30/04/15	0.674500832	0.425		0.746020996
01/05/15	0.050748752	0.5		0.874703691
04/05/15	0.249896007	0.475		0.866237724
05/05/15	0.264247088	0.4		0.768032509
06/05/15	0.354929285	0.4		0.741280054
07/05/15	0.31000416	0.35		0.749746021
08/05/15	0.221193844	0.35		0.829664748
11/05/15	0.223585691	0.225		0.78564172
12/05/15	0.28296589	0.25		0.770233661
13/05/15	0.236064892	0.3		0.775143921
14/05/15	0.261439268	0.375		0.874703691
15/05/15	0.022566556	0.275		0.868608195
18/05/15	0.494800333	0.525		0.916694887
19/05/15	0.408173877	0.55		0.912631222

Table S6. GrammarViz 2.0 API AAPL patterns.

AAPL			
Rules	Close Time Series	SentimentScore Time Series	numTweets Time Series
R#1	(0, 18), (21, 48)	(10, 26), (28, 44), (30, 47), (50, 80)	(0, 17), (27, 46), (38, 57)
R#2	(4, 21), (79, 98)	(12, 28), (112, 128)	(3, 20), (87, 108)
R#3	(9, 29), (118, 136)	(14, 30), (84, 103)	(10, 36), (33, 52), (43, 63), (73, 90), (102, 119)
R#4	(19, 35), (57, 73)	(16, 32), (118, 136)	(22, 41), (52, 69), (119, 135)
R#5	(35, 61), (74, 93), (100, 121)	(18, 36), (89, 112)	(55, 74), (67, 86)
R#6	(48, 69), (90, 113)	(23, 39), (115, 131)	(64, 80), (94, 111), (100, 116)
R#7	(67, 87), (107, 126)	(25, 42), (39, 55), (41, 58), (98, 117)	(108, 124), (110, 129)
R#8		(41, 59), (98, 118)	
R#9		(45, 61), (70, 86)	
R#10		(76, 94), (82, 98)	

Table S7. GrammarViz 2.0 API GE patterns.

GE			
Rules	Close Time Series	SentimentScore Time Series	numTweets Time Series
R#1	(6, 34), (91, 114)	(3, 21), (20, 38)	(0, 19), (47, 66)
R#2	(20, 39), (40, 62)	(8, 27), (29, 45)	(7, 24), (18, 39)
R#3	(35, 54), (74, 92)	(13, 32), (34, 50)	(13, 30), (16, 32)
R#4	(48, 66), (104, 122)	(24, 43), (99, 116)	(42, 60), (64, 80)
R#5	(8, 32), (52, 68), (92, 113)	(32, 48), (47, 67), (113, 131)	(58, 78), (71, 88)
R#6	(58, 77), (78, 95)	(36, 52), (53, 69), (118, 134)	(69, 85), (88, 105), (116, 133)
R#7	(64, 82), (84, 100)	(38, 55), (82, 99)	(80, 96), (106, 125)
R#8		(41, 57), (60, 77)	(85, 101), (94, 111)
R#9		(44, 61), (85, 104), (102, 119)	(88, 106), (116, 134)
R#10		(55, 72), (66, 86)	
R#11		(72, 88), (74, 91)	
R#12		(105, 122), (111, 127)	

Table S8. GrammarViz 2.0 API IBM patterns.

IBM			
Rules	Close Time Series	SentimentScore Time Series	numTweets Time Series
R#1	(0, 17), (112, 129)	(1, 20), (21, 44)	(0, 19), (88, 107)
R#2	(11, 30), (51, 70)	(6, 23), (32, 49), (85, 104)	(10, 39), (101, 122)
R#3	(16, 43), (40, 57), (57, 76), (66, 86), (78, 98)	(12, 29), (119, 136)	(25, 57), (43, 60)
R#4	(38, 57), (56, 76), (64, 86), (75, 98)	(16, 33), (78, 98)	(10, 38), (47, 64), (101, 120)
R#5	(46, 65), (105, 126)	(19, 35), (113, 129)	(51, 67), (53, 69)
R#6	(56, 78), (64, 89), (75, 99)	(35, 63), (49, 65)	(0, 16), (62, 81), (88, 105)
R#7	(96, 117), (115, 136)	(52, 71), (57, 73)	(73, 91), (97, 115)
R#8		(59, 75), (72, 90)	(77, 94), (115, 132)
R#9		(62, 81), (104, 126)	(84, 102), (93, 110)
R#10		(90, 108), (95, 116)	(108, 125), (118, 134)
R#11		(21, 42), (91, 108), (98, 116)	

Table S9. GrammarViz 2.0 API MSFT patterns.

MSFT			
Rules	Close Time Series	SentimentScore Time Series	numTweets Time Series
R#1	(0, 18), (54, 74), (66, 85), (98, 117)	(4, 24), (84, 104)	(0, 23), (61, 77), (99, 116)
R#2	(8, 24), (71, 87)	(10, 26), (34, 51)	(10, 27), (71, 90)
R#3	(15, 35), (22, 44)	(14, 33), (46, 63), (104, 120)	(15, 31), (108, 124)
R#4	(30, 48), (84, 101)	(19, 35), (41, 58)	(17, 47), (55, 72)
R#5	(38, 60), (75, 98)	(24, 43), (39, 55)	(40, 57), (76, 93)
R#6	(46, 64), (103, 122)	(29, 48), (44, 60)	(43, 60), (119, 136)
R#7	(50, 74), (64, 85)	(54, 72), (68, 90)	(49, 66), (90, 106), (102, 118)
R#8	(91, 110), (117, 133)	(61, 80), (94, 113)	(52, 69), (116, 133)
R#9	(64, 80), (108, 128)	(66, 82), (114, 131)	(59, 75), (93, 109)
R#10	(22, 42), (40, 58), (78, 96)	(4, 21), (7, 24), (76, 97), (84, 101), (87, 104)	(84, 100), (86, 102)
11		(90, 107), (107, 125)	

Table S10. GrammarViz 2.0 API ORCL patterns.

ORCL			
Rules	Close Time Series	SentimentScore Time Series	numTweets Time Series
R#1	(6, 25), (45, 64)	(0, 19), (106, 125)	(6, 24), (38, 58), (49, 69)
R#2	(11, 30), (92, 112)	(6, 28), (37, 57)	(11, 30), (16, 46), (115, 136)
R#3	(17, 40), (79, 101)	(19, 37), (48, 65)	(37, 58), (47, 69)
R#4	(8, 25), (26, 43), (47, 64)	(24, 41), (81, 97), (121, 136)	(60, 81), (76, 96)
R#5	(31, 59), (51, 73)	(45, 62), (76, 92), (78, 95)	(74, 90), (87, 103), (105, 121)
R#6	(89, 106), (104, 125)	(59, 77), (89, 120)	(83, 101), (97, 117)
R#7	(98, 118), (117, 134)	(68, 88), (83, 102)	
R#8	(17, 34), (35, 59), (56, 73), (79, 98)		

Table S11. AAPL DTW distances. M.V., Mean Value.

