SECURITIES DIVISION

FX Algos

Goldman Sachs

Market functioning

ECB FXCG Meeting September 2019

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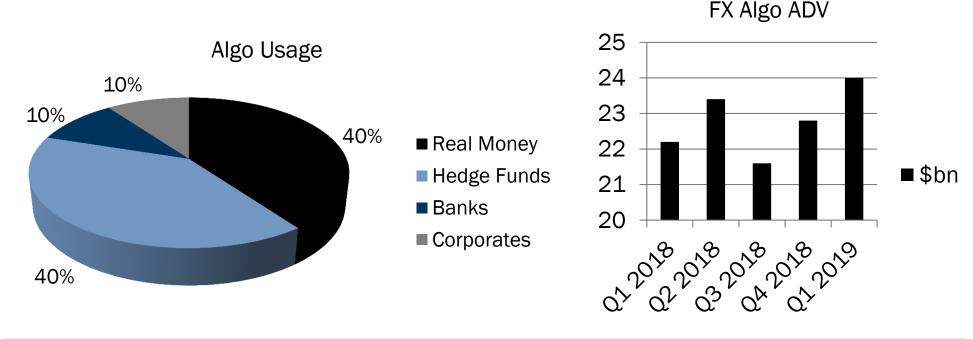




The Market for FX Algos

Total Volume Estimate

- Estimates of the total volume traded via FX algos can be attempted from
 - (limited) wallet share statistics from multi-dealer platforms where FX algos are offered
 - Participation in market surveys
 - Published studies such as by Greenwich Associates
- Using a combination of these approaches, we estimate
 - ADV: \$20-25bn
 - Split: largely real money and hedge fund



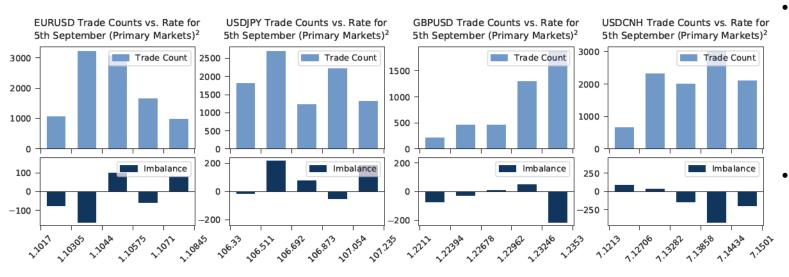
Compiled by GS FX SMM Engineering (Securities Division), as of Sep-19 Source: GS FX SMM Engineering (Securities Division)

