# **Cross Asset Volatility**

### Machine Learning Based Trade Recommendations

- This week we introduce a new signal from our recent report (Relative Value Trading on FX Volatility Surfaces, July 2). This report describes our machine learning model which uses the principal components of the volatility surfaces of FX pairs as signals to trade different parts of the surface. In Figure 14 below, we show the model's expected PnL in basis points when holding a fixed notional in either 25D Puts, ATM Straddles, or 25D Calls for each of the 3M, 6M, 12M tenors, for each G10 currency pair. The model uses a holding period of 1 Month.
- From the signal described in the report from the bullet above (see Figure 14) we recommend selling USD-NOK 1Y ATM straddles and going long USD-NOK 3M ATM Straddles. In Figure 14 below there is a large difference between the expected PnL from these two structures. We also show the history of these vol levels in the figure on page 1.
- This week our 1M ATM FX volatility models are showing that 1M ATM volatility is underpriced for most of the currency pairs. One big exception is TWD which is showing up as extremely rich. We recommend selling 1M ATM straddles on TWD and going long 1M ATM straddles on KRW. Since the EM and G10 VXY vol levels are back to near the YTD low a long vol lean may be interesting here. In this case, it may be better to choose a longer expiry, perhaps 3M as the post-summer month expiries may be more suitable for expressing the long vol tilt.

Global Quantitative and Derivatives Strategy

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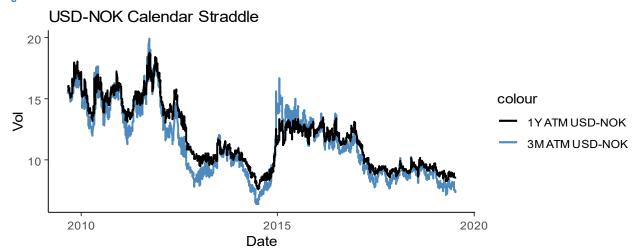
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Figure: USD-NOK Calendar Straddle

Source: J.P. Morgan



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### G10 FX 1M Volatility<sup>1</sup>

Figure 1: G10 Dollar Pair FX 1M Volatility Ranking 2019-07-05

	Ссу	1M ATM Implied Vol	IV Percentile(1 yr)	Short Vol Carry	Short Vol SVM Predicted Hit Ratio	Direction
1	CHF	5.35	0.25	-0.93	0.60	Rich
2	CAD	5.08	0.07	0.23	0.33	Cheap
3	AUD	6.38	0.01	-0.33	0.18	Cheap
4	NOK	6.98	0.03	-0.35	0.13	Cheap
5	EUR	5.05	0.11	0.07	0.13	Cheap
6	SEK	6.92	0.03	-0.52	0.07	Cheap
7	NZD	7.15	0.04	-0.79	0.05	Cheap
8	GBP	5.55	0.00	-1.28	0.04	Cheap
9	JPY	5.69	0.18	0.01	0.04	Cheap

Source: J.P. Morgan

18 16.5 14.5 13 12 10.5 9.5 8.5 Vol Carry 7.5 6.5 5.5 4.5 3.5 2.5 1.5 0.5 -0.5 -1.5 -2.5 -3.5

Figure 2: G10 Dollar Pair FX 1M Volatility Scatterplot

Source: J.P. Morgan

Green Region is Good for Selling Vol. Red is Good for Buying.

0 0.050.10.150.20.250.30.350.40.450.50.550.60.650.70.750.80.850.90.95 1

1Y IV Percentile

Direction "Rich" Means We Recommend Selling Vol.