	Patterns Close	DTW (Close-Sent)	(+3)		(−3)	
AAPL						
R#1	(0, 18)	0.132927814	(3, 21)	0.130453007	(0, 15)	0.118455931
	(21, 48)	0.224499881	(24, 52)	0.129996033	(18, 45)	0.234678589
	M.V.	0.178713848		0.13022452		0.17656726
R#2	(4, 21)	0.122488151	(7, 24)	0.17775651	(1, 18)	0.126236494
	(79, 98)	0.013949321	(82, 101)	0.014667447	(76, 95)	0.010755306
	M.V.	0.068218736		0.096211979		0.0684959
R#3	(9, 29)	0.138622	(12, 32)	0.148184249	(6, 26)	0.176994298
	(118, 136)	0.012753229	(121, 139)	0	(115, 133)	0.006232954
	M.V.	0.075687614		0		0.091613626
R#4	(19, 35)	0.290880447	(22, 38)	0.261919781	(16, 32)	0.17196995
	(57, 73)	0.082611713	(60, 76)	0.055699564	(54, 70)	0.096754118
	M.V.	0.18674608		0.158809672		0.134362034
R#5	(35, 61)	0.08811786	(38, 64)	0.075305168	(32, 58)	0.061768084
	(74, 93)	0.006734272	(77, 96)	0.019192221	(71, 90)	0.019056363
	(100, 121)	0.003301351	(103, 124)	0.004559662	(97, 118)	0.00333735
	M.V.	0.032717828		0.033019017		0.028053932
R#6	(48, 69)	0.087700635	(51, 72)	0.104168535	(45, 66)	0.089930725
	(90, 113)	0.006052134	(93, 116)	0.00352377	(87, 110)	0.00745198
	M.V.	0.046876385		0.053846152		0.048691353
R#7	(67, 87)	0.011688972	(70, 90)	0.015396011	(64, 84)	0.045889765
	(107, 126)	0.003705718	(110, 129)	0.005635293	(104, 123)	0.003326848
	M.V.	0.007697345		0.010515652		0.024608307
	(0, 136)	0.020023392	(3, 136)	0.016962889	(0, 133)	0.019556095

Table S12. GE DTW distances.

	Patterns Close	DTW (Close-Sent)	(+3)		(−3)	
GE						
R#1	6,34	0.048316762	(9, 37)	0.063273874	(3, 31)	0.043765866
	91,114	0.005961417	(94, 117)	0.005351481	(88, 111)	0.0135242
	M.V.	0.027139089		0.034312677		0.028645033
R#2	20,39	0.057791944	(23, 42)	0.123959666	(17, 36)	0.076728033
	40,62	0.024307804	(43, 65)	0.017040897	(37, 59)	0.035606593
	M.V.	0.041049874		0.070500282		0.056167313
R#3	35,54	0.061067905	(38, 57)	0.033648581	(32, 51)	0.075834768
	74,92	0.00615485	(77, 95)	0.007091716	(71, 89)	0.01451124
	M.V.	0.033611377		0.020370149		0.045173004
R#4	48,66	0.022490484	(51, 69)	0.026277473	(45, 63)	0.02849157
	104,122	0.015399226	(107, 125)	0.025514367	(101, 119)	0.019592552
	M.V.	0.018944855		0.02589592		0.024042061
R#5	8,32	0.053561217	(11, 35)	0.058276778	(5, 29)	0.040027176
	52,68	0.018014158	(55, 71)	0.008168801	(49, 65)	0.021174637
	92,113	0.006940416	(95, 116)	0.005332492	(89, 110)	0.016022284
	M.V.	0.02617193		0.023926023		0.025741366
R#6	58,77	0.006520571	(61, 80)	0.005007802	(55, 74)	0.006889779
	78,95	0.007797516	(81, 98)	0.009291552	(75, 92)	0.006447103
	M.V.	0.007159043		0.007149677		0.006668441
R#7	64,82	0.008452165	(67, 85)	0.003285581	(61, 79)	0.004910511
	84,100	0.011438153	(87, 103)	0.014549678	(81, 97)	0.008021026
	M.V.	0.009945159		0.00891763		0.006465769
	(0, 136)	0.019209451	(3, 136)	0.020979292	(0, 133)	0.01437877

Table S13. IBM DTW distances.

	Patterns Close	DTW (Close-Sent)	(+3)		(−3)	
IBM						
R#1	(0, 17)	0.061996272	(3, 20)	0.106579383	(0, 14)	0.057772954
	(112, 129)	0.029249601	(115, 132)	0.044831215	(109, 126)	0.020145415
	M.V.	0.045622937		0.075705299		0.038959185
R#2	(11, 30)	0.100113416	(14, 33)	0.196234262	(8, 27)	0.101560123
	(51, 70)	0.040641168	(54, 73)	0.034131776	(48, 67)	0.037569513
	M.V.	0.070377292		0.115183019		0.069564818
R#3	(16, 43)	0.09579497	(19, 46)	0.090980905	(13, 40)	0.116387367
	(40, 57)	0.067699973	(43, 60)	0.054790764	(37, 54)	0.116387367
	(57, 76)	0.026851872	(60, 79)	0.036069286	(54, 73)	0.034131776
	(66, 86)	0.023585529	(69, 89)	0.028918762	(63, 83)	0.025042108
	(78, 98)	0.015253489	(81, 101)	0.016386188	(75, 95)	0.022080311
	M.V.	0.045837167		0.045429181		0.062805786

Table S13. Cont.

