🌐 CME Group

DATA

Advanced Transaction Cost Analytics (TCA) with Al-enhanced Peer Grouping & Slippage Models

SPEAKERS

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Why do transactional cost analytics matter to trading participants?

• Transactional analytics provide valuable insights into your trading activities.

• By gathering data on your trades, you gain a better understanding of your trading patterns, risk factors, and performance. This in turn will help you to optimize your strategies and improve returns.

• Additionally, transactional analytics can provide traders with an edge by enabling them to identify opportunities, identify weaknesses in their strategies, and develop better risk management policies.



CME Group Transaction Cost Analytics development program

CME Group is shortly launching a new analytics service via Google GCP starting with a comprehensive suite of client TCA **covering all US Treasury trades**, **Brokertec CLOB** and across our **major UST futures markets**, followed soon by FX Futures, Equity, Major commodity markets and EBS cash FX.

The service will include

- Full Order and Trade level mark to market calculations and market impact by time and order book update count
- **Parent level aggregation**: Parent order summations by same trader ID, same Firm, Session ID in same direction within continuous time frame of 5 mins
- **Peer group benchmarking** including MTM of Futures/Cash equivalents on each transaction (including Basis Spreads cash-futures)
 - Peer grouping by Order Fill Ratios, and Market Maker classifications,
 - Peer group rankings using explainable machine learning attribution models powered by Google Vertex Ai.
- Best Execution Total Cost analysis using aggregate methods with VWAP, TWAP, Optimal Execution calculations.

External client access will start later this year.

The google analytics platform will expand in time to other products, and more complex analysis.



What is TCA and Market Impact and why is it important



What is TCA? (Transaction cost analysis)

TCA stands for Transaction Cost Analysis, which is a method used to measure and evaluate costs associated with executing financial transactions





What do we plan to deliver to market?

A simple scenario to explain ...

A corporation is looking to secure a significant volume of crude oil futures to hedge against the risk of rising prices

They send the order to "Barry the Broker" who will execute this order on behalf of the client ...





Trading "blind"

Without the tools to minimise market impact

Before the order

T-0

Barry places a large order to buy a number of oil futures contracts

Crude oil futures are trading at \$50 per contract

T+5s Other market participants notice the buy order, interpret it as a bullish sentiment for crude oil prices. This causes a temporary large pop in the price against the client

> T+10s The impact of the first trade parcel reduces with time

Seconds after ...

T+60s

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The price of the crude oil futures contract has settled at \$50.50 - a higher price than before the order

T+ns

This will affect the remaining balance of the client orders that Barry needs to execute to complete the overall parent order



What just happened?

The answer can be explained by Market Impact

- The act of placing a large buy order has pushed the price from \$50 to \$50.50
- The change in price (50 cents per contract) represents the market impact at 60 seconds
- The overall price that "Barry the broker" ended up executing the entire order at was higher than what it would have been if there was no market impact at all

- Market impact is the difference between the price trajectory of the market with the order and what the price trajectory without the order ... if only it was that easy to calculate! We are not able to simultaneously observe both price trajectories and measure market impact with any exactness, often referred to as the "Heisenberg uncertainty principle of trading."
- A simple measure used by many e-trading professionals is to look at the market impact of a client's trade in time slices (pre and post trade). Using this process clients can attempt to ascertain on average how much price impact they are causing.

What is Market Impact and why does it matter so much

- Market impact refers to the effect that a trade has on the price of a financial instrument
- When a **large trade is executed**, or **a series of fast small trades**, it can move the market by creating demand or supply pressure. This can result in a temporary (or permanent) change in the price of the market which can affect the execution price of subsequent trades, or the clients targeted trade quantity.





Trading smart Now powered with CME TCA insights

Before the order

Seconds after ...

T+1s

We provide Barry with TCA insights -

- Mark to Markets
- A corresponding CME benchmark
- The matching engine timestamp
- The type of counterparty matched with



I write the algos that make my client's sing!

T-0

Barry adjusts his trade execution, speed, order size and order execution methodology based on post trade analysis prior to the order

Crude oil futures are trading at \$50 per contract



T+60s

Barry uses these tools to reduce the traded Market Impact and therefore delivers a better execution quality service for his client

Trading smart - How can these TCA insights be used?