<sup>&</sup>lt;sup>1</sup> Big Data and AI Strategies: Enhancing FX volatility trading with machine learning, 13 Aug 2018

### **EM FX 1M Volatility**<sup>2</sup>

Figure 3: EM Dollar Pair FX 1M Volatility Ranking 2019-07-05

	Ссу	1M ATM Implied Vol	IV Percentile(1 yr)	Log Vol Carry	Carry	Short Vol SVM Predicted Hit Ratio	Direction
1	TWD	4.43	0.35	0.41	1.50	0.94	Rich
2	BRL	13.09	0.12	0.20	2.36	0.77	Rich
3	CNH	4.25	0.11	0.12	0.47	0.41	Cheap
4	SGD	3.43	0.17	0.07	0.24	0.22	Cheap
5	ZAR	13.71	0.02	0.05	0.71	0.16	Cheap
6	CLP	8.83	0.14	0.04	0.34	0.14	Cheap
7	INR	5.01	0.02	0.04	0.19	0.13	Cheap
8	RUB	7.90	0.02	0.03	0.22	0.10	Cheap
9	TRY	15.40	0.10	0.00	0.07	0.09	Cheap
10	PLN	6.32	0.06	0.00	0.01	0.08	Cheap
11	MXN	9.14	0.08	-0.01	-0.06	0.08	Cheap
12	KRW	6.39	0.22	0.02	0.13	0.06	Cheap
13	HUF	6.96	0.04	-0.11	-0.79	0.05	Cheap

Source: J.P. Morgan.

Note: Log Carry = Log(IV/EMA), Carry = IV - EMA (see original report for details)

Source: J.P. Morgan

Green Region is Good for Selling Vol. Red is Good for Buying.

Direction "Rich" Means We Recommend Selling Vol.

<sup>&</sup>lt;sup>2</sup> Big Data and AI Strategies: Machine Learning to the rescue in cracking the tough EM FX volatility trading cookie, 13 Sep 2018



### **Equity Index 1Y Variance Swaps Relative Value<sup>3</sup>**

Figure 5: Top 10 Decompression/Compression Variance Pairs 2019-07-05

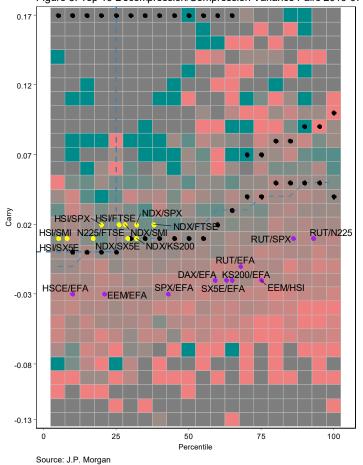


Figure 6: Top 10 Variance Pairs for Decompression

Long Short Carry IV Percentile(1 Year) Predicted H

Long	Short	Carry	IV Percentile(1 Year)	Predicted Hit Ratio
NDX	FTSE	0.02	38	1.00
HSI	FTSE	0.02	26	0.99
NDX	SPX	0.02	32	0.93
HSI	SPX	0.02	20	0.91
NDX	SMI	0.02	28	0.91
NDX	SX5E	0.01	29	0.89
N225	FTSE	0.01	17	0.85
HSI	SMI	0.01	8	0.85
NDX	KS200	0.01	32	0.82
HSI	SX5E	0.01	5	0.80
	NDX HSI NDX HSI NDX NDX NDX NDX N225 HSI NDX	NDX FTSE HSI FTSE NDX SPX HSI SPX NDX SMI NDX SX5E N225 FTSE HSI SMI NDX KS200	NDX         FTSE         0.02           HSI         FTSE         0.02           NDX         SPX         0.02           HSI         SPX         0.02           NDX         SMI         0.02           NDX         SX5E         0.01           N225         FTSE         0.01           HSI         SMI         0.01           NDX         KS200         0.01	NDX         FTSE         0.02         38           HSI         FTSE         0.02         26           NDX         SPX         0.02         32           HSI         SPX         0.02         20           NDX         SMI         0.02         28           NDX         SX5E         0.01         29           N225         FTSE         0.01         17           HSI         SMI         0.01         8           NDX         KS200         0.01         32

Source: J.P. Morgan

Figure 7: Top 10 Variance Pairs for Compression

	Long	Short	Carry	IV Percentile(1 Year)	<b>Predicted Hit Ratio</b>
1	EEM	HSI	-0.02	75	0.05
2	RUT	SPX	0.01	86	0.04
3	RUT	N225	0.01	93	0.04
4	SPX	EFA	-0.03	43	0.04
5	RUT	EFA	-0.01	68	0.04
6	SX5E	EFA	-0.02	63	0.04
7	EEM	EFA	-0.03	21	0.04
8	DAX	EFA	-0.02	59	0.04
9	KS200	EFA	-0.02	65	0.04
10	HSCE	EFA	-0.03	10	0.04