	Patterns Close	DTW (Close-Sent)	(+3)		(−3)	
R#4	(38, 57)	0.064717503	(41, 60)	0.063105081	(35, 54)	0.061315475
	(56, 76)	0.0267374	(59, 79)	0.044572698	(53, 73)	0.034382754
	(64, 86)	0.01814183	(67, 89)	0.029067463	(61, 83)	0.031105461
	(75, 98)	0.021796311	(78, 101)	0.014226569	(72, 95)	0.021229447
	M.V.	0.032848261		0.037742953		0.037008284
R#5	(46, 65)	0.019908383	(49, 68)	0.0328417	(43, 62)	0.061463001
	(105, 126)	0.016392128	(108, 129)	0.026416929	(102, 123)	0.020549259
	M.V.	0.018150255		0.029629315		0.04100613
R#6	(56, 78)	0.016392128	(59, 81)	0.026416929	(53, 75)	0.030367806
	(64, 89)	0.025844635	(67, 91)	0.021750789	(61, 86)	0.026635526
	(75, 99)	0.022439104	(78, 102)	0.014362557	(72, 96)	0.022000222
	M.V.	0.021558622		0.020843425		0.026334518
R#7	(96, 117)	0.020778609	(99, 120)	0.016388883	(93, 114)	0.014430732
	(115, 136)	0.051017149	(118, 139)	0.057881881	(112, 133)	0.071952463
	M.V.	0.035897879		0.037135382		0.043191598
	(0, 136)	0.021060988	(3, 136)	0.025955844	(0, 133)	0.023155161

Table S14. MSFT DTW distances.

	Patterns Close	DTW (Close-Sent)	(+3)		(−3)	
MSFT						
R#1	(0, 18)	0.043112148	(3, 21)	0.0204134	(0, 15)	0.049143746
	(54, 74)	0.015542666	(57, 77)	0.01394839	(51, 71)	0.017164034
	(66, 85)	0.008467735	(69, 88)	0.010408634	(63, 82)	0.016193293
	(98, 117)	0.004577522	(101, 120)	0.005211202	(95, 114)	0.0105623
	M.V.	0.017925018		0.012495406		0.023265843
R#2	(8, 24)	0.005421031	(11, 27)	0.003862107	(5, 21)	0.007380309
	(71, 87)	0.003463839	(74, 90)	0.007862162	(68, 84)	0.012899386
	M.V.	0.004442435		0.005862134		0.010139847
R#3	(15, 35)	0.006774264	(18, 38)	0.004893978	(12, 32)	0.003597077
	(22, 44)	0.004319237	(25, 47)	0.004973965	(19, 41)	0.007342368
	M.V.	0.00554675		0.004933972		0.005469722
R#4	(30, 48)	0.006384279	(33, 51)	0.019299148	(27, 45)	0.004136388
	(84, 101)	0.01533234	(87, 104)	0.011925536	(81, 98)	0.012931449
	M.V.	0.01085831		0.015612342		0.008533919
R#5	(38, 60)	0.014296979	(41, 63)	0.011544044	(35, 57)	0.014078864
	(75, 98)	0.008317173	(78, 101)	0.011455648	(72, 81)	0.008967967
	M.V.	0.011307076		0.011499846		0.011523416
R#6	(46, 64)	0.013270383	(49, 67)	0.027231381	(43, 61)	0.012998366
	(103, 122)	0.011395867	(106, 125)	0.009095291	(99, 119)	0.00612255
	M.V.	0.012333125		0.018163336		0.009560458

Table S14. Cont.

	Patterns Close	DTW (Close-Sent)	(+3)		(−3)	
R#7	(50, 74)	0.020329805	(53, 77)	0.015352291	(47, 71)	0.013835133
	(64, 85)	0.012564501	(67, 88)	0.015352291	(61, 82)	0.012478417
	M.V.	0.016447153		0.015352291		0.013156775
R#8	(91, 110)	0.013802492	(94, 113)	0.010748756	(88, 107)	0.018469122
	(117, 133)	0.024031566	(120, 136)	0.02170773	(114, 130)	0.011311427
	M.V.	0.018917029		0.016228243		0.014890274
R#9	(64, 80)	0.014465065	(67, 83)	0.011110363	(61, 77)	0.013368028
	(108, 128)	0.012543398	(111, 131)	0.00829675	(105, 125)	0.009627537
	M.V.	0.013504232		0.009703557		0.011497783
R#10	(22, 42)	0.004771107	(25, 45)	0.005182019	(19, 39)	0.005182967
	(40, 58)	0.018671199	(43, 61)	0.012998366	(37, 55)	0.008392423
	(78, 96)	0.011077892	(81, 99)	0.013120006	(75, 93)	0.006914332
	M.V.	0.011506733		0.010433463		0.006829907
	(0, 136)	0.012017329	(3, 136)	0.009474218	(0, 133)	0.012100802

Table S15. ORCL DTW distances.

	Patterns Close	DTW (Close-Sent)	(+3)		(−3)	
ORCL						
R#1	(6, 25)	0.471294804	(9, 28)	0.482935421	(3, 22)	0.448408047
	(45, 64)	0.05660017	(48, 67)	0.037376999	(42, 61)	0.073555168
	M.V.	0.263947487		0.26015621		0.260981607
R#2	(11, 30)	0.458907488	(14, 33)	0.494422239	(8, 27)	0.478130769
	(92, 112)	0.008971793	(95, 115)	0.005116217	(89, 109)	0.010234149
	M.V.	0.23393964		0.249769228		0.244182459
R#3	(17, 40)	0.481525513	(20, 43)	0.240640673	(14, 37)	0.478424925
	(79, 101)	0.013528202	(82, 104)	0.011339415	(76, 98)	0.019213732
	M.V.	0.247526857		0.125990044		0.248819328
R#4	(8, 25)	0.468079249	(11, 28)	0.472905162	(5, 23)	0.460089992
	(26, 43)	0.255305062	(29, 46)	0.211643055	(23, 40)	0.452912864
	(47, 64)	0.049486634	(50, 67)	0.031153507	(44, 61)	0.072598914
	M.V.	0.257623648		0.238567241		0.328533923
R#5	(31, 59)	0.150034876	(34, 62)	0.105219971	(28, 56)	0.17816773
	(51, 73)	0.032485304	(54, 76)	0.018515332	(48, 70)	0.034385703
	M.V.	0.09126009		0.061867652		0.106276716
R#6	(89, 106)	0.008754538	(92, 109)	0.007342528	(86, 103)	0.005647757
	(104, 125)	0.003985485	(107, 128)	0.004216581	(101, 122)	0.007539246
	M.V.	0.006370011		0.005779554		0.006593501
R#7	(98, 118)	0.005107479	(101, 121)	0.006850016	(95, 115)	0.005116217
	(117, 134)	0.004019476	(120, 136)	0.005971956	(114, 131)	0.003458915
	M.V.	0.004563477		0.006410986		0.004287566

Table S15. Cont.

