# WRDS INTRADAY INDICATOR DATA

Millisecond IID V2.0 User Manual



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# **Executive Summary**

The NYSE Trade and Quote (TAQ) database contains intraday transactions data (trades and quotes) for all securities listed on the New York Stock Exchange (NYSE), American Stock Exchange (AMEX), the Nasdaq National Market System (NMS), and all other U.S. equity exchanges.

TAQ is the primary database for intraday market research. With TAQ, a researcher can perform such analyses as daily volatility estimation, probability of informed trading, short-term impact of breaking news, back-testing of intraday trading strategies, and assessment of programmed trading protocols.

TAQ is also the only WRDS database that records market information at the intraday level (to the microsecond), covering roughly 8,000 stock issues listed on major American exchanges. Because it provides a record of every trade and quote on these exchanges (since January 1993), it is by far the largest WRDS database, growing about 0.75 terabytes monthly. No other database has market information at this level of detail.

WRDS acknowledge the computation challenges with TAQ data (the gigantic size of TAQ data - with over 200 TB in total data size; and over 8,000 individual data files). We strive to help TAQ users and market microstructure research. WRDS utilizes its computation power to do the heavy-duty computing work and provides users with a simple and easy-to-use solution. WRDS follow the most recent market microstructure research and construct efficient codes to compute key variables in TAQ research. We provide daily summary with 198 intraday variables covering prices, flows, trade classification, market summaries, liquidity, volatility and informativeness measures covering the entire TAQ sample period. WRDS also includes the interim output such as the complete NBBO and consolidated trades so that users can create their own mythology and variables for research innovations. This suite is named as "WRDS Intraday Indicator Dataset (IID)".

In this user manual, we will provide an overview of WRDS complete NBBO file, WRDS consolidated trades, and the details of the 198 IID daily summary variables. We also list the corresponding formulas in the formula section of this manual.

#### **Data Content**

- I. WRDS Intraday Indicator (Millisecond timestamp, 2003-present)
- A. WRDS Complete National Best Bid & Offer (NBBO)

  We add quote observations that have both the national best bid and national best ask to the NBBO files from NYSE.
- B. WRDS Consolidated Trades (WCT) We match the trades with their prevailing national best bid and offer prices based on the trade and quote timestamp; Various timestamp updates from millisecond to microsecond, from microsecond to nanosecond in both CTA and UTP tapes are carefully handled.
- C. WRDS Intraday Indicator Dataset (IID) Daily Summary
  - (i) Symbol Headers and Time Summaries
  - (ii) Market Hour (Open to Close) Summaries
  - (iii) After Market Hour (Before Open/After Close) Summaries
  - (iv) Lee and Ready Trade Classification and Liquidity Measures
  - (v) Tick Test Trade Classification and Summaries
  - (vi) WRDS Trade Classification and Summaries
  - (vii) Special Order Summaries
  - (viii) Volatility and Informativeness Measures
  - (ix) Retail and Institutional Order Flow
- D. Update schedule

Complete NBBO, WCT, and daily summary of millisecond IID are expected to update daily.

- II. WRDS Intraday Indicator (Second timestamp, 1993-2014)
- A. WRDS NBBO
- B. WRDS Consolidated Trades (WCT)
- C. WRDS IID Daily Summary
- D. Update schedule

  No update is needed as monthly TAQ is discontinued by NYSE.
- III. Millisecond IID Unix location on WRDS server: /wrds/nyse/sasdata/wrds\_taqms\_iid

# Data Variable List (Millisecond IID)

#### A. WRDS Complete NBBO

- We fill the official NBBO file from NYSE with the quotes that contains both national best bid and national best offer from the quote file. Quotes with NBB and NBO on both sides are not included in the official NBBO file. We identify these quotes by sorting on quote NBBO conditions:
  - UTP quotes: Qu\_Source = "N" and NatBBO\_Ind='4'
    - 4 = This quote is itself the new NBBO. No appendage is required
  - CTA quotes: Qu\_Source = "C" and NatBBO\_Ind in ('1', 'G')
    - 1= Quote contains Best Bid, Quote contains Best Offer. New quote is itself the Best Bid and Best Offer. No appendage is required. (From 2017 October, NYSE changed this NBBO indicator from numeric value '1' to alphabetic value 'G')
- WRDS Complete NBBO files are indexed by sym\_root and sym\_root-sym\_suffix pairs.
- The complete NBBO file <u>does not eliminate</u> after market-hour quotes. We left them as they were in the NYSE NBBO files. Researchers would expect to see quotes from 4 am to 10 pm.

#### B. WRDS Consolidated Trades (WCT)

 We match trades with prevailing quotes according to the timestamp of trades and quotes. We notice the timestamp changed from millisecond to microsecond, and from microsecond to nanosecond from 2003 to 2018.

DATE OF CHANGE	UTP CHANGES	CTA CHANGES
January 1993	seconds HHMMSS	seconds HHMMSS
October 2003	milliseconds HHMMSSxxx	milliseconds HHMMSSxxx
July 27, 2015	microseconds HHMMSSxxxxxx	
August 3, 2015		microseconds HHMMSSxxxxxx
October 24, 2016	nanoseconds HHMMSSxxxxxxxxx	microseconds HHMMSSxxxxxx000
September 18, 2017		nanoseconds HHMMSSxxxxxxxxx

We match the trades with previous millisecond/microsecond/nanosecond according to the UTP and CTA timestamp changes listed above.

- WCT files are indexed by sym root and sym root-sym suffix pairs.

## C. WRDS IID Daily Summary

## I. Symbol Headers and Time Summaries

Num	Variable	Descriptions	Clarification	Format	Example1	Example 2
1	DATE	Date		YYMMDD N8.	20180925	20180925
2	SYM_ROOT	Security symbol root		Char	AAPL	IBM
3	SYM_SUFFIX	Security symbol suffix		Char		
4	Symbol	Stock Symbol	Sym_root+ Sym_suffix	Char	AAPL	IBM
5	Otime	Opening Time (First Market Center Official Opening Trade)	Trade Condition = 'Q' or 'O'; When	TIME18.9	9:30:00 AM	9:30:01 AM
6	OEX	The First Opening Exchange Market Center (with the First Official Opening Trade)	multiple market centers report opening	Char	Р	Р
7	Oprc	Opening Price (First Market Center Official Opening Trade)	trades, the first market center is recorded;	BEST32.	219.76	150.72
8	Osize	Opening Trade Volume (First Market Center Official Opening Trade)	When both 'Q' and 'O' are reported, we use 'O'	BEST32.	78	30
9	CTime	,	Trade Condition = 'M' or '6';	TIME18.9	4:00:00 PM	4:00:00 PM
10	CEX	The Last Closing Exchange Market Center (with the Last Official Close Trade)	When multiple market centers report	Char	Р	P
11	CPrc	Closing Price (Last Market Center Official Close Trade)	closing trades, the last market	BEST32.	222.19	148.91
12	Csize	Closing Trade Volume (Last Market Center Official Close Trade)	center is recorded; When both 'M' and '6' are reported, we use '6'	BEST32.	500	2400
13	nbbot_after_open	Best Bid/Offer Quote Time of the Most		TIME18.9	9:30:00 AM	9:30:01 AM

		Recent Quote since				
		Market Open				
14	mid_after_open	Best Bid/Offer Middle Price of the Most Recent Quote since Market Open	mid price =(best bid+ best ask)/2	BEST32.	219.78	150.09
15	ttime_open	Trade Time of the Most Recent Trade since Market Open		TIME18.9	9:30:00 AM	9:30:02 AM
16	stime_open	Trade Volume of the Most Recent Trade since Market Open		BEST32.	31	100
17	ptime_open	Trade Price of the Most Recent Trade since Market Open		BEST32.	219.799	149.91
18	nbb_after_open	Best Bid Price of the Most Recent Quote since Market Open		BEST32.	219.76	149.54
19	nbbqty_after_open	Best Bid Size of the Most Recent Quote since Market Open		BEST32.	200	300
20	nbo_after_open	Best Offer Price of the Most Recent Quote since Market Open		BEST32.	219.8	150.64
21	nboqty_after_open	Best Offer Size of the Most Recent Quote since Market Open		BEST32.	700	100
22	nbbot_1pm	Most Recent Best Bid/Offer Quote Time as of 1PM		TIME18.9	1:00:00 PM	12:59:58 PM
23	mid_1pm	Most Recent Best Bid/Offer Middle Price as of 1PM		BEST32.	222.09	149.035
24	ttime_1pm	Trade Time of the Most Recent Trade after 1 pm		TIME18.9	1:00:00 PM	1:00:02 PM
25	ptime_1pm	Trade Price of the Most Recent Trade after 1 pm		BEST32.	222.1	149.03
26	size_1pm	Trade Volume of the Most Recent Trade after 1 pm		BEST32.	20	100
27	nbb_1pm	Most Recent Best Bid Price as of 1PM		BEST32.	222.08	149.03
28	nbbqty_1pm	Most Recent Best Bid Size as of 1PM		BEST32.	200	300
29	nbo_1pm	Most Recent Best Offer Price as of 1PM		BEST32.	222.1	149.04