Global Equity Derivatives: A simple machine learning approach to variance pairs trading, 24 July 2018
 Big Data and AI Strategies: Attractive long/short variance pairs in a machine learning framework, 15 Aug 2018
 Big Data and AI Strategies: Application of support vector machine to cross-asset volatility pair trading, 02 Oct 2018



# **ETF Relative Value Volatility Rankings<sup>4</sup>**

Figure 8: Broad Based ETF Relative Value Volatility Rankings (Ordered from Cheap to Rich) 2019-07-08

	Name	3M Implied	RV Predicted	EWMA Realised	3M Returns	RV Rank
HEDJ	WISDOMTREE EUROPE HEDGED EQU	12.0	13.1	12.8	3.9	11
EFA	ISHARES MSCI EAFE	10.7	11.4	10.8	2.3	19
QQQ	INVESCO QQQ TRUST SERIES 1	15.5	16.3	16.3	4.1	24
VGK	VANGUARD FTSE EUROPE	11.8	12.4	11.9	2.1	25
ACWI	ISHARES MSCI ACWI	11.0	11.5	10.9	2.8	29
MDY	SPDR S&P MIDCAP 400 TRST	13.0	13.6	13.2	2.0	30
IWF	ISHARES RUSSELL 1000 GROWTH	13.6	14.0	13.8	4.8	32
FEZ	SPDR EURO STOXX 50	13.2	13.4	13.0	4.6	34
IWM	ISHARES RUSSELL 2000	15.0	15.3	15.2	0.8	36
SPY	SPDR S&P 500 TRUST	11.9	12.1	11.6	4.3	37
VTI	VANGUARD TOTAL STOCK MKT	12.2	12.3	11.8	4.1	39
IVV	ISHARES CORE S&P 500	12.0	12.0	11.5	4.3	42
IWD	ISHARES RUSSELL 1000 VALUE E	11.2	11.1	10.5	3.7	51
DIA	SPDR DJIA TRUST	12.1	11.9	11.3	2.6	53
IWO	ISHARES RUSSELL 2000 GROWTH	17.5	17.0	17.2	1.8	56
IWN	ISHARES RUSSELL 2000 VALUE E	15.0	14.3	14.0	-0.2	59
EEM	ISHARES MSCIEMERGING MARKET	16.5	15.6	15.2	-1.8	61
VWO	VANGUARD FTSE EMERGING MARKE	16.5	15.2	14.9	-0.9	65

Source: J.P. Morgan

Figure 9: Sector ETF Relative Value Volatility Rankings (Ordered from Cheap to Rich) 2019-07-08

	Name	3M Implied	RV Predicted	EWMA Realised	3M Returns	RV Rank
XLK	TECHNOLOGY SELECT SECT SPDR	16.0	18.4	17.8	6.0	2
XLC	COMM SERV SELECT SECTOR SPDR	15.7	17.0	16.3	4.8	14
XLE	ENERGY SELECT SECTOR SPDR	17.4	18.6	17.8	-4.3	17
XLB	MATERIALS SELECT SECTOR SPDR	15.1	15.9	15.1	2.4	22
XLU	UTILITIES SELECT SECTOR SPDR	13.1	13.8	12.8	6.1	23
XLP	CONSUMER STAPLES SPDR	11.5	12.0	11.1	7.7	27
SPY	SPDR S&P 500 TRUST	11.9	12.1	11.6	4.3	37
XLF	FINANCIAL SELECT SECTOR SPDR	14.9	15.0	14.1	6.4	40
XLV	HEALTH CARE SELECT SECTOR	13.4	13.2	12.3	3.0	48
XLY	CONSUMER DISCRETIONARY SELT	15.2	14.2	13.3	4.4	64

<sup>&</sup>lt;sup>4</sup> Global Equity Derivatives: US ETF relative value volatility model, 27 Mar 2018