	Patterns Close	DTW (Close-Sent)	(+3)		(−3)	
R#8	(17, 34)	0.493278351	(20, 37)	0.489724639	(14, 31)	0.500775503
	(35, 59)	0.117772983	(38, 62)	0.101679742	(32, 56)	0.150765899
	(56, 73)	0.038263488	(59, 76)	0.026799588	(53, 70)	0.019677882
	(79, 98)	0.014458159	(82, 101)	0.011661849	(76, 95)	0.022347265
M.V.		0.165943245		0.157466454		0.173391637
(0, 136)		0.058098865	(3, 136)	0.053149474	(0, 133)	0.058516133

Table S16. Random windows length w for close—sentimentScore time series. Mean Value (M.V.) of DTW distance between the two time series.

Window Size = 10	AAPL	GE	IBM	MSFT	ORCL
(0 to 9)	0.132594944	0.029407011	0.092242161	0.077443956	0.421920571
(10 to 19)	0.220766056	0.074360434	0.118744716	0.001840917	0.406115196
(20 to 29)	0.30832706	0.056872127	0.25752526	0.008708723	0.545575005
(30 to 39)	0.255556822	0.130645331	0.09814162	0.00856189	0.41815446
(40 to 49)	0.092403903	0.048857659	0.089159528	0.017389937	0.159801089
(50 to 59)	0.092051367	0.02218414	0.046321985	0.039845794	0.07968165
(60 to 69)	0.145747555	0.010902172	0.051924713	0.024259335	0.020463904
(70 to 79)	0.031126111	0.00644333	0.038545699	0.006645506	0.049387201
(80 to 89)	0.034904158	0.02980676	0.037502497	0.015615256	0.029621275
(90 to 99)	0.011650497	0.019715245	0.032379206	0.015197023	0.00168897
(100 to 109)	0.008491675	0.010327482	0.029034686	0.023148428	0.0125765
(110 to 119)	0.002896972	0.027893341	0.020737998	0.009708541	0.008276105
(120 to 129)	0.010765293	0.078999909	0.03583258	0.007960564	0.005079089
(130 to 136)	0.036694448	0.391818808	0.144921426	0.040453866	0.014416648
M.V.	0.09885549	0.067016696	0.078072434	0.021198553	0.155196976
Window Size = 15	AAPL	GE	IBM	MSFT	ORCL
(0 to 14)	0.109940139	0.026756657	0.057772954	0.051912832	0.402811968
(15 to 29)	0.167979319	0.04952271	0.231559283	0.003933699	0.512928547
(30 to 44)	0.233999892	0.11806591	0.099284731	0.005833092	0.211565198
(45 to 59)	0.077718213	0.035824153	0.053105705	0.023147338	0.088357876
(60 to 74)	0.059333059	0.009938994	0.036173	0.015673704	0.024701819
(75 to 89)	0.012929441	0.017677232	0.036219332	0.007465024	0.012936454
(90 to 104)	0.007124996	0.009022719	0.019207299	0.009172702	0.004291232
(105 to 119)	0.002583163	0.01872367	0.016538332	0.010676578	0.00726314
(120 to 134)	0.014989892	0.161936701	0.116833957	0.029490723	0.004185029
(135 to 149)	0.043969151	0.51037172	0.08409094	0.068615823	0.025628153
M.V.	0.073056726	0.095784046	0.075078553	0.022592152	0.129466942
Window Size = 20	AAPL	GE	IBM	MSFT	ORCL
(0 to 19)	0.140765058	0.038802565	0.069209532	0.041315812	0.414017883
(20 to 39)	0.243761634	0.057791944	0.099271397	0.006589108	0.481864732
(40 to 59)	0.061237306	0.027366395	0.064257965	0.017935151	0.073489052
(60 to 79)	0.047460404	0.006010785	0.036069286	0.013210629	0.02276052
(80 to 99)	0.024232003	0.01016897	0.018693446	0.013040824	0.013184924
(100 to 119)	0.00265609	0.015736948	0.016447408	0.005750519	0.005851461
(120 to 139)→(120 to 136)	0.015284347	0.119681172	0.063828398	0.037343638	0.005971956
M.V.	0.076485263	0.03936554	0.052539633	0.01931224	0.14530579

Table S16. Cont.

Window Size = 10	AAPL	GE	IBM	MSFT	ORCL
Window Size = 50	AAPL	GE	IBM	MSFT	ORCL
(0 to 49)	0.087563615	0.023222385	0.040792067	0.018401021	0.181187229
(50 to 99)	0.020892696	0.009804916	0.024100138	0.014454492	0.009804755
(100 to 136)	0.007553615	0.058670432	0.035772381	0.012782511	0.005917864
M.V.	0.038669975	0.030565911	0.033554862	0.015212674	0.065636616
Window Size = 70	AAPL	GE	IBM	MSFT	ORCL
(0 to 69)	0.05828581	0.00922796	0.023147534	0.015571096	0.105280792
(70 to 136)	0.009824072	0.034843632	0.024369371	0.008509838	0.009100912
M.V.	0.034054941	0.022035796	0.023758453	0.012040467	0.057190852

Table S17. The rules, of all companies, in which there is a correlation (small DTW distance) between the closing price (close) and news (sentimentScore) time series.

	AAPL	GE	IBM	MSFT	ORCL
Rules	R#2, R#5, R#6, R#7	R#1, R#2, R#3, R#4, R#5, R#6, R#7	R#1, R#2, R#3, R#4, R#5, R#6, R#7	R#1, R#2, R#3, R#4, R#5, R#6, R#7, R#8, R#9, R#10	R#5, R#6, R#7

Table S18. AAPL DTW distance between close and numTweets time series. Mean Value (M.V.) of the intervals that consist of a rule.

	Patterns Close	DTW (Close-numTweets)	(+3)	(−3)
AAPL				
R#1	(0, 18)	0.167207678	(3, 21)	0.174740651
	(21, 48)	0.382495786	(24, 52)	0.258877117
	M.V.	0.274851732		0.216808884
R#2	(4, 21)	0.175319856	(7, 24)	0.261279676
	(79, 98)	0.013793546	(82, 101)	0.022375984
	M.V.	0.094556701		0.14182783
R#3	(9, 29)	0.368761897	(12, 32)	0.359538589
	(118, 136)	0.023506788	(121, 139)	0.026802946
	M.V.	0.196134342		0.193170768
R#4	(19, 35)	0.427951467	(22, 38)	0.427124199
	(57, 73)	0.091673757	(60, 76)	0.067387733
	M.V.	0.259812612		0.247255966
R#5	(35, 61)	0.121167522	(38, 64)	0.143205473
	(74, 93)	0	(77, 96)	0.021581356
	(100, 121)	0.04967333	(103, 124)	0.062730224
	M.V.	0.060759345		0.075839018
R#6	(48, 69)	0.169265264	(51, 72)	0.130600845
	(90, 113)	0.020655762	(93, 116)	0.024019818
	M.V.	0.094960513		0.077310332
R#7	(67, 87)	0.029193873	(70, 90)	0.030622716
	(107, 126)	0.044311421	(110, 129)	0.029043213
	M.V.	0.036752647		0.029832964
	(0, 136)	0.023043072	(3, 136)	0.019823583

Table S19. GE DTW distance between close and numTweets time series. Mean Value (M.V.) of the intervals that consist of a rule.