Using Low Latency Analytics API

Clients will be able to **adjust their strategy in near real time** and optimise their overall market impact based on the results of their prior execution analysis.

Have an insight into the **type of counterparty they are matching with**. Based on this they might adjust their trade execution differently

Using post trade analytics

Clients can look at the market impact by transaction size and trade execution style (i.e. aggressive or passive) and use this information to:

- Adjust the speed of execution of the order
- Adjust the size of the child orders (assuming the parent order needs to be broken down into smaller pieces to execute)
- Adjust the execution methodology with the intention to optimise the market impact on their trades.

What we plan on delivering *

Exact release dates TBC



What will the TCA look like ?



Trade Event View: Walk through each child and parent trade

Clients will be able to query via a Looker Dashboard (or via API, Big Query access, or through a CME Analytics HUB), individual trades and analytics for specific date ranges, whether trades are outright or spreads, by client ID, trader or session, multi product or single, order type (TBA), MTM type, or even a single match event

Over 130 fields available today, more will be available in the future

- Basic Trade fields : nanosecond time stamps, product codes, firm information (Firm ID, Operator ID, Session ID)
- Order Information: Trade Qty, Trade Direction, Trade Price, passive/aggressive indicator, Order ID, CME match events, CME Sequence numbers, Market Spread match type, Order type (TBA), Iceberg Amt shown/hidden (TBA)
- Parent Order information: Trades aggregated from same trader, trading in same direction continuously without a 5 minute break : Total Parent Trade Size, Parent Group ID, Parent VWAP, Parent Duration
- Best Execution Benchmarks: Market TWAP, Sweep VWAP at time zero, Optimal Execution Rate, slippage for each
- Market Stats: Hourly and Daily Volatility, Cash to Futures Basis Spread, Futures Equivalent Mid Price, Futures BBO and Qty, Previous BBO for Cash

Mark to Market Stats: MTM stats in USD or USD per million, First Trade of Day, Last trade of Day, MTM stats in time from -60 sec, -30, -5,-1, 0, 10ms, 50ms... out to 20 mins (31 slices currently), and MTM stats by count of number of market orderbook updates from -400..-10, -1, 1, ...5,...50...200..400..4000.. (gives a dynamic MTM based on trade activity in the market instead of just time)