30	nboqty_1pm	Most Recent Best		BEST32.	100	300
		Offer Size as of 1PM  Last Best Bid/Offer				
31	nbbot_4pm	Quote Time before 4PM		TIME18.9	4:00:00 PM	4:00:00 PM
32	mid_4pm	Last Best Bid/Offer Middle Price before 4PM		BEST32.	222.195	148.915
33	ttime_4pm	Trade Time of the Most Recent Trade before 4 pm		TIME18.9	4:00:00 PM	4:00:00 PM
34	ptime_4pm	Trade Price of the Most Recent Trade before 4 pm		BEST32.	222.19	148.91
35	size_4pm	Trade Volume of the Most Recent Trade before 4 pm		BEST32.	500	95
36	nbb_4pm	Last Best Bid Price before 4PM		BEST32.	222.19	148.91
37	nbbqty_4pm	Last Best Bid Size before 4PM		BEST32.	100	1700
38	nbo_4pm	Last Best Offer Price before 4PM		BEST32.	222.2	148.92
39	nboqty_4pm	Last Best Offer Size before 4PM		BEST32.	7700	2300
40	nbbot_before_close	Best Bid/Offer Quote Time of the Last Quote before Market Close		TIME18.9	4:00:00 PM	4:00:00 PM
41	mid_before_close	Best Bid/Offer Middle Price of the Last Quote before Market Close	mid price =(best bid+ best ask)/2	BEST32.	222.195	148.915
42	ttime_close	Trade Time of the Last Trade before Market Close		TIME18.9	4:00:00 PM	4:00:00 PM
43	ptime_close	Trade Price of the Last Trade before Market Close		BEST32.	222.19	148.92
44	stime_close	Trade Volume of the Last Trade before Market Close		BEST32.	500	100
45	nbb_before_close	Best Bid Price of the Last Quote before Market Close		BEST32.	222.19	148.91
46	nbbqty_before_close Best Bid Size of the Last Quote before Market Close			BEST32.	100	1700

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47	nbo_before_close	Best Offer Price of the Last Quote before Market Close		BEST32.	222.2	148.92
48	nboqty_before_close	Best Offer Size of the Last Quote before Market Close		BEST32.	7700	2300
49	avg_price_m	Average Trade Price during market hours (Open to Close)		BEST32.	221.562	149.251
50	price_high_m	Highest Trade Price during market hours (Open to Close)	Requires the	BEST32.	222.82	150.72
51	price_low_m	Lowest Trade Price during market hours (Open to Close)	stock to have at least one	BEST32.	201.5	146.028
52	total_dollar_m	Total Trade Value in Dollars during market hours (Open to Close)	official opening trade and	BEST32.	4207411930	474040084
53	Total Nui Trades duri		one official closing trade; BEST32.	169441	32357	
54	total_vol_m	Total Trade Volume during market hours (Open to Close)	use 9:30 am to 4 pm	BEST32.	18993554	3175237
55	vw_price_m	Volume-weighted Average Trade Price during market hours (Open to Close)		BEST32.	221.518	149.293
156	TR_SEQNUM_open	Trade Sequence Number of First Official Open Trade		Num	2816	4788
157	TR_SEQNUM_close	Trade Sequence Number of the Last Official Close Trade		Num	1288422	1784642
158	O_official	Indicator for Official Opening Trade Flag		Num	1	1
159	Indicator for Official Closing Trade Flag (Use Last Trade		('1' if official closing trade exists, '0' otherwise)	Num	1	1

#### II. Market Hour (Open to Close) Summaries

Num	Variable	Descriptions	Clarifi cation	Format	Example	Example 2
49	avg_price_m	Average Trade Price during market hours (Open to Close)		BEST32.	221.562	149.251
50	price_high_m	Highest Trade Price during market hours (Open to Close)		BEST32.	222.82	150.72
51	price_low_m	Lowest Trade Price during market hours (Open to Close)		BEST32.	201.5	146.028
52	total_dollar_m  total_n_trades_m	Total Trade Value in Dollars during market hours (Open to Close)		BEST32.	4207411930	474040084
53		Total Number of Trades during market hours (Open to Close)		BEST32.	169441	32357
54	total_vol_m	Total Trade Volume during market hours (Open to Close)	BEST32.	18993554	3175237	
55	vw_price_m	Volume-weighted Average Trade Price during market hours (Open to Close)		BEST32.	221.518	149.293
56	BestBidDepth_Dollar_tw	Time-Weighted Best Bid Dollar Depth (During Market Hours)	BEST32.	65909.92	42701.33	
57	BestBidDepth_Share_tw	Time-Weighted Best Bid Share Depth (During Market Hours)		BEST32.	297.15	286.213
58	BestOfrDepth_Dollar_tw	Time-Weighted Best Offer Dollar Depth (During Market Hours)	BEST32.	BEST32.	65278.84	37673.36
59	BestOfrDepth_Share_tw	Time-Weighted Best Offer Share Depth (During Market Hours)		BEST32.	294.25	252.463
60	QuotedSpread_Dollar_tw	Time-Weighted Dollar Quoted Spread (During Market Hours)		BEST32.	0.018018	0.021347
61	QuotedSpread_Percent_tw	Time-Weighted Percent Quoted Spread (During Market Hours)		BEST32.	0.000081311	0.00014277

#### III. After Market Hour (Before Open/After Close) Summaries

Num	Variable	Descriptions	Clarifi cation	Format	Example	Example 2
129	avg_price_b	Average Trade Price outside market hours (Before Market Open)		BEST32.	221.562	149.251
130	price_high_b	Highest Trade Price outside market hours (Before Market Open)		BEST32.	222.82	150.72
131	price_low_b	Lowest Trade Price outside market hours (Before Market Open)		BEST32.	201.5	146.028
132	total_dollar_b	Total Trade Value in Dollars outside market hours (Before Market Open)		BEST32.	4207411930	474040084
133	total_n_trades_b	Total Number of Trades outside market hours (Before Market Open)		BEST32.	169441	32357
134	total_vol_b	Total Trade Volume outside market hours (Before Market Open)			18993554	3175237
135	vw_price_b	Volume-weighted Average  Frade Price outside market BEST32. 221.51  ours (Before Market Open)		221.518	149.293	
136	avg_price_a	Average Trade Price outside market hours (After Market Close)	utside		149.251	
137	price_high_a	Highest Trade Price outside market hours (After Market Close)	BEST32.	BEST32.	222.82	150.72
138	price_low_a	Lowest Trade Price outside market hours (After Market Close)		201.5	146.028	
139	total_dollar_a	Total Trade Value in Dollars outside market hours (After Market Close)		BEST32.	4207411930	474040084
140	total_n_trades_a	Total Number of Trades outside market hours (After Market Close)		BEST32.	169441	32357
141	total_vol_a	Total Trade Volume outside market hours (After Market Close)		BEST32.	18993554	3175237
142	vw_price_a	Volume-weighted Average Trade Price outside market hours (After Market Close)		BEST32.	221.518	149.293

#### IV. Lee and Ready Trade Classification and Liquidity Measures

Num	Variable	Descriptions	Clarification	Format	Example	Example 2
62	BuyNumTrad es_LR	Total Number of Buys (Lee Ready)	See formula note: Formula 1, Lee-Ready previous nanosecond algorithm	BEST32.	81593	15637
63	BuyVol_LR Sum of Buy Trad Volume(Lee Read			BEST32.	8980934	1585367
64	buy_dv_LR	Sum of Buy Trade Value in Dollars (Lee Ready)		BEST32.	1989923284	236670973
65	SellNumTrad es_LR	Total Number of Sells (Lee Ready)		BEST32.	87848	16719
66	SellVol_LR	Sum of Sell Trade Volume(Lee Ready)		BEST32.	10012198	1587400
67	sell_dv_LR	Sum of Sell Trade Value in Dollars (Lee Ready)		BEST32.	2217394692	237001357
68	total_trade	Total Number of Trades (Lee Ready)		BEST32.	169441	32356
69	total_vol	Sum of all trade volume (Lee Ready)		BEST32.	18993132	3172767
70	total_dv_LR	Total Trade Value in Dollars(Lee Ready)		BEST32.	4207317976	473672330
71	avg_buy_pri ce_LR	Average Trade Price of Buys (Lee Ready)		BEST32.	221.56	149.251
72	vwavg_buy_ price_LR	Value-weighted Average Trade Price of Buys (Lee Ready)	See formula note: Formula 9, Value Weighted Average Price of Buy Trades	BEST32.	221.572	149.285
73	avg_sell_pric e_LR	Average Trade Price of Sells (Lee Ready)		BEST32.	221.564	149.252
74	vwavg_sell_ price_LR	Value-weighted Average Trade Price of Sells (Lee Ready)	See formula note: Formula 10, Value Weighted Average Price of Sell Trades	BEST32.	221.469	149.302
75	EffectiveSpre ad_Percent_ Ave	Simple Averaged Percent Effective Spread (Lee Ready)	See formula note: Formula 4, Simple Averaged Percentage Effective Spread	BEST32.	0.000068278	9.9602E-05
76	EffectiveSpre ad_Percent_ DW	Dollar Value- weighted Percent Effective Spread (Lee Ready)	See formula note: Formula 13, Value Weighted Percentage Effective Spread	BEST32.	0.00007327	0.00028208
77	EffectiveSpre ad_Percent_ SW	Share Volume- weighted Percent Effective Spread (Lee Ready)	See formula note: Formula 14, Share Weighted Percentage Effective Spread	BEST32.	0.000073357	0.0002813