	Patterns Close	DTW (Close-numTweets)	(+3)		(−3)	
GE						
R#1	(6, 34)	0.056392129	(9, 37)	0.049361357	(3, 31)	0.052749245
	(91, 114)	0.034657273	(94, 117)	0.036015897	(88, 111)	0.053220773
	M.V.	0.045524701		0.042688627		0.052985009
R#2	(20, 39)	0.052515785	(23, 42)	0.053296727	(17, 36)	0.051696612
	(40, 62)	0.034134798	(43, 65)	0.03518041	(37, 59)	0.043435076
	M.V.	0.043325291		0.044238568		0.047565844
R#3	(35, 54)	0.04620278	(38, 57)	0.04895125	(32, 51)	0.048808206
	(74, 92)	0.040649169	(77, 95)	0.029187242	(71, 89)	0.028842742
	M.V.	0.043425975		0.039069246		0.038825474
R#4	(48, 66)	0.034807474	(51, 69)	0.023372183	(45, 63)	0.035363266
	(104, 122)	0.078872031	(107, 125)	0.09011902	(101, 119)	0.049502482
	M.V.	0.056839752		0.056745602		0.042432874
R#5	(8, 32)	0.052968079	(11, 35)	0.044349616	(5, 29)	0.05648991
	(52, 68)	0.022820018	(55, 71)	0.017159714	(49, 65)	0.030340809
	(92, 113)	0.037317327	(95, 116)	0.017159714	(89, 110)	0.070432108
	M.V.	0.037701808		0.026223014		0.052420942
R#6	(58, 77)	0.01892078	(61, 80)	0.018714993	(55, 74)	0.01704395
	(78, 95)	0.032581759	(81, 98)	0.032820935	(75, 92)	0.042679808
	M.V.	0.02575127		0.025767964		0.029861879
R#7	(64, 82)	0.017206689	(67, 85)	0.023258879	(61, 79)	0.01892348
	(84, 100)	0.040673974	(87, 103)	0.052788932	(81, 97)	0.030693041
	M.V.	0.028940331		0.038023905		0.024808261
	(0, 136)	0.057028997	(3, 136)	0.060151508	(0, 133)	0.049364107

Table S20. IBM DTW distance between close and numTweets time series. Mean Value (M.V.) of the intervals that consist of a rule.

	Patterns Close	DTW (Close-numTweets)	(+3)		(−3)	
IBM						
R#1	(0, 17)	0.583991176	(3, 20)	0.679655365	(0, 14)	0.566732112
	(112, 129)	0.023631725	(115, 132)	0.02535549	(109, 126)	0.031039412
	M.V.	0.30381145		0.352505428		0.298885762
R#2	(11, 30)	0.66361989	(14, 33)	0.656591085	(8, 27)	0.689054541
	(51, 70)	0.184524115	(54, 73)	0.134062744	(48, 67)	0.157562991
	M.V.	0.424072003		0.395326915		0.423308766
R#3	(16, 43)	0.567196213	(19, 46)	0.538519271	(13, 40)	0.587309406
	(40, 57)	0.399105209	(43, 60)	0.432785083	(37, 54)	0.409138001
	(57, 76)	0.132156477	(60, 79)	0.432785083	(54, 73)	0.134062744
	(66, 86)	0.068968089	(69, 89)	0.069087224	(63, 83)	0.070730822
	(78, 98)	0.039536655	(81, 101)	0.023769614	(75, 95)	0.027502395
	M.V.	0.241392529		0.299389255		0.245748674

Table S20. Cont.

	Patterns Close	DTW (Close-numTweets)	(+3)		(−3)	
R#4	(38, 57)	0.405364283	(41, 60)	0.429787786	(35, 54)	0.403852345
	(56, 76)	0.116258565	(59, 79)	0.12557485	(53, 73)	0.14269275
	(64, 86)	0.053912021	(67, 89)	0.053348422	(61, 83)	0.099883769
	(75, 98)	0.023951141	(78, 101)	0.037377025	(72, 95)	0.041124226
	M.V.	0.149871503		0.161522021		0.171888272
R#5	(46, 65)	0.179756375	(49, 68)	0.148621305	(43, 62)	0.453427903
	(105, 126)	0.024169504	(108, 129)	0.021311005	(102, 123)	0.016206804
	M.V.	0.101962939		0.084966155		0.234817353
R#6	(56, 78)	0.111435758	(59, 81)	0.129911682	(53, 75)	0.140858177
	(64, 89)	0.011600668	(67, 91)	0.051330846	(61, 86)	0.076236543
	(75, 99)	0.023450839	(78, 102)	0.034414123	(72, 96)	0.040935982
	M.V.	0.048829088		0.07188555		0.086010234
R#7	−96,117	0.00634601	(99, 120)	0.007556179	(93, 114)	0.005189735
	−115,136	0.027567568	(118, 139)	0.048175613	(112, 133)	0.022398952
	M.V.	0.016956789		0.027865896		0.013794343
	(0, 136)	0.049062472	(3, 136)	0.127010102	(0, 133)	0.050433566

Table S21. MSFT DTW distance between close and numTweets time series. Mean Value (M.V.) of the intervals that consist of a rule.

	Patterns Close	DTW (Close-numTweets)	(+3)		(−3)	
MSFT						
R#1	(0, 18)	0.047599115	(3, 21)	0.077207399	(0, 15)	0.033013226
	(54, 74)	0.049248895	(57, 77)	0.047282855	(51, 71)	0.050771811
	(66, 85)	0.053604365	(69, 88)	0.030572206	(63, 82)	0.05401956
	(98, 117)	0.014337389	(101, 120)	0.015443528	(95, 114)	0.014119204
	M.V.	0.041197441		0.042626497		0.03798095
R#2	(8, 24)	0.05830396	(11, 27)	0.053994787	(5, 21)	0.093267577
	(71, 87)	0.032263632	(74, 90)	0.023431958	(68, 84)	0.088687082
	M.V.	0.045283796		0.038713372		0.090977329
R#3	(15, 35)	0.073922345	(18, 38)	0.070369843	(12, 32)	0.049137212
	(22, 44)	0.037274223	(25, 47)	0.025306239	(19, 41)	0.04607261
	M.V.	0.055598284		0.047838041		0.047604911
R4	(30, 48)	0.027137771	(33, 51)	0.019008002	(27, 45)	0.03863653
	(84, 101)	0.011875873	(87, 104)	0.005385237	(81, 98)	0.022988314
	M.V.	0.019506822		0.012196619		0.030812422
R#5	(38, 60)	0.024734577	(41, 63)	0.026714002	(35, 57)	0.026965282
	(75, 98)	0.019589698	(78, 101)	0.02380254	(72, 81)	0.099912183
	M.V.	0.022162138		0.025258271		0.063438732

Table S21. Cont.