CME Group

Trade Analytics MVP

Trade Event View ♡ 🖽

Time Breakdown	Market Spread Type		Cycle Date		Transaction Time Execution Firm ID	Operator ID Session ID	Exchange ID Product Code Product Type PTG	Order ID Aggressor Indicator (Yes /	No) Market Impact Disp	lay Type Market Impacts by Ti	me	
By Cycle Date 🔹	1	1		ñ ou googo	The second second	Trade Price Volume	Parent Trade Volume Weighted	Trade Parent Duration	The second second second	lion 👻 is mid_px_minu	s30sec or mid_px_0ms	or mi
Market Impact Type	Side	^	Market Spread Type	Trade Qty	Total PTG Qty	Weighted Avg Price	Avg Price	(seconds)	Market TWAP			
By Time 👻						· ·						
	В		Outright in Direct Market	2	2	98.6171875	98.6171875	0	98.6171875			
	S		Outright in Direct Market	2	2	98.5703125	98.5703125	0	98.5703125			:
	В		Outright in Direct Market	1	42	98.6015625	98.59821428571429	192.897568498	98.599639883	Parent Trade Volume Weighted	Trade Parent Duration	
Transaction Time (Nanoseco	B		Outright in Direct Market	2	42	98.6015625	98.59821428571429	192.897568498	98.599639883	Avg Price	(seconds)	Market TWAP
19 2022-06-02 05:18:05.293693	в		Outright in Direct Market	1	42	98.6015625	98.59821428571429	192.897568498	98.599639883	98.6171875	0	98.6171875
20 2022-06-02 05:52:25.997023 21 2022-06-02 11:22:26.608860	B		Outright in Direct Market	1	42	98.6015625	98.59821428571429	192.897568498	98.599639883	98.59821428571429	192.897568498	98.5996398834
22 2022-06-02 11:22:26.609014	в		Outright in Direct Market	1	42	98.6015625	98.59821428571429	192.897568498	98.599639883	98.59821428571429	192.897568498	98.5996398834
23 2022-06-02 11:22:26.609052 24 2022-06-02 11:22:26.609111	В		Outright in Direct Market	1	42	98.6015625	98.59821428571429	192.897568498	98.599639883	98.59821428571429 98.59821428571429	192.897568498 192.897568498	98.5996398834 98.5996398834
25 2022-06-02 11:22:26.609377 26 2022-06-02 11:22:32.234440	В		Outright in Direct Market	1	42	98.6015625	98.59821428571429	192.897568498	98.599639883	98.59821428571429 98.59821428571429	192.897568498 192.897568498	98.5996398834 98.5996398834
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28 2022-06-02 11:22:32.234459 29 2022-06-02 11:22:32.714375	B		Outright in Direct Market	5	42	98.6015625	98.59821428571429	192.897568498	98.599639883	98.59821428571429 98.59821428571429	192.897568498 192.897568498	98.5996398834 98.5996398834
30 2022-06-02 11:22:32.714590	В		Outright in Direct Market	1	42	98.6015625	98.59821428571429	192.897568498	98.599639883	98.59821428571429	192.897568498	98.5996398834
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33 2022-06-02 11:23:55.838475 34 2022-06-02 11:23:55.838476	В		Outright in Direct Market	3	42	98.6015625	98.59821428571429	192.897568498	98.599639883	98.59821428571429 98.59821428571429	192.897568498 192.897568498	98.5996398834 98.5996398834
35 2022-06-02 11:24:37.366864	В		Outright in Direct Market	1	42	98.6015625	98.59821428571429	192.897568498	98,599639883	98.59821428571429	192.897568498	98.5996398834
36 2022-06-02 11:25:13.057948 37 2022-06-02 11:25:13.057960	B B		Outright in Direct Market	1	42	98.6015625	98.59821428571429	192,897568498	98.599639883	98.59821428571429 98.59821428571429	192.897568498 192.897568498	98.5996398834 98.5996398834
38 2022-06-02 11:25:13.057968	В		Outright in Direct Market	6	42	98.59375	98.59821428571429	192.897568498	98.599639883	98.59821428571429	192.897568498	98.5996398834
39 2022-06-02 11:25:13.057969 40 2022-06-02 11:25:39.506409	B B		Outright in Direct Market	1	42	98.59375	98.59821428571429	192.897568498	98.599639883	98.59821428571429 98.59821428571429	192.897568498 192.897568498	98.5996398834 98.5996398834
41 2022-06-02 11:25:39.506426 42 2022-06-02 11:25:39.506429	2		Outright in Direct Market	2	42	98.59375	98.59821428571429	192.897568498	98.599639883	98.59821428571429 98.59821428571429	192.897568498 192.897568498	98.5996398834
43 2022-06-02 11:33:20.902653	B		Outright in Direct Market	1	42	98.59375	98.59821428571429	192.897568498	98.599639883	30.0010020	•	98.5996398834
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	B		Outright in Direct Market	2	42	98.59375	98.59821428571429	192.897568498	98.599639883			
	P		Outright in Direct Market	3	42	98.59375	98.59821428571429	192.897568498	98.599639883			
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Trade Parent Sweep VWAP