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Algo behaviour

Algo function in illiquid conditions and distressed markets

1					Heat ma	p showing	n time-wei	ohted ave	erane tour	h spread	in nins by	time of d	av for G1	0. Deliver	able FM a		crosses (using 5th	Sentembe	r nrimarv	markets	data)					
Time (LDN)	FURUSD	USDJEV	GRPUSD	USDCHE		AUDUSD	and a second second	and the second			A CONTRACTOR OF THE							all and the second second second					USDINR	USDKRW		USDPHP	USDTWC
00:00-01:00	1.0	1.1	2.9	1.6	2.1	0.9	1.8	71.1	73.0	13.8	21.3	1.7	12.3	5.0	77.5	12.0	56.3	23.8	62.4	197.3	47.2	417	11.2	289.0	73.6	17.0	3.4
01:00-02:00	0.9	0.8	2.7	1.3	1.8	0.9	1.6	47.4	47.9	15.0	9.4	1.6	5.2	7.7	65.0	12.0	51.0	20.8	60.0	199.7	52.8	28.0	50.1	27.4	112.1	7.9	3.3
02:00-03:00	0.8	0.9	2.8	1.3	1.8	1.0	1.6	56.1	39.4	15.0	7.1	1.6	5.0	8.5	65.2	12.0	43.4	11.9	60.0	197.5	67.3	7.6	4.9	17.6	82.3	3.5	1.5
03:00-04:00	0.8	0.8	2.5	1.1	1.6	0.9	1.4	53.6	60.1	15.0	4.3	1.6	3.3	7.2	68.2	12.0	47.4	24.9	60.0	158.9	91.0	5.1	8.9	17.8	70.0	3.2	0.9
04:00-05:00	0.8	0.8	2.7	1.1	1.7	0.9	1.4	37.9	59.9	15.0	4.7	1.4	3.4	7.9	67.5	12.0	43.9	34.6	60.0	137.4	95.7	5.2	3.7	17.0	70.0	1.9	0.6
05:00-06:00	0.8	0.7	2.5	1.0	1.6	0.8	1.3	29.7	54.0	12.0	4.9	1.5	2.9	7.4	57.8	12.0	44.4	34.9	60.0	165.6	87.5	3.2	1.2	19.0	69.2	2.7	0.8
06:00-07:00	0.8	0.9	2.8	1.4	1.6	0.8	1.4	45.9	42.4	5.9	4.8	1.5	2.6	8.8	44.1	13.4	36.5	32.3	47.7	171.4	77.5	3.6	1.3	18.9	61.6	2.8	0.7
07:00-08:00	0.8	0.9	2.3	1.2	1.7	0.8	1.4	31.9	23.8	5.5	3.7	1.7	2.7	6.7	50.4	20.2	23.5	18.6	32.6	108.6	76.9	3.0	1.2	18.6	52.2	2.0	0.7
08:00-09:00	0.8	0.9	2.2	1.2	1.6	0.9	1.3	33.5	39.1	2.5	3.7	1.5	1.9	7.5	31.4	13.4	14.4	15.6	12.1	91.5	77.8	4.2	1.3	26.0	60.0	2.1	0.6
09:00-10:00	0.8	0.9	2.0	1.2	1.6	0.8	1.4	26.9	24.6	2.9	4.0	1.8	2.3	7.0	30.0	13.0	9.3	13.4	11.8	66.7	71.8	6.6	1.2	28.5	50.6	1.8	0.7
10:00-11:00	0.8	0.9	1.9	1.1	1.4	0.9	1.5	27.7	24.7	3.4	4.2	1.6	2.0	6.2	31.7	12.5	10.8	13.6	12.6	84.7	79.0	7.6	1.3	28.6	34.9	4.2	0.8
11:00-12:00	0.7	0.9	2.0	1.2	1.5	0.9	1.4	30.0	26.0	3.7	4.1	1.8	3.0	4.5	29.8	9.8	15.2	16.7	15.5	77.6	70.3	15.8	1.4	44.8	53.8	4.7	0.6
12:00-13:00	0.8	0.8	1.9	1.2	1.6	0.9	1.4	26.7	22.2	2.2	5.0	2.0	2.6	8.8	31.5	7.7	10.3	17.0	12.9	86.2	59.2	8.8	1.9	41.7	61.4	6.1	0.8
13:00-14:00	0.8	0.9	2.3	1.3	1.6	0.9	1.3	30.0	24.4	3.7	5.3	2.1	2.9	8.3	32.9	8.9	12.2	12.8	11.0	90.4	53.8	6.7	1.9	44.3	62.4	2.3	0.8
14:00-15:00	0.8	0.9	1.9	1.1	1.4	0.8	1.2	25.2	22.2	2.9	5.5	2.0	3.2	7.5	31.5	7:5	9.5	13.8	9.7	82.8	43.0	6.1	1.6	49.6	43.1	2.5	1.1
15:00-16:00	0.8	0.8	1.8	1.2	1.5	0.8	1.3	27.4	23.4	6.1	5.7	1.9	4.2	7.2	35.1	12.2	10.5	18.1	21.5	92.5	41.0	4.7	1.8	43.0	25.0	2.2	0.7
16:00-17:00	0.7	0.8	1.9	1.2	1.5	0.9	1.3	23.4	27.2	3.7	5.1	2.0	3.4	8.1	34.3	14.4	18.2	17.9	22.2	86.3	36.7	4.1	2.0	42.1	21.8	17	1.1
17:00-18:00	0.7	0.8	2.1	1.1	1.5	1.0	1.2	25.9	26.0	3.0	5.8	1.9	5.0	9.2	35.3	12.5	16.0	15.7	19.0	81.6	33.5	5.7	1.1	31.2	16.7	3.9	0.7
18:00-19:00	0.8	0.9	2.2	1.2	1.7	1.0	1.3	28.6	28.0	3.0	5.4	2.1	3.4	10.1	35.0	11.8	15.7	14.1	10.3	88.6	37.0	3.7	3.6	37.3	30.0	5.1	1.1
19:00-20:00	0.7	0.8	2.2	1.1	1.5	1.0	1.3	25.8	31.0	3.0	6.2	2.0	6.3	11.7	32.5	12.0	13.0	16.9	10.0	96.6	33.3	3.0	3.5	46.6	31.9	5.1	1.1
20:00-21:00	0.9	0.9	2.1	1.2	1.6	0.9	1.7	36.9	34.0	3.0	7.1	2.3	6.0	12.9	38.1	11.0	13.7	17.0	23.3	82.3	38.1	3.6	3.1	79.3	50.0	6.0	0.8
21:00-22:00	0.9	1.1	3.2	1.3	1.9	1.2	1.8	60.4	49.6	3.5	4.4	2.1	3.3	13.6	38.4	12.8	17.3	25.9	25.0	66.2	80.7	4.1	5.0	38.6	50.0	9.0	1.4
22:00-23:00	2.3	5.2	13.6	8.2	5.4	3.1	4.7	177.5	100.5	6.0	44.9	14.1	5.3	16.9	136.6	50.4	35.2	45.5	31.5	224.8	246.7	10.0	6.0	250.0	50.0	24.3	2.0
23:00-24:00	1.2	1.3	3.1	1.9	2.3	1.8	2.3	104.8	100.0	6.0	33.7	4.0	4.3	18.6	90.0	26.3	29.8	32.1	20.0	374.7	113.4	10.0	6.0	406.8	50.0	25.0	2.0