	Patterns Close	DTW (Close-numTweets)	(+3)		(−3)	
R#6	(46, 64)	0.042871625	(49, 67)	0.041813931	(43, 61)	0.041627609
	(103, 122)	0.038100857	(106, 125)	0.039058206	(99, 119)	0.012815018
	M.V.	0.040486241		0.040436068		0.027221313
R#7	(50, 74)	0.045716831	(53, 77)	0.062366705	(47, 71)	0.043931528
	(64, 85)	0.060468397	(67, 88)	0.004835652	(61, 82)	0.055197394
	M.V.	0.053092614		0.033601178		0.049564461
R#8	(91, 110)	0.009700367	(94, 113)	0.011747901	(88, 107)	0.009311814
	(117, 133)	0.088828596	(120, 136)	0.011747901	(114, 130)	0.023323831
	M.V.	0.049264481		0.011747901		0.016317823
R#9	(64, 80)	0.088828596	(67, 83)	0.050941855	(61, 77)	0.067247882
	(108, 128)	0.06318534	(111, 131)	0.025278145	(105, 125)	0.040060883
	M.V.	0.076006968		0.03811		0.053654382
R#10	(22, 42)	0.034583759	(25, 45)	0.026476759	(19, 39)	0.049813617
	(40, 58)	0.022414899	(43, 61)	0.041627609	(37, 55)	0.032307981
	(78, 96)	0.030062522	(81, 99)	0.021000558	(75, 93)	0.025314172
	M.V.	0.029020394		0.029701642		0.035811923
	(0, 136)	0.020301539	(3, 136)	0.021285475	(0, 133)	0.015839046

Table S22. ORCL DTW distance between close and numTweets time series. Mean Value (M.V.) of the intervals that consist of a rule.

	Patterns Close	DTW (Close-numTweets)	(+3)		(−3)	
ORCL						
R#1	(6, 25)	0.700353837	(9, 28)	0.716077481	(3, 22)	0.684796561
	(45, 64)	0.100326064	(48, 67)	0.071193188	(42, 61)	0.168982993
	M.V.	0.40033995		0.393635335		0.426889777
R#2	(11, 30)	0.695941385	(14, 33)	0.706471142	(8, 27)	0.6989355
	(92, 112)	0.004278926	(95, 115)	0.004280017	(89, 109)	0.003873202
	M.V.	0.350110156		0.35537558		0.351404351
R#3	(17, 40)	0.700925525	(20, 43)	0.347404141	(14, 37)	0.68915031
	(79, 101)	0.027570148	(82, 104)	0.02249862	(76, 98)	0.029330206
	M.V.	0.364247836		0.18495138		0.359240258
R#4	(8, 25)	0.700938285	(11, 28)	0.703537785	(5, 23)	0.702296075
	(26, 43)	0.404498517	(29, 46)	0.34646886	(23, 40)	0.681372444
	(47, 64)	0.092766367	(50, 67)	0.060965561	(44, 61)	0.177981106
	M.V.	0.399401056		0.370324069		0.520549875
R#5	(31, 59)	0.247145534	(34, 62)	0.184828605	(28, 56)	0.280237863
	(51, 73)	0.060927683	(54, 76)	0.155428119	(48, 70)	0.065565255
	M.V.	0.154036608		0.170128362		0.172901559
R#6	(89, 106)	0.004400398	(92, 109)	0.004695309	(86, 103)	0.010157287
	(104, 125)	0.00606291	(107, 128)	0.006520761	(101, 122)	0.012575766
	M.V.	0.005231654		0.005608035		0.011366526

Table S22. Cont.

	Patterns Close	DTW (Close-numTweets)	(+3)		(−3)	
R7	(98, 118)	0.008839565	(101, 121)	0.013817203	(95, 115)	0.004280017
	(117, 134)	0.025725324	(120, 136)	0.02737527	(114, 131)	0.010687124
	M.V.	0.017282444		0.020596237		0.007483571
R#8	(17, 34)	0.702113634	(20, 37)	0.676442458	(14, 31)	0.708303784
	(35, 59)	0.19816808	(38, 62)	0.137240105	(32, 56)	0.234870829
	(56, 73)	0.161512861	(59, 76)	0.145985905	(53, 70)	0.045268696
	(79, 98)	0.033627402	(82, 101)	0.026393766	(76, 95)	0.030793366
	M.V.	0.273855494		0.246515559		0.254809169
	(0, 136)	0.096979763	(3, 136)	0.090078612	(0, 133)	0.097935936

Table S23. Random windows length w for close—numTweets time series. Mean Value (M.V.) of DTW distance between the two time series.