78	PercentPrice Impact_LR_A ve	Simple Averaged Percent Price Impact (Lee Ready)	See formula note: Formula 8, Simple Averaged Percentage Price Impact	BEST32.	0.000022604	5.9603E-05
79	PercentPrice Impact_LR_D Weighted Percent Price Impact (Lee Ready)		See formula note: Formula 21, Value Weighted Percentage Price Impact	BEST32.	0.000156963	0.00018574
80	PercentPrice Impact_LR_S W	Share Volume- weighted Percent Price Impact (Lee Ready)	See formula note: Formula 22, Share Weighted Percentage Price Impact	BEST32.	0.000157917	0.00018521
81	PercentReali zedSpread_L R_Ave	Simple Averaged Percent Realized Spread (Lee Ready)	See formula note: Formula 6, Simple Averaged Percentage Realized Spread	BEST32.	0.000045674	4.0003E-05
82	PercentReali zedSpread_L R_DW Dollar Value-weighted Percent Realized Spread (Lee Ready)		See formula note: Formula 18, Value Weighted Percentage Realized Spread	BEST32.	-8.3694E-05	9.6353E-05
83	PercentReali zedSpread_L R_SW Share Volume-weighted Percent Realized Spread (Lee Ready)		See formula note: Formula 17, Share Weighted Percentage Realized Spread	BEST32.	-8.4561E-05	9.6109E-05
84	EffectiveSpre ad_Dollar_A ve	Simple Averaged Dollar Effective Spread (Lee Ready)	See formula note: Formula 3, Simple Averaged Dollar Effective Spread	BEST32.	0.015102	0.014889
85	EffectiveSpre ad_Dollar_D W	Dollar Value- weighted Dollar Effective Spread (Lee Ready)	See formula note: Formula 11, Value Weighted Dollar Effective Spread	BEST32.	0.016213	0.042239
86	EffectiveSpre ad_Dollar_S W	Share Volume- weighted Dollar Effective Spread (Lee Ready)	See formula note: Formula 12, Share Weighted Dollar Effective Spread	BEST32.	0.016232	0.042122
87	DollarPricel mpact_LR_A ve	Simple Averaged Dollar Price Impact (Lee Ready)	See formula note: Formula 7, Simple Averaged Dollar Price Impact	BEST32.	0.004994598	0.00890121
88	DollarPricel mpact_LR_D W	Dollar Value- weighted Dollar Price Impact (Lee Ready)	See formula note: Formula 19, Value Weighted Dollar Price Impact	BEST32.	-0.018382	0.014432
89	DollarPricel mpact_LR_S W	Share Volume- weighted Dollar Price Impact (Lee Ready)	See formula note: Formula 20, Share Weighted Dollar Price Impact	BEST32.	-0.018572	0.014395

90	DollarRealize dSpread_LR_ Ave	Simple Averaged Dollar Realized Spread (Lee Ready)	See formula note: Formula 5, Simple Averaged Dollar Realized Spread	BEST32.	0.010107	0.005988
91	DollarRealize dSpread_LR_ DW	Dollar Value- weighted Dollar Realized Spread (Lee Ready)	See formula note: Formula 16, Value Weighted Dollar Realized Spread	BEST32.	0.034595	0.02781
92	DollarRealize dSpread_LR_ SW	Share Volume- weighted Dollar Realized Spread (Lee Ready)	See formula note: Formula 15, Share Weighted Dollar Realized Spread	BEST32.	0.034804	0.027731

### V. <u>Tick Test Trade Classification and Summaries</u>

Num	Variable	Descriptions	Clarification	Format	Example	Example 2
93	BuyNumTrades_tick	Total Number of Buys (Tick Test)	See formula note: Formula 2, Tick Test	BEST32.	82176	15428
94	BuyVol_tick	Sum of Buy Trade Volume (Tick Test)		BEST32.	9540882	1566648
95	buy_dv_tick	Sum of Buy Trade Value in Dollars (Tick Test)		BEST32.	2112992063	233886536
96	avg_buy_price_tick  vwavg_buy_price_tick	Average Trade Price of Buys (Tick Test)		BEST32.	221.561	149.26
97	vwavg_buy_price_tick	Value-weighted Average Trade Price of Buys (Tick Test)		BEST32.	221.467	149.291
98	SellNumTrades_tick	Total Number of Sells (Tick Test)		BEST32.	87265	16928
99	SellVol_tick	Sum of Sell Trade Volume (Tick Test)		BEST32.	9452250	1606119
100	sell_dv_tick	Sum of Sell Trade Value in Dollars (Tick Test)		BEST32. 209	2094325914	239785794
101	avg_sell_price_tick	Average Trade Price of Sells (Tick Test)		BEST32.	221.564	149.244
102	vwavg_sell_price_tick	Value-weighted Average Trade Price of Sells (Tick Test)		BEST32.	221.569	149.295
103	total_trade_tick	Total Number of Trades (Tick Test)		BEST32.	169441	32356
104	total_vol_tick	Sum of all trade volume (Tick Test)		BEST32.	18993132	3172767
105	total_dv_tick	Total Trade Value in Dollars (Tick Test)		BEST32.	4207317976	473672330

#### VI. WRDS Trade Classification and Summaries

Num	Variable	Descriptions	Clarification	Format	Example	Example 2
143	BuyNumTrades_wr ds	Total Number of Buys (WRDS Classification)	See formula note: Formula 2, WRDS Classification	BEST32.	82176	15428
144	BuyVol_wrds	Sum of Buy Trade Volume (WRDS Classification)		BEST32.	9540882	1566648
145	buy_dv_wrds	Sum of Buy Trade Value in Dollars (WRDS Classification)		BEST32.	2112992063	233886536
146	avg_buy_price_wr ds	Average Trade Price of Buys (WRDS Classification)		BEST32.	221.561	149.26
147	vwavg_buy_price_ wrds	Value-weighted Average Trade Price of Buys (WRDS Classification)		BEST32.	221.467	149.291
148	SellNumTrades_wr ds	Total Number of Sells (WRDS Classification)		BEST32.	87265	16928
149	SellVol_wrds	Sum of Sell Trade Volume (WRDS Classification)		BEST32.	9452250	1606119
150	sell_dv_wrds	Sum of Sell Trade Value in Dollars (WRDS Classification)		BEST32.	2094325914	239785794
151	avg_sell_price_wr ds	Average Trade Price of Sells (WRDS Classification)		BEST32.	221.564	149.244
152	vwavg_sell_price_ wrds	Value-weighted Average Trade Price of Sells (WRDS Classification)		BEST32.	221.569	149.295
153	total_trade_wrds	Total Number of Trades (WRDS Classification)		BEST32.	169441	32356
154	total_vol_wrds	Sum of all trade volume (WRDS Classification)		BEST32.	18993132	3172767
155	total_dv_wrds	Total Trade Value in Dollars (WRDS Classification)		BEST32.	4207317976	473672330

## VII. Special Order Summaries

Num	Variable	Descriptions	Clarification	Format	Example	Example 2
110	n_iso_trade	Number of Intermarket Sweep Order Trades (During Market Hours)		BEST32.	65315	12737
111	iso_dollar	Sum of Intermarket Sweep Order Trade Dollar Value (During Market Hours)		BEST32.	1158594631	163206291
112	iso_vol	Sum of Intermarket Sweep Order Trade Volume (During Market Hours)		BEST32.	5228578	1093508
117	n_oddlot_trade	Number of Odd Lot Trades (During Market Hours)		BEST32.	84234	13440
118	oddlot_dollar	Sum of Odd Lot Trade Value (Dollar Volume during Market Hours)		BEST32.	561898333.6	63759435.9
119	oddlot_vol	Sum of Odd Lot Trade Volume (During Market Hours)		BEST32.	2536195	427286
120	n_outside_nbbo_ trade	Number of trades out of the previous nanosecond National Best Bid-Ask range		BEST32.	9594	919
121	ret_mkt_m	Open to Close Return (During Market Hours) (Note: When official market opening trade or official market closing trade are missing, set to missing)	Log return of official opening price over official closing price	BEST32.	-0.010997	0.012082

### VIII. Volatility and Informativeness Measures

Num	Variable	Descriptions	Clarification	Format	Example	Example 2
106	Hindex	Herfindahl Index calculated across 30-minute Time Units (During Market Hours)	See formula note: Formula 32, Herfindahl Index	BEST32.	0.10505	0.09708
107	TSignSqrtDVol1	Lambda (Price Impact Coefficient) with intercept (During Market Hours)	See formula note: Formula 30, Lambda (Price Impact Coefficient) 1	Formula 30, Lambda (Price Impact BEST32.		5.2E-08
108	TSignSqrtDVol2	Lambda (Price Impact Coefficient) without intercept (During Market Hours)	See formula note: Formula 31, Lambda (Price Impact Coefficient) 2	BEST32.	0.00000172	5.7E-08
109	n_obs	Number of Observations used in the Lambda (Price Impact Coefficient) Regression	Number of 5-minute intervals used in the Lambda Regression; 78 5-min intervals on normal days, less freedom of 1	BEST32.	87	77
113	ivol_q	Quote-based Intrayday Volatility (During Market Hours)	See formula note: Formula 24, Second- by-second Intraday Volatility (quote based)	BEST32.	2.07E-10	7.89E-10
114	ivol_t	Trade-based Intrayday Volatility (During Market Hours)	See formula note: Formula 23, Second- by-second Intraday Volatility (trade based)	BEST32.	0.00000107	3.7E-08
115	n30_pos	Number of 30- minute Time Intervals with Trade (During Market Hours)	Value='13' on regular days, less than '13' for early closure days	BEST32.	23	13
116	n5_pos	Number of 5- minute Time Intervals with Trade (During Market Hours)	Value='78 'on regular days, less than '78' for early closure days	BEST32.	88	78