- Significant intra-day variation in market spreads and imbalance between market paids and givens are typical even in normal markets
- Algos must constantly react to changing conditions

Compiled by GS FX SMM Engineering (Securities Division), as of Sep-19

Source: GS FX SMM Engineering (Securities Division), EBS, Reuters

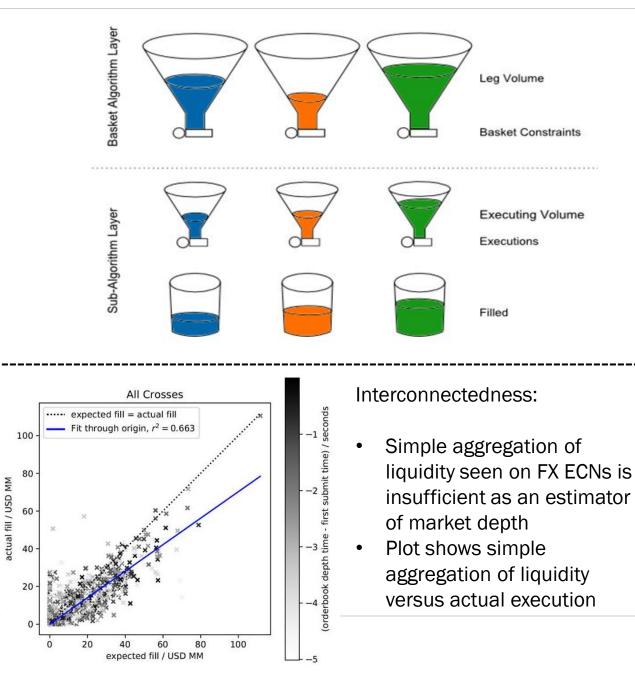
² Imbalances show the number of paids minus the number of givens within each price range. Trade counts, paids and givens are calculated using data from the 24 hour period ending at midnight Hong 3 Kong time.

³ NDF data shown is for 1 month settlement dates and aggregates both on-SEF and off-SEF liquidity.