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Breakdown Mari	et Spread Type		Cycle Date	Transaction Time	Execution Firm ID	Operator ID Session	ID Exchange ID	Product Code Produ	ict Type PTG Order ID	Aggressor Indicator (Yes / No) Market Impact Display Ty	pe Market Impacts by	/ Time	
r Cycle Date 👻 is	Outright in Direct Mark	et or Outright in Indi	2022/06/02 - 2022/06	/02 is any time	Firm ID	Operator SSN	ID IS BTEC	is UB05 is	BOND is any value	any value	Dollars per Million	✓ is mid_px_m	nus30sec or mid_px_	_0ms or mi
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Cash to Futures - Basis Spread	Futures - Mid Price	Futures - Best Bid Qty	Futures - Best Bid Price	Futures - Best Ask Qty	Futures - Best Ask Price	Previous Top Bid Price	Previous Top Bid Qty	Previous Top Ask Pr	rice Previous Top Ask Qty	Avg PTG Max Shown Qty	Total SOD Mark to Market	Total EOD Mark to Market	Mid Price -60sec	Mid Price -30sec
10 13.7421875	112.36328125	119	112.359375	155	112.3671875	98.6171875	2	98.625	8	2	\$156.25			i \$0.00
13.75	112.31640625	276	112.3125	206	112.3203125	98.5625	25	98.5703125	5	5	-\$625.00	-\$1,171.88	\$0.00	\$0.00
13.7421875	112.34765625	542	112.34375	74	112.3515625	98.6015625	11	98.609375	15	5	\$312.50		\$39.06	i \$39.06
13.7421875	112.34765625	542	112.34375	74	112.3515625	98.6015625	9	98.609375	15	5	\$312.50	\$859.38	\$39.06	\$39.06
13.7421875	112.34765625	542	112.34375	74	112.3515625	98.6015625	7	98.609375	16	5	\$312.50	\$859.38	\$39.06	\$39.00
13.7421875	112.34765625	542	112.34375	74	112.3515625	98.6015625	6	98.609375	16	5	\$312.50	\$859.38	\$39.06	i \$39.0
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13.7421875	112.34765625	311	112.34375	158	112.3515625	98.6015625	5	98.609375	14	5	\$312.50	\$859.38	\$39.06	\$39.0
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13.7421875	112.34765625	307	112.34375	161	112.3515625	98.6015625	5	98.609375	15	5	\$312.50			
13.7421875	112.34765625	307	112.34375	161	112.3515625	98.6015625	1	98.609375	15	5	\$312.50			
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13.7421875	112.34765625	432	112.34375	183	112.3515625	98.6015625	5	98.609375	17	5	\$312.50			
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13.7421875	112.33984375	120	112.3359375	331	112.34375	98.59375	5	98.6015625	14	5	\$390.63			
13.7421875	112.33984375	266	112.3359375	273	112.34375	98.59375	6	98.6015625	13	5	\$390.63			
13.7421875	112.33984375	266	112.3359375	273	112.34375	98.59375	5	98.6015625	13	5	\$390.63			
13.7421875	112.33984375	266	112.3359375	273	112.34375	98.59375	3	98.6015625	13	5	\$390.63			
13.7421875	112.33984375	266	112.3359375	273	112.34375	98.59375	2	98.6015625	13	5	\$390.63			
13.7421875	112.33984375	183	112.3359375	317	112.34375	98.59375	5	98.6015625	15	5	\$390.63			
13.7421875	112.33984375	183	112.3359375	317	112.34375	98.59375	4	98.6015625	15	5	\$390.63			
13.7421875	112.33984375	183	112.3359375	317	112.34375	98.59375	1	98.6015625	15	5	\$390.63			
13.7421875	112.34765625	550	112.34375	169	112.3515625	98.6015625	6	98.609375	16	4	\$312.50	\$859.38	\$39.06	\$0.00