122	var_ratio1	Variance Ratio 1 (15-second/3*5- second) (During Market Hours)	See formula note: Formula 25, Variance Ratio 1 (15- second/3*5-second)	BEST32.	0.029621	0.092919
123	var_ratio2	Variance Ratio 2 (1-min/4*15- second) (During Market Hours)	See formula note: Formula 26, Variance Ratio 2 (1-min/4*15- second)	BEST32.	0.095376	0.011701
124	var_ratio3	Variance Ratio 3 (5-min/5*1-min) (During Market Hours)	See formula note: Formula 27, Variance Ratio 3 (5-min/5*1- min)	BEST32.	0.20443	0.12154
125	var_ratio4	Variance Ratio 4 (15-min/3*5- min) (During Market Hours)	See formula note: Formula 28, Variance Ratio 4 (15-min/3*5- min)	BEST32.	0.054	0.43729
126	var_ratio5	Variance Ratio 5 (30-min/2*15- min) (During Market Hours)	See formula note: Formula 29, Variance Ratio 5 (30-min/2*15- min)	BEST32.	0.30944	0.40678
127	bs_ratio_num	Absolute Percent Order Imbalance - Num of Trades	See formula note: Formula 33; absolute value of [(num. of buys minus num. of sells) over total number of trades]	BEST32.	0.036916	0.03344
128	bs_ratio_vol	Absolute Percent Order Imbalance - Trade Volume	See formula note: Formula 34; absolute value of [(buy volume minus sell volume) over total trade volume]	BEST32.	0.054297	0.000641

#### IX. Retail and Institutional Order Flow

Num	Variable	Descriptions	Clarification	Format	Example	Example 2
160	BuyNumTrades _Retail	Total Number of Retail Buys (During Market Hours)		BEST32.	9715	1398
161	BuyVol_Retail	Sum of Retail Buys, Volume in Shares (During Market Hours)		BEST32.	1886366	129893
162	buy_dv_Retail	Sum of Retail Buys, Value in Dollars (During Market Hours)		BEST32.	417980617.1 7	19401402.7 6
163	SellNumTrades _Retail	Total Number of Retail Sells (During Market Hours)		BEST32.	9434	1322
164	SellVol_Retail	Sum of Retail Sells, Volume in Shares (During Market Hours)	Classified by the algorithm in Boehmer et al. (2021, JF);	BEST32.	1792713	137702
165	sell_dv_Retail	Sum of Retail Sells, Value in Dollars (During Market Hours)	See formula 35 for trade classification detail; Series available since 2006 October, See FAQ 9 and 10	BEST32.	397177236.1 4	20555726.0 5
166	total_trade_ret ail	Total Number of Retail trades (During Market Hours)	before using this series in your research.	BEST32.	19149	2720
167	total_vol_retail	Total Share Volume of Retail Trades (During Market Hours)		BEST32.	3679079	267595
168	total_dv_retail	Total Dollar Value of Retail Trades (During Market Hours)		BEST32.	815157853.3 1	39957128.8 1
169	avg_buy_price_ Retail	Average Trade Price of Retail Buys (During Market Hours)		BEST32.	221.649	149.272
170	avg_sell_price_ Retail	Average Trade Price of Retail Sells (During Market Hours)		BEST32.	221.655	149.263
171	bs_ratio_retail_ num	Absolute Percent Order Imbalance		BEST32.	0.014674	0.027941

		- Num of Retail				
		- Num of Retail Trades				
172	bs_ratio_retail_ vol	Absolute Percent Order Imbalance - Retail Trade Share Volume		BEST32.	0.025456	0.029182
173	BuyNumTrades _Inst20k	Total Number of 20K Institutional Buys (During Market Hours)		BEST32.	41118	1385
174	BuyVol_Inst20k	Sum of 20K Institutional Buys, Volume in Shares (During Market Hours)	See <u>Lee and</u> Radhakrishna (2000,  JFM) showing 53% of	BEST32.	7788177	576722
175	buy_dv_Inst20k	Sum of 20K Institutional Buys, Value in Dollars (During Market Hours)	institutional trades are above \$20,000 in value; Bhattacharya, Black, and Christensen (2007) and Shanthikumar	BEST32.	1725656760. 37	86139059.0 7
176	SellNumTrades _Inst20k	Total Number of 20K Institutional Sells (During Market Hours)	(2004) using the \$50,000 dollar value- based cutoff.*	BEST32.	45007	1389
177	SellVol_Inst20k	Sum of 20K Institutional Sells, Volume in Shares (During Market Hours)	that more recent studies (see <u>Campell</u> et al. (2009, <u>JFE</u> ) and <u>Cready et al (2014, <u>JAR</u>)) show institutions</u>	BEST32.	8410432	540366
178	sell_dv_Inst20k	Sum of 20K Institutional Sells, Value in Dollars (During Market Hours)	employing algorithmic trading strategies and order-splitting techniques to disguise their trades. Therefore, orders in large sizes	BEST32.	1863040556. 88	80718177.8 4
179	total_trade_Inst 20k	Total Number of 20K Institutional Trades (During Market Hours)	are merely one of the proxies for institutional trades and cannot capture all institutional trades. Its	BEST32.	86125	2774
180	total_vol_Inst2 0k	Total Share Volume of 20K Institutional Trades (During Market Hours)	effectiveness could be challenged, given the rise of institutional algorithm trading.	BEST32.	16198609	1117088
181	total_dv_Inst20 k	Total Dollar Value of 20K Institutional Trades (During Market Hours)		BEST32.	3588697317. 25	166857236. 91
182	avg_buy_price_ Inst20k	Average Trade Price of 20K		BEST32.	221.581	149.270

		Institutional Buys (During Market Hours)			
183	avg_sell_price_l nst20k	Average Trade Price of 20K Institutional Sells (During Market Hours)	BEST32.	221.601	149.313
184	bs_ratio_Inst20 k_num	Absolute Percent Order Imbalance - Num of 20K Institutional Trades	BEST32.	0.045155	0.001442
185	bs_ratio_Inst20 k_vol	Absolute Percent Order Imbalance - 20K Institutional Trade Share Volume	BEST32.	0.038414	0.032545
186	BuyNumTrades _Inst50k	Total Number of 50K Institutional Buys (During Market Hours)	BEST32.	4752	274
187	BuyVol_Inst50k	Sum of 50K Institutional Buys, Volume in Shares (During Market Hours)	BEST32.	3796317	336331
188	buy_dv_Inst50k	Sum of 50K Institutional Buys, Value in Dollars (During Market Hours)	BEST32.	841126896.5 9	50257103.6 1
189	SellNumTrades _Inst50k	Total Number of 50K Institutional Sells (During Market Hours)	BEST32.	4645	304
190	SellVol_Inst50k	Sum of 50K Institutional Sells, Volume in Shares (During Market Hours)	BEST32.	3915655	306946
191	sell_dv_Inst50k	Sum of 50K Institutional Sells, Value in Dollars (During Market Hours)	BEST32.	867004863.6 4	45867692.5 8
192	total_trade_Inst 50k	Total Number of 50K Institutional	BEST32.	9397	578

		Tue de a / Dunier	 		
		Trades (During			
		Market Hours)			
		Total Share			
100	total_vol_Inst5	Volume of 50K	DECTAA	7744072	642277
193	Ok	Institutional	BEST32.	7711972	643277
		Trades (During			
		Market Hours)			
		Total Dollar			
104	total_dv_Inst50	Value of 50K	DECTOO	1708131760.	96124796.2
194	k	Institutional	BEST32.	23	0
		Trades (During			
		Market Hours)			
		Average Trade Price of 50K			
195	avg_buy_price_		DECTAA	224 576	140 215
195	Inst50k	Institutional Buys	BEST32.	221.576	149.315
		(During Market			
		Hours)			
		Average Trade Price of 50K			
100	avg_sell_price_I		DECTOO	224 522	140 251
196	nst50k	Institutional Sells	BEST32.	221.522	149.351
		(During Market			
		Hours) Absolute Percent			
		Order Imbalance			
197	bs_ratio_Inst50	- Num of 50K	BEST32.	0.011387	0.051903
197	k_num		BE3132.	0.011387	0.051903
		Institutional Trades			
		Absolute Percent			
		Order Imbalance			
	hs ratio InstEO	- 50K			
198	bs_ratio_Inst50	- 50K Institutional	BEST32.	0.015474	0.045680
	k_vol				
		Trade Share			
		Volume			

### Formula Notes

- **General Notation in this formula note**
- $\overline{P_k}$  price of trade k,  $SHR_k$  shares of trade k,  $Dvol_k$  Dollar Volume of trade  $k = P_k \times SHR_k$
- Trade k is a buy order  $BUY_k$ , Trade k is a sell  $SELL_k$
- $B_k$  Bidding quote,  $A_k$  Asking quote,  $M_k$  Bid-ask mid-price  $M_k = \frac{B_k + A_k}{2}$   $D_k = \begin{cases} +1, & \text{if } trade \ k \text{ is a buy} \\ -1, & \text{if } trade \ k \text{ is a sell} \end{cases}$
- Formula 1 Lee and Ready 1991 (LR) Previous Nanosecond Algorithm: Classify trade k as a buy if price  $P_k > M_{t-1}$ , as a sell if  $P_k < M_{t-1}$  and tick test is used when  $P_k = M_{t-1}$

$$Trade \ k = \begin{cases} BUY_k, & if \ P_k > M_{t-1} \\ SELL_k, & if \ P_k < M_{t-1} \\ use \ tick \ test, & if \ P_k = M_{t-1} \end{cases},$$

where t denotes millisecond (before 20150725), microsecond (between 20150725 or 20150803 to 20161023), or nanosecond (for UTP after 20161023).