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Risks to market functioning

Co-movement and interconnectedness



Co-movement:

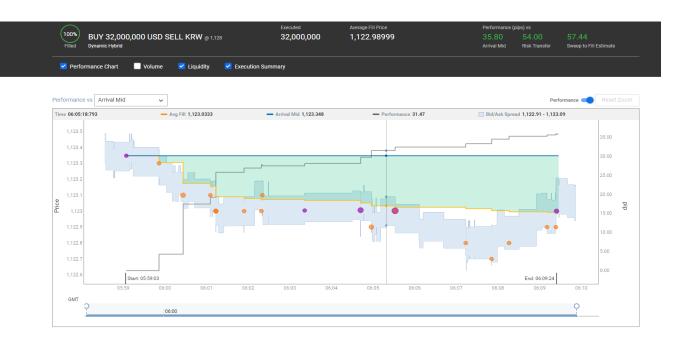
- Algo execution during announcements, economic events, fixing windows
- Large executions in correlated illiquid currencies
- New portfolio algos offer ability to control correlated market impact by setting basket level limits and flow rate



Transparency – algo provider

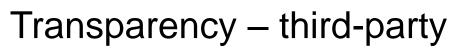
Pre-, Intra- and Post-trade tools, algo questionnaires

Example of real-time algo analytics provided by GS



Execution Summary by Venue T	уре				:=	View all executions Copy
VENUE NAME	MIC CODE	QUANTITY (USD)	QUANTITY (KRW) % OF	FILL	TAKING %	PROVIDING %
TOTAL		32,120,000.00	36,070,439,760.00	100.00%	34.25%	65.75%
V INTERNAL		14,120,000.00	15,856,839,760.00	43.96%	3.11%	40.85%
GOLDMAN SACHS INTERNAL MA	ATCHING GSIM	14,120,000.00	15,856,839,760.00	43.96%	3.11%	40.85%
V PRIMARY		18,000,000.00	20,213,600,000.00	56.04%	31.13%	24.91%
EBSX (NDF OFF SEF)	EBSX (NDF OFF SEF)	18,000,000.00	20,213,600,000.00	56.04%	31.13%	24.91%

- Demands on algo providers significantly greater than in the early years 2010-15.
 - pre-trade cost, liquidity, and algo duration estimates
 - live intra-trade performance analysis
 - algo provider AND third-party posttrade TCA reporting
 - FAQs



Third-party analytical tools

Example of BestX Ltd report on dummy algo data

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- Third-party analytical tools are increasingly popular with algo users to standardize TCA and provide a performance report that is independent of the algo provider
 - In FX, the most widely used names include BestX, ITG, Tradefeedr, Bloomberg

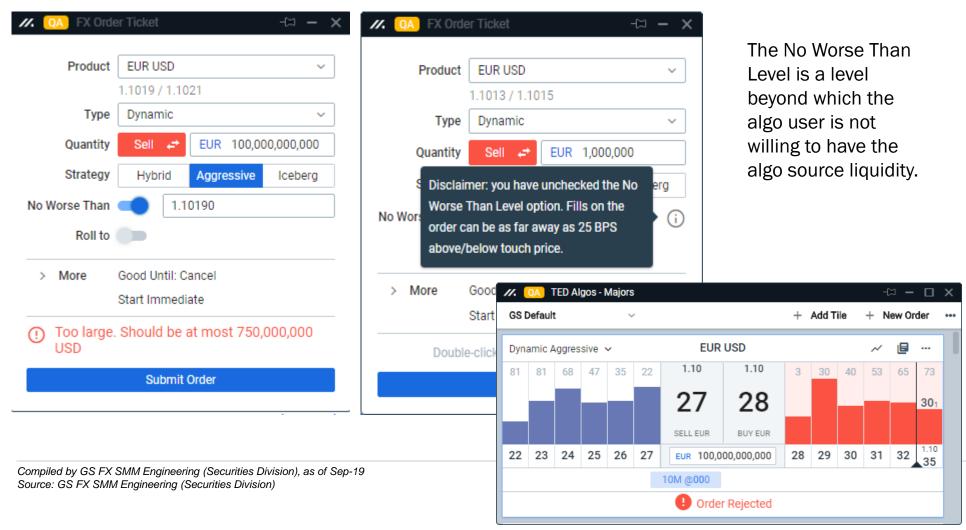
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Safety measures

Global controls, fat-finger checks, disclaimers

- Client algos fall under a framework of automatic oversight that sits above and supervises all electronic execution to address regulatory and operational risks
- Fat-finger checks are performed on order entry on trade size and limit through market. These can be customized at client request.



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