Window Size = 10	AAPL	GE	IBM	MSFT	ORCL
(0 to 9)	0.132594944	0.029407011	0.092242161	0.077443956	0.421920571
(10 to 19)	0.220766056	0.074360434	0.118744716	0.001840917	0.406115196
(20 to 29)	0.30832706	0.056872127	0.25752526	0.008708723	0.545575005
(30 to 39)	0.255556822	0.130645331	0.09814162	0.00856189	0.41815446
(40 to 49)	0.092403903	0.048857659	0.089159528	0.017389937	0.159801089
(50 to 59)	0.092051367	0.02218414	0.046321985	0.039845794	0.07968165
(60 to 69)	0.145747555	0.010902172	0.051924713	0.024259335	0.020463904
(70 to 79)	0.031126111	0.00644333	0.038545699	0.006645506	0.049387201
(80 to 89)	0.034904158	0.02980676	0.037502497	0.015615256	0.029621275
(90 to 99)	0.011650497	0.019715245	0.032379206	0.015197023	0.00168897
(100 to 109)	0.008491675	0.010327482	0.029034686	0.023148428	0.0125765
(110 to 119)	0.002896972	0.027893341	0.020737998	0.009708541	0.008276105
(120 to 129)	0.010765293	0.078999909	0.03583258	0.007960564	0.005079089
(130 to 136)	0.036694448	0.391818808	0.144921426	0.040453866	0.014416648
M.V.	0.09885549	0.067016696	0.078072434	0.021198553	0.155196976
Window Size = 15	AAPL	GE	IBM	MSFT	ORCL
(0 to 14)	0.109940139	0.026756657	0.057772954	0.051912832	0.402811968
(15 to 29)	0.167979319	0.04952271	0.231559283	0.003933699	0.512928547
(30 to 44)	0.233999892	0.11806591	0.099284731	0.005833092	0.211565198
(45 to 59)	0.077718213	0.035824153	0.053105705	0.023147338	0.088357876
(60 to 74)	0.059333059	0.009938994	0.036173	0.015673704	0.024701819
(75 to 89)	0.012929441	0.017677232	0.036219332	0.007465024	0.012936454
(90 to 104)	0.007124996	0.009022719	0.019207299	0.009172702	0.004291232
(105 to 119)	0.002583163	0.01872367	0.016538332	0.010676578	0.00726314
(120 to 134)	0.014989892	0.161936701	0.116833957	0.029490723	0.004185029
(135 to 149)	0.043969151	0.51037172	0.08409094	0.068615823	0.025628153
M.V.	0.073056726	0.095784046	0.075078553	0.022592152	0.129466942
Window Size = 20	AAPL	GE	IBM	MSFT	ORCL
(0 to 19)	0.140765058	0.038802565	0.069209532	0.041315812	0.414017883
(20 to 39)	0.243761634	0.057791944	0.099271397	0.006589108	0.481864732
(40 to 59)	0.061237306	0.027366395	0.064257965	0.017935151	0.073489052
(60 to 79)	0.047460404	0.006010785	0.036069286	0.013210629	0.02276052

Table S23. Cont.

Window Size = 10	AAPL	GE	IBM	MSFT	ORCL
(80 to 99)	0.024232003	0.01016897	0.018693446	0.013040824	0.013184924
(100 to 119)	0.00265609	0.015736948	0.016447408	0.005750519	0.005851461
(120 to 139)→(120 to 136)	0.015284347	0.119681172	0.063828398	0.037343638	0.005971956
M.V.	0.076485263	0.03936554	0.052539633	0.01931224	0.14530579
Window Size = 50	AAPL	GE	IBM	MSFT	ORCL
(0 to 49)	0.087563615	0.023222385	0.040792067	0.018401021	0.181187229
(50 to 99)	0.020892696	0.009804916	0.024100138	0.014454492	0.009804755
(100 to 136)	0.007553615	0.058670432	0.035772381	0.012782511	0.005917864
M.V.	0.038669975	0.030565911	0.033554862	0.015212674	0.065636616
Window Size = 70	AAPL	GE	IBM	MSFT	ORCL
(0 to 69)	0.05828581	0.00922796	0.023147534	0.015571096	0.105280792
(70 to 136)	0.009824072	0.034843632	0.024369371	0.008509838	0.009100912
M.V.	0.034054941	0.022035796	0.023758453	0.012040467	0.057190852

Table S24. The rules, of all companies, in which there is a correlation (small DTW distance) between the closing price (close) and number of tweets (numTweets) time series.

	AAPL	GE	IBM	MSFT	ORCL
Rules	R#2, R#4, R#5, R#6, R#7	R#1, R#2, R#3, R#4, R#5, R#6, R#7	R#4, R#5, R#6, R#7	R#1, R#2, R#3, R#4, R#5, R#6, R#7, R#8, R#9, R#10	R5, R6, R#7

Table S25. The rules that are used to examine if the sentiment score of news and the number of tweets improve the prediction of the next closing price. The rules with the smaller DTW distance.

	AAPL	GE	IBM	MSFT	ORCL
Rules	R#2, R#5, R#6, R#7	R#4, R#5, R#6, R#7	R#4, R#5, R#6, R#7	R#1, R#2, R#3, R#4	R#5, R#6, R#7

Table S26. Closing prices for the 5 companies.

Date	AAPL Close	GE Close	IBM Close	MSFT Close	ORCL Close
20/04/15	127.6	27.02	166.16	42.905	43.32
21/04/15	126.91	26.62	164.26	42.635	43.42
22/04/15	128.62	26.91	165.36	42.985	43.55
23/04/15	129.67	26.85	170.24	43.34	43.39
24/04/15	130.28	26.8	169.78	47.87	43.08
27/04/15	132.65	26.88	170.73	48.03	43.61
28/04/15	130.56	27.12	173.92	49.155	44.5
29/04/15	128.64	27.09	174.4	49.06	44.73
30/04/15	125.15	27.08	171.29	48.64	43.62
01/05/15	128.95	27.31	173.67	48.655	44.37
04/05/15	128.7	27.27	173.97	48.24	44.59
05/05/15	125.8	26.92	173.08	47.6	43.92
06/05/15	125.01	26.81	170.05	46.28	43.26
07/05/15	125.26	27.04	170.99	46.7	43.48
08/05/15	127.62	27.36	172.68	47.75	44.01
11/05/15	126.32	26.92	171.12	47.37	43.84
12/05/15	125.865	27.03	170.55	47.35	43.57
13/05/15	126.01	27.21	172.28	47.625	43.79

Table S26. Cont.