Formula 2 Tick Test

Lee and Ready (1991): The tick test is a technique which refers the direction of a trade by comparing its price to the price of the preceding trade(s). The test classifies each trade into four categories: an uptick, a downtick, a zero-uptick, and a zero-downtick. A trade is an uptick (downtick) if the price is higher (lower) than the price of the previous trade. When the price is the same as the previous trade (a zero tick), if the last price change was an uptick, then the trade is a zero-uptick. Similarly, if the last price change was a downtick, then the trade is a zero-downtick. A trade is classified as a buy if it occurs on an uptick or a zerouptick; otherwise it is classified as a sell.

Note: WRDS classification use Lee and Ready when trade price is inside prevailing NBBO and use tick test when trade price is outside prevailing NBBO

 Formula 3 Simple Averaged Dollar Effective Spread  $Dollar\ Effective\ Spread_k = 2D_k(P_k - M_k)$ .

The Simple Averaged Dollar Effective Spread of stock *i* on day *T* is calculated as

$$ESpreadDollar\_AVG_{i,T} = \frac{1}{N} * \sum_{k=1}^{n} Dollar\ Effective\ Spread_k$$
,

where N is the total number of trades of stock i on day T.

Formula 4 Simple Averaged Percentage Effective Spread

Percent Effective Spread<sub>k</sub> = 
$$\frac{2D_k(P_k - M_k)}{M_k}$$
.

The Simple Averaged Percentage Effective Spread of stock i on day T is calculated as

$$ESpreadPct\_AVG_{i,T} = \frac{1}{N} * \sum_{k=1}^{n} Percent \ Effective \ Spread_k$$
,

where N is the total number of trades of stock i on day T.

• Formula 5 Simple Averaged Dollar Realized Spread  $Dollar Realized Spread_k = 2D_k(P_k - M_{k+5})$ , where  $M_{k+5}$  is the bid-ask mid-point five minutes after the kth trade.

$$RSpreadDollar\_AVG_{i,T} = \frac{1}{N} * \sum_{k=1}^{n} Dollar \ Realized \ Spread_k$$
,

where N is the total number of trades of stock i on day T.

• Formula 6 Simple Averaged Percentage Realized Spread  $Percent \ Realized \ Spread_k = \frac{2D_k(P_k - M_{k+5})}{M_k},$ 

where  $M_{k+5}$  is the bid-ask mid-point five minutes after the kth trade.

$$RSpreadPct\_AVG_{i,T} = \frac{1}{N} * \sum_{k=1}^{n} Percent Realized Spread_k$$
,

where N is the total number of trades of stock i on day T.

• Formula 7 Simple Averaged Dollar Price Impact  $Dollar\ Price\ Impact_k = 2D_k(M_{k+5}-M_k)\ ,$  where  $M_{k+5}$  is the bid-ask mid-point five minutes after the kth trade.

$$PriceImpactDollar\_AVG_{i,T} = \frac{1}{N} * \sum_{k=1}^{n} Dollar Price Impact_k$$
,

where N is the total number of trades of stock i on day T.

• Formula 8 Simple Averaged Percentage Price Impact

Percent Price Impact<sub>k</sub> = 
$$\frac{2D_k(M_{k+5} - M_k)}{M_k},$$

where  $M_{k+5}$  is the bid-ask mid-point five minutes after the kth trade.

$$PriceImpactPct\_AVG_{i,T} = \frac{1}{N} * \sum_{k=1}^{n} Percent \ Price \ Impact_k$$
,

where N is the total number of trades of stock i on day T.

• Formula 9 Value Weighted Average Price of Buy Trades

$$BuyVWAP_{i,T} = \sum_{k=1}^{n} w_k * P_k \mid k \in \{BUY_{i,T}\},\$$

where 
$$w_k = \frac{P_k \times SHR_k}{\sum_{k=1}^n P_k \times SHR_k}$$
.

Formula 10 Value Weighted Average Price of Sell Trades

$$SellVWAP_{i,T} = \sum_{k=1}^{n} w_k * P_k \mid k \in \{SELL_{i,T}\},\$$

where 
$$w_k = \frac{P_k \times SHR_k}{\sum_{k=1}^n P_k \times SHR_k}$$
.

• Formula 11 Value Weighted Dollar Effective Spread

$$Dollar\ Effective\ Spread_k = 2D_k(P_k - M_k)$$

The Value Averaged Dollar Effective Spread of stock i on day T is calculated as

$$ESpreadDollar\_VW_{i,T} = \sum_{k=1}^{n} w_k \times Dollar \ Effective \ Spread_k$$
,

where  $w_k = \frac{P_k \times SHR_k}{\sum_{k=1}^n P_k \times SHR_k}$ , n is all the trades of stock i on day T.

• Formula 12 Share Weighted Dollar Effective Spread

Dollar Effective Spread<sub>k</sub> = 
$$2D_k(P_k - M_k)$$

The Share Averaged Dollar Effective Spread of stock i on day T is calculated as

$$ESpreadDollar\_SW_{i,T} = \sum_{k=1}^{n} w_k \times Dollar \ Effective \ Spread_k$$
,

where  $w_k = \frac{SHR_k}{\sum_{k=1}^n SHR_k}$ , n is all the trades of stock i on day T.

• Formula 13 Value Weighted Percentage Effective Spread

Percent Effective Spread<sub>k</sub> = 
$$\frac{2D_k(P_k - M_k)}{M_k}$$

The Value Averaged Percentage Effective Spread of stock i on day T is calculated as

$$ESpreadPct_{VW_{i,T}} = \sum_{k=1}^{n} w_k \times Percent \ Effective \ Spread_k \ ,$$

where  $w_k = \frac{P_k \times SHR_k}{\sum_{k=1}^n P_k \times SHR_k}$ , n is all the trades of stock i on day T.

Formula 14 Share Weighted Percentage Effective Spread

Percent Effective Spread<sub>k</sub> = 
$$\frac{2D_k(P_k - M_k)}{M_k}$$

The Share Averaged Percentage Effective Spread of stock i on day T is calculated as

$$ESpreadPct\_SW_{i,T} = \sum_{k=1}^{n} w_k \times Percent \ Effective \ Spread_k$$
,

where  $w_k = \frac{SHR_k}{\sum_{k=1}^n HR_k}$ , n is all the trades of stock i on day T.

• Formula 15 Share Weighted Dollar Realized Spread

Dollar Realized Spread<sub>k</sub> = 
$$2D_k(P_k - M_{k+5})$$
,

where  $M_{k+5}$  is the bid-ask mid-point five minutes after the kth trade.

$$RSpreadDollar\_SW_{i,T} = \sum_{k=1}^{n} w_k \times Dollar Realized Spread_k$$
,

where  $w_k = \frac{SHR_k}{\sum_{k=1}^n SHR_k}$ , n is all the trades of stock i on day T.

Formula 16 Value Weighted Dollar Realized Spread

Dollar Realized Spread<sub>k</sub> =  $2D_k(P_k - M_{k+5})$ ,

where  $M_{k+5}$  is the bid-ask mid-point five minutes after the kth trade.

$$RSpreadDollar_{-}VW_{i,T} = \sum_{k=1}^{n} w_k \times Dollar \ Realized \ Spread_k$$
,

where  $w_k = \frac{P_k \times SHR_k}{\sum_{k=1}^n P_k \times SHR_k}$ , n is all the trades of stock i on day T.

• Formula 17 Share Weighted Percentage Realized Spread

Percent Realized Spread<sub>k</sub> = 
$$\frac{2D_k(P_k - M_{k+5})}{M_k}$$
,

where  $M_{k+5}$  is the bid-ask mid-point five minutes after the kth trade.

$$RSpreadPct\_SW_{i,T} = \sum_{k=1}^{n} w_k \times Percent \ Realized \ Spread_k$$
,

where  $w_k = \frac{SHR_k}{\sum_{k=1}^n SHR_k}$ , n is all the trades of stock i on day T.