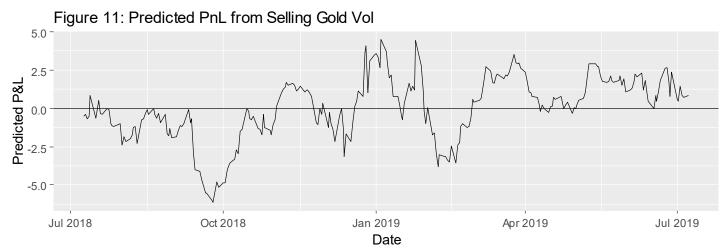
# Predicted P&L from Selling Gold Vol<sup>5</sup>

Figure 10: Gold Vol Recommendations

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	<b>Last Close Date</b>	Expected P&L from Selling 1M Vol	Recommendation				
1	2019-07-02	0.45	Sell				
2	2019-07-03	1.44	Sell				
3	2019-07-04	0.82	Sell				
4	2019-07-05	0.69	Sell				
5	2019-07-08	0.85	Sell				

Source: J.P. Morgan

<sup>\*</sup>Go long volatility when expected Vol selling P&L is negative

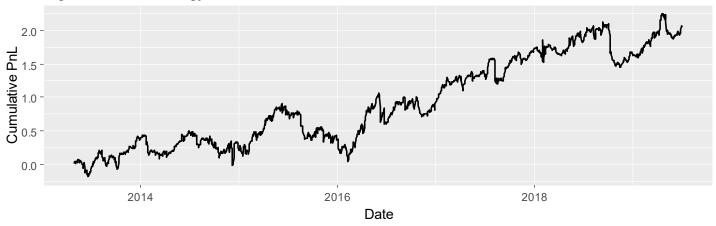


<sup>&</sup>lt;sup>5</sup> Big Data and AI Strategies: Machine learning approach to trading gold volatility, 19 Oct 2018



# VIX Term Structure Dynamic Allocation<sup>6</sup>

Figure 12: VIX Strategy PnL Curve



Source: J.P. Morgan

Figure 13: VIX Futures Weights Recommendations

	Date	Cont. 1 (Jul)	Cont. 2 (Aug)	Cont. 3 (Sep)	Cont. 4 (Oct)	Cont. 5 (Nov)
1	2019-06-28	-0.4	-0.44	-0.29	0.06	0.07
2	2019-07-01	-0.4	-0.43	-0.29	0.06	0.07
3	2019-07-02	-0.47	-0.42	-0.26	0.07	0.08
4	2019-07-03	-0.48	-0.42	-0.25	0.07	0.08
5	2019-07-05	-0.5	-0.42	-0.26	0.07	0.1

<sup>&</sup>lt;sup>6</sup> Big Data and AI Strategies: VIX Term Structure Dynamic Allocation, 08 April 2019



# Relative Value Trading on FX Volatility Surfaces

**Negative** PnL => **Profit** from **Selling** the Options.

**Positive** PnL => **Profit** from **Buying** the Options.

Figure 14: Vol Surface PnL Predictions in Basis Points 2019-07-04

	ссу	3Mp25	3Ms50	3Mc25	6Mp25	6Ms50	6Mc25	12Mp25	12Ms50	12Mc25	
1	AUD-USD	-18	-4	-4	-20	-10	-7	-19	-16	-7	
2	USD-CAD	-8	-8	-11	-7	-7	-8	-5	-3	-2	
3	USD-CHF	-5	-10	-12	-5	-7	-10	-5	-7	-7	
4	EUR-USD	0	4	-1	0	3	0	-4	-1	-2	
5	GBP-USD	-22	-19	-13	-18	-16	-11	-14	-14	-10	
6	USD-JPY	-19	-20	-22	-19	-19	-19	-19	-22	-21	
7	USD-NOK	-30	-38	-27	-41	-58	-42	-45	-69	-51	
8	NZD-USD	-41	-35	-18	-40	-40	-22	-38	-38	-18	
9	USD-SEK	-3	-9	-18	-5	-15	-20	-13	-28	-29	

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