Comparative 5 ZF Year Futures Market

What was the 5 Year Cash UST market BBO at time of trade



vate 👻	is Outright in			Cycle Date	nansa	saction Time Execut	cution Firm ID C	Operator ID Sess	ession ID Exchange ID	e ID Product Code	Product Type F	PTG Order ID A	Aggressor Indicator (Yes	(TNO) Widikes	ket Impact Display Type	e Market Imp		
Туре		in Direct Market or Ou	Jutright in Indi	2022/06/02 - 2022	2/06/02 is r	s any time Firm	rm ID	Operator SSI	SN ID is BTEC	EC is UB05	is BOND	is any value	any value	- Do'	ollars per Million	✓ is mid	id_px_minus30sec or n	mid_px_0ms or mi
	Match Event ID	Trading Platform	n															
*	is any value	BTD GLB	.BX															
									Too do Event Mercure									
Price -60sec	Mid Price -30sec	Mid Price -5sec	Mid Price -1sec	Mid Price - 100ms	Mid Price - 10ms	Mid Price Oms	Mid Price 10ms	Mid Price 50ms	Mid Price 100ms	Mid Price 200ms	Mid Price 500ms	Mid Price 1sec	Mid Price 2sec	Mid Price 3sec	Mid Price 4sec	Mid Price 5sec	Mid Price 10sec	Mid Price 15sec
100 00000																		
-\$39.06	\$0.00																	
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\$0.00	\$0.00	\$0.00	0 \$0.00	.00 \$0.00	\$0.00	.00 \$0.00	00 \$0.00	0 \$0.00	\$0.00	0 \$0.00	0 \$0.0	0.00 \$0.00	00 \$0.00	\$0.00	0 \$0.00	\$0.00	0 \$0.00	0 \$0.0
\$39.06	\$39.06	\$39.06	6 \$39.06	.06 \$39.06	\$ \$39.06	06 \$39.06	-\$39.06	6 -\$39.06	-\$39.06	6 -\$39.06	-\$39.0	9.06 -\$39.06	-\$39.06	-\$117.19	9 -\$117.19	-\$117.19	9 -\$78.13	3 -\$78.13
\$39.06	\$39.06	\$39.06				.06 \$39.06	06 <mark>-\$</mark> 39.06	6 -\$39.06	-\$39.06				-\$39.06	-\$117.19	9 -\$117.19	-\$117.19		
\$39.06	\$39.06																	
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	\$39.06	\$39.06	6 \$39.06	.06 \$39.06	\$39.06	.06 \$0.00	-\$39.06	6 -\$39.06	-\$39.06	6 -\$39.06	-\$39.0	9.06 \$39.06	\$39.06	\$39.06			6 \$39.06	
\$39.06 \$39.06	\$0.00	\$39.06				06 \$0.00	\$0.00	0 \$0.00	\$0.00	-\$39.06	-\$39.0	-\$39.06	-\$39.06	S0.00	\$0.00	-\$39.06	-\$39.06	i6 \$0.0

Mark to Market in USD Per Million traded



CME Group

Q (PP) [7]

Participant Trade Summary

Benchmark comparison shows comparison to CME peer category defined by order fill ratios

Participant S	umma	ary (Performance) ♡ 🗉															1m ago 📿 😇
Time Breakdown		Market Spread Type	Cycle Date	Execution Firm ID	Operator ID	Session ID	Exchange ID	Product Type	Product Code	Aggressor Indicator (Yes / No)		Split by T	rade Indicator (Yes / No)	Peer Category Type		Market Impact Type	
By All		is Outright in Direct Market or Outright in Indi	is any time	Firm ID	is any value	is any value	is BTEC	is BOND	is UB10	any value	¥.	Yes	No	Order Fill Ratio	- v	By Time	· · · · · · · · · · · · · · · · · · ·
Market Impact Price Displ	ау																

Dollars per Million 🛛 👻

												Peer	Group Mark	et Aggregates											
	Dece Colores		Trade Count	Trade Qty Total	Aggressive		Passive Trade	Avg PTG	Avg PTG	Avg PTG	Avg PTG	Avg PTG	Avg PTG Max	Optimal Execution	Avg Sweep	Avg TWAP	Cash to Futures -	Mid Price							
	Peer Category	^	Total (%)	(%)	Trade Total ((%)	Total (%)	Count	Qty	Aggressive Qty	Passive Qty	Duration (s)	Shown Qty	Slippage	Slippage	Slippage	Basis VWAP	-30sec	Oms	5sec	15sec	30sec	60sec	120sec	600sec
1	High Frequency		24%	21%	16%		26%	3	4	1	2	57.8	0	-0.00997759	92.18062382	0.00044119	40.04	\$12.44	\$2.48	-\$1.63	-\$1.49	-\$1.30	-\$0.40	\$0.76	\$3.61
2	Active Participant		30%	26%	2	7%	25%	2	2 3	2	2	47.3	1	-0.00823838	90.79590218	0.00005373	39.86	\$1.75	-\$7.37	\$2.18	\$1.93	\$1.90	\$2.04	\$2.30	\$2.00
3	Primary Participant		17%	17%	18%		16%	3	5	3	2	46.4	0	-0.00816419	92.28318854	0.00019900	40.02	-\$0.01	\$0.44	\$4.25	\$3.43	\$2.95	\$2.40	\$2.31	\$3.44
4	Secondary Participant		19%	24%	26	5%	21%	3	1 7	4	3	60.1	1	-0.00966700	91.14510223	-0.00002527	39.19	-\$3.89	\$3.18	\$0.15	\$0.29	\$0.49	\$0.31	-\$0.24	-\$1.51
5	Agency Model		9%	12%	13%		12%	3	6	3	3	55.2	1	-0.01215929	90.59915558	0.00002380	39.61	-\$8.59	\$3.19	-\$9.81	-\$9.01	-\$8.80	-\$8.89	-\$9.32	-\$11.35