Formula 18 Value Weighted Percentage Realized Spread

Percent Realized Spread<sub>k</sub> = 
$$\frac{2D_k(P_k - M_{k+5})}{M_k}$$
,

where  $M_{k+5}$  is the bid-ask mid-point five minutes after the kth trade.

$$RSpreadPct\_VW_{i,T} = \sum_{k=1}^{n} w_k \times Percent \ Realized \ Spread_k$$
,

where  $w_k = \frac{P_k \times SHR_k}{\sum_{k=1}^n P_k \times SHR_k}$ , n is all the trades of stock i on day T.

Formula 19 Value Weighted Dollar Price Impact

$$Dollar\ Price\ Impact_k = 2D_k(M_{k+5} - M_k)$$
,

where  $M_{k+5}$  is the bid-ask mid-point five minutes after the  $k ext{th}$  trade.

$$PriceImpactDollar\_VW_{i,T} = \sum_{k=1}^{n} w_k \times Dollar \ Price \ Impact_k$$
,

where  $w_k = \frac{P_k \times SHR_k}{\sum_{k=1}^n P_k \times SHR_k}$ , n is all the trades of stock i on day T.

Formula 20 Share Weighted Dollar Price Impact

$$Dollar\ Price\ Impact_k = 2D_k(M_{k+5} - M_k)$$
,

where  $M_{k+5}$  is the bid-ask mid-point five minutes after the kth trade.

$$PriceImpactDollar\_SW_{i,T} = \sum_{k=1}^{n} w_k \times Dollar \ Price \ Impact_k$$
,

where  $w_k = \frac{SHR_k}{\sum_{k=1}^n SHR_k}$ , n is all the trades of stock i on day T.

Formula 21 Value Weighted Percentage Price Impact

Percent Price Impact<sub>k</sub> = 
$$\frac{2D_k(M_{k+5} - M_k)}{M_k},$$

where  $M_{k+5}$  is the bid-ask mid-point five minutes after the kth trade.

$$PriceImpactPct_VW_{i,T} = \sum_{k=1}^{n} w_k \times Percent \ PriceImpact_k$$
,

where  $w_k = \frac{P_k \times SHR_k}{\sum_{k=1}^n P_k \times SHR_k}$ , n is all the trades of stock i on day T.

Formula 22 Share Weighted Percentage Price Impact

Percent Price Impact<sub>k</sub> = 
$$\frac{2D_k(M_{k+5} - M_k)}{M_k},$$

where  $M_{k+5}$  is the bid-ask mid-point five minutes after the kth trade.

$$PriceImpactPct\_SW_{i,T} = \sum_{k=1}^{n} w_k \times Percent\ Price\ Impact_k$$
,

where  $w_k = \frac{SHR_k}{\sum_{k=1}^n SHR_k}$ , n is all the trades of stock i on day T.

• Formula 23 Trade-based Intraday Volatility

The trade-based intraday volatility of stock i on day T is calculated as:

$$IVol_{i,T} = \frac{\sum_{t=1}^{T} \left(Ret_{i,t} - \overline{Ret}_{i,t}\right)^{2}}{T-1},$$

where  $Ret_{i,t} = Ln \frac{P_{k,t}}{P_{k-1,t-1}}$ , and  $P_{k,t}$  is the trade price of trade k.

Note that the "Second Intraday Indicators" use the end-of-second rule and takes the last trade of the stock in a given second when computing second-to-second returns. Multiple trades in the same second will be compressed to using the last trade of the second. Seconds with no trades are not populated.

Millisecond Intraday Indicators use neither end-of second rule nor end-ofmillisecond rule. Millisecond IID treats each trade observation as an event, and therefore, the trade-based volatility measure is event-based and does not populate for each second/millisecond.

 Formula 24 NBBO Quote-based Intraday Volatility The quote-based intraday volatility of stock i on day T is calculated as:

$$IVol_{i,T} = \frac{\sum_{t=1}^{T} \left(Ret_{i,t} - \overline{Ret}_{i,t}\right)^{2}}{T-1},$$

where  $Ret_{i,t} = Ln \frac{M_{i,t}}{M_{i,t-1}}$ ,  $M_{i,t} = \frac{B_{i,t} + A_{i,t}}{2}$  is the bid-ask mid-price for stock i at second t.

Note that the "Second Intraday Indicators" use the end-of-second rule and takes the last NBBO update of a stock in a given second when computing second-to-second returns. Multiple NBBO updates in the same second will be compressed to using the last NBBO of the second. Seconds with no NBBO updates are not populated.

Millisecond Intraday Indicators use neither end-of second rule nor end-ofmillisecond rule. Millisecond IID treats each NBBO observation as a quote innovation event, and therefore, the volatility measure is event-based and does not populate for each second/millisecond.

Formula 25 Variance Ratio 1 (15-second/3\*5-second)

$$VarianceRatio 1 = \left| \frac{VAR(Ret_{15t})}{3 \times VAR(Ret_{5t})} - 1 \right|,$$

where  $VAR(Ret_{15t})$  is the variance of 15 second log returns.

Formula 26 Variance Ratio 2 (1-min/4\*15-second) 
$$Variance Ratio 2 = \left| \frac{VAR(Ret_{60t})}{4 \times VAR(Ret_{15t})} - 1 \right|,$$

where  $VAR(Ret_{60t})$  is the variance of 1-minute log returns.

Formula 27 Variance Ratio 3 (5-min/5\*1-

$$VarianceRatio 3 = \left| \frac{VAR(Ret_{300t})}{5 \times VAR(Ret_{60t})} - 1 \right|,$$

where  $VAR(Ret_{300t})$  is the variance of 5-minute log returns.

Formula 28 Variance Ratio 4 (15-min/3\*5-min)

$$VarianceRatio 4 = \left| \frac{VAR(Ret_{900t})}{3 \times VAR(Ret_{300t})} - 1 \right|,$$

where  $VAR(Ret_{900t})$  is the variance of 15-minute log returns.

Formula 29 Variance Ratio 5 (30-min/2\*15-min)

$$VarianceRatio 5 = \left| \frac{VAR(Ret_{1800t})}{2 \times VAR(Ret_{900t})} - 1 \right|,$$

where  $VAR(Ret_{1800t})$  is the variance of 30-minute log returns.

Note that the Variance Ratios in the Millisecond Intraday Indicators will receive an update in 2020 May to be comparable to the variance ratios in the Second Intraday Indicators Dataset.

• Formula 30 Lambda (Price Impact Coefficient), Intercept Not Suppressed Lambda ( $\lambda$ ) is the regression coefficient of the following model:

$$Ln\frac{M_{i,t}}{M_{i,t-300}} = \alpha + \lambda * SSqrtDVol + \epsilon$$
,

where  $SSqrtDVol = Sgn(\sum_{t=300}^{t} BuyDollar - \sum_{t=300}^{t} SellDollar) \times \sqrt{|\sum_{t=300}^{t} BuyDollar - \sum_{t=300}^{t} SellDollar|}$ ,  $M_{i,t} = \frac{B_{i,t} + A_{i,t}}{2}$  is the bid-ask mid-price for stock i at second t.

• Formula 31 Lambda (Price Impact Coefficient), Intercept Suppressed Lambda ( $\lambda$ ) is the regression coefficient of the following model:

$$Ln\frac{M_{i,t}}{M_{i,t-300}} = \lambda * SSqrtDVol + \epsilon$$
,

where  $SSqrtDVol = Sgn(\sum_{t=300}^{t} BuyDollar - \sum_{t=300}^{t} SellDollar) \times \sqrt{|\sum_{t=300}^{t} BuyDollar - \sum_{t=300}^{t} SellDollar|}$ ,  $M_{i,t} = \frac{B_{i,t} + A_{i,t}}{2}$  is the bid-ask mid-price for stock i at second t.

Formula 32 Herfindahl Index

$$HIndex = \frac{\sum_{t=1}^{t=1800} \sum_{k=1}^{N} (P_k \times SHR_k)^2}{(\sum_{t=1}^{t=1800} \sum_{k=1}^{N} P_k \times SHR_k)^2}$$

- Formula 33 Absolute Percent Order Imbalance (N. of Trades)  $OI = \frac{|\text{Total Number of Buys} \text{Total Number of Sells}|}{\text{Total Number of Trades}}$
- Formula 34 Absolute Percent Order Imbalance (Volume)  $OI = \frac{|\text{Total Vol of Buys} \text{Total Vol of Sells}|}{\text{Total Trade Volume}}$
- Formula 35 Retail Trade Classification (Applying to trades reported by FINRA only, exchange ID= "D")

Following Boehmer et al. (2021, JF), the algorithm classy trades reporting to FINRA with fraction of penny price improvements. See an example with AMC trades below:

Date of quote	Trade Time in milliseconds (microsecs starting 7/25/2015, nanosecs starting 10/24/2016)	Security symbol root	Security symbol suffix	type	Exchange that issued the trade	Trade Sale Condition (up to 4 codes)	Volume of trade	Price of trade
20210602	10:33:42.913158912	AMC		T	D	I	14	40.5299
20210602	10:33:42.921133568	AMC		Т	D	I	5	40.5299
20210602	10:33:42.928395008	AMC		Т	D	I	3	40.5299
20210602	10:33:42.955975680	AMC		Т	D	I	15	40.5299
20210602	10:33:42.965568256	AMC		Т	D	1	6	40.5001
20210602	10:33:43.039198208	AMC		Т	D	I	1	40.5195
20210602	10:33:43.040761856	AMC		Т	D	I	8	40.5106
20210602	10:33:43.087192064	AMC		Т	D	I	10	40.5195
20210602	10:33:43.138007808	AMC		Т	D	1	1	40.4901
20210602	10:33:43.155794944	AMC		Т	D	1	2	40.5299
20210602	10:33:43.178614784	AMC		Т	D	I	9	40.4901
20210602	10:33:43.206710784	AMC		Т	D		100	40.528
20210602	10:33:43.224252416	AMC		Т	D	1	1	40.5299