Date	AAPL Close	GE Close	IBM Close	MSFT Close	ORCL Close
14/05/15	128.95	27.41	174.05	48.72	44.38
15/05/15	128.77	27.27	173.26	48.295	44.15
18/05/15	130.19	27.31	173.06	48.01	44.24
19/05/15	130.07	27.35	173.48	47.58	44.32
20/05/15	130.06	27.64	173.76	47.58	44.29
21/05/15	131.39	27.72	173.34	47.42	44.28
22/05/15	132.54	27.68	172.22	46.9	43.93
26/05/15	129.62	27.52	170.13	46.59	43.33
27/05/15	132.045	27.52	172	47.61	44.14
28/05/15	131.78	27.63	171.71	47.45	43.86
29/05/15	130.28	27.27	169.65	46.86	43.49
01/06/15	130.535	27.28	170.18	47.23	43.79
02/06/15	129.96	27.33	169.65	46.92	43.7
03/06/15	130.12	27.53	169.92	46.85	43.97
04/06/15	129.36	27.26	168.38	46.36	43.77
05/06/15	128.65	27.29	167.4	46.14	43.81
08/06/15	127.8	27.24	165.34	45.73	43.1
09/06/15	127.42	27.33	165.68	45.65	43.07
10/06/15	128.88	27.63	168.92	46.61	43.94
11/06/15	128.59	27.51	168.78	46.44	44.28
12/06/15	127.17	27.39	166.99	45.97	44.34
15/06/15	126.92	27.21	166.26	45.475	43.72
16/06/15	127.6	27.22	166.84	45.83	44.64
17/06/15	127.3	27.27	167.17	45.97	44.91
18/06/15	127.88	27.37	168.25	46.72	42.74
19/06/15	126.6	27.24	166.99	46.1	41.59
22/06/15	127.61	27.42	167.73	46.23	41.49
23/06/15	127.03	27.55	168.62	45.91	41.71
24/06/15	128.11	27.26	166.97	45.635	41.2
25/06/15	127.5	27.04	166.08	45.65	41.06
26/06/15	126.75	27.09	165.46	45.26	40.99
29/06/15	124.53	26.64	162.97	44.37	40.42
30/06/15	125.425	26.57	162.66	44.15	40.3
01/07/15	126.6	26.66	164.49	44.445	40.24
02/07/15	126.44	26.78	165.09	44.4	40.36
06/07/15	126	26.31	164.73	44.39	40.15
07/07/15	125.69	26.47	165	44.3	40.16
08/07/15	122.57	25.89	163.16	44.24	39.77
09/07/15	120.07	26.02	163.85	44.52	40.18
10/07/15	123.28	26.27	166.95	44.61	40.36
13/07/15	125.66	26.47	169.38	45.54	40.8
14/07/15	125.61	26.66	168.61	45.62	40.78
15/07/15	126.82	26.77	168.53	45.76	40.79
16/07/15	128.51	27.04	171	46.66	40.96
17/07/15	129.62	27.24	172.51	46.62	40.4
20/07/15	132.07	27.14	173.22	46.92	39.93
21/07/15	130.75	26.85	163.07	47.28	39.57
22/07/15	125.22	26.63	160.35	45.54	39.42
23/07/15	125.16	26.26	161.73	46.11	39
24/07/15	124.5	25.75	159.75	45.94	39
27/07/15	122.77	25.95	159.07	45.35	38.51
28/07/15	123.38	26.1	160.05	45.34	39.28
29/07/15	122.99	26.26	161.09	46.29	39.79
30/07/15	122.37	26.12	160.96	46.88	39.65

Table S26. Cont.

Date	AAPL Close	GE Close	IBM Close	MSFT Close	ORCL Close
31/07/15	121.3	26.1	161.99	46.7	39.94
03/08/15	118.44	25.87	158.71	46.81	39.71
04/08/15	114.64	25.9	157.6	47.54	39.66
05/08/15	115.4	26.1	157.9	47.58	39.64
06/08/15	115.13	26.03	156.32	46.62	39.32
07/08/15	115.52	26.03	155.12	46.74	39.56
10/08/15	119.72	26.24	156.75	47.33	39.89
11/08/15	113.49	25.71	155.51	46.41	39.17
12/08/15	115.24	25.86	156.16	46.74	39.28
13/08/15	115.15	25.79	155.07	46.73	39.31
14/08/15	115.96	26.08	155.75	47	39.41
17/08/15	117.16	26.21	156.31	47.32	39.72
18/08/15	116.5	26.07	156.01	47.27	39.83
19/08/15	115.01	25.73	153.94	46.61	39.53
20/08/15	112.65	25.19	152.66	45.66	38.63
21/08/15	105.76	24.59	148.85	43.07	37.55
24/08/15	103.12	23.87	143.47	41.68	36.08
25/08/15	103.74	23.27	140.96	40.47	35.45
26/08/15	109.69	24.01	146.7	42.71	36.91
27/08/15	112.92	25.01	148.54	43.9	36.82
28/08/15	113.29	25.16	147.98	43.93	37.46
31/08/15	112.76	24.82	147.89	43.52	37.09
01/09/15	107.72	23.88	142.68	41.82	36.01
02/09/15	112.34	24.57	145.05	43.36	36.75
03/09/15	110.37	24.51	146.78	43.5	36.9
04/09/15	109.27	24	143.7	42.61	36.27
08/09/15	112.31	24.96	147.23	43.89	37.68
09/09/15	110.15	24.55	145.05	43.07	37.09
10/09/15	112.57	24.68	146.2	43.29	37.61
11/09/15	114.21	24.95	147.37	43.48	37.92
14/09/15	115.31	24.77	145.65	43.04	37.56
15/09/15	116.28	25.3	147.53	43.98	37.99
16/09/15	116.41	25.93	148.41	44.3	38.27
17/09/15	113.92	25.35	148.14	44.25	36.74
18/09/15	113.45	24.8	144.51	43.48	36.38
21/09/15	115.21	25.09	146.48	44.11	36.83
22/09/15	113.4	25.11	144.43	43.9	36.19
23/09/15	114.32	25.14	143.66	43.87	35.99
24/09/15	115	24.91	144.41	43.91	36.06
25/09/15	114.71	24.92	145.42	43.94	36.05
28/09/15	112.44	24.31	142.52	43.29	35.44
29/09/15	109.06	24.57	142.47	43.44	35.51
30/09/15	110.3	25.22	144.97	44.26	36.12
01/10/15	109.58	25.19	143.59	44.61	36.24
02/10/15	110.38	25.47	144.58	45.57	36.89
05/10/15	110.78	26.82	149.04	46.63	37.59
06/10/15	111.31	27.29	148.78	46.75	37.73
07/10/15	110.78	27.77	150.09	46.8	37.66
08/10/15	109.5	28.03	152.28	47.45	37.89
09/10/15	112.12	28.07	152.39	47.11	38.1
12/10/15	111.6	28.09	151.14	47	38.04
13/10/15	111.79	27.87	149.62	46.89	37.82
14/10/15	110.21	27.6	150.01	46.68	37.26
15/10/15	111.86	28.03	150.09	47.01	37.55
16/10/15	111.04	28.98	150.39	47.51	37.37
19/10/15	111.73	28.99	149.22	47.62	36.87
20/10/15	113.77	28.78	140.64	47.77	36.86

Table S26. Cont.

Date	AAPL Close	GE Close	IBM Close	MSFT Close	ORCL Close
21/10/15	113.76	28.85	140.92	47.2	36.62
22/10/15	115.5	29.58	144.09	48.03	37.79
23/10/15	119.08	29.51	144.68	52.87	38.07
26/10/15	115.28	29.55	143.66	54.25	38.37
27/10/15	114.55	29.46	137.86	53.69	38.34
28/10/15	119.27	29.39	140.83	53.98	38.88
29/10/15	120.53	29.34	140.55	53.36	38.86
30/10/15	119.5	28.92	140.08	52.64	38.84



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