									Partic	ipant Metrics &	Market Impact	ts							
	Timeframe	Product Code	Exchange ID	Execution Firm ID	Operator ID Session	ID Peer Category	Trade Indicator	Avg PTG Max Shown Qty	Optimal Execution Slippage	Avg Sweep Slippage	Avg TWAP Slippage	Cash to Futures - Basis VWAP	Mid Price -30sec	Mid Price Oms	Mid Price 5sec	Mid Price 15sec	Mid Price 30sec	Mid Price 60sec	Mid Price 120sec N
1	Ø	UB10	BTEC			Agency Model	-	3	-0.01323956	93.16692917	-0.00008536	42.25	-\$8.41	\$12.92	-\$6.75	-\$2.38	\$1.23	\$2.85	\$1.50 🔺
2	0	UB10	BTEC			Agency Model	-	3	-0.01284264	93.07704079	-0.00016962	42.23	-\$13.47	\$13.72	-\$4.76	-\$2.01	\$0.33	-\$0.27	-\$3.32
3	ø	UB10	BTEC	augusta an		High Frequency		2	-0.01260955	91.09402242	0.00110620	39.52	\$61.00	\$31.60	\$7.17	\$5.28	\$5.66	\$5.09	\$2.63
4	ø	UB10	BTEC	Firm ID		High Frequency		2	-0.01246391	91.21113071	0.00100037	39.47	\$59.80	\$31.64	\$6.97	\$3.16	\$4.34	\$5.68	\$3.43
5	Ø	UB10	BTEC			Agency Model	1.1	4	-0.01297041	93.78648895	-0.00009767	36.60	-\$11.95	\$0.90	-\$8.06	-\$4.75	-\$3.73	-\$0.65	-\$4.31
6	0	UB10	BTEC			Agency Model		4	-0.01453585	94.67323432	-0.00016535	36.46	-\$13.28	\$1.81	-\$6.10	\$0.35	\$1.03	\$2.01	\$5.41
7	0	UB10	BTEC			Active Participant		1	-0.01246251	94.82626739	0.00062605	43.17	\$50.50	\$31.51	-\$8.53	-\$10.28	-\$10.52	-\$7.08	-\$9.07
8	ø	UB10	BTEC			Active Participant		1	-0.01196258	94.95037477	0.00057539	43.22	\$49.67	\$33.53	-\$5.14	-\$7.10	-\$7.94	-\$2.77	-\$3.57
9	0	UB10	BTEC			Secondary Participant		7	-0.00135987	84.31297982	0.00018105	37.87	-\$19.89	\$37.67	\$1.58	-\$4.29	-\$3.09	\$13.35	\$0.94
10	ø	UB10	BTEC			Active Participant		7	-0.00368184	76.55094717	-0.00012769	28.19	-\$82.83	\$14.42	\$13.68	-\$23.28	\$2.48	\$69.27	\$86.11
11	ø	UB10	BTEC			Active Participant	-	10	-0.00246659	84.12726281	-0.00141812	32.86	\$42.12	-\$37.92	\$12.72	\$42.36	\$16.68	-\$23.40	\$1.56
12	ø	UB10	BTEC			Agency Model	-	4	-0.00062296	88.59516995	0.00000468	37.73	-\$46.68	\$8.44	-\$21.35	-\$34.26	-\$40.39	\$5.30	\$18.37
13	0	UB10	BTEC			High Frequency		2	-0.01622768	93.56391887	-0.00034077	39.14	\$73.11	\$17.38	\$2.69	\$5.55	-\$29.21	-\$45.33	-\$75.26
14	ø	UB10	BTEC			Agency Model		1	-0.00228987	82.93468806	0.00039911	26.47	-\$98.44	-\$33.40	\$129.10	\$110.94	\$148.44	\$188.28	\$195.12
15	0	UB10	BTEC			Agency Model	1.1	2	-0.00034091	97.10330294	0.00194098	39.14	-\$111.27	\$17.16	\$8.09	\$29.00	\$112.06	\$201.82	\$169.86
16	Ø	UB10	BTEC			Secondary Participant		3	-0.00194752	86.74682668	0.00077837	7.55	-\$40.40	-\$11.44	\$4.62	\$2.92	\$7.06	-\$6.08	-\$27.50
17	Ø	UB10	BTEC			Secondary Participant		10	0.00000000	84.29200491	0.00072570	24.29	-\$9.11	\$15.63	\$11.07	-\$18.88	-\$29.30	-\$14.65	\$9.44
18	Ø	UB10	BTEC			Agency Model	1.1	6	0.00000000	83.73377528	0.00000000	33.25	\$38.36	\$5.58	-\$14.30	-\$6.28	\$3.14	\$90.68	\$36.27