Let  $Penny_k = 100 \text{ mod(price, 0.01)}$ , then

$$Trade \ k = \begin{cases} BUY_k, & if \ 1 > Penny_k > 0.6\\ SELL_k, & if \ 0 < Penny_k < 0.4\\ & dropped, \ else \end{cases}$$

# Frequently Asked Questions (FAQs)

- 1. What is the difference of Second-timestamped IID and Millisecond-timestamped IID?
  - The Second-timestamped IID is developed based on the NYSE Monthly TAQ data, which has second-to-second timestamps. The Millisecond-timestamped IID is built on the NYSE Daily TAQ data, which has the millisecond-level timestamps. These two datasets vary in the following perspectives:
  - (1) Data range: monthly TAQ goes from 1993 to 2014 and is discontinued after 2014; daily TAQ covers from 2003 to present
  - (2) Data timestamp: Monthly TAQ is timestamped at second level while Daily TAQ is at millisecond level. WRDS noticed that Monthly TAQ simply floor the millisecond timestamp to the second level, which is not a rounding method. For example,
    - Daily TAQ time: 16:00:00:500000001
    - Monthly TAQ time (same observation, flooring to the second):
       16:00:00 (flooring is like truncating the finer levels)
    - Rounding method would be: 16:00:01 (this is just for comparison, it is not used in monthly TAQ)
  - (3)Official NBBO: Monthly TAQ does not come with any official NBBO files from NYSE. All the NBBO and WCT files are home-made. NBBOs are generated by comparing the best bid/offer prices across exchanges at the same second. Unlike Monthly TAQ, Daily TAQ comes with NYSE official NBBO files that tell you the official NBBO prices at a given millisecond during market hours. This NBBO files also helps to eliminate quotes that are not qualified for NBB or NBO according to NYSE's definition. With the official NBBO files in Daily TAQ, we expect that millisecond IID has higher-quality variables.
  - (4) Additional variables and conditions: we find the trade and quote conditions in Daily TAQ are richer and better updated compared to those in the Monthly TAQ.
- 2. What is the difference between Second-timestamped IID version 2.0 (2019 April release) and the vintage Second-timestamped IID? Our first version of Second-timestamped IID Beta was released in 2017 (referred as Second IID V1.0). In 2019 April, WRDS will release V2.0 Second-timestamped IID, which has the following updates:
  - (1) V 2.0 has 20 more variables, for example, more variance ratio variation variables and more out-of-market-hour variables
  - (2) Fixed few missing tickers reported in the vintage version

- 3. What methodology/academic papers do you follow to compute the variables in WRDS IID?
  - Our methodology and cleaning filters used to clean the TAQ data are similar to those used by Holden and Jacobsen (JF, 2014). You may find liquidity measure values are similar to those computed by Holden and Jacobsen's SAS code.<sup>2</sup>
- 4. Can I grab the same variables from Second IID and Millisecond IID together?
  - We understand that there is a need for a long historical sample for timeseries studies. Since Monthly TAQ and Daily TAQ differs in many ways mentioned in FAQ 1, we do not recommend researchers to combine variables from Millisecond IID to those from Second IID. One biggest difference would be Millisecond IID is built on Daily TAQ which contains official NBBO from NYSE, while Second IID is built on Monthly TAQ which does not have official NBBO files. The NBBO file in Second IID is homemade and is subject to inclusion of noisy messages.
- 5. Why there are fewer variables in Millisecond IID than those in Second IID? Millisecond IID offers 198 variables while Second IID offers 289 variables. The reduction of variables is caused by better and more accurate methodology. Point A to C below are the variable categories that have the most variable reduction. Motivations are explained.
  - A. In the Monthly TAQ, users don't have trade sequence number and quote sequence number. Therefore, researchers have to assume a quote/trade distribution within the second and assign the trades with quotes. In the Millisecond IID (using Daily TAQ), we have the sequence numbers and no longer use these methods anymore.
    - This is the reason why we don't need other quote-trade matching methods like those used in the Second IID:
  - Second IID variables (each method has 30 variables in Second IID):
  - 1) Previous second method
  - 2) Same second method
  - 3) Interpolated second method
  - Millisecond IID variables:
  - 1) Previous millisecond method

This difference eliminates the two methods that are no longer needed in Daily TAQ, that's 30\*2=60 variables less.

<sup>&</sup>lt;sup>1</sup> Holden, Craig W., and Stacey Jacobsen. "Liquidity measurement problems in fast, competitive markets: Expensive and cheap solutions." *The Journal of Finance* 69.4 (2014): 1747-1785.

<sup>&</sup>lt;sup>2</sup> Prof. Holden shares his SAS code at: <a href="https://kelley.iu.edu/cholden/">https://kelley.iu.edu/cholden/</a>. Please note their code does not deal with the timestamp update from millisecond to microsecond and microsecond to nanosecond which affect the TAQ data after July 27, 2015.

The 30 variables are specified on page 12 in the manual, variable # 62 - # 92.

- B. WRDS Second IID has two set of timers (9:30 am to 16:00 pm and market open to market close). This might be confusing because market open is usually 9:30 and market close is 16:00 pm. Sometimes the open trade and close trade are 1-2 seconds ahead or after the time mark. In Millisecond IID, we use an improved algorithm: use market open time and market close time when they are not missing; if they are missing then use 9:30 am to 16:00 pm. This saves about 30 variables.
- C. As Daily TAQ does not have aftermarket hour NBBOs, Millisecond IID does not offer trade classification summaries for aftermarket hours. In monthly TAQ, there is no NBBO file. Second IID home-made all the NBBOs (during market hours and after-market hours). In daily TAQ, NYSE provides official NBBO files during market hours. Generally, there is no NBBO aftermarket hours (as this message is excluded in the NBBO file). Thus, we cannot assign a trade as a buy or as a sell aftermarket hours (WRDS has a plan to develop aftermarket hour home-made NBBO files). This cause Millisecond IID have 20 fewer variables.

From point A to C listed above, Millisecond IID has much fewer variables compared to those offered in Second IID. The reduction in the number of variables is caused by the access to finer data timestamp and message sequence availability in Daily TAQ.

- 6. Among the similar variables in both Millisecond IID and Second IID, which ones may I find significant difference? What causes such differences? Generally, there are three categories of variables that users may expect to see different values:
  - (a) Daily summary variables (pending illustration)
  - (b) Timestamp related variables (pending illustration)
  - (c) Quote related variables (pending illustration)
- 7. If I still want to grab similar variables in Second IID and Millisecond IID, what is the best way to do that?
  We do not recommend combining variables from Millisecond IID (for post-2003) with the similar ones from Second IID (from 1993 to 2003). The variable may not be continuous and could have a jump in 2003's data. This would severely affect variables in the liquidity category. Some variables, however, have minor differences between the two IID products. We are preparing a mapping table for users to grab similar variables from both IID products. This mapping table will be released shortly. Please note doing so puts the researcher at risks of sample bias and continuity issues. WRDS is not responsible for and suggests against such actions.

8. What are the revisions to open and close trade? Why do I find some variable values slightly differ from those I downloaded from Version 1.0? Existing research treats all observations in the TAQ trade files are actual trades executed at the exchanges. However, we find a specific type of messages that have the same number of trade size and prices. We confirmed with NYSE and confirmed that those messages are status messages and are not real trades. Thus, we remove those messages in our computation.

Example 1: Duplicates of "Market Center Official Close (M)" that mirrors "Market Center Closing Trade (6)". First, we want to show you examples of two trade messages having the exact same trade volume and prices back-to-back. One is with trade condition "6", according to the manual that is the "Market Center Closing Trade". The one following it has trade condition="M", noted "Market Center Official Close" in the TAQ manual. Below is an example for AAPL on 07/08/2020, the two messages both report the same trade volume of 1,995,168 shares of trades executed at 381.37 per share. Please note the two messages have two distinct trade sequence number that current research considers each distinct trade sequence number is a unique trade.

	Date of trade	Time to the millisecond (prior to 07/27/2015) or microsecond (starting 07/27/2015)	Exchange that issued the trade	Security symbol root	Security symbol suffix	Trade Sale Condition (up to 4 codes)	Volume of trade	Price of trade	Trade Sequence Number
323293	08JUL2020	15:59:59.941112342	Q	AAPL		@	23	381.38	4405113
323294	08JUL2020	16:00:00.000752156	D	AAPL		@	800	381.3323	4405389
323295	08JUL2020	16:00:00.111757844	P	AAPL		@ M	251	381.44	4406530
323296	08JUL2020	16:00:00.513336319	Q	AAPL		@6 X	1995168	381.37	4407089
323297	08JUL2020	16:00:00.513350040	Q	AAPL		@ M	1995168	381.37	4407090
323298	08JUL2020	16:00:00.540739376	D	AAPL		@ T	1960	381.37	4407145
323299	08JUL2020	16:00:00.540795353	D	AAPL		@ T	630	381.37	4407146
323300	08JUL2020	16:00:00.541158372	D	AAPL		@ T	554	381.37	4407147

Another example, IVV (an SP500 ETF) on the same day, also shows the two messages being identical.