Participant Trade Summary

450



4	4	4

2 Non Market Maker

465

	Timeframe	Product Code	Exchange ID	Execution Firm ID	Operator ID	Session ID Peer Category	Trade Indicator	Order Fill %	Trade Count Total	Trade Qty Tot 🗸	Spread Trade Total	Direct Trade Total	Indirect Trade Total	Aggressive Trade Total	Passive Trade Total	% Aggressor	Avg PTG Count	Avg PTG Qty	Avg PTG Aggressive Qty	Avg PTG Passive Qty	Avg PTG Duration (s)	Avg) Shov
1	0	UB10	BTEC			Non Market Maker		82.0%	44,254	100,633	0	100,628	5	50,320	50,313	50%	4	9	4		4 111	.0 _
2	0	UB10	BTEC			Non Market Maker		81.7%	44,135	99,896	0	99,860	36	50,317	49,579	50%	4	9	1		4 107	.8
3	6	UB10	BTEC			Non Market Maker		6.9%	67,490	87,851	0	87,786	65	32	87,819	0%	4	5	i (5 100	1.7
4	ø	UB10	BTEC	Firm ID		Non Market Maker		6.9%	67,067	87,323	0	87,217	106	43	87,280	0%	4	5	6 0		5 97	.6
5	Ø	UB10	BTEC			Non Market Maker		88.3%	8,674	22,022	0	22,022	0	14,987	7,035	68%	3	8	6		3 85	5.9
6	0	UB10	BTEC			Non Market Maker		88.4%	8,472	21,570	0	21,564	6	15,020	6,550	70%	3	8			2 90	1.1
7	Ø	UB10	BTEC			Non Market Maker		17.5%	2,918	3,662	0	3,661	1	88	3,574	2%	4	5	6 (5 135	i.1
8	0	UB10	BTEC			Non Market Maker		17.6%	2,941	3,632	0	3,626	6	86	3,546	2%	4	5	i (5 129	1.7
9	Ø	UB10	BTEC			Non Market Maker	34 - C	57.4%	1,085	2,329	0	2,329	0	686	1,643	29%	5	11	4		7 29	1.5
10	ø	UB10	BTEC			Non Market Maker		14.8%	266	1,262	0	1,262	0	915	347	73%	3	15	5		6 48	3.1
11	ø	UB10	BTEC			Non Market Maker		17.7%	200	651	0	651	0	478	173	73%	6	19	14		5 26	5.8
12	ø	UB10	BTEC			Non Market Maker		96.9%	145	472	0	472	0	264	208	56%	2	6	1 3		3 1	1.3
13	Ø	UB10	BTEC			Non Market Maker	14 - C	2.5%	265	436	0	436	0	102	334	23%	3	5	5 1		4 79	9.3
14	0	UB10	8TEC			Non Market Maker		96.7%	30	400	0	400	0	400	0	100%	3	26	25		1 10	0.3
15	0	UB10	BTEC			Non Market Maker		86.8%	43	395	0	396	0	368	28	93%	9	43	32	1	1 2	2.7
16	0	UB10	BTEC			Non Market Maker		59.0%	141	321	0	321	0	257	64	80%	3	7	5		2 64	13
17	ø	UB10	BTEC			Non Market Maker		65.9%	75	240	0	240	0	126	114	53%	5	16	i 9		8 14	1.0
18	Ø	UB10	BTEC			Non Market Maker		80.2%	104	224	0	224	0	122	102	54%	5	13	8		5 2	2.5
19	Ø	UB10	BTEC			Non Market Maker		84.3%	42	210	0	210	0	130	80	62%	5	23	14		9 1	1.2
20	0	UB10	BTEC			Non Market Maker		95.2%	20	190	10	190	0	176	14	93%	2	13	11		2 2	2.8
21	ø	UB10	BTEC			Non Market Maker		82.8%	172	172	0	172	0	167	5	97%	1	1	1		0 52	1
22	8	UB10	BTEC			Non Market Maker		77.9%	165	165	n	165	0	161	4	98%	1	1	1		0 38	3.7 *