	Date of trade	Time to the millisecond (prior to 07/27/2015) or microsecond (starting 07/27/2015)	Exchange that issued the trade	Security symbol root	Security symbol suffix	Trade Sale Condition (up to 4 codes)	Volume of trade	Price of trade	Trade Sequence Number
357422	08JUL2020	16:00:00.007187310	Р	IVV		FI	37	317.35	45500002
357423	08JUL2020	16:00:00.007187310	P	IVV		F	1663	317.35	45500003
357424	08JUL2020	16:00:00.141163392	P	IVV		6	618274	317.33	45525701
357425	08JUL2020	16:00:00.168275037	P	IVV		M	618274	317.33	45528101
357//26	US II II SUSU	16:00:00 433386445	P	IVA/		FT	100	217 /	45543901

Please note in the two examples above, the trade volume in the highlighted trade is about 6.3% of the total trade volume for Apple, and 10% for IVV on 07/08/2020.

The problem is worse after market hours for ETFs. I find the message with "Market Center Official Close (M)" trade condition is reported multiple times. All have the same trade volume and trade price, with a unique trade sequence number assigned by SIP.

	Date of trade	Time to the millisecond (prior to 07/27/2015) or microsecond (starting 07/27/2015)	Exchange that issued the trade	Security symbol root	Security symbol suffix	Trade Sale Condition (up to 4 codes)	Volume of trade	Price of trade	Trade Sequence Number
1	08JUL2020	16:00:00.141163392	P	IVV		6	618274	317.33	45525701
2	08JUL2020	16:00:00.168275037	P	IVV		M	618274	317.33	45528101
3	08JUL2020	16:10:00.001393019	P	IVV		M	618274	317.33	45587903
4	08JUL2020	18:30:00.002842062	P	IVV		M	618274	317.33	45818908
5	08JUL2020	20:00:00.001058136	P	IVV		M	618274	317.33	45895801

And the timestamp pattern is not unique for a given ETF, it is the same timestamp pattern for all ETFs. Note that Exchange ID = "P" is NYSE Arca, which is the major marketplace for ETF trading.

,	,g.								
	Date of trade	Time to the millisecond (prior to 07/27/2015) or microsecond (starting 07/27/2015)	Exchange that issued the trade	Security symbol root	Security symbol suffix	Trade Sale Condition (up to 4 codes)	Volume of trade	Price of trade	Trade Sequence Number
1	08JUL2020	16:00:00.168275037	P	IVV		M	618274	317.33	45528101
2	08JUL2020	16:10:00.001393019	P	IVV		M	618274	317.33	45587903
3	08JUL2020	18:30:00.002842062	P	IVV		M	618274	317.33	45818908
4	08JUL2020	20:00:00.001058136	P	IVV		M	618274	317.33	45895801
5	08JUL2020	16:00:00.222444232	P	SPY		M	804208	316.18	56534301
6	08JUL2020	16:10:00.000466871	P	SPY		M	804208	316.18	56888601
7	08JUL2020	18:30:00.000551371	P	SPY		M	804208	316.18	57538601
8	08JUL2020	20:00:00.002622517	P	SPY		M	804208	316.18	57755801
9	08JUL2020	16:00:00.148734937	P	VOO		M	27554	290.38	49884701
10	08JUL2020	16:10:00.004288467	P	VOO		M	27554	290.38	50003401
11	08JUL2020	18:30:00.003928749	P	VOO		M	27554	290.38	50187402
12	08JUL2020	20:00:00.006821314	P	VOO		M	27554	290.38	50243601

To adjust for those status messages, we confirm that observations in the TAQ Trades file with trade condition = M "Market Center Official Close" are not real trades. They are more sort of a status message produced by the Security Information Processor (SIP). Therefore, such messages should not be counted when computing daily summary trade volume related variables.

This modification also helps to narrow the daily share volume gap with CRSP. After removing open trade status messages "Q" and close trade status messages "M", the difference between daily volume in IID (4am to 8pm, total\_vol\_b+ total\_vol\_m+ total\_vol\_a) and CRSP Daily share volume (VOL) is now less than 0.7%.

9. Boehmer et al. (2021, JF) Stopped their sample period in 2015, is it safe to use the retail classification after this point?

Boehmer et al. (2021, JF) stopped their sample in 2015. On page 5 of their paper, they mentioned "Second, from 2016 to September 2018, the SEC adopted a tick size pilot program (TSPP) that affects tick size and brokers' ability to provide price improvement for many stocks, which likely affects the prevalence of subpenny price improvements unevenly in the cross section."

We checked the details of the TSPP and find that it <u>affects 1,200 selected</u> stocks from 10/01/2016 to 10/01/2018.

The details of the program can be found here:

- SEC: <a href="https://www.sec.gov/ticksizepilot">https://www.sec.gov/ticksizepilot</a>
- FINRA: <a href="https://www.finra.org/rules-guidance/key-topics/tick-size-pilot-program">https://www.finra.org/rules-guidance/key-topics/tick-size-pilot-program</a>

FINRA collected data during the program: <a href="https://www.finra.org/rules-guidance/key-topics/tick-size-pilot-program/data-collection-securities-and-pilot-securities-files">https://www.finra.org/rules-guidance/key-topics/tick-size-pilot-program/data-collection-securities-and-pilot-securities-files</a>

The percent of penny rule may not work for the stocks selected in this program.

The list of 1,200 effected stocks can be found here: <a href="http://tsp.finra.org/finra.org/ticksizepilot/TSPilotChanges.txt">http://tsp.finra.org/finra.org/finra.org/ticksizepilot/TSPilotChanges.txt</a>.

After the expiration of the program on October 2018, the limits posted by the is no longer affecting the 1,200 treatment stocks. So the classification algorithm should work for those 1,200 stocks again after 2018. (See <a href="https://www.sec.gov/news/public-statement/tm-dera-expiration-tick-size-pilot">https://www.sec.gov/news/public-statement/tm-dera-expiration-tick-size-pilot</a>)

"Therefore, on Sept. 10, 2018, the Commission issued an exemption to the exchanges and Financial Industry Regulatory Authority (FINRA) to allow the quoting and trading requirements to terminate at the end of trading on Friday, Sept. 28, 2018."

So far, we did not find any regulation changes related to the Tick Size Pilot Program (TSPP). We will keep an eye on it. It also means, <u>other than the treatment 1,200 stocks that may have problem with the retail order flow identification during Oct 2016 to Oct 2018, the rest of the universe still works with the algorithm posted by Boehmer et al. (2021, <u>JF)</u>.</u>

10. What are the challenges I should be aware of when using the retail classification by Boehmer et al. (2021, JF)?

We previously linked an article about Robinhood sells its marketable order flow to citadel and are concerned that not all retail order flows are captured by the algorithm. We want to thank Professor Charles Jones for clarifying this: "we do not capture every retail order that is marketable, only the ones that are executed off exchange and price improved by a small fraction of a penny. Although Robinhood sells its marketable order flow to citadel and other HFT firms, that order flow is usually directly filled by citadel or the purchaser of the flow, but regardless of how it's executed

after Robinhood sells the order, the off exchange trade must be reported to a FINRA TRF and would thus be captured by our algorithm as long as it's price improved by a small fraction of a penny." We suggest users check BJZZ³ for more details on this and cite the BJZZ paper when using the retail order flows variables.

## In-development Updates

Release Note 2019 March:

Millisecond IID Version 1.0 (computed from Daily millisecond-timestamped TAQ, 2003-2019):

- Released Complete NBBO files
- Released WCT files
- Released Daily Summaries
- Update Note 2021 July

#### Millisecond IID:

- Update to Version 2.0
- Revisions to the open/close trade classifications
- Removed noises from the intraday timestamp residuals
  - All revisions are highlighted in bright red throughout the variable lists
- Added the module of retail and institutional order flow
  - See Variable List IX, and FAQs 9 and 10

#### Planed Future Products

(Due to unexpected key person turnover, we are experiencing delays in releasing new products. Thank you for your patience.)

• Coming Spring 2023:

#### Millisecond IID PLUS:

- Release 1-min/5-minute/15-minute/30-minute intraday summaries
- Complete NBBO modification as NYSE release advanced NBBO files
- Coming late 2023:

Millisecond IID Integrated with WRDS Event Study:

- Daily event study using WRDS IID
- To be announced:
- Daily Classic PIN computed from 5-minute intervals
- WRDS-enhanced trade classification algorithm
- Intraday event study using WRDS IID PLUS

We sincerely thank the feedback and suggestions from our users for proposing new variables. Due to our grid capability and plans to load other high-frequency data in the future, we are not able to accommodate all requests. Some high demand suggested variables computed using the intraday interval summaries will be released soon. Thank you for your understanding. We are open to new variable suggestions using the Daily TAQ data for empirical financial research. If you have variables that you would like to suggest, please contact the WRDS research team at <a href="mailto:jun5@wharton.upenn.edu">jun5@wharton.upenn.edu</a>. We will give high priority to variables that are computing intensive and demanded by large empirical research audience.