Participant Metrics & Market Impacts

-0.01152182

90.26304559

0.00024367

39.62

\$2.77

\$10.66

-\$2.03

-\$2.28

-\$2.33

-\$2.64

-\$2.96

-\$3.71

69.2

Summary

Clients will be able to query via

- CME Google Analytics Hub / Google Big Query (Sep 24)
- Low latency Direct API with updated trade deltas in near real time (Q4 24)
- Looker dashboards in 2025

Clients can pick and choose which bit of information they wish to focus on, and which benchmarks are meaningful to them and grab just the information that they want and download to their own systems for analysis.

Eg, a client may want to see only

- Basic Trade Information
- Parent Order stats, including best ex comparison to VWAP at time of trade with lookup including hidden orders
- MTM at Zero seconds, 10 and 30 seconds, and Benchmark Market Maker MTM for that time period

We expect to be adding new features over coming months before its live

For example,

- 1. What type of client did you match with on each trade, market maker or non market maker ?
- 2. If you traded the whole sweep at the start what would have being your fill including hidden liquidity ?
- 3. How can you reduce trade execution slippage using a machine learning model ?

Al-enabled TCA: ML-based Peer Grouping & Explainable Al can Lower Costs



AI - Treasury TCA on Google Cloud Platform

- Utilizing leading edge Google Cloud Al technology to help customers better comprehend and refine trade execution activities.
- Net new insight: Peer group benchmarking based on trading behavior. Explainable AI to provide actionable suggestions to reduce slippage rate, helping customers unlock new value.

*slippage rate = the difference between the expected price of an order and the price when the order actually executes





AI-Enabled TCA



Autoencoder Neural Network



Using K-Means Clustering Algorithm to Group Participants

- Transform participant trading data into embeddings using Autoencoder.
- Run K-Means clustering using the embeddings.
- Evaluate cluster "goodness of fit" using silhouette score.



Using Explainable AI to Define the Peer Groups

- <u>XGBoost Classifier Model</u> trained using original participant trading data.
- Determine the most important features attributed to each peer group using Shapley Addative Explanations (<u>SHAP</u>).
- Explain why a particular individual was placed into a particular peer group using Local Interpretable Model-agnostic Explanations (<u>LIME</u>).



Slippage Rate Reduction

- <u>XGBoost Regression Model</u> trained to predict slippage rate of trade parent.
- Helps the client understand how they can change their trading behavior in order to reduce their slippage cost.
- Prescribe alternative trading behavior using Diverse Counterfactual Explanations (<u>DiCE</u>).





Explainable AI Using Diverse Counterfactual Explanations (DiCE)



Explainable AI Using Diverse Counterfactual Explanations (DiCE)





CME Group and Gen Al

	Public	Internal	Individual Customer
Purpose	Broad, general purpose	Broad, general purpose	Individual & firm specific
Accessibility	Open to the public	Restricted access, employee only, ambassadors	Access is limited to entitled users and firms
Performance	Scalable, supports a large number of users simultaneously, optimal	Customized, optimized for specific operational tasks, personalization engine	Personalized, high volume, mission critical
Data Handling & Privacy	Low data privacy, companies can use data in accordance with the law	High data security, company handles its own data	high-level security & privacy, users agree to company terms of service







Thank you